RESEARCH ARTICLE



# Assessing the potential impacts of non-native small mammals in the South African pet trade

Ndivhuwo Shivambu<sup>1</sup>, Tinyiko C. Shivambu<sup>1</sup>, Colleen T. Downs<sup>1</sup>

I DSI-NRF Centre of Excellence for Invasion Biology, and the Centre for Functional Biodiversity, School of Life Sciences, University of KwaZulu-Natal, Private Bag X01, Scottsville, Pietermaritzburg, 3209, South Africa

Corresponding author: Colleen T. Downs (downs@ukzn.ac.za)

Academic editor: Wolfgang Rabitsch | Received 3 April 2020 | Accepted 29 June 2020 | Published 12 August 2020

**Citation:** Shivambu N, Shivambu TC, Downs CT (2020) Assessing the potential impacts of non-native small mammals in the South African pet trade. NeoBiota 60: 1–18. https://doi.org/10.3897/neobiota.60.52871

#### Abstract

The pet trade is one of the most important pathways by which small mammals are introduced to nonnative areas. To prevent the introduction and invasion of non-native pets, an impact assessment protocol is useful in understanding which pets might have potential negative impacts should they escape or be released from captivity. In this study, we used the Generic Impact Scoring System (GISS) to assess the potential effects associated with 24 non-native small mammal species sold in the South African pet trade. European rabbits *Oryctolagus cuniculus*, house mice *Mus musculus*, Norwegian rats *Rattus norvegicus* and eastern grey squirrels *Sciurus carolinensis* had the highest potential impacts for both socio-economic and environmental categories. We found no statistically significant difference between the overall environmental and socio-economic impact scores. Impacts on agricultural and animal production (livestock) were the main mechanisms in the socio-economic category, while the impacts on animals (predation), competition and hybridisation prevailed for environmental impacts. The non-native mammal pet species with high impacts should be strictly regulated to prevent the potential impacts and establishment of feral populations in South Africa.

#### Keywords

GISS, introduction pathways, invasions, impact assessment, policy implementation

## Introduction

Different invasion pathways have been associated with the introduction and spread of non-native species (McNeely 2006; Hulme 2009). These pathways include accidental introductions (e.g. hitch-hikers or contaminants of transported goods) and intentional introductions through horticulture, biocontrol and pet trade (Padilla and Williams 2004; Hulme 2009; Keller et al. 2011). The latter has gained considerable attention over the past decades as the global trade in live animals increases (Keller and Lodge 2007; Faulkner et al. 2016; Ng et al. 2016; Lockwood et al. 2019). Some of the non-native pet species may establish self-sustaining populations through accidental escapes and intentional releases (Gaertner et al. 2015; da Rosa et al. 2017); for example, European rabbit *Oryctolagus cuniculus*, eastern grey squirrel *Sciurus carolinensis*, common marmoset *Callithrix jacchus* and the black tufted-ear marmoset *Callithrix penicillata* (Huynh et al. 2010; da Rosa et al. 2017; Measey et al. 2020).

Non-native pets have been associated with negative impacts on biodiversity, human health, the economy, and agriculture (Marbuah et al. 2014; Su et al. 2015; Shivambu et al. 2020). In Brazil, the common marmoset *C. jacchus* has been reported to negatively affect the population of vulnerable buffy-tufted marmosets *C. aurita* through hybridisation (Nogueira et al. 2011; Malukiewicz et al. 2014). An increase in the trade of non-native small mammal species is also associated with outbreaks of zoonotic diseases, e.g. Salmonellosis in 28 patients in the USA has been linked to pet rodents such as mice, rats and hamsters (Hargreaves 2007). The common marmoset has been implicated into transmitting rabies to humans in Brazil (Kotait et al. 2019). Economic impacts have also been reported for some non-native small mammals, e.g. the European rabbit *O. cuniculus* has been indicated to compete with livestock for pasture in Australia (Fleming et al. 2002). In addition, species such as the eastern grey squirrel, the Norwegian rat *Rattus norvegicus* and the house mouse *Mus musculus* have been reported to cause impacts on infrastructures and crops of economic importance (Signorile and Evans 2007; Almeida et al. 2013; Panti-May et al. 2017).

The negative impacts associated with any introduced species can be partly prevented by prohibiting the trade of those non-native species with known harmful impacts and invasive potential (Vaes-Petignat and Nentwig 2014; van der Veer and Nentwig 2015; da Rosa et al. 2018). In cases where non-native pet species have already been introduced but not yet established, possible impacts can be avoided by preventing their release or escape from captivity (da Rosa et al. 2018). In South Africa, the pet trade has been cited as an invasion pathway for different non-native animals through releases and accidental escapees, including species such as the mallard duck *Anas platyrhynchos* (Gaertner et al. 2015), the rose-ringed parakeet *Psittacula krameri* (Hart and Downs 2014), and the Australian red claw crayfish *Cherax quadricarinatus* (Nunes et al. 2017). The South African National Environmental Management: Biodiversity Act (No. 10 of 2004) (NEMBA) requires that impact and risk assessments are undertaken by either the issuing authority or the importer before issuing permits for non-native species being imported, sold, kept in captivity or released into the wild (van Wilgen et al. 2008). Impact and risk assessment protocols are considered to be cost-effective and reliable methods that can be used to identify potential invasion impacts, enable ranking of them and support decision-making (Jeschke et al. 2014; da Rosa et al. 2018; Shivambu et al. 2020). Both impact and risk assessment protocols have been successfully used for fishes (van der Veer and Nentwig 2015), plants (Novoa et al. 2016) and for species in the pet trade (Bomford et al. 2005; Patoka et al. 2014; da Rosa et al. 2018; Weiperth et al. 2018) to investigate the potential invasion risks and impacts.

The present study focused on non-native small mammals sold as pets in South Africa. These non-native small mammal species include rodents, lagomorphs, primates, Eulipotyphla, carnivores, Afrosoricida, and Diprotodontia (Suppl. material 1, Table S1). These small mammal pets are traded on different platforms, including online, among breeders and in pet shops (Maligana et al. 2020). There is a relative paucity of information on the potential impacts associated with non-native small mammals sold as pets in South Africa. Non-native small mammal pets such as the sugar glider Petaurus breviceps (Heinsohn et al. 2015), the domesticated ferret Mustela putorius furo (Davison et al. 1999), the European rabbit (Fleming et al. 2002), the common and the black tufted-ear marmoset (Malukiewicz et al. 2014; Kotait et al. 2019) have been reported to cause impacts in their invaded areas. The aim of the present study was, therefore, to identify which non-native small mammal species sold as pets in South Africa have potentially high environmental and/or socio-economic impacts. We also investigated which impact mechanisms are associated with them. Given that previous studies found that non-native birds and mammals are associated with economic impacts (Kumschick and Nentwig 2010; Nentwig et al. 2010), we predicted that most of the non-native small mammal species traded as pets in South Africa would be more associated with socio-economic impacts rather than environmental impacts. In addition, some of the small mammal species, especially rodents, are associated with human habitation (Garba et al. 2014; Panti-May et al. 2017) and therefore, we expected them to cause more economic than environmental impacts.

## **Methods**

## Study species

In this study, pet shops were visited in South Africa to document the list of nonnative small mammals sold. The list was complemented with data collated from the online trade. All pet shops and online websites were surveyed four times, once per season (spring, summer, autumn, and winter) between September 2018 and September 2019. During each visit, the numbers of each mammal species were recorded to determine the prevalence. We averaged the numbers of each species for both online and pet shop trade to indicate the most prevalent species. We carried out the impact assessments for 24 non-native small mammals sold in pet shops and online (Maligana et al. 2020; Suppl. material 1, Table S1).

#### Impact assessments

We conducted impact assessments using the Generic Impact Scoring System (GISS) (Nentwig et al. 2010). This tool depends on published evidence associated with environmental and socio-economic impacts of the studied species and allows comparisons and prioritisation. The environmental impacts (Kumschick and Nentwig 2010) were grouped into six impact categories, which included impacts on plants or vegetation (herbivory), impacts on animals (predation), competition, disease transmission, hybridisation, and impacts on ecosystems. The socio-economic impacts were also grouped into six categories, which included impacts on agricultural production, animal production (livestock), forestry production, human infrastructure, human health, and human social impacts (Kumschick and Nentwig 2010; Nentwig et al. 2010). The impact mechanism for each category under environmental and socio-economic impacts ranged from 0 to 5 (0: no impact or literature associated with scored species, 1-2: minor impacts, 3: medium impacts, and 4-5: major impacts) (Nentwig et al. 2010). The potential maximum scores for both environmental and socio-economic impacts is 60. Information on the impacts of the assessed species was retrieved by searching on Google Scholar and Web of Science (https://clarivate.com/) using the scientific and common names of the species in combination with each impact mechanism, for example, "Oryctolagus cuniculus impacts on plants or vegetation", "Callithrix jacchus impacts on animals", "house mouse impacts on agricultural production", and "Cebus capucinus impacts on human social life". In the present study, we only assessed the impacts associated with feral populations of non-native small mammals. We did not assess the reported impacts associated with non-native small mammals in captivity. The assessments of the impacts were based on the publication records entirely from areas outside South Africa.

#### Statistical analyses

We tested the similarity between the sum of the GISS environmental and socio-economic impact scores using the paired Wilcoxon's signed-rank tests. We tested for significant differences between the mechanisms for environmental and socio-economic impacts using a Kruskal-Wallis test, and the Mann-Whitney pairwise tests were used to test for differences within the species and within the impact mechanisms. All statistical analyses were performed in R statistical software (version 3.4.4, R Core Team, 2018).

## Results

#### Impact assessments

We found a total of 122 pet shops and seven online websites selling 24 non-native small mammals in South Africa. The European rabbit, the Norwegian rat, the house

mouse and the Guinea pig were the most prevalent species in both pet shops and online (Suppl. material 2, Table S2). The first three species and the eastern grey squirrel are established species in South Africa (Table 1). A total of 106 publications were found and used to rank the impacts of these species. Of the 24 non-native mammal species traded, we could only find published impacts for 10 species and therefore assessed those. The literature ranged between 1 to 23 publications for a single species, and for some of the species, the literature was identical (Suppl. material 2, Table S2). The total GISS scores ranged from 3 to 40, with environmental impact ranging from 0 to 18 and socio-economic impacts ranging from 0 to 22 (Table 1). The total score for environmental impact was 115 and for socioeconomic impact was 81 (Table 1). When comparing the overall scores between the two impacts, there was no significant difference between overall environmental and socio-economic impact scores (Wilcoxon signed-rank test, V = 23, P = 0.1022). European rabbit, Norwegian rat and house mouse had the highest overall GISS scores (between 32 and 40) representing between 53% and 67% of the maximum impact assessment score (i.e. 60) (Table 1).

All the non-native mammal species assessed in the present study had environmental impacts, except for the Mongolian gerbil *Meriones unguiculatus* (Table 1, Fig. 1a). There was no significant difference between the potential environmental impacts of the non-native small mammal species assessed (Kruskal-Wallis test;  $X^2 =$ 3.01, df = 9, P = 0.90). The species with the highest environmental impact were the European rabbit, followed by the house mouse and the Norwegian rat (Table 1). These species represented between 50% and 60% of the maximum environmental impact score (i.e. 30).

Seven out of 10 of the non-native mammal species traded as pets had socio-economic impacts in the present study (Table 1, Fig. 1b). There was a significant difference between the socio-economic impact scores for the 10 non-native small mammals traded as pets (Kruskal-Wallis test,  $X^2 = 22.27$ , df = 9, P = 0.003, Fig. 1b). The European rabbit, the house mouse and the Norwegian rat had significantly higher socioeconomic impacts when compared with the other seven species (Mann-Whitney pairwise test, Bonferroni corrected p values, P < 0.001, Table 1, Fig. 1b). They represented more than 50% of the maximum socio-economic impact score (i.e. 30).

#### Environmental impacts mechanisms

Between the environmental impact mechanisms, significant differences were found (Kruskal-Wallis test,  $X^2 = 15.63$ , df = 5, P = 0.002, Table 1). The only significant difference found was between the impact on animals (predation), disease transmission and the impact on the ecosystem (Mann-Whitney pairwise test, Bonferroni corrected p values, P < 0.001). The impact on animals (predation), competition, and hybridisation were the most common mechanisms followed by the impact on plants and vegetation (herbivory), impact on ecosystems, and disease transmission

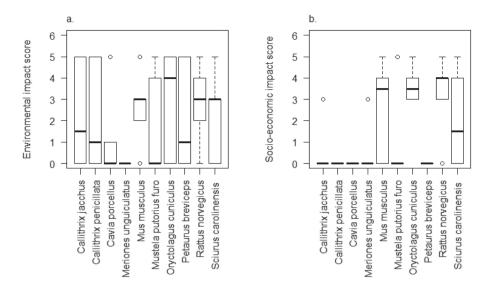
**Table 1.** The GISS scores of 10 non-native small mammal species sold in the South African pet trade. The sum of each impact category is given, and the total impact indicates the overall sum of environmental and socio-economic impacts for each species. Detailed scores for each species and literature used are available in the Suppl. material 2, Table S2. An asterisk indicates species established in South Africa (see Picker and Griffiths 2017, and Measey et al. 2020).

		Environmental impact						Socio-economic impact									
Species	Common names	Plants or vegetation (Herbivory)	Animals (Predation)	Competition	Diseases transmission	Hybridisation	Ecosystems	Overall environmental scores	Agricultural production	Animal production (Livestock)	Forestry production	Human Infrastructure	Human health	Human social life	Overall socio-economic scores	Overall GISS impact scores	Number of literature used
Callithrix jacchus	Common marmoset	0	3	5	0	5	0	13	0	0	0	0	3	0	3	16	10
Callithrix penicillata	Black tufted- ear marmoset	0	2	5	0	5	0	12	0	0	0	0	0	0	0	12	8
Cavia porcellus	Guinea pig	0	5	0	0	1	0	6	0	0	0	0	0	0	0	6	2
Meriones unguiculatus	Mongolian gerbil	0	0	0	0	0	0	0	3	0	0	0	0	0	3	3	2
Mus musculus*	House mouse	3	5	2	0	3	3	16	5	4	0	4	3	0	16	32	23
Mustela putorius furo	Domesticated ferret	0	5	0	0	4	0	9	0	5	0	0	0	0	5	14	9
Oryctolagus cuniculus*	European rabbit	4	5	5	0	0	4	18	5	4	4	3	3	3	22	40	23
Petaurus breviceps	Sugar glider	0	5	5	0	2	0	12	0	0	0	0	0	0	0	12	7
Rattus norvegicus*	Norwegian rat	3	5	3	0	0	4	15	4	4	0	5	4	3	20	35	20
Sciurus carolinensis*	Eastern grey squirrel	5	3	3	3	0	0	14	4	0	5	3	0	0	12	26	10
Overall score	s	15	38	28	3	20	11	115	21	17	9	15	13	6	81	196	106

(Table 1). For each impact mechanism, different species had maximum scores, i.e., plants and vegetation (herbivory) (eastern grey squirrel), animals (predation) (Guinea pig, house mouse, domesticated ferret, the European rabbit, sugar glider and Norwegian rat), competition (common marmoset, black tufted-ear marmoset, European rabbit and sugar glider) and hybridisation (common marmoset and black tufted-ear marmoset) (Table 1).

#### Socio-economic impacts mechanisms

All assessed non-native small mammal species (n = 10) had socio-economic impacts except for the black tufted-ear marmoset, the Guinea pig and the sugar glider (Table 1). No significant differences between the impact mechanisms were found (Kruskal-Wallis test,  $X^2 = 2.89$ , df = 5, P = 0.54, Table 1). However, the most often mentioned impact mechanism was on agricultural production with a summed score of 21 (Table 1). Different species had maximum scores for each impact mechanism, namely, agricultural produc-



**Figure 1.** Box-plot showing **a** environmental and **b** socio-economic impact scores for the10 non-native small mammals available in the South African pet trade. (Boxes shows the 25<sup>th</sup> and 75<sup>th</sup> percentiles and whiskers (values below and above 5 and 4.5 for environmental and socio-economic respectively were considered as outliers) indicate maximum range, interquartile range, median, and the minimum range).

tion (house mouse and European rabbit), animal production (livestock) (domesticated ferret), forest production (eastern grey squirrel) and human infrastructure (Norwegian rat) (Table 1). Four out of 10 species had impacts on human health, and the Norwegian rat had the highest impact (Table 1). Only the European rabbit and the Norwegian rat had an impact on human social life, and these species had similar impact scores (Table 1).

## Discussion

The non-native small mammals traded as pets and assessed in the present study had no significant differences between the overall environmental and socio-economic impact categories. However, a related study on feral mammal species by Hagen and Kumschick (2018) found a difference between environmental and socio-economic impacts where environmental impacts were significantly higher when compared with socio-economic impacts. An explanation for this difference could be that different domesticated non-native species were scored, and only three species were identical between the studies (Hagen and Kumschick 2018). Three species, the European rabbit, Norwegian rat, and house mouse were estimated to have the highest overall impact. Previous studies have also shown that these species have relatively high impacts in both environmental and socio-economic impact categories (Nentwig et al. 2010; Hagen and Kumschick 2018).

The environmental impacts of these three species with high scores were related to their impacts on other animals (predation) and competition, because they have caused the extinction of native species or generally compete with several species of high conservation concern. For example, the extinction of the Laysan crake Porzana palmeri in Hawaii has been linked to the introduction of Guinea pigs and European rabbits, and in Australia, rabbits outcompete the vulnerable rufous hare-wallaby Lagorchestes hirsutus for food and space (Lees and Bell 2008; Hume 2017). The house mouse and the Norwegian rat are associated with the reduction of native species and are also responsible for the extinction of several bird, insect and reptile species on different islands (Atkinson 1985; Marris 2000; Cuthbert and Hilton 2004; Zeppelini et al. 2007; Jones et al. 2008; Dagleish et al. 2017). These three species represent the most popular species in the South African pet trade industry (Maligana et al. 2020; Suppl. material 1, Table S1). In addition, the European rabbit is regarded as invasive on South African offshore islands, while the Norwegian rat and the house mouse are invasive on the mainland and offshore islands (Picker and Griffiths 2017; Measey et al. 2020). Consequently, these species may likely have higher impacts than other species scored in this study, given their establishment status in South Africa. There is also a lack of studies on the actual environmental and socio-economic impacts of these small mammals recorded in South Africa (Hagen and Kumschick 2018). It is also possible that most of the impacts reported elsewhere for these non-native mammals have already taken place in South Africa but are not yet documented. The results for the present study were different when compared with a study on non-native invertebrate pets in South Africa which found that popular species had minimal impacts (Nelufule et al. 2020). This difference may be explained by the fact that invertebrates are generally not well studied when compared with mammal species (Nentwig et al. 2010; Kumschick et al. 2015; Hagen and Kumschick 2019; Nelufule et al. 2020). Some popular mammal species in the pet trade, such as the sugar glider, have previously been reported to have relatively high potential ecological risk (da Rosa et al. 2018). This species can survive in the wild and has been reported to cause negative impacts on biodiversity by preving on the critically endangered swift parrot Lathamus discolor in Tasmania, Australia (Campbell et al. 2018). If this species is released from captivity, it can cause similar impacts in South Africa, as it is also popular in the pet trade, especially in the online trade (Suppl. material 1, Table S1).

The common marmoset and the black tufted-ear marmoset were the only species scoring high impacts through hybridisation. These two species have been reported to threaten the vulnerable populations of buffy-tufted marmosets *C. aurita* and Wied's marmosets *C. kuhlii* in Brazil (Nogueira et al. 2011; Cezar et al. 2017; Moraes et al. 2019). The hybrids of these two primates have been reported in the wild, and they are also fertile (Ruiz-Miranda et al. 2006; Oliveira and Grelle 2012; Malukiewicz et al. 2014). It is evident that these primates are a threat to populations of other marmosets in their introduced ranges. However, it is unlikely that these species will threaten the populations of other primates in South Africa as there are no native marmoset species. However, this does not suggest that these species will not cause impacts through other mechanisms as there is evidence of impacts on other animals through predation (Alexandrino et al. 2012). The only species which recorded maximum impact on forestry production and plants or vegetation (herbivory) in the present study was the eastern grey squirrel. This species scored a maximum potential impact because it has been reported to cause impacts to endangered plant species, and its impacts have also resulted in major economic losses. For example, Lawton et al. (2007) reported that economic damage caused by eastern grey squirrels to beech *Fagus sylvatica*, sycamore *Acer pseudoplatanus* and ash *Fraxinus excelsior* (listed as near threatened by IUCN, (Khela 2013)) woodlands in the UK was estimated to be ~£10 million (Williams et al. 2010; Merrick et al. 2016). This species has also been reported to damage *Populus × euroamericana* plantations (Signorile and Evans 2007). Given that this species thrives in the urban and commercial areas in South Africa, it is likely to cause impacts on forestry production, nut, fruit and vegetable crops, and also telecommunication cables (Measey et al. 2020).

Several non-native mammal species assessed in the present study are regarded as agricultural pests (Reid et al. 2007; Girling 2013). Therefore, the impact on agriculture was high when compared with other impact mechanisms. The species responsible for the maximum potential impact under this mechanism were the house mouse and the European rabbit. These species scored high because their impacts were mostly associated with major economic losses on agriculture, and also their eradication plans required the application of pesticides which are expensive and have negative impacts (Twigg et al. 2002; Williams et al. 2010; Haniza et al. 2015; Capizzi 2020; Mill et al. 2020). In developing countries, invasive rats and mice compete with humans for food (Stenseth et al. 2003), targeting various crops such as cereals, rice, palm oil, fruits, cocoa, and sugarcane, which results in a significant economic loss and affects food security (Tobin and Fall 2004; Varnham 2006). The United Nations reported that in 1982 rats and mice damaged ~42 million tons of food globally, worth ~US \$30 billion worldwide (Almeida et al. 2013). Even though there is lack of information on the impacts associated with non-native invasive rats and mice in South Africa, these species are likely to be causing socio-economic impacts. Studies in South Africa indicated that pesticides are used to control rats and mice in different households in urban areas (Balme et al. 2010; Rother 2012; Roomaney et al. 2012). This may suggest that these rodents may be problematic, but little attention has been given to the economic losses associated with control measures and other socio-economic impacts in general.

Domesticated ferrets were responsible for the highest impact through the animal production (livestock) mechanism. In New Zealand, they have been reported to host the *Bovine tuberculosis* disease that has been transmitted to livestock and threatens production of beef, dairy and venison markets (Ragg et al. 1995; Byrom 2002; de Lisle et al. 2008). Domesticated ferrets might also pose the risk of transmitting *B. tuberculosis* in South Africa, given that they are kept as pets and have become invasive after accidental escapes in New Zealand (Byrom 2002). The Norwegian rat had the highest score for infrastructural impact. Their damage to infrastructure includes gnawing of electric cables, burrowing, and contaminating water and food through droppings and urine (Johnson 2008; Garba et al. 2014; Panti-May et al. 2017). Their gnawing on communication cable and wires has further resulted in fires; as a result, repellents/rodenticides

are generally used to control them (Shumake et al. 2000). The Norwegian rat also had a high potential impact on human health in the present study because they carry pathogens that are transmittable and fatal to humans such as *Bartonella, Echinococcosis* and *Seoul* virus (Firth et al. 2014; Abdel-Moein and Hamza 2016). This rat has also been reported to bite humans, causing wounds which require medical attention (Donoso et al. 2004; Garba et al. 2014; Panti-May et al. 2017). It is possible that non-native invasive rats may threaten the health of humans in South Africa, given their wide distribution in the urban landscapes and having been found to carry zoonotic agents such as helminths, toxoplasmosis and leptospirosis (Taylor et al. 2008; Julius et al. 2018).

Only the European rabbit and the Norwegian rat had an impact on human social life, and these species had the same impact scores. Rabbit burrows cause damage to gardens and golf courses (Brown 2012). Norwegian rats also make damaging burrows, for example, in cities, especially under concrete sidewalks and in backyards (Sullivan 2004; van Adrichem et al. 2013). In South Africa, the Norwegian rat would likely cause severe human social life impacts when compared with the European rabbit given that it is distributed in urban areas and rabbits are present on the offshore islands only (Bastos et al. 2011; Julius et al. 2018; Measey et al. 2020). However, impacts associated with the European rabbit may be severe on the offshore islands where the species is known to reduce vegetation (Sherley 2016). Should species with high impacts be released or escape from captivity and establish feral populations, impacts reported in the present study may occur and results in reduction of biodiversity and economic loss during eradication and the repairing of damages caused.

### **Conclusions and recommendations**

The present study showed that several of the South African non-native small mammal pets that are traded and were assessed pose either potentially high environmental and/ or socio-economic impacts as documented in other countries. But of great concern are the following species: the European rabbit, the house mouse, the Norwegian rat and the eastern grey squirrel which have been reported as established in South Africa and its offshore islands (Picker and Griffiths 2017; Measey et al. 2020). The establishment of the European rabbit and the eastern grey squirrel in South Africa is associated with escapees from captivity (Measey et al. 2020). It is likely that these species are causing similar impacts in South Africa but unreported. We recommend that established species with high impacts should be prioritised for eradication and management. The trade for those species with significantly higher environmental and socio-economic impacts should be stopped and monitored, prioritised in policy development and regulations implemented so that their potential impacts in South Africa may be prevented. Regulations on the trade of non-native species exist, but these regulations are not implemented in many countries, and furthermore in South Africa, there is an increased demand for non-native pets and ongoing illegal trade (van Wilgen et al. 2008; Martin et al. 2018; Siriwat and Nijman 2018). To prevent impacts by non-native pet species, countries may need to document alien species traded, and do impact or risk assessments to identify invasive species, which may require management.

### Acknowledgements

We would like to thank the University of KwaZulu-Natal (ZA), the DSI-NRF Centre of Excellence for Invasion Biology, University of Stellenbosch (ZA) and the National Research Foundation (ZA) for funding. We gratefully acknowledge the Ford Wildlife Foundation (ZA) for vehicle support. We are grateful to the anonymous reviewers for their constructive comments which have improved the manuscript.

### References

- Abdel-Moein KA, Hamza DA (2016) Norway rat (*Rattus norvegicus*) as a potential reservoir for *Echinococcus granulosus*: a public health implication. Acta Parasitology 61: 815–9. https:// doi.org/10.1515/ap-2016-0113
- Alexandrino ER, Luz DT, Maggiorini EV, Ferraz KM (2012) Nest stolen: the first observation of nest predation by an invasive exotic marmoset (*Callithrix penicillata*) in an agricultural mosaic. Biota Neotropica 12: 211–215. https://doi.org/10.1590/S1676-06032012000200021
- Almeida A, Corrigan R, Sarno R (2013) The economic impact of commensal rodents on small businesses in Manhattan's Chinatown: trends and possible causes. Suburban Sustainability 1: 1–15. https://doi.org/10.5038/2164-0866.1.1.2
- Atkinson IAE (1985) The spread of commensal species of *Rattus* to oceanic islands and their effects on island avifaunas. In: Moors PJ (Eds) Conservation of island birds. International Council for Bird Preservation Technical Publication (Bristol): 35–81.
- Balme KH, Roberts JC, Glasstone M, Curling L, Rother HA, London L, Zar H, Mann MD (2010) Pesticide poisonings at a tertiary children's hospital in South Africa: an increasing problem. Clinical Toxicology 48: 928–934. https://doi.org/10.3109/15563650.2010.534482
- Bastos AD, Nair D, Taylor PJ, Brettschneider H, Kirsten F, Mostert E, Von Maltitz E, Lamb JM, Van Hooft P, Belmain SR, Contrafatto G (2011) Genetic monitoring detects an overlooked cryptic species and reveals the diversity and distribution of three invasive Rattus congeners in South Africa. BMC Genetics 12: 26. https://doi.org/10.1186/1471-2156-12-26
- Bomford M, Kraus F, Braysher M, Walter L, Brown L (2005) Risk assessment model for the import and keeping of exotic reptiles and amphibians. Bureau of Rural Sciences, Canberra.
- Brown A (2012) Glovebox guide for managing rabbits. PestSmart Toolkit publication. The Centre for Invasive Species Solutions, Canberra, ACT.
- Byrom AE (2002) Dispersal and survival of juvenile feral ferrets *Mustela furo* in New Zealand. Journal of Applied Ecology 39: 67–78. https://doi.org/10.1046/j.1365-2664.2002.00689.x
- Campbell CD, Sarre SD, Stojanovic D, Gruber B, Medlock K, Harris S, MacDonald AJ, Holleley CE (2018) When is a native species invasive? Incursion of a novel predatory marsupial detected using molecular and historical data. Diversity and Distribution 24: 831–840. https://doi.org/10.1111/ddi.12717
- Capizzi D (2020) A review of mammal eradications on Mediterranean islands. Mammal Review 50: 124–135. https://doi.org/10.1111/mam.12190

- Cezar AM, Pessôa LM, Bonvicino CR (2017) Morphological and genetic diversity in *Callithrix* hybrids in an anthropogenic area in southeastern Brazil (Primates: Cebidae: Callitrichinae). Zoologia 34: 1–9. https://doi.org/10.3897/zoologia.34.e14881
- Cuthbert R, Hilton G (2004) Introduced house mice *Mus musculus*: A significant predator of threatened and endemic birds on Gough Island, South Atlantic Ocean? Biological Conservation 117: 483–489. https://doi.org/10.1016/j.biocon.2003.08.007
- da Rosa CA, de Almeida Curi NH, Puertas F, Passamani M (2017) Alien terrestrial mammals in Brazil: current status and management. Biological Invasions 19: 2101–2123. https://doi. org/10.1007/s10530-017-1423-3
- da Rosa CA, Zenni R, Ziller SR, de Almeida Curi N, Passamani M (2018) Assessing the risk of invasion of species in the pet trade in Brazil. Perspective in Ecology and Conservation 16: 38–42. https://doi.org/10.1016/j.pecon.2017.09.005
- Dagleish MP, Ryan PG, Girling S, Bond AL (2017) Clinical pathology of the critically endangered Gough Bunting (*Rowettia goughensis*). Journal of Comparative Pathology 156: 264–274. https://doi.org/10.1016/j.jcpa.2017.01.002
- Davison A, Birks JDS, Griffiths HI, Kitchener AC, Biggins D, Butlin RK (1999) Hybridisation and the phylogenetic relationship between polecats and domestic ferrets in Britain. Biological Conservation 87: 155–161. https://doi.org/10.1016/S0006-3207(98)00067-6
- de Lisle GW, Kawakami RP, Yates GF, Collins DM (2008) Isolation of *Mycobacterium bovis* and other mycobacterial species from ferrets and stoats. Veterinary Microbilogy 132: 402–407. https://doi.org/10.1016/j.vetmic.2008.05.022
- Donoso A, Leon J, Rojas G, Ramírez M, Oberpaur B (2004) Hypovolaemic shock by rat bites. A paradigmatic case of social deprivation. Journal of Emergency Medicine 21: 640–641. https://doi.org/10.1136/emj.2003.004911
- Faulkner KT, Robertson MP, Rouget M, Wilson JR (2016) Understanding and managing the introduction pathways of alien taxa: South Africa as a case study. Biological Invasions 18: 73–87. https://doi.org/10.1007/s10530-015-0990-4
- Firth C, Bhat M, Firth MA, Williams SH, Frye MJ, Simmonds P, Conte JM, Ng J, Garcia J, Bhuva NP, Lee B (2014) Detection of zoonotic pathogens and characterisation of novel viruses carried by commensal *Rattus norvegicus* in New York City. mBio 5: e01933. https:// doi.org/10.1128/mBio.01933-14
- Fleming PJ, Croft JD, Nicol HI (2002) The impact of rabbits on a grazing system in eastern New South Wales. 2. Sheep production. Australian Journal of Experimental Agriculture 42: 917–23. https://doi.org/10.1071/EA01107
- Gaertner M, Irlich U, Visser V, Walker G, McLean P (2015) Cities invaded: feature. Quest 11: 48–50.
- Garba M, Kane M, Gagare S, Kadaoure I, Sidikou R, Rossi JP, Dobigny G (2014) Local perception of rodent-associated problems in Sahelian urban areas: A survey in Niamey, Niger. Urban Ecosystems 17: 573–84. https://doi.org/10.1007/s11252-013-0336-x
- Girling SJ (2013) Common diseases of small mammals, 2<sup>nd</sup> ed. Wiley Online Library: Hoboken, New Jersey, USA https://doi.org/10.1002/9781118782941.ch5
- Hagen BL, Kumschick S (2018) The relevance of using various scoring schemes revealed by an impact assessment of feral mammals. NeoBiota 38: 37–75. https://doi.org/10.3897/ neobiota.38.23509

- Haniza MZ, Adams S, Jones EP, MacNicoll A, Mallon EB, Smith RH, Lambert MS (2015) Large-scale structure of brown rat (*Rattus norvegicus*) populations in England: effects on rodenticide resistance. PeerJ 3: e1458 https://doi.org/10.7717/peerj.1458
- Hargreaves S (2007) *Salmonellosis* outbreak linked to domestic pet rodents. Lanc Infec Diseases 7: 88. https://doi.org/10.1016/S1473-3099(07)70013-0
- Hart LA, Downs CT (2014) Public surveys of rose-ringed parakeets, *Psittacula krameri*, in the Durban Metropolitan area, South Africa. African Zoology 49: 283–289. https://doi.org/1 0.1080/15627020.2014.11407644
- Heinsohn R, Webb M, Lacy R, Terauds A, Alderman R, Stojanovic D (2015) A severe predator-induced population decline predicted for endangered, migratory swift parrots (*Lathamus discolor*). Biological Conservation 186: 75–82. https://doi.org/10.1016/j.biocon.2015.03.006
- Hulme PE (2009) Trade, transport and trouble: managing invasive species pathways in an era of globalisation. Journal of Applied Ecology 46:10–18. https://doi.org/10.1111/j.1365-2664.2008.01600.x
- Hume JP (2017) Undescribed juvenile plumages of the Laysan rail or crake (*Zapornia palmeri*: Frohawk, 1892) and a detailed chronology of its extinction. Wilson Journal of Ornithology 129: 429–445. https://doi.org/10.1676/16-159.1
- Huynh HM, Williams GR, McAlpine DF, Thorington RW (2010) Establishment of the eastern gray squirrel (*Sciurus carolinensis*) in Nova Scotia, Canada. Northeastern Naturalist 17: 673–677. https://doi.org/10.1656/045.017.0414
- Jeschke JM, Bacher S, Blackburn TM, Dick JT, Essl F, Evans T, Gaertner M, Hulme PE, Kühn I, Mrugała A, Pergl J (2014) Defining the impact of non-native species. Conservation Biology 28: 1188–1194. https://doi.org/10.1111/cobi.12299
- Johnson T (2008) Rat control for Alaska waterfront facilities. Alaska sea grant college program, University of Alaska Fairbanks, 1–106. https://doi.org/10.4027/rcawf.2008
- Jones HP, Tershy BR, Zavaleta ES, Croll DA, Keitt BS, Finkelstein ME, Howald GR (2008) Severity of the effects of invasive rats on seabirds: A global review. Conservation Biology 22: 16–26. https://doi.org/10.1111/j.1523-1739.2007.00859.x
- Julius RS, Schwan EV, Chimimba CT (2018) Molecular characterisation of cosmopolitan and potentially co-invasive helminths of commensal, murid rodents in Gauteng Province, South Africa. Parasitology Research 117: 1729–1736. https://doi.org/10.1007/s00436-018-5852-4
- Keller RP, Lodge DM (2007) Species invasions from commerce in live aquatic organisms: problems and possible solutions. BioScience 57: 428–436. https://doi.org/10.1641/B570509
- Keller RP, Geist J, Jeschke JM, Kühn I (2011) Invasive species in Europe: ecology, status, and policy. Environmental Sciences Europe 23: 23. https://doi.org/10.1186/2190-4715-23-23
- Khela S (2013) *Fraxinus excelsior*. The IUCN Red List of Threatened Species 2013: e.T203367A2764403.
- Kotait I, Oliveira RDN, Carrieri ML, Castilho JG, Macedo CI, Pereira PMC, Boere V, Montebello L, Rupprecht CE (2019) Non-human primates as a reservoir for rabies virus in Brazil. Zoonosis and Public Health 66: 47–59. https://doi.org/10.1111/zph.12527
- Kumschick S, Nentwig W (2010) Some alien birds have as severe an impact as the most effectual alien mammals in Europe. Biological conservation 143: 2757–2762. https://doi. org/10.1016/j.biocon.2010.07.023

- Kumschick S, Bacher S, Evans T, Marková Z, Pergl J, Pyšek P, Vaes-Petignat S, van der Veer G, Vilá M, Nentwig W (2015) Comparing impacts of alien plants and animals in Europe using a standard scoring system. Journal of Applied Ecology 52: 552–561. https://doi. org/10.1111/1365-2664.12427
- Lawton C, Rochford J (2007) The recovery of grey squirrel (*Sciurus carolinensis*) populations after intensive control programmes. Biological Environment: Proceeding of the Royal Irish Academy 107B: 19–29. https://doi.org/10.3318/BIOE.2007.107.1.19
- Lees AC, Bell DJ (2008) A conservation paradox for the 21st century: The European wild rabbit *Oryctolagus cuniculus*, an invasive alien and an endangered native species. Mammal Review 38: 304–320. https://doi.org/10.1111/j.1365-2907.2008.00116.x
- Lockwood JL, Welbourne DJ, Romagosa CM, Cassey P, Mandrak NE, Strecker A, Leung B, Stringham OC, Udell B, Episcopio-Sturgeon DJ, Tlusty MF (2019) When pets become pests: The role of the exotic pet trade in producing invasive vertebrate animals. Frontiers in Ecology and Environment 6: 323–330. https://doi.org/10.1002/fee.2059
- Maligana N, Julius RS, Shivambu TC, Chimimba CT (2020) Genetic identification of freely-traded synanthropic invasive murid rodents in pet shops in Gauteng Province, South Africa. African Zoology 55: 149–154. https://doi.org/10.1080/15627020.2019.1704632
- Malukiewicz J, Boere V, Fuzessy LF, Grativol AD, French JA, Silva IDOE, Pereira LC, Ruiz-Miranda CR, Valenca YM, Stone AC (2014) Hybridisation effects and genetic diversity of the common and black-tufted marmoset (*Callithrix jacchus* and *Callithrix penicillata*) mitochondrial control region. American Journal of Physical Anthropology 155: 522–536. https://doi.org/10.1002/ajpa.22605
- Marbuah G, Gren IM, McKie B (2014) Economics of harmful invasive species: A review. Diversity 6: 500–523. https://doi.org/10.3390/d6030500
- Marris JWM (2000) The beetle (Coleoptera) fauna of the Antipodes Islands, with comments on the impact of mice; and an annotated checklist of the insect and arachnid fauna. Journal of Royal Society of New Zealand 30: 169–195. https://doi.org/10.1080/03014223.2000 .9517616
- Martin RO, Senni C, D'Cruze NC (2018) Trade in wild-sourced African grey parrots: Insights via social media. Global Ecology and Conservation 15: e00429. https://doi.org/10.1016/j. gecco.2018.e00429
- McNeely JA (2006) As the world gets smaller, the chances of invasion grow. Euphytica 148: 5–15. https://doi.org/10.1007/s10681-006-5937-5
- Merrick MJ, Evans KL, Bertolino SA (2016) Urban grey squirrel ecology, associated impacts and management challenges. The Grey Squirrel: Ecology Management of an Invasive Species in Europe. 57–77.
- Measey J, Hui C, Somers MJ (2020) Terrestrial vertebrate invasions in South Africa. In: van Wilgen B, Measey J, Richardson D, Wilson J, Zengeya T (Eds) Biological invasions in South Africa. Invading Nature - Springer Series in Invasion Ecology (Switzerland):115–151. https://doi.org/10.1007/978-3-030-32394-3\_5
- Mill AC, Crowley SL, Lambin X, Mckinney C, Maggs G, Robertson P, Robinson NJ, Ward AL, Marzano M (2020) The challenges of long-term invasive mammal management: lessons from the UK. Mammal Review 50: 136–146. https://doi.org/10.1111/mam.12186

- Moraes AM, Vancine MH, Moraes AM, de Oliveira Cordeiro CL, Pinto MP, Lima AA, Culot L, Silva TSF, Collevatti RG, Ribeiro MC, Sobral-Souza T (2019) Predicting the potential hybridisation zones between native and invasive marmosets within Neotropical biodiversity hotspots. Global Ecology and Biogeography 20: e00706. https://doi.org/10.1016/j. gecco.2019.e00706
- Nentwig W, Kühnel E, Bacher S (2010) A generic impact-scoring system applied to alien mammals in Europe. Conservation Biology 24: 302–311. https://doi.org/10.1111/j.1523-1739.2009.01289.x
- Nelufule T, Robertson MP, Wilson JR, Faulkner KT, Sole C, Kumschick S (2020) The threats posed by the pet trade in alien terrestrial invertebrates in South Africa. Journal for Nature Conservation 24:125831. https://doi.org/10.1016/j.jnc.2020.125831
- Ng TH, Tan SK, Wong WH, Meier R, Chan SY, Tan HH, Yeo DC (2016) Molluscs for sale: assessment of freshwater gastropods and bivalves in the ornamental pet trade. PLoS One 11: e0161130. https://doi.org/10.1371/journal.pone.0161130
- Nogueira DM, Ferreira AMR, Goldschmidt B, Pissinatti A, Carelli JB, Verona CE (2011) Cytogenetic study in natural hybrids of *Callithrix* (Callitrichidae: Primates) in the Atlantic forest of the state of Rio de Janeiro, Brazil. Iheringia. Série Zoologia 101: 156–160. https:// doi.org/10.1590/S0073-47212011000200002
- Novoa A, Kumschick S, Richardson DM, Rouget M, Wilson JR (2016) Native range size and growth form in Cactaceae predict invasiveness and impact. NeoBiota 33: 75–90. https:// doi.org/10.3897/neobiota.30.7253
- Nunes AL, Zengeya TA, Hoffman AC, Measey GJ, Weyl OL (2017) Distribution and establishment of the alien Australian redclaw crayfish, *Cherax quadricarinatus*, in South Africa and Swaziland. PeerJ 5: e3135. https://doi.org/10.7717/peerj.3135
- Oliveira LC, Grelle CE (2012) Introduced primate species of an Atlantic Forest region in Brazil: present and future implications for the native fauna. Tropical Conservation Science 5: 112–120. https://doi.org/10.1177/194008291200500110
- Padilla DK, Williams SL (2004) Beyond ballast water: aquarium and ornamental trades as sources of invasive species in aquatic ecosystems. Frontiers in Ecology and the Environment 2:131–138. https://doi.org/10.1890/1540-9295(2004)002[0131:BBWAAO]2.0.CO;2
- Panti-May JA, Sodá-Tamayo L, Gamboa-Tec N, Cetina-Franco R, Cigarroa-Toledo N, Machaín-Williams C, del Rosario Robles M, Hernández-Betancourt SF (2017) Perceptions of rodent-associated problems: an experience in urban and rural areas of Yucatan, Mexico. Urban Ecosystems 20: 983–988. https://doi.org/10.1007/s11252-017-0651-8
- Patoka J, Kalous L, Kopecký O (2014) Risk assessment of the crayfish pet trade based on data from the Czech Republic. Biological Invasions 16: 2489–2494. https://doi.org/10.1007/ s10530-014-0682-5
- Picker MD, Griffiths CL (2017) Alien animals in South Africa-composition, introduction history, origins and distribution patterns. Bothalia 47: a2147. https://doi.org/10.4102/abc.v47i2.2147
- R Core Team (2018) R: a language and environment for statistical computing. R Foundation for Statistical Computing, Vienna. https://www.R-project.org/
- Ragg JR, Moller H, Waldrup KA (1995) The prevalence of bovine tuberculosis (*Mycobacterium bovis*) infections in feral populations of cats (*Felis cutus*), ferrets (*Mustela furo*) and stoats

(*Mustela erminea*) in Otago and Southland, New Zealand. New Zealand Veterinary Journal 43: 333–337. https://doi.org/10.1080/00480169./1995.35915

- Reid N, McDonald RA, Montgomery WI (2007) Mammals and agri-environment schemes: hare haven or pest paradise? Journal of Applied Ecology 44: 1200–1208. https://doi. org/10.1111/j.1365-2664.2007.01336.x
- Rother HA (2012) Improving poisoning diagnosis and surveillance of street pesticides. South African Medical Journal 102: 485–488. https://doi.org/10.7196/SAMJ.5838
- Roomaney R, Ehrlich R, Rother HA (2012) The acceptability of rat trap use over pesticides for rodent control in two poor urban communities in South Africa. Environmental Health 11: 32. https://doi.org/10.1186/1476-069X-11-32
- Ruiz-Miranda CR, Affonso AG, Morais MMD, Verona CE, Martins A, Beck BB (2006) Behavioral and ecological interactions between reintroduced golden lion tamarins (*Leontopithecus rosalia* Linnaeus, 1766) and introduced marmosets (*Callithrix* spp, Linnaeus, 1758) in Brazil's Atlantic Coast forest fragments. Brazilian Archives of Biology and Technology 49: 99–109. https://doi.org/10.1590/S1516-89132006000100012
- Shivambu TC, Shivambu N, Downs CT (2020) Impact assessment of seven alien invasive bird species already introduced to South Africa. Biological Invasions 22 1829–1847. https:// doi.org/10.1007/s10530-020-02221-9
- Sherley RB (2016) Unusual foraging behaviour of two introduced mammals following degradation of their island habitat. Biodiversity Observations 7: 21–10.
- Shumake SA, Sterner RT, Gaddis SE (2000) Repellents to reduce cable gnawing by wild Norway rats. Journal of Wildlife Management 64: 1009–1013. https://doi. org/10.2307/3803211
- Signorile AL, Evans J (2007) Damage caused by the American grey squirrel (*Sciurus carolinen-sis*) to agricultural crops, poplar plantations and semi-natural woodland in Piedmont, Italy. Forestry 80: 89–98. https://doi.org/10.1093/forestry/cpl044
- Siriwat P, Nijman V (2018) Illegal pet trade on social media as an emerging impediment to the conservation of Asian otter species. Journal of Asia-Pacific Biodiversity 11: 469–475. https://doi.org/10.1016/j.japb.2018.09.004
- Stenseth NC, Leirs H, Skonhoft A, Davis SA, Pech RP, Andreassen HP, Singleton GR, Lima M, Machang'u RS, Makundi RH, Zhang Z (2003) Mice, rats, and people: the bio-economics of agricultural rodent pests. Frontiers of Ecology and Environment 7: 367–75. https://doi. org/10.1890/1540-9295(2003)001[0367:MRAPTB]2.0.CO;2
- Su S, Cassey P, Vall-Llosera M, Blackburn TM (2015) Going cheap: determinants of bird price in the Taiwanese pet market. PLoS One 10: e0127482. https://doi.org/10.1371/journal. pone.0127482
- Sullivan R (2004) Rats: Observations on the history and habitat of the city's most unwanted inhabitants. New York: Bloomsbury USA.
- Taylor PJ, Arntzen L, Hayter M, Iles M, Frean J, Belmain S (2008) Understanding and managing sanitary risks due to rodent zoonoses in an African city: beyond the Boston Model. Integrative Zoology 3: 38–50. https://doi.org/10.1111/j.1749-4877.2008.00072.x

- Tobin ME, Fall MW (2004) Pest control: Rodents. USDA National Wildlife Research Center - staff publications paper No.67. Lincoln: University of Nebraska. 1–21.
- Twigg LE, Martin GR, Lowe TJ (2002) Evidence of pesticide resistance in medium-sized mammalian pests: A case study with 1080 poison and Australian rabbits. Journal of Applied Ecology 39: 549–560. https://doi.org/10.1046/j.1365-2664.2002.00738.x
- Vaes-Petignat S, Nentwig W (2014) Environmental and economic impact of alien terrestrial arthropods in Europe. NeoBiota 22: 23–42. https://doi.org/10.3897/neobiota.22.6620
- van Adrichem MH, Buijs JA, Goedhart PW, Verboom J (2013) Factors influencing the density of the brown rat (*Rattus norvegicus*) in and around houses in Amsterdam. Lutra 56: 77–91.
- van der Veer G, Nentwig W (2015) Environmental and economic impact assessment of alien and invasive fish species in Europe using the generic impact scoring system. Ecology and Freshwater Fish 24: 646–656. https://doi.org/10.1111/eff.12181
- van Wilgen NJ, Richardson DM, Baard EH (2008) Alien reptiles and amphibians in South Africa: towards a pragmatic management strategy. South African Journal of Science 104: 13–20.
- Varnham K (2006) Non-native species in UK overseas territories: a review. Joint Nature Conservation Committee Report Series No.372. ISSN.
- Weiperth A, Gál B, Kuříková P, Langrová I, Kouba A (2019) Risk assessment of pet-traded decapod crustaceans in Hungary with evidence of *Cherax quadricarinatus* (von Martens, 1868) in the wild. North West Journal of Zoology 5: 42–47.
- Williams F, Eschen R, Harris A, Djeddour D, Pratt C, Shaw RS, Varia S, Lamontagne-Godwin J, Thomas SE, Murphy ST (2010) The economic cost of invasive non-native species on Great Britain. CABI report: 1–199.
- Zeppelini D, Mascarenhas R, Meier GG (2007) Rat eradication as part of a Hawksbill turtle (*Eretmochelys imbricata*) conservation program in an urban area in Cabedelo, Paraiba State, Brazil. Marine Turtle Newsletter 117: 5–7.

## Supplementary material I

#### Table S1

Authors: Ndivhuwo Shivambu, Tinyiko C. Shivambu, Colleen T. Downs

Data type: pet trade data

Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.52871.suppl1

## Supplementary material 2

## Table S2

Authors: Ndivhuwo Shivambu, Tinyiko C. Shivambu, Colleen T. Downs

Data type: impact assessment detailed scores

- Explanation note: Assessment of non-native mammalian species sold in the pet trade in South Africa.
- Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.52871.suppl2

LETTER TO THE EDITOR



# Please don't mow the Japanese knotweed!

Daniel Jones<sup>1,2</sup>, Mike S. Fowler<sup>1</sup>, Sophie Hocking<sup>1</sup>, Daniel Eastwood<sup>1</sup>

**I** Department of Biosciences, Swansea University, Singleton Park, Swansea, SA2 8PP, UK **2** Advanced Invasives Ltd., Institute of Life Science 2, Swansea University, Singleton Park, SA2 8PP, UK

Corresponding author: Daniel Jones (daniel.ll.jones@gmail.com)

Academic editor: Ingolf Kühn   Received 27 July 2020   Accepted 27 July 2020   Published 12 August 2020
Citation: Jones D, Fowler MS, Hocking S, Eastwood D (2020) Please don't mow the Japanese knotweed!. NeoBiota
60: 19–23 https://doi.org/10.3897/neobiota.60.56935

We welcome Martin et al.'s (2020) significant contributions toward advancing understanding of *Reynoutria japonica* var. *japonica* (Japanese knotweed) clonal growth strategies and resource allocation in response to environmental heterogeneity; understanding knotweed ecophysiology is essential to inform and enhance large-scale invasive knotweed management. However, we strongly disagree that mowing should be recommended for the landscape management of invasive knotweeds on the grounds of limited efficacy, practicality and environmental and economic sustainability. To achieve the successful control and long-term management of invasive rhizome-forming plants, we should do more with less, as the evidence guides us (Jones et al. 2018).

## **Invasive Knotweed Management**

As Martin et al. (2020) state, Japanese knotweed is very difficult to control (Child 1999; Skibo 2007; Delbart et al. 2012; Jones et al. 2018). Mature invasive knotweeds (Japanese knotweed *s.l.* taxa) are physically large plants (above and belowground biomass regularly exceeds several kilograms per m<sup>2</sup>, respectively) with extensive belowground growth (several metres in diameter and depth; Fennell et al. 2018; Jones et al. 2018). Depth and extent of belowground biomass affect management strategy by enabling the plant to recover from many physical, herbicide-based and integrated control treatments, even when applied over relatively long time periods (>3 years; Jones et al. 2018).

While we acknowledge that mowing is a widely applied vegetation management method for infrastructure maintenance, cutting as a management method for established invasive knotweeds has been reported as ineffective in the medium to long-term at a range of spatial scales throughout the academic and grey literature in Europe and North America (Seiger 1997; Brabec and Pyšek 2000; Child and Wade 2000; Green 2003; CEH 2004; Soll 2004; Gover et al. 2005; Kabat et al. 2006; Rennocks 2007; Skibo 2007; Bashtanova et al. 2009; Macfarlane 2011; Delbart et al. 2012), though native species diversity may increase during active management (Adler 1993; Hartwig and Kiviat 2009).

Historically, where cutting was proposed as a management method in the UK and North America, it was suggested that Japanese knotweed stems were cut down to ground level at least every 2 to 3 weeks through the growing season to deplete belowground rhizomes (Child and Wade 2000; McHugh 2006; EA 2013). Yet, to our knowledge, there are no examples of successful long-term invasive knotweed management using this treatment programme, despite the application of approximately 20 cuts per year. While the 3 cuts per year proposed by Martin et al. is more economically sustainable than 20 applications, if the more intensive programme has not demonstrated efficacy at the field scale, it would seem unlikely that 3 cuts per year will deplete the rhizome sufficiently to achieve short-term control, let alone effective long-term management. Hujerová et al. (2013) and Van Evert et al. (2020) reported that aboveground cutting of taproot-forming Rumex spp. (Docks; also members of the Polygonaceae) three times per year did not eliminate these species from grassland, or result in plant death. This is despite Docks being smaller and less vigorous than any of the invasive knotweeds. Consequently, on the grounds of treatment efficacy alone, we do not recommend mowing as an effective management method for Japanese knotweed.

Aside from limited efficacy, consideration of practicality and the risk of further spread of Japanese knotweed in the environment should inform the application of mowing. Accessing large swathes of invaded riparian or roadside habitat with heavy equipment is frequently problematic, and it is crucial to ensure that stem and rhizome fragments created by cutting methods do not result in wider dispersal of knotweed into the environment (Sieger 1997; Child and Wade 2000; Soll 2004; McHugh 2006; Skibo 2007; Bashtanova et al. 2009; Macfarlane 2011; Delbart et al. 2012; EA 2013, Jones 2015). Minimising dispersal at the landscape scale is unfeasible, considering that leaf (Brabec 1997), stem (De Waal 2001) and rhizome fragments (weighing as little as 0.06 g; McFarlane 2011) may give rise to new plants. Further, Scott (1988), Beerling (1990) and Beerling et al. (1994) highlight direct lateral expansion of rhizome in response to cutting, exacerbating local spread. Causing the dispersal and/or exacerbating the spread of invasive knotweeds in the UK may be in contravention of national biodiversity legislation (e.g. The Wildlife and Countryside Act 1981, UK).

#### Parsimony as a principle for invasive plant management

There are strong environmental, ecological and economic arguments for the management of invasive alien plants (IAPs) to minimise their negative environmental and economic impacts (Pergl et al. 2020). However, limited empirical evidence underpinning the ecology and management of rhizome-forming invasive plants can lead to the application of ineffective and labour-intensive physical control treatments, and/or unnecessary/excessive herbicide use. This undermines the sustainability of long-term control programmes for these species, resulting in further spread and dispersal in the environment with no discernible management benefit (i.e. *'the cure is worse than the disease*'; Kettenring and Adams 2011; Jones et al. 2018; Jones and Eastwood 2019).

In short, to achieve the successful control and long-term management of invasive rhizome-forming plants, we should do more with less, as the evidence guides us (Jones et al. 2018). While we welcome Martin et al.'s significant contributions toward advancing understanding of Japanese knotweed belowground, in particular clonal growth strategies and resource allocation in response to environmental heterogeneity, we strongly disagree that mowing should be recommended for the landscape management of invasive knotweeds on the grounds of limited efficacy, practicality and environmental and economic sustainability.

## Acknowledgements

This work is part-funded by the European Social Fund (ESF) through the European Union's Convergence programme administered by the Welsh Government with Swansea University and Complete Weed Control Ltd.

### References

- Adler C (1993) Growth and dispersal strategies and associations of the neophyte *Polygonum cuspidatum* with special regard to mowing. Tuexenia 13: 373–97.
- Bashtanova UB, Beckett KP, Flowers TJ (2009). Review: Physiological Approaches to the Improvement of Chemical Control of Japanese Knotweed (*Fallopia japonica*). Weed Sci. 57: 584–592. https://doi.org/10.1614/WS-09-069.1
- Beerling DJ (1990) The ecology and control of Japanese knotweed (Reynoutria japonica Houtt.) and Himalayan balsam (*Impatiens glandulifera* Royle) on river banks in South Wales. PhD thesis, University of Wales, Cardiff, UK
- Beerling DJ, Bailey JP, Conolly AP (1994) Fallopia japonica (Houtt.) Ronse Decraene. J Ecol. 82: 959–979. https://doi.org/10.2307/2261459
- Brabec J (1997) Experimental study of the effect of management on invasion of selected plant pieces into meadow communities. PhD Thesis, Charles University, Prague, Czech Republic

- Centre for Ecology & Hydrology (CEH) (2004) Information Sheet 5: Japanese Knotweed. Centre for Aquatic Plant Management (CAMP) www.capm.org.uk [Accessed 21 March 2012]
- Child L (1999) Vegetative Regeneration and Distribution of *Fallopia japonica* and *Fallopia × bohemica*: Implications for Control and Management. PhD Thesis, Loughborough University, Loughborough, UK
- Child L, Wade M (2000) The Japanese Knotweed Manual: The Management and Control of an Invasive Weed. DPS Partnership Ltd, Burgess Hill
- Delbart E, Mahy G, Weickmans B, Henriet F, Crémer S, Pieret N, Vanderhoeven S, Monty A (2012) Can Land Managers Control Japanese Knotweed? Lessons from Control Tests in Belgium. Environ Manage 50: 1089–1097. https://doi.org/10.1007/s00267-012-9945-z
- De Waal LC (2001) A viability study of *Fallopia japonica* stem tissue. Weed Res. 40: 447–460. https://doi.org/10.1046/j.1365-3180.2001.00249.x
- Environment Agency (EA) (2013) Managing Japanese Knotweed on Development Sites: The Knotweed Code of Practice. Environment Agency, Bristol
- Fennell M, Wade M, Bacon KL (2018) Japanese knotweed (*Fallopia japonica*): an analysis of capacity to cause structural damage (compared to other plants) and typical rhizome extension. PeerJ 6:e5246. https://doi.org/10.7717/peerj.5246
- Gover A (2005) Managing Japanese knotweed and giant knotweed on roadsides, Factsheet 5a. Penn State, Department of Horticulture, College of Agricultural Sciences, Roadside Research Project
- Green S (2003) A review of the potential for the use of bioherbicides to control forest weeds in the UK. Forestry 76: 285–297. https://doi.org/10.1093/forestry/76.3.285
- Hartwig T, Kiviat E (2009) Experimental Management of Japanese Knotweed (*Fallopia japonica*) on the Batavia Kill, Greene County, New York. Hudsonia Report to Greene County Soil and Water Conservation District & New York City Department of Environmental Protection
- Hujerová R, Pavlů V, Hejcman M, Pavlů L, Gaisler J (2013) Effect of cutting frequency on above- and belowground biomass production of *Rumex alpinus*, *R. crispus*, *R. obtusifolius* and the *Rumex* hybrid (*R. patienta* × *R. tianschanicus*) in the seeding year. Weed Res. 53: 378–386. https://doi.org/10.1111/wre.12037
- Jones D (2015) Japanese Knotweed *s.l.* Taxa and Introduced *Petasites* Species: Biosystematics, Ecology and Control. PhD Thesis, Swansea University, Swansea (UK)
- Jones D, Bruce G, Fowler MS, Law-Cooper R, Graham I, Abel A, Street-Perrott FA, Eastwood D (2018) Optimising physiochemical control of invasive Japanese knotweed. Biol. Invasions 20: 2091–2105. https://doi.org/10.1007/s10530-018-1684-5
- Jones D, Eastwood D (2019) Sustainable Control of Invasive Japanese Knotweed. Outlooks on Pest Management 30: 195–200. https://doi.org/10.1564/v30\_oct\_02
- Kabat TJ, Stewart GB, Pullin AS (2006) Are Japanese knotweed (*Fallopia japonica*) control and eradication interventions effective? Centre for Evidence-Based Conservation (CEBC) Systematic Review No. 21
- Kettenring KM, Adams CR (2011) Lessons learned from invasive plant control experiments: a systematic review and meta-analysis. J App Ecol 48: 970–979. https://doi.org/10.1111/ j.1365-2664.2011.01979.x

- Macfarlane J (2011) Development of strategies for the control and eradication of Japaneseknotweed. PhD Thesis, University of Exeter, Exeter (UK)
- Martin F-M, Dommanget F, Lavallée F, Evette A (2020) Clonal growth strategies of *Reynoutria japonica* in response to light, shade, and mowing, and perspectives for management. Neo-Biota 56: 89–110. https://doi.org/10.3897/neobiota.56.47511
- McHugh JM (2006) A review of literature and field practices focused on the management and control of invasive knotweed (*Polygonum cuspidatum*, *P. sachalinense*, *P. polystachyum* and hybrids). The Nature Conservancy, Southern Lake Champlain Valley Program, West Haven, VT. http://www.invasive.org/gist/moredocs/polspp02.pdf [Accessed 07 November 2009]
- Pergl J, Härtel H, Pyšek P, Stejskal R (2020) Don't throw the baby out with the bathwater ban of glyphosate use depends on context. NeoBiota 56: 27–29. https://doi.org/10.3897/ neobiota.56.51823
- Rennocks L (2007) Knotweed Control: Implications for Biodiversity and Economic Regeneration in Cornwall. Duchy College, Rosewarne. http://www.cornwall.gov.uk/default. aspx?page=19740 [Accessed 15 February 2012]
- Scott R (1988) A Review of Japanese Knotweed Control. NCC/NERC contract report, Cumbria
- Seiger LA (1997) The Status of Fallopia japonica (Reynoutria Japonica; Polygonum cuspidatum) In North America from Plant Invasions: Studies from North America and Europe. Edited by Brock JH, Wade M, Pysek P, Green D. Backhuys Publishers, Leiden
- Skibo A (2007) The Evaluation of Selected 'POST'-Applied Herbicides for Control of Japanese Knotweed (*Polygonum cuspidatum* syn. *Fallopia japonica* syn. Reynoutria japonica) and a Survey and Characterization of this Invasive Species in Delaware. PhD Thesis, University of Delaware, Delaware (US)
- Soll J (2004) Controlling Knotweed (*Polygonum cuspidatum*, *P. sachalinense*, *P. polystachyum* and hybrids) in the Pacific Northwest. The Nature Conservancy, Oregon Field Office. http://www.invasive.org/gist/moredocs/polspp01.pdf [Accessed 03 September 2010]
- Van Evert FK, Cockburn M, Beniers JE, Latsch R (2020) Weekly defoliation controls, but does not kill broad-leaved dock (*Rumex obtusifolius*). Weed Res. 60: 161–170. https://doi. org/10.1111/wre.12407

A peer-reviewed open-access journal

# Multi-taxa inventory of naturalized species in Chile

Nicol Fuentes<sup>1</sup>, Alicia Marticorena<sup>1</sup>, Alfredo Saldaña<sup>1</sup>, Viviane Jerez<sup>2</sup>, Juan Carlos Ortiz<sup>2</sup>, Pedro Victoriano<sup>2</sup>, Rodrigo A. Moreno<sup>3,4</sup>, Juan Larraín<sup>5</sup>, Cristobal Villaseñor-Parada<sup>6,7</sup>, Götz Palfner<sup>1</sup>, Paulina Sánchez<sup>6,8</sup>, Aníbal Pauchard<sup>6,8</sup>

I Departamento de Botánica, Facultad de Ciencias Naturales y Oceanográficas, Universidad de Concepción, Chile 2 Departamento de Zoología, Facultad de Ciencias Naturales y Oceanográficas, Universidad de Concepción, Chile 3 Facultad de Ciencias, Universidad Santo Tomás, Av. Ejército 146, Santiago, Chile 4 Centro de Investigación e Innovación para el Cambio Climático (CIICC), Universidad Santo Tomás, Av. Ejército 146, Santiago, Chile 5 Instituto de Biología, Pontificia Universidad Católica de Valparaíso, Campus Curauma, Av. Universidad 330, Valparaíso, Chile 6 Laboratorio de Invasiones Biológicas (LIB), Facultad de Ciencias Forestales, Universidad de Concepción, Chile 7 Laboratorio de Estudios Algales (ALGALAB), Departamento de Oceanografía, Facultad de Ciencias Naturales y Oceanográficas, Universidad de Concepción, Chile 8 Instituto de Ecología y Biodiversidad (IEB), Santiago, Chile

Corresponding author: Nicol Fuentes (nfuentes@udec.cl)

Academic editor: Marcel Rejmanek | Received 12 June 2020 | Accepted 27 July 2020 | Published 12 August 2020

**Citation:** Fuentes N, Marticorena A, Saldaña A, Jerez V, Ortiz JC, Victoriano P, Moreno RA, Larraín J, Villaseñor-Parada C, Palfner G, Sánchez P, Pauchard A (2020) Multi-taxa inventory of naturalized species in Chile. NeoBiota 60: 25–41. https://doi.org/10.3897/neobiota.60.55366

#### Abstract

Here we present a multi-taxa inventory of naturalized alien species recorded on continental Chile and adjacent marine habitats, including eight taxonomic groups. We identified 1,122 species. These comprise 790 vascular plants (terrestrial and aquatic); 31 nonvascular plants [Bryophyta (mosses), Marchantiophyta (liverworts) and Anthocerotophyta (hornworts)]; 18 marine and freshwater macro and micro algae; 71 fungi; 39 terrestrial vertebrates (amphibians, reptiles, mammals and birds); 108 insects; 37 marine and freshwater invertebrates and vertebrates (6 polychaetes, 3 mollusks and 28 Pisces); and 28 terrestrial gas-tropods. For all taxonomic groups, naturalized species were found to mainly be distributed in regions with Mediterranean and temperate climates, with few at either extreme of the country. The invasion curves show that naturalized species first underwent a positive increment, followed by an apparent plateau phase,

mainly in vascular plants, insects and vertebrates. In fungi, marine and freshwater macro and microalgae, vertebrates and invertebrates, the cumulative number of naturalized species increased sharply starting in the early 20<sup>th</sup> century; the lack of collections before 1900 is also evident. When considering naturalized species as a whole, this inventory highlights that the rate of new naturalizations consistently increased after 1950, especially for some taxonomic groups such as insects, fungi, and vascular plants. This multi-taxa inventory of naturalized species provides a platform for national reporting on biodiversity indicators and highlights areas where Chile must invest resources to manage biological invasions.

#### **Keywords**

alien species, Chile, database, invasion periods, rate of introduction

## Introduction

Inventories of naturalized alien species are not only fundamental to elucidate the causes and consequences of the invasion phenomenon (Mack et al. 2000; Pimentel et al. 2005; van Kleunen et al. 2015; Seebens et al. 2017), but also because of their relevance in nature conservation, ecosystem functioning, human health and economy (Hulme 2009; Pyšek and Richardson 2010). Currently, there is an urgent need for inventories of naturalized species, since they reflect these species' local patterns and provide critical information about invasive species distribution (van Kleunen et al. 2015; Seebens et al. 2017). However, in developing countries, naturalized species distribution is still poorly documented and understood (Gardener et al. 2012; Speziale et al. 2012; but see Castilla et al. 2005; Moreno et al. 2006; Castilla and Neill 2009 for marine non-native species; Fuentes et al. 2013 for plants). These species have been neglected in collections and studies due to a historical bias that found no scientific value in studying the naturalized component (Pauchard et al. 2004; Fuentes et al. 2013). Thus, a national Chilean naturalized species inventory is now essential for the early detection and potential eradication or control of invasive species through risk assessment protocols (Moreno et al. 2006; Fuentes et al. 2010, 2013). Additionally, naturalized species inventories provide datasets suitable for the analysis of temporal patterns of biological invasions, in contrast with the current pattern that reflects geographical biases in information on invasion patterns (Pyšek et al. 2008; Núñez and Pauchard 2010).

Approaches such as invasion curves and variations in the rate of naturalized species introductions allow us to identify invasion periods as well as the temporal dynamics of species accumulations (Fuentes et al. 2008; Seebens et al. 2017). Pyšek and Prach (1993) prepared invasion curves methods for reconstructing the propagation history of four alien species in the Czech Republic. They adjusted an exponential model to the accumulated number of locations against time. The slope of the corresponding regression line was used as a measure of the invasion rate (Mihulka and Pyšek 2001). Abrupt inflexions on the invasion curve indicate expansion periods

of the alien species involved (Pyšek and Prach 1993). In this context, whether different taxa show similar invasion curves in a given region is an open question, hence, comparing invasion curves can reveal differences in the invasion process. Seebens et al. (2017) proposed that differences in the pathways and distribution of species introductions suggest that the chronology of invasion could vary among taxonomic groups. This approach allows us to infer whether the increase in numbers of naturalized species shows any sign of saturation, or whether we can expect biological invasions to continue increasing (Seebens et al. 2017).

A substantial part of Chile has been recognized as a hotspot of world biodiversity (Ormazabal 1993; Myers et al. 2000; Mittermeier et al. 2005) due to its remarkably high levels of endemism and the biogeographic isolation of several taxonomic groups (Armesto et al. 1998; Habit et al. 2006; Vidal and Díaz-Páez 2012; Rodríguez et al. 2018), raising concerns regarding its susceptibility to invasions (Arroyo et al. 2000; Fuentes et al. 2015; Seebens et al. 2017). The extraordinary biogeographic characteristics of Chile make it ideal for understanding biological invasion patterns and have great potential for inferring future invasion trends. However, the study of biological invasions in Chile has been addressed mainly in the last decade, both in terrestrial (Quiroz et al. 2009), and marine systems (Castilla and Neill 2009; Villaseñor-Parada et al. 2017). Therefore, the few inventories that exist of naturalized species have been created for only certain taxonomic groups (e.g., boring polychaetes, Moreno et al. 2006; vascular plants, Fuentes et al. 2013; ascidians, Turon et al. 2016; aquatic plants, Urrutia et al. 2017; marine seaweed, Villaseñor-Parada et al. 2018), with no comprehensive inventory of naturalized species, which would allow for the identification of invasion patterns at the multi-taxa level. To address this knowledge gap, the Project GEF/MMA/PNUD, aimed to develop the first national inventory of naturalized species, including eight taxonomic groups recorded on continental Chile and adjacent marine habitats (PNUD 2017). In this paper, we have updated these lists with current taxonomic status and the full dataset has been included as supplementary material. Here, we present a comprehensive inventory of naturalized species in Chile and analyze the distributional and temporal trends of biological invasions in the country in order to identify priority responses to the growing threat from biological invasions.

#### **Methods**

Continental Chile extends over 38.5 degrees of latitude (17.5°–56°S; 4300 km), and administratively, the country is divided into 16 regions (which range from 15,403 to 132,291 km<sup>2</sup> in size) and 56 provinces, sequentially ordered from north to south. This arrangement is closely correlated with increasing precipitation and decreasing temperatures with increasing latitude (di Castri and Hajek 1976; Luebert and Pliscoff 2006). This establishes a smooth gradient in climatic conditions

and a sequence of biomes, from hyperdesert in the north, a Mediterranean climate region in the center and temperate rain forest and cold sub-Antarctic wetlands in the south. In this physical pattern, most of the human population, which is associated with greater environmental alterations, is distributed mainly in the Mediterranean area. In relation to marine systems, the oceanographic conditions of the Chilean coast are strongly influenced by the Humboldt Current System and the Cape Horn Current (Camus 2001; Thiel et al. 2007). To the north of 42°S, the Chilean coast is virtually a line, with few geographical features, but strongly influenced by diverse factors, such as upwelling and El Niño Southern Oscillation (ENSO). On the contrary, south of 42°S is characterized by the high occurrence of geographical accidents, and low salinities due to the influence of fjords (Camus 2001, 2008; Thiel et al. 2007).

We performed an exhaustive bibliographic revision and used herbarium and zoological collections to identify all the species recorded as naturalized in continental Chile and adjacent marine habitats for each of the eight taxonomic groups: a) vascular plants (terrestrial and aquatic); b) nonvascular plants [Bryophyta (mosses), Marchantiophyta (liverworts), and Anthocerotophyta (hornworts)]; c) marine and freshwater macro and micro algae; d) fungi; e) terrestrial vertebrate fauna (amphibians, reptiles, birds and mammals); f) insects; g) marine and freshwater vertebrates (Pisces) and invertebrates (polychaetes and mollusks); and h) terrestrial gastropods. For each taxonomic group, we used the most accepted and comprehensive definition of naturalized species (see Table 1 for details). In general terms, naturalized species were considered as those that are not native to Chile (i.e. nonindigenous) and whose presence is due to intentional or accidental introduction as a result of human activities. We considered all organisms that are naturalized or invasive, but not those that survive only with human assistance (Richardson et al. 2000). The preliminary list of each taxonomic group was then verified by experts (local and international). Thus, we had a second opinion regarding the inclusion or rejection of naturalized species in the database. For each species, we made a substantial effort to compile and organize a database integrating both species characteristics and spatial distribution information (see Table 2 for details). We checked all records for their scientific names and spatial distributions.

To construct the invasion curves of naturalized species we modified the procedure in Pyšek and Prach (1993), following Fuentes et al. (2008). We plotted the cumulative number of species collected/recorded in Chile against time in 20-year periods. Data on the first-year records were gathered from various sources (including online databases, scientific peer-reviewed publications, reports and books) and analyzed for 20-year periods. For invasion curves and the annual rate of first records, we only included species that were first reported in a known year. Thus, terrestrial gastropods, as well as marine and freshwater vertebrates, were excluded from these analyses.

# **Table 1.** Definitions of naturalized alien species for each taxonomic group included in the inventory.

Taxonomic group	Definition
Taxonomic group     Naturalized vascular plants	We included all naturalized alien species <i>sensu</i> Richardson et al. (2000). Additionally,
(terrestrial and aquatic)	we used expert criteria when the status of the plant species was ambiguous on not supported by publications. Due to a lack of knowledge regarding the native ranges of several species in southern South America (i.e. among Chile, Argentina, Perú, and Bolivia) and to avoid problems in relation to their status (i.e. naturalized or native), we deliberately excluded plants whose natural distribution range fell within the neighboring regions and shared an immediate border with Chile. For this group, the database was constructed on the most recent research by Fuentes et al. (2013), and
	updated to include new records and spatial information.
Naturalized nonvascular plants (Bryophyta (mosses), Marchantiophyta (liverworts) and Anthocerotophyta (hornworts))	To classify naturalized species in this group we utilized six criteria following Crundwell (1985): 1) absence of subfossil record, 2) evidence of a change in geographical distribution, 3) anomalous geographical distribution, on a world scale or locally, 4) association with some means of introduction e.g. botanic garden or ports, 5) less than the normal amount of genetic variation in populations. Sometimes in dioecious species only one sex is present, and 6) association with open, disturbed or temporary habitats.
Naturalized marine and freshwater macro and microalgae	For both marine and freshwater environment, we included all naturalized species referring to organisms that have established a self-sustaining population, but have not necessarily been involved in an invasion process (Richardson et al. 2000; Falk-Petersen et al. 2006). We considered 12 criteria proposed by different authors to identify species introduced into marine systems worldwide (Chapman and Carlton 1991; Cranfield et al. 1998; Ribera and Boudouresque 1995; Boudouresque and Verlaque 2002), and these were: 1) new report in one area, 2) geographical discontinuity in its worldwide distribution, 3) expansion of its distribution range in the invaded area from its point of introduction following a logical pattern (e.g. gradual decrease in abundance from its point of introduction, colonization of new sites following a spatio- temporal pattern), 4) very localized distribution in the introduced region, restricted when compared with similar native species (for example, of the same genus, of the same functional group, with similar life histories), 5) proximity to the probable source of introduction (e.g. ports, cultivation centers), 6) association (or dependence) with other introduced species, 7) association (or dependence) with anthropic activities (e.g. colonizes docks or other artificial substrates), 8) no native evolutionary origin (e.g. absence of congeners in the variable range), 9) tendency to generate massive proliferations (at least seasonally), 10) is identified as naturalized or invasive in other parts of the world, 11) life stories that infer a high invasive power, and 12) genetically identical distant populations.
Naturalized fungi	For this group, the concept of naturalized species is not easily handled due to the lack of larger inventories of Chilean fungi before 1945. Also, the deficient knowledge in terms of the biogeography of fungi can make it difficult to determine what is a naturalized species. Priority was given to published records of biotrophic and saprotrophic specialists associated to allochthonous plants (trees), apart from collection specimens (CONC-F, Universidad de Concepción) recorded between 2004 and 2017 for the first time in Chile. The preliminary list was revised and completed by external experts.
Naturalized terrestrial vertebrates (mammals, birds, amphibians and reptiles)	In this taxonomic group, we included all naturalized species based on the definition proposed by the United Nations Development Program (UNDP). This definition includes all naturalized alien species that were introduced intentionally or accidentally by humans, establishing a self-sustaining population, without intervention by humans. This general definition was complemented by specific literature for this taxonomic group (e.g. Daniels and Corbett 2003; Lever 1994).
Naturalized insects	For this group, we included all naturalized alien species, referring to organisms that have established a self-sustaining population, but not necessarily ended up in an invasion process (Falk-Petersen et al. 2006; Carvallo 2009).
Naturalized marine and freshwater vertebrates and invertebrates (polychaetes and mollusks) and terrestrial gastropoda	We used the criteria proposed by Orensanz et al. (2002), Castilla et al. (2005) and Castilla and Neill (2009), which states the following: 1) status determined by scientific literature or expert criteria, 2) anomalous geographical distribution, on a world scale or locally, 3) species with wide geographic distribution, including cosmopolitan species, 4) species described as nonindigenous in Chile, and 5) species that are abundant near to ports or aquaculture centers, but rare or not present in other areas of the country.

	Plant traits	Description		
Taxonomic information	Family, genus, scientific name and author	Text		
Distribution	Native range	Name of the countries, continents or		
		bioclimatic zones		
	Administrative Regions occupied by the	15= AYP, Arica y Parinacota 1= TAR, Tarapacá		
	naturalized species in Chile	2= ANT, Antofagasta 3= ATA, Atacama		
		4= COQ, Coquimbo 5= VAL, Valparaíso		
		13= RME, Región Metropolitana 6= LBO,		
		Libertador Bernardo O'Higgins 7= MAU,		
		Maule 8= BIO, Biobío 9= ARA, La Araucaní		
		14= LRI, Los Ríos 10= LLA, Los Lagos 11 AIS,		
		Aisén 12= MAG, Magallanes ND = no data.		
Introduction	First year report	The year (or range) of the first report in Chile		
	Type of introduction	Accidental / Intentional / Other		
Impacts	Description of impacts	The known impacts produced by the species		
_		around the world.		

**Table 2.** Species traits, descriptions, and traits level included in the inventory of naturalized species present in Chile.

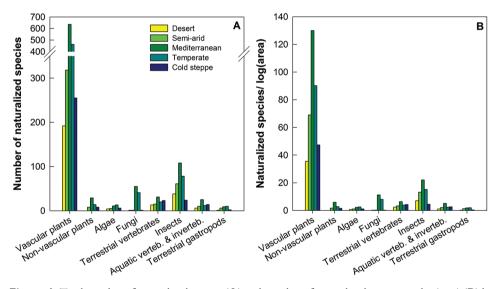
### Results

We identified 1,122 species, which we consider as naturalized at least in some parts of continental Chile and adjacent marine habitats (Table 3). These comprise 790 vascular plants (terrestrial and aquatic); 31 nonvascular plants (Bryophyta, Marchantiophyta and Anthocerotophyta); 18 marine and freshwater macro and micro algae; 71 fungi; 39 terrestrial vertebrates (amphibians, reptiles, birds and mammals); 108 insects; 37 marine and freshwater vertebrates and invertebrates (6 polychaetes, 3 mollusks and 28 Pisces); and 28 terrestrial gastropods (Table 3). For most taxonomic groups, the highest numbers of naturalized species were found mainly in the Mediterranean and rainy climatic zones (Table 3, Fig. 1A, B). Terrestrial vertebrates also showed a significant number of species in the cold steppe zone (Table 3), as did insects, and vascular plants in the semi-arid zone (Table 3, Fig. 1A, B).

The cumulative number of naturalized species collected in Chile over time (i.e. invasion curves) has shown a consistent increment in all taxonomic groups during the 19<sup>th</sup> and 20<sup>th</sup> century (Fig. 2). Despite the temporal differences among taxonomic groups in their first records, slopes of invasion curves for naturalized species did differ among taxonomic groups, suggesting different rates of species accumulations. While vascular plants, nonvascular plants, and terrestrial vertebrates showed a slight, but steady increase in the number of naturalized species over the last 150 years (Fig. 2A, B, F), the cumulative number of naturalized species in the remaining four taxa increased steeply at the beginning of the 20<sup>th</sup> century (Fig. 2C, D, E, G). The total rate of first records remained low between 1850 and 1950 (on average 2.8 first records annually, Fig 3A). Since 1951, first records have increased steeply (on average 5.9 first records annually, Fig 3A). During this period, the continuous increment in first record rates has been consistent in vascular plants, insects and fungi (Fig. 3B). On the contrary, nonvascular plants, terrestrial vertebrates, algae, and marine invertebrates have shown markedly low first record rates over the last 160 years (less than 1 first record annually, Fig. 3B).

**Table 3.** Number of naturalized species by climatic zones in continental Chile and adjacent marine habitats. The total number of species within each taxonomic group is given in parentheses. Marine organisms are present in the coastal area in front of each climatic zones.

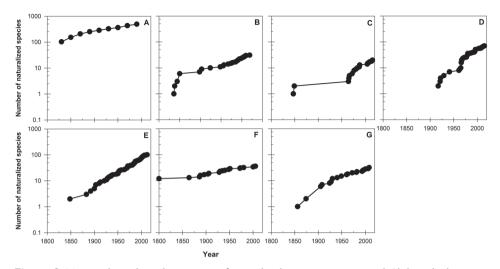
Climatic zones	Vascular plants (790)	Non- vascular plants (31)	Marine & freshwater macro- & microalgae (18)	Fungi (71)	Terrestrial vertebrates (39)		Marine & freshwater vertebrates & invertebr. (37)	Terrestrial gastropods (28)
Desert	192	0	4	1	13	38	6	1
Semi-arid	318	8	5	1	15	61	10	6
Mediterranean	636	29	11	55	31	108	25	9
Temperate rainy	463	14	13	41	20	78	12	10
Cold steppe	255	8	6	1	23	24	14	2



**Figure 1.** Total number of naturalized species (**A**) and number of naturalized species per log(area) (**B**) by climatic zones of continental Chile and adjacent marine habitats.

## Discussion

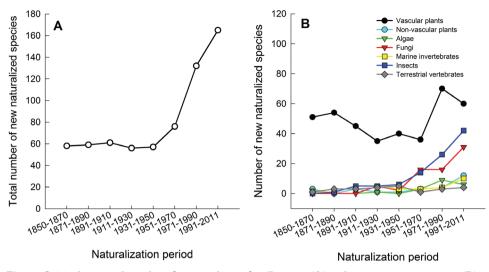
Unlike previous studies that have provided a database of naturalized species in Chile (e.g., Fuentes et al. 2013 vascular plants; Moreno et al. 2006 boring polychaetes; Turon et al. 2016 ascidians; Urrutia et al. 2017 aquatic plants, Villaseñor-Parada et al. 2018 marine seaweed and Castilla et al. 2005; Moreno et al. 2006; Castilla and Neill 2009 for marine non-native species), here, we present the first multi-taxa dataset of naturalized species for the whole country. Unfortunately, there are biases in creating this type of inventory because vascular plants are over-represented compared to other taxa, probably because they are more conspicuous, stationary and hence more easily discovered (DAISIE 2009). This plant bias occurred in the present study, where 74.1 % of



**Figure 2.** Temporal trends in the invasion of naturalized species in continental Chile and adjacent marine habitats, for each taxonomic group for which data on introduction dates were available (terrestrial gastropods are not shown due to lack of data). The cumulative number of recorded species is shown over the last 200 years. **A** vascular plants **B** nonvascular plants **C** marine and freshwater macro and micro algae **D** fungi **E** insects **F** terrestrial vertebrate fauna and **G** marine and freshwater vertebrates and invertebrates.

the naturalized species recorded in Chile are vascular plants. Most of the naturalized species in this database came from herbarium records and zoological collections, while few came from literature. Regarding fauna, there were also some biases in the data sources, e.g. while vertebrates were well represented in museum collections, records of naturalized insects came mainly from literature. The use of natural history collections as the primary source of information highlights their role in naturalized species studies at large spatial and temporal scales in Chile (e.g. see Fuentes et al. 2015 for vascular plants). The present study integrates data in a unique inventory to obtain a more realistic pattern of naturalized species richness and distributions. One major issue came up; when the number of records for certain naturalized species was still particularly low, we could not be completely certain whether these species had naturalized in the area (e.g., nonvascular plants which were poorly sampled before 1950). Nonetheless, the more than 1,100 well-checked species reported in this study should be sufficient to diagnose the situation in Chile in the past and evaluate future risks.

For all taxonomic groups, naturalized species were found to be mainly distributed in Mediterranean and temperate climate regions (central and central-southern Chile), with few species recorded in the far north and south of the country. In the case of vascular plants, several authors have shown similar distribution patterns for naturalized species (Castro et al. 2005; Fuentes et al. 2008; Fuentes et al. 2013). The high concentration of naturalized species in these two climate zones can be related to the fact that since Spanish colonization, most Chileans have lived in this area (ca. 80 % of the population) (Fuentes et al. 2013). Consequently, this area has been strongly trans-



**Figure 3.** Total temporal trends in first record rates for all species (**A**) and seven taxonomic groups (**B**) in Chile. Terrestrial gastropods, as well as marine and freshwater vertebrates are not shown due lack of data.

formed by human activities and land-use changes, while the northern and southern areas have been relatively isolated, mainly due to their climatic conditions and remoteness from the main cities in central-southern Chile (Arroyo et al. 2000; Fuentes et al. 2008, 2015). In marine systems, ship traffic, ballast water and activities associated with aquaculture have been identified as the main introduction vectors for naturalized species (Naylor et al. 2001; Hewitt et al. 2009). In Chile, the main ports are located on the south-central coast (e.g. Valparaíso 33°S, San Antonio 33°35'S, Lirquén 36°42'S, Talcahuano 36°43'S, San Vicente 36°44'S, Coronel 37°01'S and Corral 39°52'S), which increases the susceptibility of these ecosystems to be invaded by naturalized species. Paradoxically, this sector of the Chilean coast has been one of the least studied in terms of biological invasions (Villaseñor-Parada et al. 2017), and even though the number of reports of naturalized species was found to be high, this number could be underestimated due to the lack of information available (Camus 2005; Carlton 2009; Castilla and Neill 2009; Villaseñor-Parada et al. 2017). The few naturalized species recorded in the extreme north and south of the country, could be associated with sampling efforts in these areas, the fact that naturalized species have not yet arrived to these areas due to low propagule pressure or introduction effort, and/or the fact that some species may have arrived, but not thrived because such habitats were incompatible with their ecological niches (Garrido 1985; Jaksic 1998; Fuentes et al. 2015; Villaseñor-Parada et al. 2017, 2018). For vascular plants in particular, the low species density in the Atacama Desert may be attributable to the harsh climatic conditions there, while the lack of naturalized plants in the far south may be the result of a combination of inaccessibility and lower levels of anthropization (Fuentes et al. 2008, 2015). In the case of insects, the highest presence of naturalized species was found to be concentrated in

Chile's central zone, which could be explained by the higher concentration of seaports, border crossings and airports, and the import of biological control agents (Parra and González 2007), pollinators (Montalva et al. 2008), and products of plant or animal origin that, in turn, are contaminated with foreign insects (Estay 2016). Thus, a more comprehensive inventory of naturalized species in these areas will help to identify priority responses to the growing threats from biological invasions.

Thorough documentation of the accumulation of naturalized species, allows us to assess the accumulation process and the dynamics of the establishment and expansion of naturalized species in Chile. We identified invasion periods in Chile based on bibliographic revisions, herbarium and zoological collections for each of the eight taxonomic groups analyzed. Comparatively, the invasion curves show that naturalized species first underwent a positive increment, followed by an apparent plateau phase, mainly in vascular plants, nonvascular plants, and terrestrial vertebrates. In the remaining four taxonomic groups (fungi, insects, marine and freshwater vertebrates and invertebrates, macro and microalgae), the cumulative number of naturalized species increased abruptly at the beginning of the 20th century. The lack of collections before 1900 is also evident for most of the taxonomic groups. In marine systems, the first reports of marine flora and fauna date back to the end of the 18th century, as a result of scientific expeditions that were limited to enumerating the different taxa collected, with few and brief descriptions (Etcheverry 1958; Ramírez 2010). In 1940, the first publications by resident Chilean taxonomists who ratified and added information on the presence of the aforementioned taxa started to appear (Ramírez 2010). Therefore, although the results observed when analyzing the temporal trend of marine invasions show a growing increase since 1900 (Fig. 2C, G), these results are biased due to a lack of prior information before this date. Since the Spanish colonization, an important number of species has been introduced in the drier central Mediterranean climate area, associated with landscape transformations (Aronson et al. 1998). Additionally, in the 19th century there was an important increase in the number of biodiversity records in Chile associated with the inventories developed by naturalists, such as Claudio Gay (Gay 1845, 1854). For vascular plants, there were sustained increments in the collection of weeds from 1894 to 1934, associated with wheat imports (Matthei 1995), whereas the increase of naturalized fungal species, especially macromycetes, is strongly correlated with the fast and extensive spread of naturalized timber plantations, mainly pine and eucalyptus, during the late decades of the 20th century (Palfner and Casanova 2019). The latter authors observed an almost threefold increase in allochthonous, and ubiquitous fungi associated with Pinus radiata plantations in central-southern Chile within the last 40 years. For other taxonomic groups, such as terrestrial vertebrates, the record of introduced species is relatively more complete and the relative lower rate of increase may be due to control measures implemented by government services (Iriarte et al. 2005). Specific phytosanitary regulations and other laws related to the introduction of naturalized species have most likely worked in these cases.

Considering naturalized species as a whole, this inventory highlights the consistent increase in the rate of new naturalizations since 1950, especially for some taxonomic groups, such as insects, fungi, and vascular plants. Even where rates of establishment

did not prove to be rising for nonvascular plants, algae, marine, and terrestrial vertebrates, the cumulative number of naturalized taxa did show a consistent increase for these taxonomic groups. Our results are consistent with the fact that the annual rate of first records worldwide has increased during the last 200 years, with 37% of all first records reported recently (1970-2014) (Seebens et al. 2017). Continuous increases in the rates of naturalized species first records in Chile, stress the need to improve the implementation of national legislation and international agreements that aim to reduce the threats that naturalized alien species pose to biodiversity, particularly in the case of insects and fungi. Additionally, the above pattern suggests that the number of new naturalized species will most likely continue to increase because current tools to prevent biological invasions are not effective enough to slow down the increment in the number of naturalized species (Seebens et al. 2017). This inventory is a basis for future studies that analyze more detailed biological patterns and mechanisms that explain invasion processes in many taxa that have been understudied (sensu, Capdevila-Argüelles and Zilletti 2005). In this context, to effectively assess consequences and risks, in terms of the spread and invasion of individual species, documentation with an efficient combination of species records requires a coordinated effort across multiple government agencies and research institutions, in addition to well-designed and specifically oriented sampling and monitoring programs.

## Acknowledgements

A previous version of the current database was created during the study conducted by the University of Concepción under the contract SCT N°20/2015 "Consultoría para elaborar el catálogo de las especies exóticas asilvestradas/naturalizadas en Chile, en el marco del Proyecto GEF/MMA/PNUD EEI AJF". We would like to thank the Ministerio del Medio Ambiente de Chile (MMA) and PNUD, especially Fernando Baeriswyl, Charif Tala, Emma Elgueta, Macarena Isla and Giuliana Furci. We are grateful to Fernando Carrasco, Héctor Ibarra (terrestrial vertebrates) and Fabio Labra (Facultad de Ciencias, Universidad San Tomás, Chile) for their help during the Project. NF and AS are supported by FONDECYT N°1181688, AP and PS funded by CONICYT PIA grant AFB 170008. We thank all the people at CONC Herbarium (University of Concepción).

#### References

- Armesto JJ, Rozzi R, Smith-Ramírez C, Arroyo MTK (1998) Conservation targets in South American temperate forests. Science 5392: 1271–1272. https://doi.org/10.1126/science.282.5392.1271
- Aronson J, Del Pozo A, Ovalle C, Avendano J, Lavin A, Etienne M (1998) Land use changes and conflicts in Central Chile. In: Rundel PW, Montenegro G, Jaksic F (Eds) Landscape disturbance and biodiversity in Mediterranean type ecosystems. Springer-Verlag Germany, 155–168. https://doi.org/10.1007/978-3-662-03543-6\_9

- Arroyo MTK, Marticorena C, Matthei O, Cavieres L (2000) Plant invasions in Chile: present patterns and future predictions. In: Mooney A, Hobbs R (Eds) Invasive species in a changing world. Island Press, California USA, 385–421.
- Boudouresque CF, Verlaque M (2002) Biological pollution in the Mediterranean Sea: invasive versus introduced macrophytes. Marine Pollution Bulletin 44: 32–38. https://doi. org/10.1016/S0025-326X(01)00150-3
- Camus PA (2001) Biogeografía marina de Chile continental. Revista Chilena de Historia Natural 74: 587–617. https://doi.org/10.4067/S0716-078X2001000300008
- Camus PA (2005) Introducción de especies en ambientes marinos chilenos: no solo exóticas, no siempre evidentes. Revista Chilena de Historia Natural 78: 155–159. https://doi. org/10.4067/S0716-078X2005000100011
- Camus PA (2008) Diversidad, distribución y abundancia de especies en ensambles intermareales rocosos. Revista de Biología Marina y Oceanografía 43: 615–627. https://doi. org/10.4067/S0718-19572008000300021
- Capdevila-Argüelles L, Zilletti B (2005) Issues in Bioinvasion Science. Springer, Netherlands.
- Carlton JT (2009) Deep invasion ecology and the assembly of communities in historical time In: Rilov G, Crooks JA (Eds) Biological Invasions in Marine Ecosystems: Ecological, Management, and Geographic Perspectives. Springer-Verlag, Berlin, 13–56. https://doi. org/10.1007/978-3-540-79236-9\_2
- Carvallo GO (2009) Especies exóticas e invasiones biológicas. Ciencia Ahora 23(12): 15–21.
- Castilla JC, Uribe M, Bahamonde N, Clarke M, Desqueyroux-Faúndez R, Kong I, Moyano H, Rozbaczylo N, Santelices B, Valdovinos C, Zavala P (2005) Down under the southeastern Pacific: marine non-indigenous species in Chile. Biological Invasions 7: 213–232. https:// doi.org/10.1007/s10530-004-0198-5
- Castilla JC, PE Neill (2009) Marine Bioinvasions in the Southeastern Pacific: Status, Ecology, Economic Impacts, Conservation and Management. In: Rilov G, Crooks JA (Eds) Biological Invasions in Marine Ecosystems: Ecological, Management, and Geographic Perspectives. Springer-Verlag, Berlin, 439–457. https://doi.org/10.1007/978-3-540-79236-9\_26
- Castro SA, Figueroa J, Muñoz-Schick M, Jaksic FM (2005) Minimum residence time, biogeographical origin, and life cycle as determinants of the geographical extent of naturalized plants in continental Chile. Diversity and Distributions 11: 183–191. https://doi. org/10.1111/j.1366-9516.2005.00145.x
- Chapman JW, Carlton JT (1991) A test of criteria for introduced species: the global invasion by the isopod *Synidotea laevidorsalis* (Miers,1881) Journal of Crustacean Biology 11: 386–400. https://doi.org/10.2307/1548465
- Cranfield HJ, Gordon DP, Willan RC, Marshall BA, Battershill CN, Francis MP, Nelson WA, Glasby CJ, Read GB (1998) Adventive marine species in New Zealand. Wellington. http:// docs.niwa.co.nz/library/public/NIWAtr34.pdf
- Crundwell AC (1985) The introduced bryophytes of the British Isles. Bulletin of the British Bryological Society 45: 8–9.
- DAISIE (Ed.) (2009) Handbook of alien species in Europe. Springer, Berlin.
- Daniels MJ, Corbett L (2003) Redefining introgressed protected mammals: when is a wildcat a wild cat and a dingo a wild dog? Wildlife Research 30: 213–218. https://doi.org/10.1071/WR02045

- di Castri F, Hajek ER (1976) Bioclimatología de Chile. Santiago Chile. Vicerrectoría Académica de la Universidad Católica de Chile. https://www.ecolyma.cl/documentos/bioclimatologia\_de\_chile.pdf
- Estay S (2016) Invasive insects in the Mediterranean forests of Chile. In: Paine T, Lieutier F (Eds) Insects and diseases of Mediterranean forest systems. Springer, Cham, 379–396. https://doi.org/10.1007/978-3-319-24744-1\_13
- Etcheverry H (1958) Bibliografía de las algas chilenas. Revista de Biología Marina 7: 163–182.
- Falk-Petersen J, Bøhn T, Sandlund OT (2006) On the numerous concepts in invasion biology. Biological Invasions 8: 1409–1424. https://doi.org/10.1007/s10530-005-0710-6
- Fuentes N, Ugarte E, Kühn I, Klotz S (2008) Alien plants in Chile: inferring invasion periods from herbarium records. Biological Invasions 10: 649–657. https://doi.org/10.1007/ s10530-007-9159-0
- Fuentes N, Ugarte E, Kühn I, Klotz S (2010) Alien plants in southern South America. A framework for evaluation and management of mutual risk of invasion between Chile and Argentina. Biological Invasions 12: 3227–3236. https://doi.org/10.1007/s10530-010-9716-9
- Fuentes N, Pauchard A, Sanchez P, Esquivel J, Marticorena A (2013) A new comprehensive database of alien plant species in Chile based on herbarium records. Biological Invasions 15: 847–858. https://doi.org/10.1007/s10530-012-0334-6
- Fuentes N, Saldaña A, Kühn I, Klotz S (2015) Climatic and socio-economic factors determine the level of invasion in Chile. Plant Ecology and Diversity 8: 371–377. https://doi.org/10 .1080/17550874.2014.984003
- Gardener M, Bustamante RO, Herrera I, Durigand G, Pivello VR, Moro MF, Stoll A, Langdon B, Baruch Z, Rico A, Arredondo-Nuñez A, Flores S (2012) Plant invasion in Latin America: fast track to a more focused agenda. Plant Ecology and Diversity 5: 225–232. https://doi.org/10.1080/17550874.2011.604800
- Garrido N (1985) Index Agaricalium Chilensium. Bibliotheca Mycologica 99. Vaduz J Cramer.
- Gay C (1845) Historia Física y Política de Chile. Tomo I. Thunot Paris, France.
- Gay C (1854) Atlas de la Historia Física y Política de Chile. Tomo II. Thunot Paris, France.
- Habit E, Dyer B, Vila I (2006) Estado de conocimiento de los peces dulceacuícolas de Chile. Gayana 70(1):100–113. https://doi.org/10.4067/S0717-65382006000100016
- Hewitt CL, Gollasch S, Minchin D (2009) The vessel as a vector biofouling, ballast water and sediments. In: Rilov G, Crooks JA (Eds) Biological Invasions in Marine Ecosystems: Ecological, Management, and Geographic Perspectives. Ecological Studies Series. Springer-Verlag, 117–131. https://doi.org/10.1007/978-3-540-79236-9\_6
- Hulme PE (2009) Trade, transport and trouble: managing invasive species pathways in an area of globalization. Journal of Applied Ecology 46: 10–18. https://doi.org/10.1111/j.1365-2664.2008.01600.x
- Iriarte JA, Lobos G, Jaksic FM (2005) Invasive vertebrate species in Chile and their control and monitoring by governmental agencies. Revista Chilena de Historia Natural 78: 149–154. https://doi.org/10.4067/S0716-078X2005000100010
- Jaksic FM (1998) Vertebrate invaders and their ecological impacts in Chile. Biodiversity & Conservation 7(11): 1427–1445. https://doi.org/10.1023/A:1008825802448
- Lever C (1994) Naturalized Animals: The Ecology of Successfully Introduced Species. Poyser Natural History, London.

- Luebert F, Pliscoff P (2006) Sinopsis bioclimática y vegetacional de Chile. Santiago de Chile. Editorial Universitaria.
- Mack RN, Simberloff D, Lonsdale WM, Evans H, Clout M, Bazzaz FA (2000) Biotic invasions: causes, epidemiology, global consequences, and control. Ecological Applications 10(3): 689–710. https://doi.org/10.1890/1051-0761(2000)010[0689:BICEGC]2.0.CO;2
- Matthei O (1995) Manual de las malezas que crecen en Chile. Concepción (Chile). Alfabeta Impresores.
- Mihulka S, Pyšek P (2001) Invasion history of *Oenothera* congeners in Europe: a comparative study of spreading rates in the last 200 years. Journal of Biogeography 28:597–609. https://doi.org/10.1046/j.1365-2699.2001.00574.x
- Mittermeier RA, Robles Gil P, Hoffman M, Pilgrim J, Brooks T, Mittermeier CG, Lamoreux J, Da Fonseca GAB (2005) Hotspots revisited: earth's biologically richest and most endangered terrestrial ecoregions. University of Chicago Press for Conservation International. USA.
- Montalva J, Arroyo MK, Ruz L (2008) *Bombus terrestris* Linnaeus (Hymenoptera: Apidae: Bombini) en Chile: Causas y consecuencias de su introducción. Revista del Jardín Botánico Chagual Año 6: 6–5.
- Moreno RA, Neill PE, Rozbaczylo N (2006) Native and non-indigenous boring polychaetes in Chile: a threat to native and commercial mollusc species. Revista Chilena de Historia Natural 79: 263–278. https://doi.org/10.4067/S0716-078X2006000200012
- Myers N, Mittermeier RA, Mittermeier CG, Da Fonseca GAB, Kent J (2000) Biodiversity hotspots for conservation priorities. Nature 403: 853–858. https://doi.org/10.1038/35002501
- Naylor RL, Williams SL, Strong DR (2001) Aquaculture A Gateway for Exotic Species Science 294 (5547): 1655–1656. https://doi.org/10.1126/science.1064875
- Núñez M, Pauchard A (2010) Biological invasions in developing and developed countries: does one model fit all? Biological Invasions 12:707–714. https://doi.org/10.1007/s10530-009-9517-1
- Orensanz JM, Schwindt E, Pastorino G, Bortolus A, Casas G, Darrigran G, Elías R, López Gappa JJ, Obenat S, Pascual M, Penchaszadeh P, Piriz ML, Scarabino F, Spivak ED, Vallarino EA (2002) No longer the pristine confines of the world ocean: a survey of exotic marine species in the southwestern Atlantic. Biological Invasions 4: 115–143. https://doi. org/10.1023/A:1020596916153
- Ormazabal C (1993) The conservation of biodiversity in Chile. Revista Chilena de Historia Natural 66:383–402. http://rchn.biologiachile.cl/pdfs/1993/4/Ormazabal\_1993.pdf
- Palfner G, Casanova-Katny A (2019) Micocenosis en remanentes de bosque nativo y en plantaciones forestales en la península de Arauco, Biobío, Chile: composición, aspectos funcionales y conservación (Comparison of the Mycobiota in remnants of native forests and forest plantations in the Arauco península of the Bíobío region, highlighting functional and conservation aspects). In: Smith-Ramírez C, Squeo FA (Eds) Biodiversidad y Ecología de los Bosques Costeros de Chile, Editorial Universidad de Los Lagos: 175–210.
- Parra P, González M (2007) *Megarhyssa praecellens*, Parasitoide de la avispa de la madera *Tremex fuscicornis*, en Chile. Instituto Forestal de Chile INFOR 13(3): 473–489.
- Pauchard A, Cavieres L, Bustamante R, Becerra P, Rapoport E (2004) Increasing the understanding of plant invasions in southern South America: first symposium on Alien

Plant Invasions in Chile. Biological Invasions 6:255–257. https://doi.org/10.1023/ B:BINV.0000022137.61633.09

- Pimentel D, Zuniga R, Morrison D (2005) Update on the environmental and economic costs associated with alien-invasive species in the United States. Ecological Economics 52(3): 273–28. https://doi.org/10.1016/j.ecolecon.2004.10.002
- PNUD (2017) Catálogo de las especies exóticas asilvestradas/naturalizadas en Chile. Laboratorio de Invasiones Biológicas (LIB) Universidad de Concepción, Proyecto GEF/MMA/ PNUD Fortalecimiento de los Marcos Nacionales para la Gobernabilidad de las Especies Exóticas Invasoras: Proyecto Piloto en el Archipiélago de Juan Fernández. Santiago de Chile.
- Pyšek P, Prach K (1993) Plant invasion and the role of riparian habitats: a comparison of four species alien to central Europe. Journal of Biogeography 20: 413–420. https://doi. org/10.2307/2845589
- Pyšek P, Richardson DM, Pergl J, Jarošik V, Sixtová Z, Weber E (2008) Geographical and taxonomic biases in invasion ecology. Trends in Ecology and Evolution 23: 237–244. https:// doi.org/10.1016/j.tree.2008.02.002
- Pyšek P, Richardson DM (2010) Invasive species, environmental change and management, and health. Annual Review of Environment and Resources 35: 25–55. https://doi.org/10.1146/ annurev-environ-033009-095548
- Quiroz CL, Pauchard A, Cavieres LA, Anderson CB (2009) Análisis cuantitativo de la investigación en invasiones biológicas en Chile: tendencias y desafíos. Revista Chilena de Historia Natural 82: 497–505. https://doi.org/10.4067/S0716-078X2009000400005
- Ramírez ME (2010) Algas Marinas Bentónicas: Chlorophyta, Ochrophyta (Phaeophyceae) y Rhodophyta. In: Palma S, Báez P, Pequeño G (Eds) Bibliografía Sobre Biodiversidad Acuática de Chile. Comité Oceanográfico Nacional, Valparaíso, 13–28. http://www.cona. cl/pub/libro\_bibliografia/1.PDF
- Ribera MA, Boudouresque CF (1995) Introduced marine plants, with special reference to macroalgae: mechanisms and impact. In: Round FE, Chapman DJ (Eds) Progress in Phycological Research. Biopress Bristol, 187–268. https://people.mio.osupytheas.fr/~boudouresque/ Publications\_pdf/Ribera\_Boudouresque\_1995\_Prog\_Phycol\_Res.pdf
- Richardson DM, Pyšek P, Rejmánek M, Barbour MG, Panetta FD, West CJ (2000) Naturalization and invasion of alien plants: concepts and definitions. Diversity and Distributions 6: 93–107. https://doi.org/10.1046/j.1472-4642.2000.00083.x
- Rodriguez R, Marticorena C, Alarcón D, Baeza C, Cavieres L, Finot VL, Fuentes N, Kiessling A, Mihoc M, Pauchard A, Ruiz E, Sanchez P, Marticorena A (2018) Catálogo de las plantas vasculares de Chile. Gayana Botánica 75(1): 1–430. https://doi.org/10.4067/S0717-66432018000100001
- Seebens H, Blackburn TM, Dyer EE, Genovesi P, Hulme PE, Jeschke JM, Pagad S, Pyšek P, Winter M, Arianoutsou M, Bacher S, Blasius B, Brundu G, Capinha C, Celesti-Grapow L, Dawson W, Dullinger S, Fuentes N, Jäger H, Kartesz J, Kenis M, Kreft H, Kühn I, Lenzner B, Liebhold A, Mosena A, Moser D, Nishino M, Pearman D, Pergl J, Rabitsch W, Rojas-Sandoval J, Roques A, Rorke S, Rossinelli S, Roy HE, Scalera R, Schindler S, Štajerová K, Tokarska-Guzik B, van Kleunen M, Walker K, Weigelt P, Yamanaka T, Essl F (2017) No

saturation in the accumulation of alien species worldwide. Nature Communications 8: 14435. https://doi.org/10.1038/ncomms14435

- Speziale K, Lambertucci S, Carrete M, Tella J (2012) Dealing with non-native species: what makes the difference in South America. Biological Invasions 14: 1609–1621. https://doi.org/10.1007/s10530-011-0162-0
- Thiel M, Macaya EC, Acuña E, Arntz WE, Bastias H, Brokordt K, Camus PA, Castilla JC, Castro LR, Cortés M, Dumont CP, Escribano R, Fernández M, Gajardo JA, Gaymer CF, Gomez I, González AE, González HE, Haye PA, Illanes JE, Iriarte JL, Lancelloti DA, Luna-Jorquera G, Luxoro C, Manriquez PH, Marín V, Muñoz P, Navarretes SA, Perez E, Poulin E, Sellanes J, Sepúlveda HH, Stotz W, Tala F, Thomas A, Vargas CA, Vasquez JA, Vega JMA (2007) The Humboldt current system of northern and central Chile Oceanographic processes, ecological interactions and socioeconomic feedback. Oceanography and Marine Biology: An Annual Review 45: 195–344. https://doi.org/10.1201/9781420050943.ch6
- Turon X, Cañete JI, Sellanes J, Rocha RM, López-legentil S (2016) Too cold for invasions? Contrasting patterns of native and introduced ascidians in subantarctic and temperate Chile. Management of Biological Invasions 7: 77–86. https://doi.org/10.3391/mbi.2016.7.1.10
- Urrutia J, Sánchez P, Pauchard A, Hauenstein E (2017) Plantas acuáticas invasoras presentes en Chile: Distribución, rasgos de vida y potencial invasor. Gayana Botánica 74(1): 147–157. https://doi.org/10.4067/S0717-66432017005000324
- van Kleunen M, Dawson W, Essl F, Pergl J, Winter M, Weber E, Kreft H, Weigelt P, Kartesz J, Nishino M, Antonova LA, Barcelona JF, Cabezas FJ, Cárdenas D, Cárdenas-Toro J, Castaño N, Chacón E, Chatelain C, Ebel AL, Figueiredo E, Fuentes N, Groom QJ, Henderson L, Inderjit, Kupriyanov A, Masciadri S, Meerman J, Morozova O, Moser D, Nickrent DL, Patzelt A, Pelser PB, Baptiste MP, Poopath M, Schulze M, Seebens H, Shu W-S, Thomas J, Velayos M, Wieringa JJ, Pyšek P (2015) Global exchange and accumulation of non-native plants. Nature 525: 100–103. https://doi.org/10.1038/nature14910
- Vidal MA, Díaz-Páez H (2012) Biogeography of Chilean herpetofauna: biodiversity hotspot and extinction risk. In: Stevens L (Ed.) Global advances in biogeography. Intech Editions, Flagstaff, USA. http://cdn.intechopen.com/pdfs/34659/InTech-Biogeography\_of\_chilean\_herpetofauna\_biodiversity\_hotspot\_and\_extinction\_risk.pdf
- Villaseñor-Parada C, Pauchard A, Macaya EC (2017) Ecología de invasiones marinas en Chile continental: ¿Qué sabemos y que nos falta por saber? Revista de Biología Marina y Oceanografía, 52(1): 01–17. https://doi.org/10.4067/S0718-19572017000100001
- Villaseñor-Parada C, Pauchard A, Ramírez M, Macaya EC (2018) Macroalgas exóticas en la costa de Chile: patrones espaciales y temporales en el proceso de invasión. Latin American journal of aquatic research 46(1): 147–165. https://doi.org/10.3856/vol46-issue1fulltext-15

# A comprehensive inventory of naturalized species in Chile

Authors: Nicol Fuentes, Alicia Marticorena, Alfredo Saldaña, Viviane Jerez, Juan Carlos Ortiz, Pedro Victoriano, Rodrigo A. Moreno, Juan Larraín, Cristobal Villaseñor-Parada, Götz Palfner, Paulina Sánchez, Aníbal Pauchard

Data type: dataset

Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.55366.suppl1

**RESEARCH ARTICLE** 



# Australia's wish list of exotic pets: biosecurity and conservation implications of desired alien and illegal pet species

Adam Toomes<sup>1</sup>, Oliver C. Stringham<sup>1,2</sup>, Lewis Mitchell<sup>2</sup>, Joshua V. Ross<sup>2</sup>, Phillip Cassey<sup>1</sup>

I School of Biological Sciences, the University of Adelaide, Adelaide, Australia 2 School of Mathematical Sciences, the University of Adelaide, Australia

Corresponding author: Adam Toomes (adam.toomes@adelaide.edu.au)

Academic editor: Daniel Sol | Received 25 February 2020 | Accepted 25 June 2020 | Published 18 August 2020

**Citation:** Toomes A, Stringham OC, Mitchell L, Ross JV, Cassey P (2020) Australia's wish list of exotic pets: biosecurity and conservation implications of desired alien and illegal pet species. NeoBiota 60: 43–59. https://doi.org/10.3897/ neobiota.60.51431

#### Abstract

Globalisation of the live pet trade facilitates major pathways for the transport and introduction of invasive alien species across longer distances and at higher frequencies than previously possible. Moreover, the unsustainable trade of species is a major driver for the over-exploitation of wild populations. Australia minimises the biosecurity and conservation risk of the international pet trade by implementing highly stringent regulations on the live import and keeping of alien pets beyond its international CITES obligations. However, the public desire to possess prohibited alien pets has never been quantified and represents a number of species that could be acquired illegally or legally under different future legislative conditions. As such, highly desirable species represent an ongoing conservation threat and biosecurity risk via the pet-release invasion pathway.

We aimed to characterise the Australian desire for illegal alien pets and investigate potential sources of external information that can be utilised to predict future desire. Using public live import enquiry records from the Australian Commonwealth Department of Agriculture, Water and the Environment as a proxy for alien pet desire, we tested for differences in the proportion of species with threatened listings and records of invasions, after accounting for taxonomy. Additionally, we used a United States of America (U.S.) live imports dataset to infer pet demand in another Western market with less stringent regulations and determined whether species highly desired in Australia had higher U.S. trade demand than would be expected by chance.

Copyright Adam Toomes et al. This is an open access article distributed under the terms of the Creative Commons Attribution License (CC BY 4.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

The Australian public desire for alien pets is heavily and significantly biased towards species threatened with extinction, species popular in the U.S. trade and species with a history of successful invasions. Not only does this indicate the potential impacts of pet desire on invasion risk and the conservation of threatened species, but we also highlight the potential role of the U.S. trade as an effective predictor for Australian desire. Our research emphasises the value of novel datasets in building predictive capacity for improved biosecurity awareness.

#### **Keywords**

alien, invasive species, non-native, smuggling, wildlife trade

# Introduction

Globalisation of trade and tourism has led to substantial changes in the international trade of live pets (Bush et al. 2014). Rapid information sharing, particularly via social media, has increased public awareness of traded species, potentially leading to subsequent increases in pet demand (Clarke et al. 2019; Kitson and Nekaris 2017). Additionally, the use of e-commerce platforms such as international classifieds has facilitated the acquisition of pets in greater numbers and from a greater diversity of regions than previously possible (Bergin et al. 2018; Morgan and Chng 2018; Siriwat et al. 2019), including species with highly restricted distributions (Shepherd et al. 2019). As such, the proliferation of the pet trade has the potential to exacerbate its existing detrimental impacts, including the over-exploitation of wildlife, the violation of animal welfare and both the transport and introduction of invasive alien species (IAS) via the pet-release pathway (Ashley et al. 2014; Auliya et al. 2016; Baker et al. 2013; Lockwood et al. 2019).

Australia has experienced an increased rate of IAS incursions over the last two decades, particularly from species prominent in the international pet trade, such as rose-ringed parakeets (*Psittacula krameri*), corn snakes (*Pantherophis guttatus*) and redeared sliders (*Trachemys scripta elegans*) (Henderson et al. 2011; McFadden et al. 2017; Toomes et al. 2019; Vall-llosera et al. 2017). These trends are of concern for Australian biosecurity, as establishment success of IAS is dependent on propagule pressure, which is influenced by the number of individuals smuggled in and their probability of release/escape from captivity (Cassey et al. 2018; García-Díaz et al. 2015; Stringham and Lockwood 2018). Given the cost and difficulty of eradicating IAS from large landmasses (García-Díaz et al. 2017; Holmes et al. 2016; Jardine and Sanchirico 2018; Rout et al. 2014), the interception of IAS earlier in the invasion pathway is necessary for efficient management of biosecurity in Australia.

Australia implements wildlife trade restrictions beyond its' CITES obligations (Department of the Environment and Energy 2019). This stringent regulatory framework has played a major part in mitigating the threat of IAS to date, as highlighted by fewer IAS established in Australia compared with the U.S. (Capinha et al. 2017; Smith et al. 2008; Strecker et al. 2011), a country with less stringent pet trading and keeping regulations (Eskew et al. 2019; Smith et al. 2017). However, a challenge associated with Australia's regulatory system is the lack of consistent surveillance of alien pets held, legally or otherwise, within Australia. There are a number of species that are not permitted for live import, yet are legal to domestically trade within Australia (Fredberg and McNeil 2010). Additional species have been acquired illegally, either from international smuggling or from domestic captive breeding (Toomes et al. 2019). Therefore, an unquantified proportion of pet keepers have the capacity to legally or illegally acquire desired pets if they are not accessible through importation. Anticipating which species are likely to be desired, acquirable and subsequently pose a biosecurity risk through deliberate/accidental releases, is essential to mitigating the cost of IAS.

While it is important to consider Australia's acquisition of alien pets from the perspective of biosecurity risk, there are also potentially serious conservation implications. The unsustainable harvest and trade of species at rates exceeding their reproductive output can be a major driver of biodiversity loss (Mandimbihasina et al. 2020; Natusch and Lyons 2012; Siriwat and Nijman 2018; Shepherd 2010). Threatened species and those with low fecundity are especially susceptible to this threatening process, due to the effect of perceived rarity on market value (Holden and McDonald-Madden 2017; Siriwat et al. 2019). Even when captive breeding is established to supply a given market, harvesting can still take place in order to increase genetic diversity of captive populations from 'founder stock' (Brooks et al. 2010; Lyons and Natusch 2011) or to introduce a new subpopulation/breed/locality into the market with higher perceived value (Auliya et al. 2016). These issues are particularly apparent in illegal trade, as there are no licensing systems in place to promote sustainable practice. As such, the demand for and acquisition of alien pets within Australia may be contributing to a leading global threatening process.

Quantifying and characterising public demand for alien wildlife is extremely difficult given that the keeping of most alien pets in Australia is illegal or unregulated by any domestic permit system (Toomes et al. 2019). Specifically, to date, there has been no attempt to quantify or elucidate public preference for exotic alien pets. Here, we seek to generate insights about potential demand for alien vertebrates by analysing a novel dataset on the public 'desire' for alien species. We obtained records of anonymous public enquiries to the Australian Commonwealth Department of Agriculture, Water and the Environment (DAWE; formerly the Department of Environment and Energy) relating to the legality of importation of various alien taxa. We aimed to investigate whether species desired in Australia (i.e. species present in DAWE enquiries) were biased towards being threatened by extinction, as indicated by broader research on pet demand (Holden and McDonald-Madden 2017; Siriwat et al. 2019) or towards being invasive species elsewhere, which would indicate trade-related biosecurity risks (Toomes et al. 2019). Furthermore, we compared Australian desire with that of a Western nation with less stringent pet-keeping regulations (the U.S.) in order to identify a potential source of data to predict future desire. The U.S. plays a leading role in the

global exotic pet trade, importing millions of live animals annually to be kept as pets (Harfoot et al. 2018; Smith et al. 2009). Thus, we considered the species imported into the U.S. to represent the total diversity of traded pets and their quantity as a proxy for 'Western' demand for pets.

## Methods

#### Australian phone enquiries

The Australian Department of Agriculture, Water and the Environment (DAWE) maintains a hotline for people to enquire about the legality of importing or owning a particular species in Australia. A DAWE policy officer answers and responds to the enquiry and records non-identifiable information about each request. The information recorded by the officer, if supplied by the caller, includes: (i) the date the enquiry occurred; (ii) the location of the enquirer (city or State/Territory); (iii) the species enquired about; (iv) the action (importing, keeping/owning, breeding); and (v) whether the action was for private or commercial reasons. We acquired this dataset for all enquires lodged from October 2017 to April 2019, which contained a total of 150 phone calls. We acknowledge that the sample size of this dataset is relatively small; however, as we are using the data to identify broad-scale biases, we assumed the data to be sufficiently representative of highly-desired alien pets. Moreover, as enquiries are free and anonymous, we assumed the set of anonymous callers to be an unbiased representation of pet keepers/traders with an interest in importing alien pets.

We categorised the stated use of the animal into six categories: (i) pet (private use); (ii) zoo (commercial use for display in a zoo/wildlife park); (iii) exhibitor (commercial use for exhibition/show); (iv) breeding pets (commercial use to breed as pet); (v) breeding food (commercial use to breed as food); (vi) other (not otherwise specified). If an enquirer specified multiple intended uses, all use types were recorded. We referenced species and common names against the Global Biodiversity Information Facility (GBIF 2019) to resolve species identification to the most specific possible taxonomic level. If multiple species were discussed in a single call, we recorded each species as an independent enquiry (n = 198). For our analyses, we only considered enquiries relating to vertebrate pets (n = 168). We categorised cartilaginous fishes (Chondrichthyes) and ray-finned fishes (Actinopterygii) into one clade (Fish).

#### U.S. imports of live animals

The U.S. maintains a database of imports/exports of live organisms and wildlife products, called the Law Enforcement Management Information System (LEMIS), which is maintained by the U.S. Fish and Wildlife Service (see Romagosa (2014) and Eskew et al. (2019) for more details). We acquired the LEMIS dataset for records from 1999 to 2016. We excluded records of exported animals, records that did not specify the quantity of individuals imported, records that were not categorised as live imports and all non-vertebrate records. We only considered import records that were deemed relevant to the pet trade (i.e. commercial or personal use designation). This dataset resulted in 3083 species, resolved using GBIF. For analysis, we derived the popularity of each species in the U.S. import records by ranking the species by total number of individuals imported from 1999 to 2016.

#### **Comparison datasets**

We compared four metrics between species in DAWE enquiries and U.S. imports: (i) popularity in the trade; (ii) the proportion of threatened taxa; (iii) the proportion of taxa with international trade restrictions; and (iv) the proportion of species known to be invasive species elsewhere. To compare the proportion of threatened taxa, we matched each species from DAWE enquiries and LEMIS imports to their IUCN Red List designations: Data Deficient (DD), Least Concern (LC), Near Threatened (NT), Vulnerable (VU), Endangered (EN) and Critically Endangered (CR) (IUCN 2019). For the purpose of our analysis, we re-categorised the Red List designation into a binary variable: Not Threatened (LC and NT) and Threatened (VU, EN and CR). Species listed as "Data Deficient" were excluded from our analysis. We created a binary variable because we had small sample sizes for some IUCN designations. To compare proportions of trade-restricted taxa, we recorded whether species were listed in the Appendices of the Convention on International Trade in Endangered Species of Wild Fauna and Flora (CITES) (UNEP-WCMC 2019). Finally, we used the Global Invasive Species Database (GISD) to determine if a species has a history of successful invasions (ISSG 2019). We supplemented this dataset to include species known to the authors as being considered invasive in peer-reviewed scientific literature, for example, established populations of Argentine black and white tegus (Salvator merianae) in Florida (Johnson et al. 2017). For enquiries involving hybrids, we took a conservative precautionary approach and categorised them as GISD-listed if at least one parent species has a history of invasions.

#### Analysis

We performed four analyses comparing the species in the phone enquiries with the species in exotic pet trade at large (i.e. species from U.S. imports). First, we compared the popularity (see *U.S. imports of live animals*) of the species in the phone enquiries to the overall popularity of species in the exotic pet trade at large. Next, we compared whether the proportion of threatened species (i.e. species listed in the IUCN Red List)

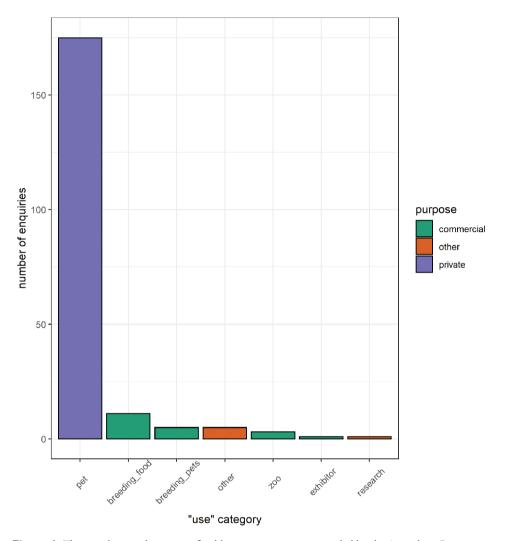
in the phone enquiries differs from the proportion of threatened species in the exotic pet trade at large. Then, we tested whether the proportion of species with trade restrictions (i.e. species listed in CITES appendix) in the phone enquiries differs from the proportion of species with trade restrictions in the exotic pet trade at large. Finally, we tested whether the proportion of species known to be invasive species elsewhere (whether or not in a GISD database) in the phone enquiries differs from the proportion of species known to be invasive species elsewhere in the exotic pet trade at large.

To test these hypotheses, we performed a series of empirical hypothesis tests (analogous to two-tailed t-tests but for ranked data; also known as bootstrap hypothesis testing) by randomly sampling from the U.S. imports dataset and comparing this to what was observed in the DAWE phone enquiries. To obtain the popularity of pets in the overall exotic pet trade, we uniformly randomly sampled species from the U.S. import records and calculated their collective median rank. To obtain the proportion of species threatened, with trade restrictions or invasive in the overall exotic pet trade, we randomly sampled species from the U.S. import records and recorded their collective proportions (respectively). The sample size of this sampling procedure was set to the total number of phone enquiries and was stratified by taxonomic class to account for taxonomic bias. For example, for the species popularity test, there was a total of 79 phone enquiries corresponding to species or subspecies, of which 42 enquiries were mammals (class Mammalia), 24 were birds (class Aves), 14 were reptiles (class Reptilia) and nine were fish (class Actinopterygii or Chondrichthyes). Therefore, for each iteration of sampling, we randomly sampled from the U.S. imports 42 mammals, 24 birds, 14 reptiles and nine fish. We repeated this sampling for 10,000 iterations for each analysis, with replacement. The sample size, stratified by taxonomic class, differed slightly for the proportion threatened (IUCN) test since some species are not yet evaluated by the IUCN or designated as Data Deficient and therefore excluded from analysis. We then compared the phone enquiry median rank or proportion (i.e. observed rank/proportion) with the resulting distribution of rank or proportions from sampling of the U.S. imports. P-values were calculated as the proportion of sampling iterations that were more extreme than the observed rank or proportion. For these analyses, we only considered taxa that were resolved to the taxonomic level of species (i.e. no genus, family etc.).

#### Results

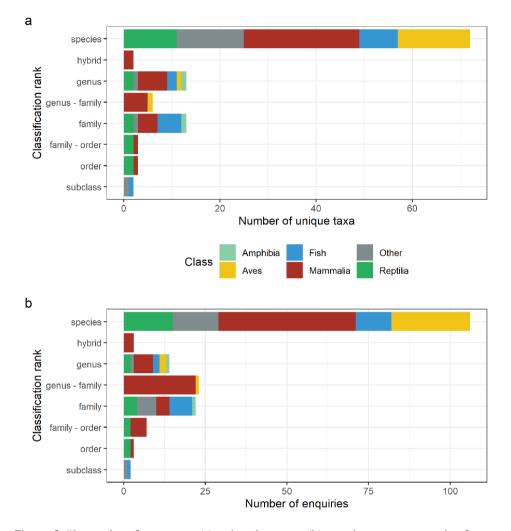
#### Summary statistics

In total, there were 196 enquiries from 150 phone calls. Most enquiries were related to the private keeping of pets (n = 180), followed by breeding for food (n = 11; Fig. 1). Across all uses, there were 126 unique taxa (subspecies, species, genus, family etc.) and 84 unique species (including subspecies), of which 114 unique taxa and 73 unique species pertained to pet enquiries (Fig. 2a, b). Mammals received the most enquiries (n = 83) followed by birds (n = 27), then reptiles (n = 25; Fig. 3a). Carnivora was the order with the most en-



**Figure 1.** The stated use and purpose of public import enquiries recorded by the Australian Government Department of Agriculture, Water and the Environment. Use was categorised using enquiry notes (Pet = private use of the animal as a pet; breeding food = commercial use of the animal to be bred as food; breeding pets = commercial use of the animal to breed and sell as pets; zoo = commercial use for display in a zoo/wildlife park; exhibitor = commercial use for exhibitions/shows; research = use of the animal for scientific research; other = use not stated).

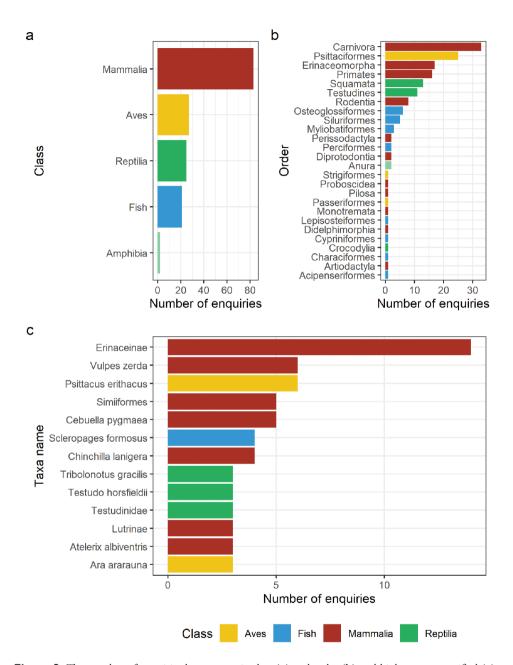
quiries, followed by parrots (Psittaciformes), then hedgehogs (Erinaceomorpha; Fig. 3b). Overall, the most enquired taxa were hedgehogs (Erinaceinae), fennec fox (*Vulpes zerda*), African grey parrot (*Psittacus erithacus*), monkeys (Simiiformes) and pygmy marmoset (*Cebuella pygmaea*; Fig. 3c). The two most commonly enquired non-vertebrate taxa were tarantula spiders (Theraphosidae, n = 14) and freshwater atyid shrimp (*Caridina*, n = 5). All remaining non-vertebrate taxa (n = 3) had a single enquiry each.



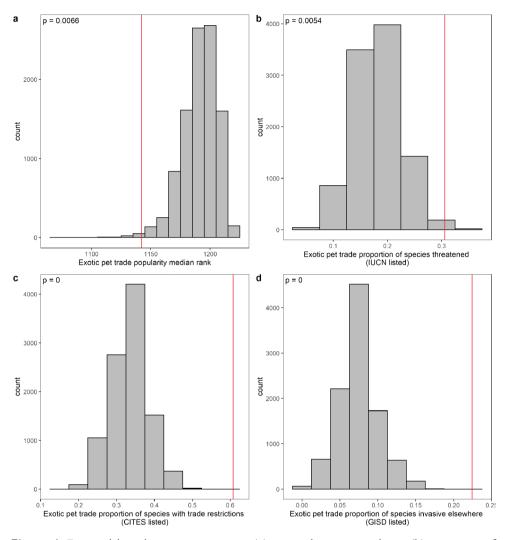
**Figure 2.** The number of unique taxa (**a**) and total enquiries (**b**) according to taxonomic classification rank for enquiries relating the private use of keeping or importing pets. We resolved the species or common names mentioned by the enquirers to the most specific possible taxonomic rank. Here, species refers to both species and subspecies. Genus – family corresponds to taxonomic ranks in between genus and family (i.e. tribe, subfamily) and family – order corresponds to taxonomic ranks in between family and order (i.e. infra-order). Colours correspond to the taxonomic class, where fish includes Chondrichthyes and Actinopterygii. Other taxonomic class refers to taxa not in vertebrate (Vertebrata) classes.

#### **Comparative analysis**

We found that enquired species were more popular than expected by chance compared to species in the U.S. exotic pet trade (p = 0.007, Fig. 4a). We found that the proportion of enquired species threatened by extinction (IUCN listed) is higher than the



**Figure 3.** The number of enquiries by taxonomic class (**a**) and order (**b**) and highest taxa specified (**c**), excluding invertebrates. The subfamily Erinaceinae includes hedgehogs, *Vulpes zerda* is the fennec fox, *Psittacus erithacus* is the African grey parrot, order Simiiformes refers to monkeys, *Cebuella pygmaea* is the pygmy marmoset, *Scelropages formosus* is the Asian arowana, *Chinchilla lanigera* is the long-tailed chinchilla, *Tribolonotus gracilis* is the red-eyed crocodile skink, *Testudo horsfieldii* is the Russian tortoise, the family Testudinidae includes tortoises, the family Lutrinae include otters, *Atelerix albiventris* is the four-toed hedgehog and *Ara ararauna* is the blue-and-yellow macaw.



**Figure 4.** Empirical hypothesis tests comparing: (**a**) enquired species popularity; (**b**) proportion of threatened species; (**c**) proportion of international trade-restricted species; and (**d**) proportion of invasive species, to the overall exotic pet trade. Each histogram represents 10,000 iterations of random sampling from the U.S. Fish and Wildlife imports dataset from 1999–2016 (representative of the Western exotic pet trade), stratified by taxonomic class. Red lines correspond to the 'observed' median rank or proportion from the enquired species. P-values are calculated as the proportion of sampling iterations that fall to the left or right of the observed rank or proportion. Non-vertebrate taxa were not included in these analyses.

proportion in overall pet trade (p = 0.005, Fig. 4b). Additionally, we found that the proportion of enquired species with trade restrictions (CITES listed) is higher than the proportion in overall pet trade (p < 0.005, Fig. 4c). Finally, we found that the proportion of enquired species that are invasive species elsewhere (GISD listed) is higher than the proportion found in overall pet trade (p < 0.005, Fig. 4d).

### Discussion

Australia imposes strict legislation to prevent the importation of alien vertebrate species (Henderson and Bomford 2011), yet the continual rise in illegally smuggled pets suggests that biosecurity efforts are being undermined (Toomes et al. 2019). Here, we characterised the attributes of desirable alien species. In the absence of direct information on which illegal alien species are most desirable, our approach serves as a reasonable first step to identify the characteristics of species that can be a future and conservation biosecurity threat. We revealed that the Australian desire for illegal alien pets is biased towards species threatened with extinction, species with global trade restrictions in place, species with a history of successful invasions and species frequently imported into the U.S., a western market with less stringent pet-trade regulations. In addition, we show a taxonomic bias towards a desire for mammal species. This knowledge is easily interpretable and can be used to anticipate future trends in illegal animal imports and to focus biosecurity surveillance efforts.

Our findings that desired species were more likely to be IUCN-listed and CITESlisted compared to overall trade are consistent with the Anthropogenic Allee Effect, a process in which the trade and harvest of a species increases with rarity due to its effect on perceived value (Courchamp et al. 2006; Holden and McDonald-Madden 2017). Specifically, our results show a bias towards CITES-listed primates, some of which have previously been seized from illegal captivity in Australia, such as the pygmy marmoset (*Cebuella pygmaea*) (Toomes et al. 2019). In Thailand, Siriwat et al. (2019) found a high number of primates for sale in various social media groups, as well as price-rarity dynamics consistent with the Anthropogenic Allee Effect.

In addition to conservation indicators, we found that desired species were much more likely to be invasive than expected by chance. Unlike the Anthropogenic Allee Effect, we are not aware of any study that shows a correlation between desirability of a species and their invasion status. This novel finding is of great concern for biosecurity agencies because it suggests that a filtering process is occurring where illegally smuggled animals may already be "pre-selected" to have the characteristics that are correlated with invasive species. For instance, traits closely associated with successful invasions include high fecundity and broad climatic tolerances (Herrel and van der Meijden 2014; Capellini et al. 2015; Howeth et al. 2016). In addition, the most desired taxa (mammals and birds) are considered 'charismatic', meaning people prefer them due to their appearance, behaviour or function (Beeves et al. 2019). These charismatic taxa may present an additional challenge to biosecurity because, if they become introduced or established, the general public may oppose eradication efforts (e.g. free-roaming horses in Australia, monk parakeets in the U.S. (Crowley et al. 2017; Knight 2019; Pruett-Jones et al. 2012)). Some examples of enquired species, which have yet to be detected in Australia but have established invasive species elsewhere, include the Argentine black and white tegus (S. merianae) (Johnson et al. 2017) and raccoon dogs (Nyctereutes procyonoides) (Kauhala and Kowalczyk 2011), representing potential future biosecurity risks for Australia. However, we emphasise that the probability of establishment of alien

species, as well as the scale of potential impacts, should be considered alongside public desire in determining high-priority biosecurity threats (Bacher et al. 2018; Blackburn et al. 2014; Bomford et al. 2009; Cassey et al. 2014; Davidson et al. 2016).

Our analysis relied on information collected in the style of a self-selecting survey from people interested in acquiring alien species, particularly pets. This does not necessarily represent actual intentions to illegally acquire alien pets and it remains unknown how desirability and introduction efforts are correlated. Given the records of illegally smuggled animals and illegally kept pets in Australia (Toomes et al. 2019), it is clear that there are people in Australia intent on acquiring illegal-alien pets. Whether the enquirers' desired pets are aligned with people who illegally acquire pets has not been tested. Therefore, one future avenue of research would be to interview people involved in the illicit trade. However, this is a problem with illegal activities in general; it is difficult to acquire information as people are unwilling to disclose or admit to illicit actions (Gnambs and Kaspar 2015). Following survey methodologies developed in the field of criminology may be useful to acquire information about the species in the illicit trade and the motives behind the want to acquire these species (Kleck and Roberts 2012). Similarly, these methods could be used to contact existing Australian wildlife breeders/ traders and acquire a list of desired species that would be traded if legalised. Such a dataset would provide a representative sample of Australian wildlife traders and would help verify the extent to which anonymous enquiries are representative.

The legislative framework surrounding the import of alien pets, to which our enquiry data pertain, has a number of shortcomings that need to be addressed in order for the threat of alien imports to be reduced. In particular, there are discrepancies between what can be legally imported into Australia and what can be legally kept in domestic captivity as part of the national permitted list (Part 13A of the EPBC 1999) or State/Territory legislation. A large number of species are not permitted for live import, yet possession of live individuals within Australia is not necessarily a prosecutable offence unless evidence can be provided that the individuals have an illegal origin (Ciavaglia et al. 2015). Such evidence, requiring forensic analysis of provenance (e.g. Campbell et al. (2019)) is rarely available and costly to acquire. Thus, the purportedly captive-bred trade of species which potentially pose high biosecurity risks to Australia and which potentially originated from illegal import, continues unabated. We recommend renewed priority in addressing this legislative gap, including a national audit of alien species currently traded, in order to increase synergy between permitted imports and legal captive keeping.

Using U.S. import frequency, we have demonstrated that Australian import enquiries are heavily biased towards species popular in an overseas western market. The underlying process behind this observation deserves more investigation. We hypothesise that both U.S. legal trade and Australian demand for alien pets are driven by the same underlying processes, facilitated by the emergent role of social media in providing access to and awareness of available pets (Clarke et al. 2019; Harrington et al. 2019; Kitson and Nekaris 2017). Under this hypothesis, DAWE enquiries would represent a random sample of desire for species in the U.S. trade weighted by their popularity. This suggests the U.S. import data may have considerable utility for Australian biosecurity in predicting species that are likely to either be illegally present yet undetected, or arrive illegally in the short-term future. This is exemplified by the fact that the vast majority (98.7%) of the 75 alien reptile species detected in Australia are present in the U.S. trade (Toomes et al. 2019). Further research aims to test these hypotheses with a comparative analysis between U.S. imports and the interception records collated by Toomes et al. (2019).

# Conclusions

Invasive alien species have the potential to be introduced into Australia despite substantial investment in border and post-border biosecurity. We characterised a subset of domestic desire for alien pets via public import enquiries and identified several biases pertinent to both biosecurity and the conservation of threatened species. Specifically, desired species are more likely to be threatened by extinction and be invasive species elsewhere compared to species in the overall pet trade. Moreover, we emphasise the need for modifications to Australia's live import list in order to maintain relevance with a rapidly changing international pet trade. Finally, the utility of the U.S. pet demand as a predictor of Australian desire for alien pets needs to be investigated further and for other regional pet markets, in order to foster greater biosecurity preparedness.

# Acknowledgements

We would like to thank Jo Beath, Julie Quinn and Alex Blander from the Australian Government Department of Agriculture, Water and the Environment for providing access to de-identified digitised public enquiry data. This research was funded by the Centre for Invasive Species Solutions (Project PO1-I-002). The authors have declared that no competing interests exist.

# References

- Ashley S, Brown S, Ledford J, Martin J, Nash A-E, Terry A, Tristan T, Warwick C (2014) Morbidity and mortality of invertebrates, amphibians, reptiles, and mammals at a major exotic companion animal wholesaler. Journal of Applied Animal Welfare Science 17: 308–321. https://doi.org/10.1080/10888705.2014.918511
- Auliya M, Altherr S, Ariano-Sanchez D, Baard EH, Brown C, Brown RM, Cantu J-C, Gentile G, Gildenhuys P, Henningheim E, Hintzmann J, Kanari K, Krvavac M, Lettink M, Lippert J, Luiselli L, Nilson G, Nguyen TQ, Nijman V, Parham J, Pasachnik SA, Pedrono M, Rauhaus A, Cordova R, Sanchez M-E, Schepp U, van Schingen M, Schneeweiss N, Segniagbeto GH, Somaweera R, Sy E, Türkozan O, Vinke S, Vinke T, Vyas R, Williamson S, Ziegler T (2016) Trade in live reptiles, its impact on wild populations, and the role of the European market. Biological Conservation 204: 103–119. https://doi.org/10.1016/j.biocon.2016.05.017

- Bacher S, Blackburn TM, Essl F, Genovesi P, Heikkilä J, Jeschke JM, Jones G, Keller R, Kenis M, Kueffer C (2018) Socio-economic impact classification of alien taxa (SEICAT). Methods in Ecology and Evolution 9: 159–168. https://doi.org/10.1111/2041-210X.12844
- Baker SE, Cain R, Van Kesteren F, Zommers ZA, D'cruze N, Macdonald DW (2013) Rough trade: animal welfare in the global wildlife trade. BioScience 63: 928–938. https://doi. org/10.1525/bio.2013.63.12.6
- Bergin D, Atoussi S, Waters S (2018) Online trade of Barbary macaques Macaca sylvanus in Algeria and Morocco. Biodiversity and Conservation 27: 531–534. https://doi.org/10.1007/ s10531-017-1434-5
- Blackburn TM, Essl F, Evans T, Hulme PE, Jeschke JM, Kühn I, Kumschick S, Marková Z, Mrugała A, Nentwig W (2014) A unified classification of alien species based on the magnitude of their environmental impacts. PLoS Biology 12: e1001850. https://doi. org/10.1371/journal.pbio.1001850
- Bomford M, Kraus F, Barry SC, Lawrence E (2009) Predicting establishment success for alien reptiles and amphibians: a role for climate matching. Biological Invasions 11: 713. https:// doi.org/10.1007/s10530-008-9285-3
- Brooks, EG, Roberton, SI, Bell, DJ (2010) The conservation impact of commercial wildlife farming of porcupines in Vietnam. Biological Conservation 143: 2808–2814. https://doi. org/10.1016/j.biocon.2010.07.030
- Bush ER, Baker SE, Macdonald DW (2014) Global trade in exotic pets 2006–2012. Conservation Biology 28: 663–676. https://doi.org/10.1111/cobi.12240
- Campbell CD, Pecon-Slattery J, Pollak R, Joseph L, Holleley CE (2019) The origin of exotic pet sugar gliders (Petaurus breviceps) kept in the United States of America. PeerJ 7: e6180. https://doi.org/10.7717/peerj.6180
- Capinha C, Seebens H, Cassey P, García-Díaz P, Lenzner B, Mang T, Moser D, Pyšek P, Rödder D, Scalera R (2017) Diversity, biogeography and the global flows of alien amphibians and reptiles. Diversity and Distributions 23: 1313–1322. https://doi.org/10.1111/ddi.12617
- Cassey P, Delean S, Lockwood JL, Sadowski J, Blackburn TM (2018) Dissecting the null model for biological invasions: A meta-analysis of the propagule pressure effect. PLoS Biology 16: e2005987. https://doi.org/10.1371/journal.pbio.2005987
- Cassey P, Prowse TA, Blackburn TM (2014) A population model for predicting the successful establishment of introduced bird species. Oecologia 175: 417–428. https://doi.org/10.1007/s00442-014-2902-1
- Ciavaglia S, Dridan H, Paul Kirkbride K, Linacre A (2015) Current issues with the investigation of wildlife crime in Australia: problems and opportunities for improvement. Journal of International Wildlife Law & Policy 18: 244–263. https://doi.org/10.1080/13880292 .2015.1074008
- CITES (2019) The Checklist of CITES Species Website. CITES Secretariat, Geneva, Switzerland. Compiled by UNEP-WCMC, Cambridge, UK. http://checklist.cites.org [accessed 11 July 2019]
- Clarke TA, Reuter KE, LaFleur M, Schaefer MS (2019) A viral video and pet lemurs on Twitter. PloS one 14: e0208577. https://doi.org/10.1371/journal.pone.0208577

- Crowley SL, Hinchliffe S, McDonald RA (2017) Conflict in invasive species management. Frontiers in Ecology and the Environment 15: 133–141. https://doi.org/10.1002/fee.1471
- Davidson A, Fusaro A, Sturtevant RA, Kashian DR (2016) Development of a risk assessment framework to predict invasive species establishment for multiple taxonomic groups and vectors of introduction. Management of Biological Invasions 8: 25–36. https://doi.org/10.3391/mbi.2017.8.1.03
- Department of the Environment and Energy (2019) List of specimens taken to be suitable for live import. https://www.legislation.gov.au/Details/F2014C00647 [accessed 21 June 2019]
- Eskew EA, White AM, Ross N, Smith KM, Smith KF, Rodríguez JP, Zambrana-Torrelio C, Karesh WB, Daszak P (2019) United States wildlife and wildlife product imports from 2000–2014. BioRxiv: 780197. https://doi.org/10.1101/780197
- Fredberg J, McNeil DG (2010) Review of non-native ornemental fish species grey listed in Australia. Report to the Ornamental Fish Management Implementation Group (OFMIG). South Australian Research and Development Institute, Adelaide, South Australia.
- García-Díaz P, Ramsey DS, Woolnough AP, Franch M, Llorente GA, Montori A, Buenetxea X, Larrinaga AR, Lasceve M, Álvarez A (2017) Challenges in confirming eradication success of invasive red-eared sliders. Biological Invasions 19: 2739–2750. https://doi.org/10.1007/ s10530-017-1480-7
- García-Díaz P, Ross JV, Ayres C, Cassey P (2015) Understanding the biological invasion risk posed by the global wildlife trade: propagule pressure drives the introduction and establishment of Nearctic turtles. Global Change Biology 21: 1078–1091. https://doi.org/10.1111/gcb.12790
- GBIF (2019) Home Page. https://www.gbif.org/en/citation-guidelines [accessed 01 July 2019]

Global Invasive Species Database (2019) http://www.iucngisd.org/gisd/ [accessed 02 July 2019]

- Gnambs T, Kaspar K (2015) Disclosure of sensitive behaviors across self-administered survey modes: a meta-analysis. Behavior Research Methods 47: 1237–1259. https://doi.org/10.3758/s13428-014-0533-4
- Harfoot M, Glaser SA, Tittensor DP, Britten GL, McLardy C, Malsch K, Burgess ND (2018) Unveiling the patterns and trends in 40 years of global trade in CITES-listed wildlife. Biological Conservation 223: 47–57. https://doi.org/10.1016/j.biocon.2018.04.017
- Harrington L, Macdonald D, D'Cruze N (2019) Popularity of pet otters on YouTube: evidence of an emerging trade threat. Nature Conservation 36: 17–45. https://doi.org/10.3897/natureconservation.36.33842
- Henderson W, Bomford M (2011) Detecting and preventing new incursions of exotic animals in Australia. (Invasive Animals Cooperative Research Centre: Canberra, ACT, Australia).
- Henderson W, Bomford M, Cassey P (2011) Managing the risk of exotic vertebrate incursions in Australia. Wildlife Research 38: 501–508. https://doi.org/10.1071/WR11089
- Holden MH, McDonald-Madden E (2017) High prices for rare species can drive large populations extinct: the anthropogenic Allee effect revisited. Journal of Theoretical Biology 429: 170–180. https://doi.org/10.1016/j.jtbi.2017.06.019
- Holmes N, Campbell K, Keitt B, Griffiths R, Beek J, Donlan C, Broome K (2016) Correction: reporting costs for invasive vertebrate eradications. Biological Invasions 18: 2801–2807. https://doi.org/10.1007/s10530-016-1187-1

- Jardine SL, Sanchirico JN (2018) Estimating the cost of invasive species control. Journal of Environmental Economics and Management 87: 242–257 https://doi.org/10.1016/j. jeem.2017.07.004
- Johnson FA, Smith BJ, Bonneau M, Martin J, Romagosa C, Mazzotti F, Waddle H, Reed RN, Eckles JK, Vitt LJ (2017) Expert elicitation, uncertainty, and the value of information in controlling invasive species. Ecological Economics 137: 83–90 https://doi.org/10.1016/j. ecolecon.2017.03.004
- Kauhala K, Kowalczyk R (2011) Invasion of the raccoon dog Nyctereutes procyonoides in Europe: history of colonization, features behind its success, and threats to native fauna. Current Zoology 57: 584–598 https://doi.org/10.1093/czoolo/57.5.584
- Kitson H, Nekaris K (2017) Instagram-fuelled illegal slow loris trade uncovered in Marmaris, Turkey. Oryx 51: 394–394 https://doi.org/10.1017/S0030605317000680
- Knight AR (2019) How can the social sciences work with ecology in informing feral horse policy and management in south-eastern Australia? Ecological Management & Restoration 20: 9–12 https://doi.org/10.1111/emr.12366
- Lockwood JL, Welbourne DJ, Romagosa CM, Cassey P, Mandrak NE, Strecker A, Leung B, Stringham OC, Udell B, Episcopio-Sturgeon DJ (2019) When pets become pests: the role of the exotic pet trade in producing invasive vertebrate animals. Frontiers in Ecology and the Environment 17: 323–330 https://doi.org/10.1002/fee.2059
- Lyons JA, Natusch DJ (2011) Wildlife laundering through breeding farms: illegal harvest, population declines and a means of regulating the trade of green pythons (Morelia viridis) from Indonesia. Biological Conservation 144, 3073–3081. https://doi.org/10.1016/j.biocon.2011.10.002
- Mandimbihasina AR, Woolaver LG, Concannon LE, Milner-Gulland E, Lewis RE, Terry AM, Filazaha N, Rabetafika LL, Young RP (2020) The illegal pet trade is driving Madagascar's ploughshare tortoise to extinction. Oryx 54, 188–196. https://doi.org/10.1017/ S0030605317001880
- McFadden MS, Topham P, Harlow PS (2017) A Ticking Time Bomb: Is the illegal pet trade a pathway for the establishment of Corn Snake (*Elaphe guttata*) populations in Australia? Australian Zoologist 38: 499–504 https://doi.org/10.7882/AZ.2017.006
- Morgan J, Chng S (2018) Rising internet-based trade in the Critically Endangered ploughshare tortoise Astrochelys yniphora in Indonesia highlights need for improved enforcement of CITES. Oryx 52: 744–750 https://doi.org/10.1017/S003060531700031X
- Natusch DJ, Lyons JA (2012) Exploited for pets: the harvest and trade of amphibians and reptiles from Indonesian New Guinea. Biodiversity and Conservation 21, 2899–2911. https://doi.org/10.1007/s10531-012-0345-8
- Pruett-Jones S, Appelt CW, Sarfaty A, Van Vossen B, Leibold MA, Minor ES (2012) Urban parakeets in Northern Illinois: A 40-year perspective. Urban Ecosystems 15: 709–719 https://doi.org/10.1007/s11252-011-0222-3
- Romagosa C (2014) Patterns of live vertebrate importation into the United States: Analysis of an invasion pathway. Invasive species in a globalized world: Ecological, social, and legal perspectives on policy: 115–146

- Rout T, Kirkwood R, Sutherland D, Murphy S, McCarthy M (2014) When to declare successful eradication of an invasive predator? Animal Conservation 17: 125–132 https://doi. org/10.1111/acv.12065
- Shepherd CR (2010) Illegal primate trade in Indonesia exemplified by surveys carried out over a decade in North Sumatra. Endangered Species Research 11, 201–205. https://doi.org/10.3354/esr00276
- Shepherd CR, Janssen J, Noseworthy J (2019) A case for listing the Union Island Gecko Gonatodes daudini in the Appendices of CITES. Global Ecology and Conservation 17: e00549 https://doi.org/10.1016/j.gecco.2019.e00549
- Siriwat P, Nekaris K, Nijman V (2019) The role of the anthropogenic Allee effect in the exotic pet trade on Facebook in Thailand. Journal for Nature Conservation 51: 125726 https:// doi.org/10.1016/j.jnc.2019.125726
- Siriwat P, Nijman V (2018) Illegal pet trade on social media as an emerging impediment to the conservation of Asian otters species. Journal of Asia-Pacific Biodiversity 11, 469–475. https://doi.org/10.1016/j.japb.2018.09.004
- Smith K, Zambrana-Torrelio C, White A, Asmussen M, Machalaba C, Kennedy S, Lopez K, Wolf T, Daszak P, Travis D (2017) Summarizing US wildlife trade with an eye toward assessing the risk of infectious disease introduction. EcoHealth 14: 29–39 https://doi. org/10.1007/s10393-017-1211-7
- Smith KF, Behrens M, Schloegel LM, Marano N, Burgiel S, Daszak P (2009) Reducing the risks of the wildlife trade. Science 324: 594–595 https://doi.org/10.1126/science.1174460
- Smith KF, Behrens MD, Max LM, Daszak P (2008) US drowning in unidentified fishes: scope, implications, and regulation of live fish import. Conservation Letters 1: 103–109 https:// doi.org/10.1111/j.1755-263X.2008.00014.x
- Strecker AL, Campbell PM, Olden JD (2011) The aquarium trade as an invasion pathway in the Pacific Northwest. Fisheries 36: 74–85 https://doi.org/10.1577/03632415.2011.103 89070
- Stringham OC, Lockwood JL (2018) Pet problems: Biological and economic factors that influence the release of alien reptiles and amphibians by pet owners. Journal of Applied Ecology. https://doi.org/10.1111/1365-2664.13237
- Toomes A, García-Díaz P, Wittmann TA, Virtue J, Cassey P (2019) New aliens in Australia: 18 years of vertebrate interceptions. Wildlife Research 47: 55–67. https://doi.org/10.1071/WR18185
- Vall-Ilosera M, Woolnough AP, Anderson D, Cassey P (2017) Improved surveillance for early detection of a potential invasive species: the alien Rose-ringed parakeet *Psittacula krameri* in Australia. Biological Invasions 19: 1273–1284. https://doi.org/10.1007/s10530-016-1332-x

**RESEARCH ARTICLE** 



# Into the great wide open: do alien plants spread from rivers to dry savanna in the Kruger National Park?

Petr Pyšek<sup>1,2,3</sup>, Martin Hejda<sup>1</sup>, Jan Čuda<sup>1</sup>, Guin Zambatis<sup>4</sup>, Klára Pyšková<sup>1,2</sup>, Sandra MacFadyen<sup>5</sup>, David Storch<sup>2,6</sup>, Robert Tropek<sup>2,7</sup>, Llewellyn C. Foxcroft<sup>4,3</sup>

Czech Academy of Sciences, Institute of Botany, Department of Invasion Ecology, CZ-252 43 Průhonice, Czech Republic 2 Department of Ecology, Faculty of Science, Charles University, Viničná 7, CZ-128 44 Prague, Czech Republic 3 Centre for Invasion Biology, Department of Botany & Zoology, Stellenbosch University, Matieland 7602, South Africa 4 Scientific Services, South African National Parks, Private Bag X402, Skukuza 1350, South Africa 5 Biodiversity Informatics Unit, Department of Mathematical Sciences, Stellenbosch University, Matieland 7602, South Africa 6 Center for Theoretical Study, Charles University, Jilská 1, CZ-110 00 Prague, Czech Republic 7 Institute of Entomology, Biology Centre, Czech Academy of Sciences, České Budějovice, Czech Republic

Corresponding author: Petr Pyšek (pysek@ibot.cas.cz)

Academic editor: Sven Jelaska | Received 22 May 2020 | Accepted 22 July 2020 | Published 18 August 2020

**Citation:** Pyšek P, Hejda M, Čuda J, Zambatis G, Pyšková K, MacFadyen S, Storch D, Tropek R, Foxcroft LC (2020) Into the great wide open: do alien plants spread from rivers to dry savanna in the Kruger National Park? NeoBiota 60: 61–77. https://doi.org/10.3897/neobiota.60.54608

#### Abstract

Protected areas play an important role as refuges from invasive species impacts on biodiversity. Within the MOSAIK (Monitoring Savanna Biodiversity in the Kruger National Park) project, plant species were recorded in a representative set of 60 plots, 50 × 50 m in size, across the entire KNP, distributed so as to cover a range of savanna habitats, i.e. perennial rivers, seasonal rivers and dry crests, and two main bedrock types (granite and basalt). The data were used to assess the role of rivers in the dispersal of alien plants and study whether the alien plant species spread from rivers to open dry savanna. The resulting dataset provided the first thorough information on the spatial distribution of naturalised alien plants in KNP. In total, we recorded 20 plant species that are alien to the park, four of them considered invasive: *Parthenium hysterophorus, Opuntia stricta, Xanthium strumarium* and *Zinnia peruviana*. The most widespread species in KNP was *Tridax procumbens*, recorded in 11 plots (i.e. 18% of all sampled), four other species were found in > 10% of the plots. One species, *Bidens bipinnata*, was not previously reported from the park and represents a new record. The majority of aliens were concentrated along perennial rivers (60% of all occurrences), but some were repeatedly recorded at seasonal rivers as well and two of the most invasive species in KNP, *Opuntia stricta* and *Parthenium hysterophorus*, occurred also on dry crests away from water.

Copyright Petr Pyšek et al. This is an open access article distributed under the terms of the Creative Commons Attribution License (CC BY 4.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

The average number of alien species per plot was low (1.6), as was their mean percentage contribution to all species in a plot (2.2%), but some plots harboured as many as seven species and contributed up to 11.9%. Moreover, only 21 plots (35%) were alien-species free. In terms of the total species number per habitat, perennial rivers had significantly more aliens than crests and were marginally significantly richer than seasonal rivers. By recording all naturalised alien species occurring in the plots – many of them are not invasive but may become so in the future – and by using the GloNAF database of global distribution of naturalised species, we assessed the invasion potential of the recorded species.

#### Keywords

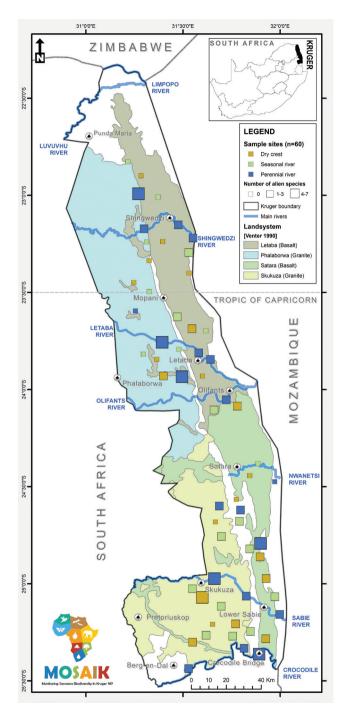
alien species richness, crest, habitat, perennial river, plant invasion, protected area, savanna, seasonal river

#### Introduction

The majority of protected areas worldwide are vulnerable to invasions, with very few completely free of alien species (Foxcroft et al. 2017; Moodley et al. 2020) and many suffering various impacts at the species and community levels. These impacts include the alteration of habitats, ecosystem regime shifts and losses to native species abundance, diversity and richness (Foxcroft et al. 2013; Hulme et al. 2014; Pyšek et al. 2020). In a global assessment, De Poorter (2007) found there were 487 protected areas where invasive alien species posed a serious threat to biodiversity. Along these lines, invasive plants are almost universally regarded as a major threat by managers of protected areas (Pyšek et al. 2020). These authors compared how the threat by and management of invasive species have changed in a representative set of 21 protected areas that were included in the international SCOPE programme on biological invasions in the mid-1980s (Drake et al. 1989). Amongst the taxonomic groups analysed, invasive plants pose the greatest continued threat, as documented by increased numbers in 31% of the protected areas over ~30 years from 1980s to the present (Shackleton et al. 2020).

One of the iconic protected areas included into the SCOPE programme is the Kruger National Park (KNP) in South Africa. Established in 1898, it is the largest game reserve in South Africa and one of the oldest national parks in the world (Carruthers 1995). It covers an area of ~20,000 km<sup>2</sup>, the majority in a subtropical climate with the Tropic of Capricorn crossing the park in the North. Several large, mostly perennial, rivers flow through the park in a west-east direction, including Sabie, Olifants, Crocodile, Letaba, Shingwedzi, Luvuvhu and Limpopo (Fig. 1, MacFadyen et al. 2018). Environmental heterogeneity is generated by a mosaic of geological conditions (granitoid bedrock in the western vs. basalt and gabro in the eastern part), altitude (140–780 m a.s.l.), climate (450–750 mm of annual precipitation) and character of vegetation (dominant woody species, proportional representation of woody cover vs. open grassland; du Toit et al. 2003; MacFadyen et al. 2016).

There are about 360 alien plant species currently recorded in KNP (Foxcroft et al. 2017), of which only a few are considered noxious invaders (Jarošík et al. 2011).



**Figure 1.** The Kruger National Park situated between latitudes 22°19'40"S to 25°31'44"S and longitudes 30°53'18"E to 32°01'59"E, with location of the 60 sampled sites, separated according to habitat and distributed across the four land systems. The size of the symbols indicates the number of alien plant species recorded in the plot.

The boundaries of KNP were shown to act as a barrier to invasions from the surrounding intensively-used agricultural landscape or urbanised areas (Foxcroft et al. 2011), in accordance with the role protected areas play in other parts of the world by offering refuges from invasive species (Pyšek et al. 2003; Gallardo et al. 2017). For KNP, it has been shown that the best human-related predictors of the number of alien invasive plants inside the park were the amount of water bringing propagules from adjacent densely populated areas, together with density of major roads (Foxcroft et al. 2011) and human settlements in the park surroundings (Spear et al. 2013). A study of invasive species across South African National Parks identified ornamental planting and rivers as the primary pathways of invasion (Foxcroft et al. 2019) – a large number of alien ornamental species and alien species occurring along rivers are reported for KNP (Foxcroft et al. 2008). Therefore, a great threat from alien plant invasions to KNP is associated with rivers that act as the most efficient pathways for propagules from adjacent areas. However, while these indicators represent the potential for introduction of alien plants into KNP, the context dependence of the invasion process requires study at finer scales to determine which alien species may become naturalised and invade within KNP.

In response to the escalating importance of plant invasions, KNP has initiated a number of programmes aimed at preventing and mitigating incursions of alien species (van Wilgen et al. 2017). These efforts have yielded data on the distribution of major invaders through long-term monitoring (Foxcroft et al. 2009) and species-specific studies on the ecology of particular invaders (Foxcroft et. al. 2004; Hui et al. 2011). However, as is often the case in plant invasion research, the data collection focused on alien species hotspots, such as human-disturbed habitats or rivers and, to date, none of the projects in KNP has systematically investigated the distribution of alien plants across the entire park or assessed how successfully they persist across a range of different habitats.

To contribute to closing this gap, we use our data collected by the MOSAIK (Monitoring Savanna Biodiversity in the Kruger National Park) project aimed at studying biodiversity across the entire KNP, within four distinct land systems with variable supply of water and contrasting geologies. Here we aim to (i) describe the distribution of alien plant species, (ii) assess to what extent alien plants are confined to rivers as the main introduction pathways and dispersal vectors, versus how commonly they occur in drier habitats away from rivers and (iii) identify potentially invasive species of the future.

# Methods

# Data collection

The data analysed in this paper were collected within the MOSAIK project between 2018 and 2020. MOSAIK's primary objective is to sample plant and animal (mammals, birds, bats and moths) biodiversity in habitats across different land systems in

KNP (as defined by Venter 1990). To this purpose, we established triplets of  $50 \times 50$  m plots, each triplet including a site (i) near a perennial river or another permanent source of water, such as a dam or pool (the criterion being water present all year round), (ii) near a seasonal river, defined as a river or stream where water is only present in the rainy season and (iii) on a dry crest at least 5 km from any source of water (Fig. 2). The plots within each triplet were selected to capture the different habitats in a similar landscape context within a reasonable distance of ~7–13 km between plots. There were 20 triplets distributed so as to cover the four land systems (five triplets in each), giving a total of 60 plots (Fig. 1). Consequently, each of the three habitats was sampled by 20 plots and each of the two bedrock types by 30 plots.

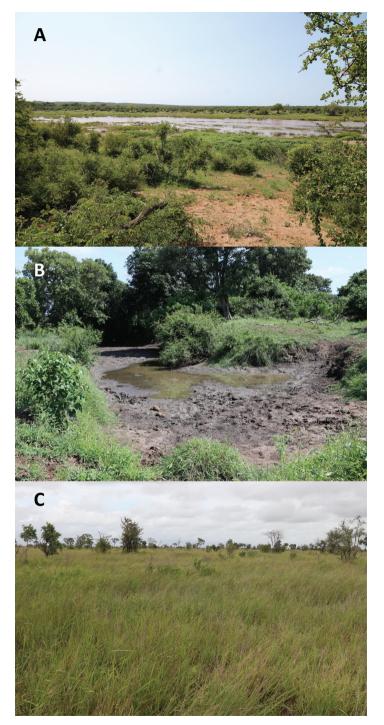
Plants were sampled during two rainy seasons, 16 January to 4 February 2019 and 17 January to 3 February 2020. All vascular plant species were recorded in each 2500 m<sup>2</sup> plot and their abundance estimated visually using the Braun-Blanquet coverabundance seven-grade scale (Mueller-Dombois and Ellenberg 1974). To quantify the occurrence of species in plots, the Braun-Blanquet scores were tranformed to percentage values as follows: 5 = 87.5%, 4 = 62.5%, 3 = 37.5%, 2 = 15%, 1 = 2.5%, + = 1.0%, r = 0.02% (van der Maarel 1979). The time spent to sample a plot ranged from 1 to 7 hours, with an average of  $2:15 \pm 1:01$  hour (mean  $\pm$  S.D.).

Species that are alien to South Africa were selected for analyses in this paper. To assign species an alien status, we followed geographical criteria broadly accepted in the invasion literature, referring to species introduced by humans to regions outside their native range (see Pyšek et al. 2004; Essl et al. 2018 for definitions). Further, to classify which of the recorded alien species are naturalised (forming self-sustainable populations in the wild) or invasive (subgroup of naturalised species rapidly spreading in the invaded area), we followed the definition proposed by Richardson et al. (2000) and Blackburn et al. (2011). This classification of species was based on previous publications relevant to the study area (Foxcroft et al. 2017). For each species, we recorded the region of origin and life history information.

To assess the invasion potential of the alien species recorded in KNP, we extracted information on their global naturalisation success from the GloNAF (Global Naturalized Alien Flora) database (van Kleunen et al. 2015, 2019; Pyšek et al. 2017). This database includes information on the occurrence of naturalised plant species in 843 regions of the world (at the level of countries, states and provinces in case of large countries and islands) and summarises the distributions of almost 14,000 taxa. For each species recorded in our plots, we extracted the number of GloNAF records globally and in Africa.

#### Statistical analysis

Differences amongst habitats and bedrock in the mean numbers of alien species in plots were tested by using a Linear Mixed-Effects Model (LMM) (R Development Core Team 2013; Bates et al. 2015). The square-root of the number of alien species



**Figure 2.** Images of habitats that were considered in the Kruger National Park study: **A** perennial river, **B** seasonal river and **C** dry crest. The plots were located in the vicinity of the rivers, near the river beds and within the crest.

was the response variable and the type of bedrock (granite vs. basalt), habitat (seasonal rivers, perennial rivers, crests) and their interactions were the predictors. The triplets of plots were set as the random effect factor (grouping variable). Possible autocorrelations, based on the distances between individual triplets, were modelled as a continuous function, using the "cor" parameter. The significances of different predictors (bedrock, habitat, bedrock × habitat interaction) were tested using deletion tests, by comparing the explanatory power of models with and without a particular term (Crawley 2007). The quality of models was checked visually, by plotting standardised residuals against fitted values. Possible deviations from normality were inspected using probability plots. The data on the percentages of aliens amongst all species in plots were arcsin-transformed.

A log-linear model (Crawley 2007) was used to test the differences in the total numbers of aliens amongst different habitats and bedrocks. In this model, the total number of aliens was the response variable and habitat (seasonal rivers, perennial rivers, crests), bedrock (granite, basalt) and their interaction were the predictors. The significance of individual terms was tested using deletion tests, by comparing the explanatory power of models with and without that particular main effect or interaction (Crawley 2007). All models were created in the R software (R Development Core Team 2013).

#### Results

# Structure of alien flora: effects of habitat and bedrock on species' occurrence patterns

In total, we recorded 20 plant species that are classified as naturalised aliens to KNP (Table 1). Family Asteraceae was most represented with nine species, followed by Amaranthaceae with four species, Cactaceae with two species and the remaining five species in five other families. There are 13 species that occur as annuals (50%), 10 as perennials (39%), two as shrub or semi-shrub (*Malvastrum coromandelianum* and *Datura innoxia*, respectively). Four of the species recorded are considered invasive in KNP: *Parthenium hysterophorus* (recorded in nine plots, i.e. 15% of all sampled), *Xanthium strumarium* (three plots), *Opuntia stricta* (three plots) and *Zinnia peruviana* (two plots). The remaining species are considered naturalised, except *Bidens bipinnata* that was not previously reported from the park and represents a new record; for this species, the status remains to be confirmed.

The most widespread species in KNP was *Tridax procumbens*, recorded in 11 plots (i.e. 18%), other species recorded in more than 10% of plots being *Bidens biternata*, *Malvastrum coromandelianum*, *Parthenium hysterophorus* and *Alternanthera pungens* (Table 1; Fig. 3). The majority of alien species recorded in our KNP plots have successfully naturalised in various parts of the world, with 11 of them occurring in more than 100 regions globally (*Portulaca oleracea* and *Chenopodium album* with 311 and 298 regions, respectively, are the most widespread). These data indicate the overall potential of recorded alien plants to spread; the majority of them have also successfully

**Table 1.** Overview of alien plant species recorded in savanna habitats in the Kruger National Park. Total number of records, separately for basalt and granite bedrock, frequency of occurrence in plots (n = 60) and the range of covers are given (one cover value indicates that the species occurred in plots with the same cover). Species that are currently considered as invasive in KNP are marked with \* (based on Foxcroft et al. 2017). The naturalisation success is expressed as the number of regions in the GloNAF 1.1 database (n = 843, van Kleunen et al. 2015, 2019; Pyšek et al. 2017) in which the species is recorded as naturalised, shown globally and for Africa. Life history: a – annual herb, p – perennial herb, ss – subshrub. Species are ranked by decreasing frequency in KNP.

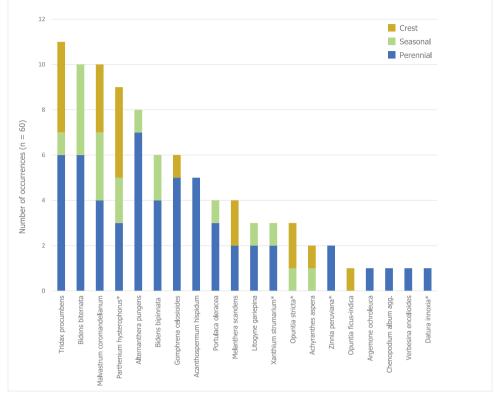
Species	Family	Life history	Origin	Occurrences	Frequency (%)	Basalt	Granite	Cover (%)	Naturalised (globally/in Africa)
Tridax procumbens	Asteraceae	а	central America	11	18.3	3	8	0.1	146/55
Bidens biternata	Asteraceae	а	East Asia (Himalayas)	10	16.7	4	6	0.1 - 15.0	31/29
Malvastrum coromandelianum	Malvaceae	a, p, ss	North America	10	16.7	5	5	0.1	161/29
Parthenium hysterophorus*	Asteraceae	р	North America	9	15.0	4	5	0.1	119/13
Alternanthera pungens	Amaranthaceae	р	tropical America	8	13.3	5	3	0.1 - 2.5	124/35
Bidens bipinnata	Asteraceae	а	Asia, North America	6	10.0	2	4	0.1-15	88/26
Gomphrena celosioides	Amaranthaceae	a, p	tropical South America	6	10.0	2	4	0.1	94/43
Acanthospermum hispidum	Asteraceae	а	tropical America	5	8.3	3	2	0.1 - 2.5	128/49
Portulaca oleracea	Portulacaceae	а	Eurasia	4	6.7	3	1	0.1	311/56
Melanthera scandens	Asteraceae	р	tropical to subtropical Africa	4	6.7	3	1	0.1	12/12
Litogyne gariepina	Asteraceae	р	obscure	3	1.7	2	1	0.1	-
Xanthium strumarium*	Asteraceae	а	America <sup>1</sup>	3	5.0	2	1	0.1	147/18
Opuntia stricta*	Cactaceae	р	North America	3	5.0	0	3	0.1	84/10
Achyranthes aspera	Amaranthaceae	a, p	Mediterranean	2	3.3	2	0	0.1	160/52
Zinnia peruviana*	Asteraceae	а	North to South America	2	3.3	1	1	0.1	45/9
Opuntia ficus-indica	Cactaceae	р	North America	1	1.7	0	1	0.1	139/40
Argemone ochroleuca	Papaveraceae	а	North America	1	1.7	1	0	0.1	96/15
Chenopodium album agg.	Amaranthaceae	а	Eurasia	1	1.7	1	0	0.1	298/28
Datura inoxia	Solanaceae	p, ss	North America	1	1.7	1	0	0.1	126/29
Verbesina encelioides	Asteraceae	а	South America	1	1.7	0	1	0.1	88/12

<sup>1</sup>some sources give Eurasia as the region of origin

naturalised in Africa. In particular, *Portulaca oleracea* (56 regions), *Tridax procumbens* (55), *Achyranthes aspera* (52), *Acanthospermum hispidum* (49) and *Gomphrena celosioides* (43) are species that are most widely naturalised in this continent (Table 1).

In terms of distribution of the recorded species by habitats, the majority were concentrated at perennial rivers. Some species, for example, *Alternanthera pungens, Gomphrena celosioides* and *Acanthospermum hispidum*, occurred almost exclusively in this habitat, whilst others, for example, *Bidens biternata, Malvastrum coromandelianum* and *Parthenium hysterophorus*, were repeatedly recorded also at seasonal rivers and *Opuntia stricta, Parthenium hysterophorus* and *Tridax procumbens* on the crests, too (Fig. 3).

The majority of species did not prefer any particular bedrock, with the exception of four species occurring more frequently on granites: *Tridax procumbens* (eight records on granites vs. three on basalts), *Bidens bipinnata, Gomphrena celosioides* (four vs. two) and *Opuntia stricta* (three records exclusively on granite). The species occurring more often on basalt bedrock were *Alternanthera pungens* (three vs. five) and *Melanthera scandens* (three vs. one) (Table 1).



**Figure 3.** Distribution of alien species in the Kruger National Park according to the savanna habitats delimited within the MOSAIK project (perennial rivers, seasonal rivers, dry crest). Numbers of occurrences (n = 20 per habitat) are shown. Species with \* are considered invasive in KNP.

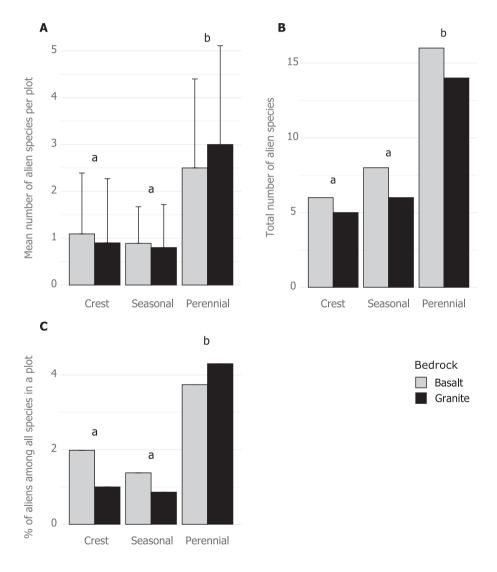
#### Levels of invasion in savanna habitats: rivers and beyond

The average number of alien species per plot was relatively low,  $1.6 \pm 1.7$  (mean  $\pm$  S.D.), but only 21 plots out of 60 were alien free, meaning that 65% of plots harboured some alien species. The maximum number of alien species per plot was seven. On average, the alien species made up 2.2% (range 0–11.9%) of all species in a plot. The numbers of alien and native species in plots were not correlated (r = 0.067, DF<sub>resid</sub> = 58, p = 0.609).

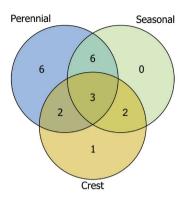
Testing the average number of aliens per plot (Fig. 4A) revealed a significant effect of habitat (LMM: deletion test,  $DF_{model} = 5$  vs. 7, L-ratio = 22.175, p < 0.001), with perennial rivers being significantly richer than seasonal rivers and crests (LMM:  $DF_{error} = 36$ , T = -2.751, p = 0.0092;  $DF_{error} = 36$ , T = -3.662, p = 0.0008, respectively).

In total, there were 17, 11 and 8 species recorded at perennial rivers, seasonal rivers and on the crest, respectively, and the total numbers of alien species in a habitat (Fig. 4B) significantly differed (log-linear model: deletion test,  $DF_{resid} = 2$  vs. 4, Dev. = -10.76, p = 0.005). Perennial rivers had significantly more aliens than crests (z = -2.842, p = 0.0125)

and seasonal rivers (z = 2.361, p = 0.048). Only three species (*Tridax procumbens, Mal-vastrum coromandelianum* and *Parthenium hysterophorus*) occurred in all three habitats. Perennial rivers had six species occurring exclusively in this habitat and another six they share with seasonal rivers (see Fig. 3), one species was found exclusively on crests (*Opuntia ficus-indica*) and none only at seasonal-river sites (Fig. 5). In terms of the number of occurrences (defined as the sum of the numbers of records over all alien species), the importance of the perennial rivers was even more pronounced. The 55 occurrences at perennial rivers



**Figure 4.** Level of invasion by bedrock and habitat. **A** Mean numbers  $\pm$  S. D. of species per plot (n = 20 per habitat) **B** total species numbers and **C** percentage of alien species amongst all species in a plot are shown for particular factors. The habitats bearing the same letter were not significantly different in the respective characteristics; the effect of bedrock was not significant.



**Figure 5.** Venn diagram showing the sharing of alien species by habitats in the Kruger National Park. *Tridax procumbens, Malvastrum coromandelianum* and *Parthenium hysterophorus* were the species recorded at all three habitats.

(compared to 18 at seasonal rivers and 18 in crest plots) means that 60.4% of all alien species' occurrences were associated with the former habitat.

The percentage of alien species per plot (Fig. 4C) differed amongst habitats (LMM: deletion test,  $DF_{model} = 5$  vs. 7, L-ratio = 7.884, p = 0.005), with perennial rivers being marginally significantly richer than crests (LMM:  $DF_{error} = 36$ , T = -2.004, p = 0.053) and significantly richer than seasonal rivers (LMM:  $DF_{error} = 36$ , T = -2.218, p = 0.033).

#### Levels of invasion: no effect of bedrock

Of the 20 alien species recorded in total, 16 were found on granites and 17 on basalts, with corresponding averages per plot  $1.6 \pm 1.9$  and  $1.5 \pm 1.5$ , respectively. Neither the main effect of bedrock, nor the bedrock × habitat interaction had significant effects on the mean number of aliens per plot (LMM: deletion test,  $DF_{model} = 6$  vs. 7, L-ratio = 0.895, p = 0.344, and  $DF_{model} = 7$  vs. 9, L-ratio = 0.294, p = 0.634, respectively; Fig. 4A), the total number of aliens in a given category (log-linear model: deletion test,  $DF_{resid} = 2$  vs. 3, Dev. = -4.55, p = 0.5; and  $DF_{resid} = 0$  vs. 2, Dev. = -0.056, p = 0.972, respectively; Fig. 4B) and the percentage of aliens amongst all species per plot (LMM: deletion test,  $DF_{resid} = 6$  vs. 7, L-ratio = 1.242, p = 0.537; and  $DF_{resid} = 5$  vs. 7, L-ratio = 1.355, p = 0.322, respectively; Fig. 4C).

#### Discussion

It has been suggested that the negative impacts of plant invasions in protected areas in African savannas are less dramatic than in the savanna regions and ecosystems in the Neotropics and Australia. Foxcroft et al. (2010) reviewed this issue and concluded that the rather low levels of savanna invasions are in part due to lower rates of intentional plant introductions to Africa, for example, less widespread planting of large numbers of grass species, the key role of large mammalian herbivores in these ecosystems, historical and biogeographical issues related to the regions of origin of introduced species and the adaptation of African ecosystems to fire. Most of these factors are especially relevant in large protected areas, such as KNP, where the above constraints to invasion are strengthened by the fact that the protected areas act as barriers to colonisation of alien species from the outside (Pyšek et al. 2003; Foxcroft et al. 2011). They also act as refuges protecting native species against combined effects of invasion and climate change, as shown for European protected areas (Gallardo et al. 2017).

Due to research conducted mostly in the temperate areas, rivers have long been recognised as major pathways of alien plant introduction to new regions; they are highly prone to invasion by alien plants, largely because of their dynamic hydrology that makes them conduits for efficient dispersal of propagules (Planty-Tabacchi et al. 1996; Hood and Naiman 2000; Sibiya 2019). Fluctuating water levels provide space for new species by removing vegetation and increasing resources by making nutrients and light available (Richardson et al. 2007; Sibiya 2019). As most rivers flow through human settlements, there are multiple opportunities for the introduction of alien propagules into riparian zones and there is quantitative evidence that alien plants concentrate in riparian sites (e.g. Chytrý et al. 2008; Pyšek et al. 2010). While some species invading riparian habitats remain restricted to the vicinity of the river, other plants spread away from the river often after a considerable time lag spanning decades (Čuda et al. 2020). This represents a major threat to vegetation beyond the riparian ecosystems and can start new invasions into habitats previously not affected.

However, we found that the threat of invasion beyond the main perennial rivers and adjacent floodplain areas, where the major invaders are concentrated (Jarošík et al. 2011), is currently relatively minor in KNP. The majority of aliens recorded by our survey still occur at plots located near perennial rivers - but not all (Fig. 1). Some of the species not confined to rivers are amongst the most widespread, for example, Bidens biternata, Malvastrum coromandelianum and Parthenium hysterophorus and were repeatedly recorded also at seasonal-river plots. More importantly, two of the most invasive plants in the park, Opuntia stricta and Parthenium hysterophorus, were also found on the crest plots. Apparently, despite the successful biological control of Opuntia stricta in KNP in 1980s-1990s (Foxcroft et al. 2004), this invasive species is still present in dry areas of the savanna and could potentially start a new invasion. In addition, almost all of the alien plants we recorded in KNP have successfully naturalised in many regions of the world, half of them in more than 100 regions, which needs to be taken as a warning of the potential for many species to become serious invaders in KNP in the future. That these alien species successfully persist in subtropical and tropical climates is evident from all of them having naturalised in many other African regions, too, and five being distributed in more than 40 regions on this continent (Portulaca oleracea, Tridax procumbens, Achyranthes aspera, Acanthospermum hispidum and Gomphrena celosioides). None of these most widely naturalised species in

Africa is currently considered invasive in KNP, but attention should be paid by park management, especially in surveillance programmes.

It needs to be pointed out, however, that alien species recorded in our plots mostly occur in low abundance. *Bidens bipinnata* occasionally reached up to 15% of cover and *Alternanthera pungens* and *Acanthospermum hispidum* ~5%. Aliens also account for a rather small proportion of the total plant richness; on average, there were less than two alien species per plot, with maximum of seven and contribute less than 3% to the total plot richness. However, in two plots at perennial rivers, alien species contributed 11.9% and 9.2% and additional seven plots harboured more than 5% of aliens. This, together with the fact that almost three quarters of all sampled plots had at least one alien species, indicates that KNP needs to monitor the occurrence of these species, ideally on a regular and systematic basis. Our detailed survey covered, in cumulative terms, 15 hectares and, extrapolating the figures to the total park area, implies that alien plant species are already a fairly common phenomenon throughout the whole park.

## Acknowledgements

The study was supported by grant no. 18-18495S (Czech Science Foundation), EXPRO grant no. 19-28807X (Czech Science Foundation), long-term research development project RVO 67985939 (Czech Academy of Sciences) and projects UNCE204069 and PRIMUS/17/SCI/8 (Charles University). The project was registered as PYSK1432 with SANParks. LCF thanks SANParks and acknowledges support from the DSI-NRF Centre for Invasion Biology, Stellenbosch University. Thanks are to our guards Obert Mathebula, Thomas Rikombe, Desmond Mabaso, Herman Ntimane, Annoit Mashele, Isaac Sedibe, Priska Rikombe and Velly Ndlovu for keeping us safe in the field. We thank Elizabete Marchante, Nina Šajna and Sven Jelaska for helpful comments on the manuscript.

## References

- Bates D, Mächler M, Bolker B, Walker S (2015) Fitting linear mixed-effects models using lme4. Journal of Statistical Software 67: 1–48. https://doi.org/10.18637/jss.v067.i01
- Blackburn TM, Pyšek P, Bacher S, Carlton JT, Duncan RP, Jarošík V, Wilson JRU, Richardson DM (2011) A proposed unified framework for biological invasions. Trends in Ecology & Evolution 26: 333–339. https://doi.org/10.1016/j.tree.2011.03.023
- Carruthers J (1995) The Kruger National Park: A Social and Political History. University of Natal Press, Natal, 170 pp.
- Chytrý M, Maskell LC, Pino J, Pyšek P, Vilà M, Font X, Smart SM (2008) Habitat invasions by alien plants: A quantitative comparison among Mediterranean, subcontinental and oceanic regions of Europe. Journal of Applied Ecology 45: 448–458. https://doi.org/10.1111/ j.1365-2664.2007.01398.x

- Crawley MJ (2007) The R Book. JohnWiley & Sons, Chichester, 950 pp. https://doi. org/10.1002/9780470515075
- Čuda J, Skálová H, Pyšek P (2020) Spread of *Impatiens glandulifera* from riparian habitats to forests and its associated impacts: Insights from a new invasion. Weed Research 60: 8–15. https://doi.org/10.1111/wre.12400
- De Poorter M (2007) Invasive alien species and protected areas: A scoping report. Part 1. Scoping the scale and nature of invasive alien species threats to protected areas, impediments to IAS management and means to address those impediments. Global Invasive Species Program, Invasive Species Specialist Group. http://www.issg.org/gisp\_publications\_reports.htm
- Drake JA, Mooney HA, di Castri F, Groves RH, Kruger FJ, Rejmánek M, Williamson M [Eds] (1989) Biological Invasions: A Global Perspective. John Wiley & Sons, Chichester, 525 pp.
- du Toit JT, Biggs H, Rogers KH [Eds] (2003) The Kruger Experience: Ecology and Management of Savanna Heterogeneity. Island Press, Washington DC, 492 pp.
- Essl F, Bacher S, Genovesi P, Hulme PE, Jeschke JM, Katsanevakis S, Kowarik I, Kühn I, Pyšek P, Rabitsch W, Schindler S, van Kleunen M, Vilà M, Wilson JRU, Richardson DM (2018) Which taxa are alien? Criteria, applications, and uncertainties. BioScience 68: 496–509. https://doi.org/10.1093/biosci/biy057
- Foxcroft LC, Jarošík V, Pyšek P, Richardson DM, Rouget M (2011) Protected-area boundaries as filters of plant invasions. Conservation Biology 25: 400–405. https://doi.org/10.1111/ j.1523-1739.2010.01617.x
- Foxcroft LC, Pyšek P, Richardson DM, Genovesi P [Eds] (2013) Plant Invasions in Protected Areas: Patterns, Problems and Challenges. Springer, Dordrecht, 656 pp. https://doi. org/10.1007/978-94-007-7750-7
- Foxcroft LC, Pyšek P, Richardson DM, Genovesi P, MacFadyen S (2017) Plant invasion science in protected areas: Progress and priorities. Biological Invasions 19: 1353–1378. https://doi. org/10.1007/s10530-016-1367-z
- Foxcroft LC, Richardson DM, Rejmánek M, Pyšek P (2010) Alien plant invasions in tropical and sub-tropical savannas: Patterns, processes and prospects. Biological Invasions 12: 3913–3933. https://doi.org/10.1007/s10530-010-9823-7
- Foxcroft LC, Richardson DM, Rouget M, MacFadyen S (2009) Patterns of alien plant distribution at multiple spatial scales in a large national park: Implications for ecology, management and monitoring. Diversity and Distributions 15: 367–378. https://doi.org/10.1111/ j.1472-4642.2008.00544.x
- Foxcroft LC, Richardson DM, Wilson JRU (2008) Ornamental plants as invasive aliens: Problems and solutions in Kruger National Park, South Africa. Environmental Management 41: 32–51. https://doi.org/10.1007/s00267-007-9027-9
- Foxcroft LC, Rouget M, Richardson DM, MacFadyen S (2004) Reconstructing 50 years of *Opuntia stricta* invasion in the Kruger National Park, South Africa: Environmental determinants and propagule pressure. Diversity and Distributions 10: 427–437. https://doi. org/10.1111/j.1366-9516.2004.00117.x
- Foxcroft LC, Spear D, van Wilgen NJ, McGeoch MA (2019) Assessing the association between pathways of alien plant invaders and their impacts in protected areas. NeoBiota 43: 1–25. https://doi.org/10.3897/neobiota.43.29644

- Gallardo B, Aldridge DC, González-Moreno P, Pergl J, Pizarro M, Pyšek P, Thuiller W, Yesson C, Vilà M (2017) Protected areas offer refuge from invasive species spreading under climate change. Global Change Biology 23: 5331–5343. https://doi.org/10.1111/gcb.13798
- Hood WG, Naiman RJ (2000) Vulnerability of riparian zones to invasion by exotic vascular plants. Plant Ecology 148: 105–114. https://doi.org/10.1023/A:1009800327334
- Hui C, Foxcroft LC, Richardson DM, MacFadyen S (2011) Defining optimal sampling effort for large-scale monitoring of invasive alien plants: A Bayesian method for estimating abundance and distribution. Journal of Applied Ecology 48: 768–776. https://doi.org/10.1111/j.1365-2664.2011.01974.x
- Hulme PE, Pyšek P, Pergl J, Jarošík V, Schaffner U, Vilà M (2014) Greater focus needed on alien plant impacts in protected areas. Conservation Letters 7: 459–466. https://doi. org/10.1111/conl.12061
- Jarošík V, Pyšek P, Foxcroft LC, Richardson DM, Rouget M, MacFadyen S (2011) Predicting incursion of plant invaders into Kruger National Park, South Africa: The interplay of general drivers and species-specific factors. PLoS ONE 6: e28711. https://doi.org/10.1371/ journal.pone.0028711
- MacFadyen S, Hui C, Verburg PH, Van Teeffelen AJA (2016) Quantifying spatiotemporal drivers of environmental heterogeneity in Kruger National Park, South Africa. Landscape Ecology 31: 2013–2029. https://doi.org/10.1007/s10980-016-0378-6
- MacFadyen S, Zambatis N, Van Teeffelen AJA, Hui C (2018) Long-term rainfall regression surfaces for the Kruger National Park, South Africa: A spatio-temporal review of patterns from 1981–2015. International Journal of Climatology 38: 2506–2519. https://doi. org/10.1002/joc.5394
- Moodley D, Foxcroft LC, Novoa A, Pergl J, Pyšková K, Pyšek P (2020) Invasive alien species add to the uncertain future of protected areas. NeoBiota 57: 1–5. https://doi.org/10.3897/ neobiota.57.52188
- Mueller-Dombois D, Ellenberg H (1974) Aims and Methods of Vegetation Ecology. John Wiley and Sons, New York, 547 pp.
- Planty-Tabacchi AM, Tabacchi E, Naiman RJ, Deferrari C, Décamps H (1996) Invasibility of species rich communities in riparian zones. Conservation Biology 10: 598–607. https:// doi.org/10.1046/j.1523-1739.1996.10020598.x
- Pyšek P, Bacher S, Chytrý M, Jarošík V, Wild J, Celesti-Grapow L, Gassó N, Kenis M, Lambdon PW, Nentwig W, Pergl J, Roques A, Sádlo J, Solarz W, Vilà M, Hulme PE (2010) Contrasting patterns in the invasions of European terrestrial and freshwater habitats by alien plants, insects and vertebrates. Global Ecology and Biogeography 19: 317–331. https:// doi.org/10.1111/j.1466-8238.2009.00514.x
- Pyšek P, Genovesi P, Pergl J, Monaco A, Wild J (2013) Invasion of protected areas in Europe: An old continent facing new problems. In: Foxcroft LC, Pyšek P, Richardson DM, Genovesi P (Eds) Plant Invasions in Protected Areas: Patterns, Problems and Challenges. Springer, Dordrecht, 209–240. https://doi.org/10.1007/978-94-007-7750-7\_11
- Pyšek P, Hulme PE, Simberloff D, Bacher S, Blackburn TM, Carlton JT, Dawson W, Essl F, Foxcroft LC, Genovesi P, Jeschke JM, Kühn I, Liebhold AM, Mandrak NE, Meyerson LA, Pauchard A, Pergl J, Roy HE, Seebens H, van Kleunen M, Vilà M, Wingfield MJ,

Richardson DM (2020) Scientists' warning on invasive alien species. Biological Reviews (in press). https://doi.org/10.1111/brv.12627

- Pyšek P, Jarošík V, Kučera T (2003) Inclusion of native and alien species in temperate nature reserves: An historical study from Central Europe. Conservation Biology 17: 1414–1424. https://doi.org/10.1046/j.1523-1739.2003.02248.x
- Pyšek P, Pergl J, Essl F, Lenzner B, Dawson W, Kreft H, Weigelt P, Winter M, Kartesz J, Nishino M, Antonova LA, Barcelona JF, Cabezas FJ, Cárdenas D, Cárdenas-Toro J, Castaño N, Chacón E, Chatelain C, Dullinger S, Ebel AL, Figueiredo E, Fuentes N, Genovesi P, Groom QJ, Henderson L, Inderjit, Kupriyanov A, Masciadri S, Maurel N, Meerman J, Morozova O, Moser D, Nickrent D, Nowak PM, Pagad S, Patzelt A, Pelser PB, Seebens H, Shu W, Thomas J, Velayos M, Weber E, Wieringa JJ, Baptiste MP, van Kleunen M (2017) Naturalized alien flora of the world: Species diversity, taxonomic and phylogenetic patterns, geographic distribution and global hotspots of plant invasion. Preslia 89: 203–274. https://doi.org/10.23855/preslia.2017.203
- Pyšek P, Richardson DM, Rejmánek M, Webster G, Williamson M, Kirschner J (2004) Alien plants in checklists and floras: Towards better communication between taxonomists and ecologists. Taxon 53: 131–143. https://doi.org/10.2307/4135498
- R Development Core Team (2013) R: A language and environment for statistical computing. R Foundation for Statistical Computing, Vienna. http://www.R-project.org/
- Richardson DM, Holmes PM, Esler KJ, Galatowitsch SM, Stromberg JC, Kirkman SP, Pyšek P, Hobbs RJ (2007) Riparian vegetation: Degradation, alien plant invasions, and restoration prospects. Diversity and Distributions 13: 126–139. https://doi.org/10.1111/j.1366-9516.2006.00314.x
- Richardson DM, Pyšek P, Rejmánek M, Barbour MG, Panetta FD, West CJ (2000) Naturalization and invasion of alien plants: Concepts and definitions. Diversity and Distributions 6: 93–107. https://doi.org/10.1046/j.1472-4642.2000.00083.x
- Shackleton RT, Foxcroft LC, Pyšek P, Wood LE, Richardson DM (2020) Assessing biological invasions in protected areas after 30 years: Revisiting nature reserves targeted by the 1980s SCOPE programme. Biological Conservation 243: 108424. https://doi.org/10.1016/j. biocon.2020.108424
- Sibiya TE (2019) Riparian plant community change and alien plant invasions following geomorphological change in the Sabie River, Kruger National Park, South Africa. MSc Thesis, Stellenbosch University, Stellenbosch.
- Spear D, Foxcroft LC, Bezuidenhout H, McGeoch MA (2013) Human population density explains alien species richness in protected areas. Biological Conservation 159: 137–147. https://doi.org/10.1016/j.biocon.2012.11.022
- van der Maarel E (1979) Transformation of cover-abundance values in phytosociology and its effects on community similarity. Vegetatio 38: 97–114. https://doi.org/10.1007/ BF00052021
- van Kleunen M, Dawson W, Essl F, Pergl J, Winter M, Weber E, Kreft H, Weigelt P, Kartesz J, Nishino M, Antonova LA, Barcelona JF, Cabezas FJ, Cárdenas D, Cárdenas-Toro J, Castańo N, Chacón E, Chatelain C, Ebel AL, Figueiredo E, Fuentes N, Groom QJ, Henderson L, Inderjit, Kupriyanov A, Masciadri S, Meerman J, Morozova O, Moser D, Nickrent DL,

Patzelt A, Pelser PB, Baptiste MP, Poopath M, Schulze M, Seebens H, Shu W, Thomas J, Velayos M, Wieringa JJ, Pyšek P (2015) Global exchange and accumulation of non-native plants. Nature 525: 100–103. https://doi.org/10.1038/nature14910

- van Kleunen M, Pyšek P, Dawson W, Essl F, Kreft H, Pergl J, Weigelt P, Stein A, Dullinger S, König C, Lenzner B, Maurel N, Moser D, Seebens H, Kartesz J, Nishino M, Aleksanyan A, Ansong M, Antonova LA, Barcelona JF, Breckle SW, Brundu G, Cabezas FJ, Cárdenas D, Cárdenas-Toro J, Castaño N, Chacón E, Chatelain C, Conn B, de Sá Dechoum M, Dufour-Dror J-M, Ebel A-L, Figueiredo E, Fragman-Sapir O, Fuentes N, Groom QJ, Henderson L, Inderjit, Jogan N, Krestov P, Kupriyanov A, Masciadri S, Meerman J, Morozova O, Nickrent D, Nowak A, Patzelt A, Pelser PB, Shu W-S, Thomas J, Uludag A, Velayos M, Verkhosina A, Villaseñor JL, Weber E, Wieringa J, Yazlık A, Zeddam A, Zykova E, Winter M (2019) The Global Naturalized Alien Flora (GloNAF) database. Ecology 100: e02542. https://doi.org/10.1002/ecy.2542
- van Wilgen BW, Fill JM, Govender N, Foxcroft LC (2017) An assessment of the evolution, costs and effectiveness of alien plant control operations in Kruger National Park, South Africa. NeoBiota 35: 35–59. https://doi.org/10.3897/neobiota.35.12391
- Venter FJ (1990) A classification of land for management planning in the Kruger National Park. PhD Thesis, University of South Africa, Pretoria.

**RESEARCH ARTICLE** 



# Germination of the invasive legume Lupinus polyphyllus depends on cutting date and seed morphology

Yves P. Klinger<sup>1</sup>, Rolf Lutz Eckstein<sup>2</sup>, David Horlemann<sup>1</sup>, Annette Otte<sup>1</sup>, Kristin Ludewig<sup>1</sup>

 Division of Landscape Ecology and Landscape Planning, Research Centre for Biosystems, Land Use and Nutrition (iFZ), Justus Liebig University Giessen, Heinrich-Buff-Ring 26–32, D-35392 Giessen, Germany
 Department of Environmental and Life Sciences, Biology, Karlstad University, SE- 651 88 Karlstad, Sweden

Corresponding author: Yves Klinger (yves.p.klinger@umwelt.uni-giessen.de)

Academic editor: Bruce Osborne | Received 3 July 2020 | Accepted 30 July 2020 | Published 25 August 2020

**Citation:** Klinger YP, Eckstein RL, Horlemann D, Otte A, Ludewig K (2020) Germination of the invasive legume *Lupinus polyphyllus* depends on cutting date and seed morphology. NeoBiota 60: 79–95. https://doi.org/10.3897/ neobiota.60.56117

#### Abstract

In semi-natural grasslands, mowing leads to the dispersal of species that have viable seeds at the right time. For invasive plant species in grasslands, dispersal by mowing should be avoided, and information on the effect of cutting date on the germination of invasive species is needed. We investigated the germination of seeds of the invasive legume Lupinus polyphyllus Lindl. depending on the cutting date. We measured seed traits associated with successful germination that can be assessed by managers for an improved timing of control measures. To this end, we sampled seeds of L. polyphyllus on six cutting dates and analyzed the germination of these seeds in climate chambers and under ambient weather conditions. We collected information on seed morphology (color/size/hardseededness) for each cutting date to identify seed traits associated with successful germination. Observed germination patterns were highly asynchronous and differed between seeds cut at different dates. Seeds cut early, being green and soft, tended to germinate in autumn. Seeds cut late, being dark and hard, were more prone to germinate the following spring, after winter stratification. This allows the species to utilize germination niches throughout the year, thus indicating a bet-hedging strategy. Seed color and the percentage of hard seeds were good predictors of germination percentage, but not of mean germination time and synchrony. Managers should prevent the species producing black and hard seeds, while cutting plants carrying green and soft seeds is less problematic. Furthermore, germination patterns differed between climate chambers and the common garden, mainly because germination of dormant seeds was lower in climate chambers. More germination experiments under ambient weather conditions should be carried out, as they can give information on the germination dynamics of invasive species.

## Keywords

dormancy, grassland management, lupine, phenology, seed traits

Copyright Yves P. Klinger et al. This is an open access article distributed under the terms of the Creative Commons Attribution License (CC BY 4.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

## Introduction

The timing of germination determines which environmental conditions the seedling will experience and thereby influences a variety of plant characteristics (Casas et al. 2012). Consequently, the germination ecology of a species largely decides in which habitats and under which climates it may establish. The introduction of species to new ranges often leads to new germination conditions (Kudoh et al. 2007), and the ability to germinate successfully under a variety of environmental conditions is a characteristic of many successful and widespread invasive species (Baker 1974; Wainwright and Cleland 2013). Whether seeds are viable depends largely on their development stage, which is influenced by the timing of seed set and seed ripening.

In semi-natural grasslands, the mowing date is the environmental factor that most strongly determines the timing of seed release. Furthermore, mowing is a way of seed dispersal for species that have viable seeds at the right time. In most cases, the dispersal of mature seeds after mowing is a desirable process, as it is responsible for sustaining a high plant diversity in semi-natural grasslands (Auffret 2011; Humbert et al. 2012). In other cases, such as weeds or non-native invasive species, dispersal of ripe seeds by mowing is not wanted (Wilson et al. 2009) and shifts in grassland management and the time of cutting may create opportunities for invasives to establish in these ecosystems. Consequently, understanding the germination ecology of invasive plants is essential for their management and control and for limiting their spread to new sites.

Established invasive species are often more challenging to manage than newly arrived species (Simberloff 2003). Ideally, control measures would take place before seed formation, but time windows for adequate management can be short in areas where different conservation goals have to be matched. In the case of species invading mountain grasslands, e.g., mowing of areas critical for the protection of ground-nesting birds has to be postponed until nesting is finished, which means that invasive species may have produced viable seeds by the time of mowing. Consequently, managers are looking for information on the relationships between cutting dates, seed morphology, and seed germinability. Lupinus polyphyllus Lindl. is a widespread perennial legume originating from North-America. It is widely found as an ornamental plant (Fremstad 2010) and commonly used for soil stabilization and soil melioration (Rehfuess et al. 1991). Due to its many uses, the species is naturalized in different regions all over the world, e.g. in Europe (Fremstad 2010; Hejda 2013), New Zealand (Holdaway and Sparrow 2006) and Chile (Meier et al. 2013). Invaded habitats include road verges (Valtonen et al. 2006), riparian terraces (Meier et al. 2013), and mountain grasslands (Klinger et al. 2019). Due to its ability to fix nitrogen, it is considered an ecosystem engineer and may cause unwanted ecosystem effects (Hiltbrunner et al. 2014). In invaded habitats, *L. polyphyllus* is capable of overgrowing and shading the underlying vegetation and may cause a considerable decline in the richness of small species (Thiele et al. 2010; Hiltbrunner et al. 2014), while promoting the spread of tall-growing, nitrogen-demanding vegetation (Otte and Maul 2005). Meadows invaded by this species provide hay of low fodder quality, because of its high water-content and the presence of alkaloids in L. polyphyllus (Hensgen and Wachendorf 2016).

Despite the importance of seed ecology for the spread and establishment of species, there is often insufficient knowledge concerning germination and ripening characteristics of invasive species (Gallinat et al. 2018). The capability of seeds to after-ripe and germinate, which depends on the interaction between phenology and cutting date, may have important implications for the management of invasive species in grasslands. Therefore, we investigated the germination of the invasive legume *L. polyphyllus* in relation to the cutting date. Over the course of the vegetation period, i.e., weekly from the beginning to the end of fruiting, we sampled seeds from five locations invaded by *L. polyphyllus*. We combined two experiments to investigate the germination of *L. polyphyllus*: A common garden experiment to analyze the germination patterns under ambient weather conditions and a climate chamber experiment under standardized conditions. We aim to provide management recommendations based on seed traits such as seed color and hardseededness that may help to decide when fruiting lupine stands should be cut and when plant material has to be removed from the sites after mowing.

Specifically, our research hypotheses were:

- 1) The germination ability of *L. polyphyllus* seeds increases with later cutting date. Consequently, we expect a higher germination percentage, a shorter mean germination time, and a higher synchrony of germination with later cutting date.
- 2) Seed traits such as seed size, seed color, and the percentage of hard seeds provide reliable information about the germination ability of seeds sampled at different dates. We expect larger seeds, seeds with darker color and harder seeds to show higher germination percentage, shorter mean germination time and higher synchrony compared to small, green, and soft seeds.

# Methods

# Seed sampling, seed handling, and experimental design

Seeds were collected in the Rhön UNESCO Biosphere Reserve, in central Germany. The study area (from 50°26'N to 50°32'N and from 09°54'E to 10°05'E), a part of the Biosphere Reserve, is situated between 600 m and 950 m a.s.l. It is characterized by large and coherent semi-natural grasslands of high conservational value that are non-intensively used as meadows and pastures (e.g., Habitats Directive 92/43/EEC, habitat types 6520: mountain hay meadows, and 6230: species-rich *Nardus* grasslands). These grasslands have a centuries-long land-use history of mowing and pasturing with low nitrogen-inputs. In the 1990s, the traditional mowing date in early July was postponed to August and September, in order to safeguard the populations of protected ground-nesting birds and because the meadows decreased in importance for local farmers. This allowed *L. polyphyllus*, already present along roadsides in the area, to produce seeds before mowing and to spread extensively into the meadows. During the past 20 years, parts of the region were heavily invaded, with the area covered by *L. polyphyllus* dou-

bling in some localities (Klinger et al. 2019). This invasion is considered a major threat to the biodiversity of the mountain grasslands in the study region. Depending on site conditions, *L. polyphyllus* can reach a height of 60 to 150 cm. In June and July inflores-cences are formed, each consisting of 50 to 80 single flowers (Fremstad 2010; Bunde-samt für Naturschutz 2017). *L. polyphyllus* develops seed pods with four to twelve seeds, which burst at seed maturity and spread the seeds ballistically up to several meters (Otte et al. 2002; Volz 2003). Per plant, up to 2500 seeds can be produced (Aniszewski 2001).

Seeds of *L. polyphyllus* were manually collected from five meadows (*sampling locations*) over six weeks (July-August 2015; cutting dates). The distance between sampling locations ranged between 1500 and 5000 meters. For each cutting date and location, we sampled one inflorescence each from ten plants for the germination experiments. From each inflorescence, we randomly took one pod and determined seed size, seed color, and the proportion of hard seeds. For seed color, we distinguished between four colors: green, dark green, brown and black. Seeds with different pigmentations and puncturing (see Aniszewski 2001) were integrated to the different classes according to the predominant color, seeds were assigned the color "black" when they were considerably darker than brown seeds. Usually, seeds of several colors were found on the same location or even within the same seed pod. To determine the average color for each replicate, we gave ranks from one (green) to four (black) to each color and calculated the median. For seed hardness, we classified the seeds into five classes, from undeveloped and very soft to very hard. Based on these data, we calculated mean seed size, average seed color and the proportion of hard seeds for each replicate. For the germination experiments, we pooled the seeds within each sampling location. Seeds were manually cleaned, air-dried and stored in darkness at room temperature (app. 20 °C) until the start of the germination experiments on September 28<sup>th</sup>, 2015.

Laboratory experiments are a standardized tool to investigate germination in a controlled environment and can provide information on germination cues, dormancy, and other factors (Baskin and Baskin 2014). Nonetheless, germination in the laboratory often differs from germination under (semi-)natural conditions (Grime et al. 1981; Hölzel and Otte 2004) and thus gives only a limited representation of germination patterns that can be observed in the field. We combined a climate chamber experiment and a common garden experiment to study the germination of *L. polyphyllus* both under standardized and ambient weather conditions. A factorial experimental design was used to analyze the effects of *cutting date* (6 dates), *sampling location* (5 locations), and *temperature* (day/night: 20/10 °C and 15/5 °C; only in the climate chamber experiment) on seedling emergence. Germination was defined as protrusion of the radicle.

In the climate chamber experiment (from September 28<sup>th</sup>, 2015 to July 28<sup>th</sup>, 2016), seeds were placed into petri dishes with distilled water (25 seeds per replicate) in climate chambers (Rumed type 3401, Rubarth Apparate GmbH). Each treatment combination (*cutting date × sampling location × temperature*) was replicated five times, resulting in 300 petri dishes. For incubation in climate chambers, we exposed the seeds to 12 h light and 12 h darkness and two diurnally fluctuating temperatures (15/5 °C and 20/10 °C) that represent spring and early summer temperature conditions. Similar fluctuating temperature conditions have been applied by Elliott et al. (2011). Moisture

content of the Petri dish was controlled during the experiment. For seeds in the climate chambers, germination was checked once a week and seedlings were removed.

In the common garden experiment, germination was observed under ambient weather conditions from September 17<sup>th</sup>, 2015 to July 14<sup>th</sup>, 2016. The seeds were placed on a 1:1 mixture of sand and commercial potting soil (Fruhstorfer Erde, Type P, Industrie-Erdenwerke Archut GmbH, Lauterbach/Germany) in trays (18 × 28 cm) in a common garden at the research station Linden-Leihgestern of the Justus-Liebig University (50°32'N, 8°41'E). Per tray, 25 seeds were used (n = 5 for each *cutting date* × *sampling location* combination, resulting in 150 trays). Seeds were protected from predation using wire cages. For seeds in the common garden, germination was checked once every seven to fourteen days. After three months of incubation, germination decreased in both experiments and thus was checked every other week. After ten months of incubation, the experiments ended since no further germination was observed. By the end of the experiments, the remaining seeds were covered by mold and collapsed when pinched by hand. Thus, the remaining seeds were considered dead (following Baskin and Baskin 2014).

## Germination variables and statistical analyses

As response variables, we calculated the germination percentage (%), mean germination time (days) and synchrony of germination (unitless) per replicate (according to Ranal and Santana 2006; Ranal et al. 2009). The germination percentage is the proportion of germinated seeds of the total number of seeds. Mean germination time and synchrony of germination were calculated based on seedling counts over time (Ranal et al. 2009). Mean germination time is a measurement of the weighted average time required for germination (Ranal and Santana 2006). The synchrony index is a measure for the overlapping of germination that ranges from 0 (when no two seeds germinated at the same time) to 1 (when all germinating seeds germinated at the same time; for details see Ranal et al. 2009).

Seeds from the climate chamber experiment and from the common garden experiment were analyzed separately. The effects of the experimental variables *cutting date*, *sampling location* and *temperature* on the response variables germination percentage and germination time were analyzed using linear mixed-effect models (LMM) and synchrony of germination using generalized linear mixed-effect models (GLMM) for binomial distributions. The factors *cutting date* and *temperature* were included as fixed factors in the first models. As there was no effect of the *temperature*, the final models only included cutting date or seed color fixed factors. We added an error term for repeated measures to the models to account for variation within each *sampling location*. Furthermore, we added a general linear hypothesis and multiple comparisons (glht) to determine significant differences between groups.

To identify seed traits associated with germination success, we checked for correlation of seed traits with the factor *cutting date* using Pearson's R<sup>2</sup>. This was the case for *seed size*, *seed color*, and *proportion of hard seeds*. We then fitted models with these traits as fixed factors (both in combinations and as single-factor models) and *sampling*  *location* as random factor. To choose the best seed traits or trait combination to explain germination success of *L. polyphyllus*, we compared these models via AIC and pairwise model ANOVA. To assess model quality, we calculated Nagakawa and Schielzeth's R<sup>2</sup> for linear mixed-effect models (Nakagawa and Schielzeth 2013). We visually checked for normality of residuals and homogeneity of variances using diagnostic plots (Zuur et al. 2010). Mixed-effect models were carried out using the 'lme4' (Bates et al. 2015) and 'lmerTest' (Kuznetsova et al. 2017) packages, post-hoc-tests were calculated using the 'multcomp' package (Hothorn et al. 2008), graphs were created using the 'ggplot2' package (Wickham 2016) in R (R Core Team 2016).

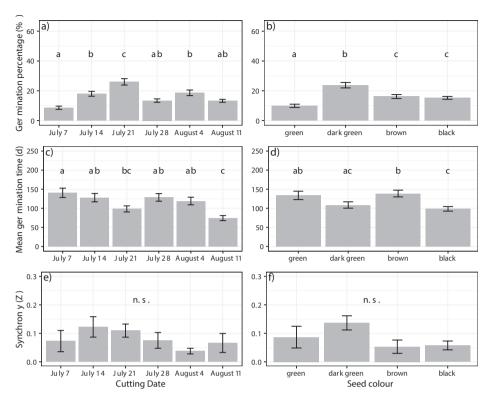
# Results

During the sampling period, seed color became darker (changing from green via dark green and brown, to black) and the proportion of hard seeds increased gradually. Mean seed size ranged from 3.9 mm (date six, August 11<sup>th</sup>) to 6.4 mm (date three, July 21<sup>st</sup>). It increased during the first three weeks of cutting and then decreased thereafter as seeds became drier. Seed color and the proportion of hard seeds were correlated, as hard seeds usually were darker than soft seeds. There were no differences in the total germination percentages between different *sampling locations*, although the germination peaks shifted by up to two weeks between different locations.

In climate chambers, 16.3% of all collected lupine seeds germinated (Fig. 1a, b). Germination percentage was lowest after the first cutting date (July 7<sup>th</sup>, 8.6%) and increased until the third date (July 21<sup>st</sup>) where it peaked at 26% (Fig. 1a). Afterwards, we observed a significant decrease from week three (July 21<sup>st</sup>) to four (July 28<sup>th</sup>; to 13.4%; Table 1). Mean germination time was 114 days and varied from 3 days to 303 days in climate chambers (Fig. 1c, d), with seeds collected on the first date having the longest mean germination time (141 d; Fig. 2d). Mean germination time decreased until week three (98 d), then increased again and had its overall minimum in week six (74 d). Synchrony of germination was quite low with an average of 0.08 over all cutting dates (Fig. 1e, f).

In the common garden, 51.7% of seeds germinated and mean germination time was 153.6 days (Fig. 2). Thus, seeds in the common garden germinated to a higher degree compared to seeds in climate chambers, but slower. Germination percentages in the common garden were lowest in seeds sampled during the first two weeks (17.0% on July 7<sup>th</sup> and 30.6% on 14<sup>th</sup>), reached the highest level in week three (63.2% on July 21<sup>st</sup>) and stayed high afterwards (Fig. 2a, Table 1). In the common garden, mean germination time was similar for all cutting dates and averaged 153.6 days. Synchrony of germination in the common garden was quite low with an average of 0.12 over all treatments and on all cutting dates (Fig. 2e, f).

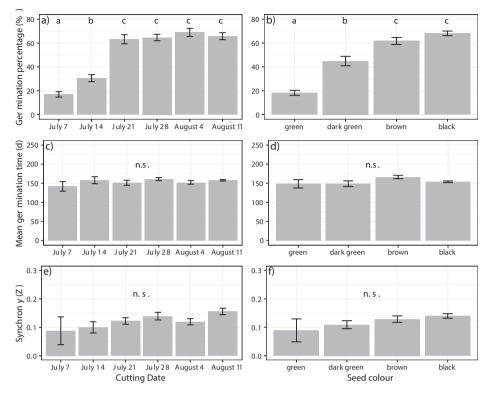
There were significant differences in germination percentages between seeds of different color (Figs 1b, 2b, Table 2). In climate chambers, dark green seeds showed the highest germination while in the common garden, germination percentages increased steadily as seeds darkened (Figs 1b, 2b). In climate chambers, germination percentage peaked when 60% of collected seeds were hard and decreased when the amount of hard seeds was lower



**Figure 1.** The effect of the factors cutting date (weekly from July 7<sup>th</sup> to August 11<sup>th</sup>) and seed color on germination percentage (**a**, **b**), mean germination time (**c**, **d**), and synchrony of germination (**e**, **f**) in seeds stored in climate chambers averaged over the two temperature regimes. Bars show mean values  $\pm$  standard errors.

Table I. Differences in germination percentages of L. polyphyllus seeds between six cutting dates assessed
in two germination experiments (climate chamber and common garden). Differences were assessed using
mixed effect models for each experiment separately with sampling location as random factor (formula:
Germination percentage ~ Cutting Date + (1 Sampling location).

Climate chamber	n = 300	$R^2_{marginal} = 0.20$	$R^2_{conditional} = 0.25$		
—	Estimate	Std. Error	Df	t Value	p Value
Date 1 (July 7; Intercept)	8.64	1.86	22.56	4.65	< 0.001
Date 2 (July 14)	9.36	2.11	295	4.45	< 0.001
Date 3 (July 21)	17.36	2.11	295	8.25	< 0.001
Date 4 (July 28)	4.8	2.11	295	2.28	0.023
Date 5 (August 4)	10	2.11	295	4.75	< 0.001
Date 6 (August 11)	4.64	2.11	295	2.20	0.028
Common garden	n = 150	$R^2_{marginal} = 0.63$	$R^2_{conditional} = 0.71$		
_	Estimate	Std. Error	Df	t Value	p Value
Date 1 (July 7; Intercept)	16.96	3.88	14.21	4.37	< 0.001
Date 2 (July 14)	13.6	3.86	145	3.52	< 0.001
Date 3 (July 21)	46.24	3.86	145	11.99	< 0.001
Date 4 (July 28)	47.68	3.86	145	12.37	< 0.001
Date 5 (August 4)	52	3.86	145	13.49	< 0.001
Date 6 (August 11)	48.8	3.86	145	12.66	< 0.001



**Figure 2.** The effect of the factors cutting date (weekly from July 7<sup>th</sup> to August 11<sup>th</sup>) and seed color on germination percentage (**a**, **b**), mean germination time (**c**, **d**), and synchrony of germination (**e**, **f**) in seeds stored under ambient weather conditions. Bars show mean values  $\pm$  standard errors.

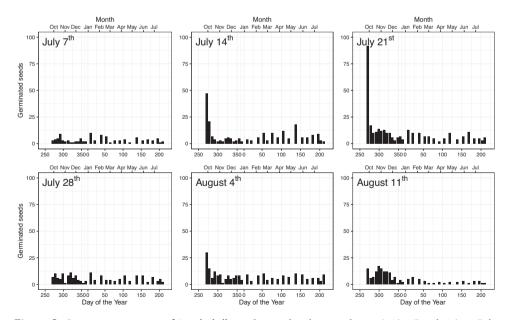
**Table 2.** Differences in germination percentages of *L. polyphyllus* seeds between four seed colors (median seed color per sample with four levels: green, dark green, brown, and black) assessed in two germination experiments (climate chamber and common garden). Differences were assessed using mixed effect models for each experiment separately with sampling location as random factor (formula: Germination percentage ~ Seed color + (1|Sampling location).

Climate chamber	n = 300	$R^2_{marginal} = 0.15$	$R^2_{conditional} = 0.22$		
=	Estimate	Std. Error	Df	t Value	p Value
Green (Intercept)	9.45	1.88	16.2	5.03	< 0.001
Dark green	14.34	1.94	298.48	7.4	< 0.001
Brown	7.71	2.12	299.21	3.64	< 0.001
Black	5.64	1.74	297.85	3.25	< 0.01
Common garden	n = 150	$R^2_{marginal} = 0.58$	$R^2_{conditional} = 0.65$		
-	Estimate	Std. Error	Df	t Value	p Value
Green (Intercept)	17.29	4.11	12.24	4.21	< 0.01
Dark green	27.78	3.82	146.4	7.27	< 0.001
Brown	47.13	4.18	146.84	11.27	< 0.001
Black	50.14	3.42	146.09	14.65	< 0.001

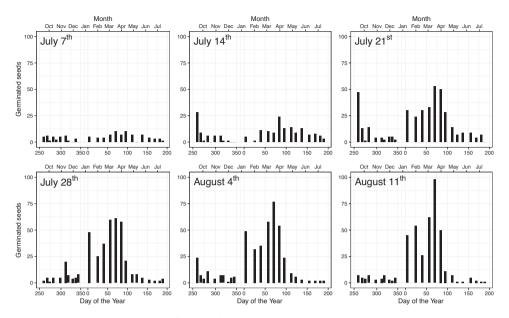
or higher while in the common garden, germination percentage increased continuously with the amount of hard seeds. In both experiments, seeds of different color had relatively similar germination times with black (99 d) and dark green (109 d) seeds germinating most rapidly in climate chambers (Fig. 1d). In the common garden, there were no significant differences in mean germination time between seeds of different colors (Fig. 2d).

While in climate chambers, germination peaked early and decreased afterwards (Fig. 3), two peaks (in autumn and spring) characterized germination in the common garden (Fig. 4). There were no significant differences between colors in climate chamber, while synchrony in the common garden increased slightly with the increase in the percentage of hard seeds.

Germination percentage (in both experiments) and mean germination time (only in climate chambers) responded significantly to *cutting date*, while there was no effect of the different *temperature* regimes. For germination percentage and mean germination time, the best explanatory models (see Suppl. material 1: Model Tables) each contained solely one fixed factor, mainly due to high correlations between explaining factors. Germination percentage in climate chambers was best explained by seed color and showed highly significant differences between colors ( $R^2 = 0.15$ ). Germination percentage in the common garden was well explained by both seed color ( $R^2 = 0.58$ ) and proportion of hard seeds. For mean germination time, the best explaining factors were either color or proportion of hard seeds, while both models performed poorly overall. Synchrony was not affected significantly by any factor and there was no model of significant explanatory value.



**Figure 3.** Germination patterns of *L. polyphyllus* in climate chambers conditions (15/5 °C and 20/10 °C diurnally fluctuating temperatures) sampled weekly on six cutting dates (July 7<sup>th</sup> to August 11<sup>th</sup>) after seed set.



**Figure 4.** Germination patterns of *L. polyphyllus* under ambient weather conditions sampled weekly on six cutting dates (July 7<sup>th</sup> to August 11<sup>th</sup>) after seed set.

## Discussion

The germination patterns of the invasive legume L. polyphyllus differed between different cutting dates, partially confirming our first hypothesis. Seeds collected early, while being green and soft, germinated to a lower degree and more slowly compared to seeds collected later. While seeds of early-cut L. polyphyllus plants germinated in autumn, seeds of late-cut plants were more prone to germinate in spring. This relationship may be associated with their progression through different phases of seed development. During morphogenesis the embryo develops, then during maturation, storage compounds are synthesized in the growing endosperm and thereafter, seeds may go through a phase of desiccation, in which they dry and eventually enter dormancy (Angelovici et al. 2010). Consequently, the different cutting dates of our experiment covered the phases of maturation and desiccation. Until late July, L. polyphyllus seeds were in the phase of maturation. Afterwards (end-July to mid-August), seeds were in the desiccation phase. Although dormancy per se was not tested in our study, the observed germination patterns and differences between climate chambers and the common garden strongly indicate that seeds from late cut L. polyphyllus plants expressed dormancy, which is also supported by our observation that seeds decreased in size and became harder. Physical dormancy is common in legumes (Russi et al. 1992a), but whether an individual plant produces dormant seeds at a given point in time depends on a variety of factors, such as temperature and moisture conditions during seed ripening (Masaka and Yamada 2009; Bolingue et al. 2010; D'hondt et al. 2010). Thus, the expression of dormancy can vary strongly in legume seeds, even within plants of the

same population (D'hondt et al. 2010), which may consequently lead to asynchronous germination patterns.

Despite pronounced peaks of germination in autumn and spring, germination of L. polyphyllus seeds was highly asynchronous. In both experiments and under all cutting dates, some seeds germinated over the whole duration of the experiments, over 300 days. The timing of germination determines which environmental conditions the seedling will experience and may influence plant characteristics, such as growth and reproduction (Donohue 2002; Casas et al. 2012). The timing of germination itself may be influenced by plant life-history traits, e.g. the phenology of flowering, seed maturation, and seed dispersal (Galloway 2001; Donohue 2002). Variations in germination depending on the time of seed collection have been observed by other authors (e.g., Greipsson and El-Mayas 2003; Samarah 2005; El-Keblawy and Al-Rawai 2006; Brobäck 2015), but there is little information on the long-term germination patterns of species and seasonal effects that are associated with this factor. In invasive species, asynchronous germination can lead to the exploitation of open germination niches throughout the year, which might contribute to their invasion success (Wolkovich and Cleland 2011; Gioria et al. 2016). In the case of L. polyphyllus, this effect may be amplified by its high seed production (Volz 2003), its long-lasting flowering, by its ability to resprout and produce seeds after early cutting (Brobäck 2015), and by the observation that the ballistic seed dispersal of the species takes place over many weeks if stands are left untouched (Klinger et al., unpublished data). The observed germination patterns of *L. polyphyllus* thus suggest a bet-hedging strategy (Cohen 1966), which may partly explain its invasion success and its capability to colonize many different habitats.

Our second hypothesis can be verified, as seed color and the percentage of hard seeds were good predictors of germination percentage and give information on the germination patterns that can be expected. Soft and green seeds germinated to the lowest degree and in autumn. However, germination percentages of these seed batches were relatively high, given their early developmental phase. High germination rates in immature seeds have been found in some legumes, e.g., in Lotus and Scorpiurus (Cristaudo et al. 2008), and Vicia (Samarah 2005), but germination failed in others, such as in green seeds of Lupinus nootkatensis (Greipsson and El-Mayas 2003). Black and hard seeds germinated to a high degree and in spring. In temperate climates, seedlings germinating in autumn face harsh environmental conditions during winter combined with low competition, while spring germination is associated with more favorable environmental conditions, but higher competition (Masuda and Washitani 1992). Since soft and green seeds mostly germinated in autumn, the winter survival of the emerging seedlings may be low, as L. polyphyllus seedlings seem to be sensitive to freezing and showed high mortality when exposed to -10 °C (Arfin-Khan et al. 2018). Furthermore, unripe seeds of roadside L. polyphyllus stands in Sweden were prone to mold infection that led to very low germination rates (Brobäck 2015). The last cutting date represents the state in which seeds are shed by the plant. Both ballistic seed dispersal as well as the expression of physical dormancy go along with the drying of the pods and the seed coat. Black and hard seeds are more prone to germinate in spring and may thus have higher survival rates compared to green seeds. Furthermore, as L. polyphyllus follows a c-strategy (Grime et al. 1988), it may be able to cope with higher competition

in spring, especially in habitats with weak competitors, such as semi-natural grasslands. Additionally, water impermeable/hard seeds are more prone to being carried over into the seed bank (Russi et al. 1992b) or dispersed via endozoochory (Otte et al. 2002; D'hondt and Hoffmann 2011). Although *L. polyphyllus* may not have invaded the seed bank of meadows in our study region yet (Ludewig et al., unpublished data), a carry-over of seeds should be avoided, as it makes invasive species management lengthier and more expensive. Consequently, managers should target plants that still have green and soft seeds, which can be considered less problematic despite germination percentages being relatively high.

Germination patterns differed between climate chambers and the common garden, particularly after seeds darkened and became harder. Overall, germination percentages in the climate chamber experiment (ca. 16%) were similar to the emergence rates found by Sober and Ramula (2013) (21.5%), but relatively low compared to other studies on L. polyphyllus (Elliott et al. 2011; Arfin-Khan et al. 2018; over 60%). We suggest that this is at least partly due to the fact that seeds were not scarified and that dormancy was probably not broken by imbibition in the climate chamber experiment. This is also supported by the results of the common garden experiment, in which germination percentages were considerably higher than under laboratory conditions, mainly due to a second germination peak in spring after winter-stratification *in situ*. However, germination of *L. polyphyl*lus only slightly increased when seeds were pre-treated by cold in another study (Elliott et al. 2011). Our results show that, while laboratory experiments give valuable information on the environmental factors influencing germination, the germination patterns observed under artificial conditions may diverge from germination dynamics under ambient weather conditions (Hölzel and Otte 2004). A better understanding of invasive species germination under natural conditions is necessary, as it can potentially reveal windows of opportunity for invasive species management. We thus recommend to complement germination experiments in climate chambers with common garden or field experiments.

## Conclusions

Seeds of *L. polyphyllus* are capable of after-ripening and germinating even if plants are cut while most seeds are still green and soft. Germination capability increased strongly during the first weeks after seed set with a maximum when most seeds were brown to black and not fully hardened. Therefore, *L. polyphyllus* stands should be cut before seed set, if possible. If this is not feasible due to different limitations, we recommend cutting while plants carry green and soft seeds. When stands with black and hard seeds are cut, the plant material should be removed immediately to reduce propagule pressure on site.

## Acknowledgments

We would like to thank Dr. Reinhard Stock, Dr. Volker Wachendörfer, and Dr. Franz-Peter Heidenreich for continuous interests and suggestions as well as constructive support of our study. Furthermore, we thank Torsten Kirchner (Wildlandstiftung Bavaria), Michael Geier and Tobias Gerlach (Bavarian Administration of the Biosphere Reserve Rhön), as well as Torsten Raab (Hessian Administration of the Biosphere Reserve Rhön). We greatly thank Josef Scholz vom Hofe for assistance with propagule and data collection both in the field and in the lab, Sabrina Rothen for data preparation, Sarah Harvolk-Schöning for statistical support, and Melanie Schindler for valuable comments on the final version of the manuscript. We are grateful to two anonymous referees for their insightful comments on an earlier version of the manuscript.

## References

- Angelovici R, Galili G, Fernie AR, Fait A (2010) Seed desiccation: A bridge between maturation and germination. Trends in Plant Science 15(4): 211–218. https://doi.org/10.1016/j. tplants.2010.01.003
- Aniszewski T (2001) Seed number, seed size and seed diversity in washington lupin (*Lupinus poly-phyllus* Lindl.). Annals of Botany 87(1): 77–82. https://doi.org/10.1006/anbo.2000.1300
- Arfin-Khan MAS, Vetter VMS, Reshi ZA, Dar PA, Jentsch A (2018) Factors influencing seedling emergence of three global invaders in greenhouses representing major eco-regions of the world. Plant Biology 20(3): 610–618. https://doi.org/10.1111/plb.12710
- Auffret AG (2011) Can seed dispersal by human activity play a useful role for the conservation of European grasslands? Applied Vegetation Science 14(3): 291–303. https://doi.org/10.1111/j.1654-109X.2011.01124.x
- Baker HG (1974) The evolution of weeds. Annual Review of Ecology and Systematics 5(1): 1–24. https://doi.org/10.1146/annurev.es.05.110174.000245
- Baskin CC, Baskin JM (2014) Chapter 2 Ecologically meaningful germination studies. In: Baskin CC, Baskin JM (Eds) Seeds (Second Edition). Academic Press: 5–35. https://doi. org/10.1016/B978-0-12-416677-6.00002-0
- Bates D, Mächler M, Bolker B, Walker S (2015) Fitting linear mixed-effects models using lme4. Journal of Statistical Software 67(1): 1–48. https://doi.org/10.18637/jss.v067.i01
- Bolingue W, Ly Vu B, Leprince O, Buitink J (2010) Characterization of dormancy behaviour in seeds of the model legume *Medicago truncatula*. Seed Science Research 20(2): 97–107. https://doi.org/10.1017/S0960258510000061
- Brobäck D (2015) Preventing the spread of the invasive plant *L. polyphyllus*. Master Thesis. Uppsala Universitet (Uppsala).
- Bundesamt für Naturschutz (2017) FloraWeb: Daten und Informationen zu Wildpflanzen und zur Vegetation Deutschlands. http://www.floraweb.de/pflanzenarten/biologie.xsql?suchnr=3524&
- Cohen D (1966) Optimizing reproduction in a randomly varying environment. Journal of Theoretical Biology 12(1): 119–129. https://doi.org/10.1016/0022-5193(66)90188-3
- Cristaudo A, Gresta F, Avola G, Miano V (2008) Germination capability of immature seeds of *Lotus* ornithopodioides L. and *Scorpiurus subvillosus* L. Proceedings of the 12<sup>th</sup> Meeting of the FAO-CIHEAM Sub-Network on Mediterranean Pastures And Fodder Crops, Elvas, Portugal, 9–12.
- de Casas RR, Kovach K, Dittmar E, Barua D, Barco B, Donohue K (2012) Seed after-ripening and dormancy determine adult life history independently of germination timing. New Phytologist 194(3): 868–879. https://doi.org/10.1111/j.1469-8137.2012.04097.x

- D'hondt B, Brys R, Hoffmann M (2010) The incidence, field performance and heritability of non-dormant seeds in white clover (*Trifolium repens* L.). Seed Science Research 20(3): 169–177. https://doi.org/10.1017/S0960258510000152
- D'hondt B, Hoffmann M (2011) A reassessment of the role of simple seed traits in mortality following herbivore ingestion. Plant Biology 13(s1): 118–124. https://doi.org/10.1111/j.1438-8677.2010.00335.x
- Donohue K (2002) Germination timing influences natural selection on life-history characters in Arabidopsis thaliana. Ecology 83: 1006–1016. https://doi.org/10.1890/0012-9658(2002)083[1006:GTINSO]2.0.CO;2
- El-Keblawy A, Al-Rawai A (2006) Effects of seed maturation time and dry storage on light and temperature requirements during germination in invasive *Prosopis juliflora*. Flora 201(2): 135–143. https://doi.org/10.1016/j.flora.2005.04.009
- Elliott CW, Fischer DG, LeRoy CJ (2011) Germination of three native *Lupinus* species in response to temperature. Northwest Science 85(2): 403–410. https://doi.org/10.3955/046.085.0223
- Fremstad E (2010) NOBANIS Invasive Alien Species Fact Sheet Lupinus polyphyllus. Online Database of the European Network on Invasive Alien Species – NOBANIS. www.nobanis.org
- Gallinat AS, Russo L, Melaas EK, Willis CG, Primack RB (2018) Herbarium specimens show patterns of fruiting phenology in native and invasive plant species across New England. American Journal of Botany 105(1): 31–41. https://doi.org/10.1002/ajb2.1005
- Galloway LF (2001) Parental environment effects on life history in the herbaceous plant *Campanula americana*. Ecology 82(10): 2781–2789. https://doi.org/10.2307/2679960
- Gioria M, Pyšek P, Osborne BA (2016) Timing is everything: Does early and late germination favor invasions by herbaceous alien plants? Journal of Plant Ecology 11(1): 4–16. https://doi.org/10.1093/jpe/rtw105
- Greipsson S, El-Mayas H (2003) Seed set, germination and seedling establishment in *Lupinus* nootkatensis. Journal of New Seeds 5(4): 1–15. https://doi.org/10.1300/J153v05n04\_01
- Grime JP, Hodgson JG, Hunt R (1988) Comparative Plant Ecology: A functional approach to common British species. Springer Netherlands. https://doi.org/10.1007/978-94-017-1094-7
- Grime JP, Mason G, Curtis AV, Rodman J, Band SR (1981) A comparative study of germination characteristics in a local flora. The Journal of Ecology 69(3): 1–1017. https://doi. org/10.2307/2259651
- Hejda M (2013) Do species differ in their ability to coexist with the dominant alien *Lupinus polyphyllus*? A comparison between two distinct invaded ranges and a native range. Neo-Biota 17: 39–55. https://doi.org/10.3897/neobiota.17.4317
- Hensgen F, Wachendorf M (2016) The effect of the invasive plant species Lupinus polyphyllus Lindl. on energy recovery parameters of semi-natural grassland biomass. Sustainability 8(10): 1–998. https://doi.org/10.3390/su8100998
- Hiltbrunner E, Aerts R, Bühlmann T, Huss-Danell K, Magnusson B, Myrold DD, Reed SC, Sigurdsson BD, Körner C (2014) Ecological consequences of the expansion of N<sub>2</sub>-fixing plants in cold biomes. Oecologia 176(1): 11–24. https://doi.org/10.1007/s00442-014-2991-x
- Holdaway RJ, Sparrow AD (2006) Assembly rules operating along a primary riverbed-grassland successional sequence. Journal of Ecology 94(6): 1092–1102. https://doi.org/10.1111/ j.1365-2745.2006.01170.x

- Hölzel N, Otte A (2004) Ecological significance of seed germination characteristics in floodmeadow species. Flora 199(1): 12–24. https://doi.org/10.1078/0367-2530-00132
- Hothorn T, Bretz F, Westfall P (2008) Simultaneous inference in general parametric models. Biometrical Journal 50(3): 346–363. https://doi.org/10.1002/bimj.200810425
- Humbert J-Y, Pellet J, Buri P, Arlettaz R (2012) Does delaying the first mowing date benefit biodiversity in meadowland? Environmental Evidence 1(1): 1–9. https://doi. org/10.1186/2047-2382-1-9
- Klinger YP, Harvolk-Schöning S, Eckstein RL, Hansen W, Otte A, Ludewig K (2019) Applying landscape structure analysis to assess the spatio-temporal distribution of an invasive legume in the Rhön UNESCO Biosphere Reserve. Biological Invasions 21: 2735–2749. https:// doi.org/10.1007/s10530-019-02012-x
- Kudoh H, Nakayama M, Lihová J, Marhold K (2007) Does invasion involve alternation of germination requirements? A comparative study between native and introduced strains of an annual Brassicaceae, *Cardamine hirsuta*. Ecological Research 22(6): 869–875. https:// doi.org/10.1007/s11284-007-0417-5
- Kuznetsova A, Brockhoff PB, Christensen RHB (2017) ImerTest Package: Tests in linear mixed effects models. Journal of Statistical Software 82(1): 1–26. https://doi.org/10.18637/jss. v082.i13
- Masaka K, Yamada K (2009) Variation in germination character of *Robinia pseudoacacia* L. (Leguminosae) seeds at individual tree level. Journal of Forest Research 14(3): 167–177. https://doi.org/10.1007/s10310-009-0117-9
- Masuda M, Washitani I (1992) Differentiation of spring emerging and autumn emerging ecotypes in *Galium spurium* L. var. *Echinospermon*. Oecologia 89(1): 42–46. https://doi. org/10.1007/BF00319013
- Meier CI, Reid BL, Sandoval O (2013) Effects of the invasive plant *Lupinus polyphyllus* on vertical accretion of fine sediment and nutrient availability in bars of the gravel-bed Paloma river. Limnologica – Ecology and Management of Inland Waters 43(5): 381–387. https:// doi.org/10.1016/j.limno.2013.05.004
- Nakagawa S, Schielzeth H (2013) A general and simple method for obtaining R<sup>2</sup> from generalized linear mixed-effects models. Methods in Ecology and Evolution 4(2): 133–142. https://doi.org/10.1111/j.2041-210x.2012.00261.x
- Otte A, Maul P (2005) Verbreitungsschwerpunkte und strukturelle Einnischung der Stauden-Lupine (*Lupinus polyphyllus* Lindl.) in Bergwiesen der Rhön. Tuexenia 25: 151–182.
- Otte A, Obert S, Volz H, Weigand E (2002) Effekte von Beweidung auf *Lupinus polyphyllus* Lindl. in Bergwiesen des Biosphärenreservates Rhön. In: Kowarik I, Starfinger U(Eds) Biologische Invasionen. Herausforderungen zum Handeln? Neobiota 1: 101–133.
- Rehfuess KE, Makeschin F, Rodenkirchen H (1991) Results and experience from amelioration trials in Scots pine (*Pinus sylvestris* L.) forests of Northeastern Bavaria. Fertilizer Research 27(1): 95–105. https://doi.org/10.1007/BF01048612
- Russi L, Cocks PS, Roberts EH (1992a) Coat thickness and hard-seededness in some *Medicago* and *Trifolium* species. Seed Science Research 2(4): 243–249. https://doi.org/10.1017/ S0960258500001434
- Russi L, Cocks PS, Roberts EH (1992b) Hard-seededness and seed bank dynamics of six pasture legumes. Seed Science Research 2(4): 231–241. https://doi.org/10.1017/S0960258500001422

- Samarah NH (2005) Effect of drying methods on germination and dormancy of common vetch (*Vicia sativa* L.) seed harvested at different maturity stages. Seed Science and Technology 33(3): 733–740. https://doi.org/10.15258/sst.2005.33.3.21
- Simberloff D (2003) How much information on population biology is needed to manage introduced species? Conservation Biology 17(1): 83–92. https://doi.org/10.1046/j.1523-1739.2003.02028.x
- Sóber V, Ramula S (2013) Seed number and environmental conditions do not explain seed size variability for the invasive herb *Lupinus polyphyllus*. Plant Ecology 214(6): 883–892. https://doi.org/10.1007/s11258-013-0216-8
- Thiele J, Isermann M, Otte A, Kollmann J (2010) Competitive displacement or biotic resistance? Disentangling relationships between community diversity and invasion success of tall herbs and shrubs. Journal of Vegetation Science 21(2): 213–220. https://doi.org/10.1111/ j.1654-1103.2009.01139.x
- Valtonen A, Jantunen J, Saarinen K (2006) Flora and lepidoptera fauna adversely affected by invasive *Lupinus polyphyllus* along road verges. Biological Conservation 133(3): 389–396. https://doi.org/10.1016/j.biocon.2006.06.015
- Volz H (2003) Ursachen und Auswirkungen der Ausbreitung von Lupinus polyphyllus Lindl. im Bergwiesenökosystem der Rhön und Maßnahmen zu seiner Regulierung. PHD Thesis. Justus Liebig University (Giessen).
- Wainwright CE, Cleland EE (2013) Exotic species display greater germination plasticity and higher germination rates than native species across multiple cues. Biological Invasions 15(10): 2253–2264. https://doi.org/10.1007/s10530-013-0449-4
- Wickham H (2016) ggplot2: Elegant graphics for data analysis (Second edition). Springer. https://doi.org/10.1007/978-3-319-24277-4\_9
- Wilson JRU, Dormontt EE, Prentis PJ, Lowe AJ, Richardson DM (2009) Something in the way you move: Dispersal pathways affect invasion success. Trends in Ecology & Evolution 24(3): 136–144. https://doi.org/10.1016/j.tree.2008.10.007
- Wolkovich EM, Cleland EE (2011) The phenology of plant invasions: A community ecology perspective. Frontiers in Ecology and the Environment 9(5): 287–294. https://doi. org/10.1890/100033
- Zuur AF, Ieno EN, Elphick CS (2010) A protocol for data exploration to avoid common statistical problems. Methods in Ecology and Evolution 1(1): 3–14. https://doi.org/10.1111/ j.2041-210X.2009.00001.x

# **Model Tables**

Authors: Yves P. Klinger, Rolf Lutz Eckstein, David Horlemann, Annette Otte, Kristin Ludewig

Data type: table xlsx-file

Explanation note: Model summary tables.

Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.56117.suppl1

**RESEARCH ARTICLE** 



# A bobber's perspective on angler-driven vectors of invasive species transmission

Rachel M. Fricke<sup>1</sup>, Spencer A. Wood<sup>2</sup>, Dustin R. Martin<sup>3</sup>, Julian D. Olden<sup>1</sup>

I School of Aquatic and Fishery Sciences, University of Washington, Seattle, Washington 98195, USA 2 eScience Institute, University of Washington, Seattle, Washington 98195, USA 3 ReelSonar, Inc., Seattle, Washington 98109, USA

Corresponding author: Julian D. Olden (olden@uw.edu)

Academic editor: S. M. Thomaz | Received 28 May 2020 | Accepted 8 August 2020 | Published 2 September 2020

**Citation:** Fricke RM, Wood SA, Martin DR, Olden JD (2020) A bobber's perspective on angler-driven vectors of invasive species transmission. NeoBiota 60: 97–115. https://doi.org/10.3897/neobiota.60.54579

## Abstract

Prevention of aquatic invasive species is a fundamental management challenge. With hundreds of millions of people participating in fishing trips each year, understanding angler movements that transmit invasive species can provide critical insight into the most effective locations and scales at which to apply preventative measures. Recent evidence suggests that mobile technologies provide new opportunities to understand different types of angler movement behaviour beyond what is possible with infrequently and sparsely conducted in-person boat surveys and mail questionnaires. Here we capitalise on data provided by ReelSonar's iBobber, a sonar-enabled bobber with over 5 M recorded fishing locations, globally. By quantifying geographic patterns of fishing activities and assessing how these patterns change seasonally, we explore angler behaviour across the entire continental United States in terms of fishing frequency and distance travelled between sites and characterise the attributes of fished ecosystems. We found that iBobber users (anglers) undertook 66,918 trips to 20,049 different water-bodies over a two-year period. Anglers who use iBobber were more likely to visit larger, deeper and more urbanised water-bodies and these water-bodies were over five times more likely to be a reservoir compared to a lake. Inter-water-body travel road distances averaged 93 km (SD = 277 km; range < 1-300 km) and nearly half of these movements occurred over a timespan of two days or less, a timeframe that we show falls well within the desiccation tolerance window of many prevalent plant and animal invasive species. Our study offers novel insight into spatiotemporal patterns of angler behaviour well beyond the geographical and temporal extent of conventional ground-collected approaches and carries important implications for predicting and preventing future transmission of aquatic invasive species via recreational fishing.

## Keywords

big data, desiccation tolerance, invasion risk, recreational fishing, species transmission, vectors

Copyright Rachel M. Fricke et al. This is an open access article distributed under the terms of the Creative Commons Attribution License (CC BY 4.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

# Introduction

Technological innovations in ecology have evolved significantly in recent decades, now serving a much more common and indispensable role in scientific research and management. The application of technology in conservation biology is rapidly growing and becoming more widespread (Joppa 2015; Pimm et al. 2015; Berger-Tal and Lahoz-Monfort 2018; Toivonen et al. 2019). Mobile app-derived data, for instance, are increasingly used to provide information for management strategies related to outdoor recreational use and planning, such as hiking and nature-based tourism (e.g. Wood et al. 2013; Fisher et al. 2018). This wealth of new data allows practitioners to map human recreational activities and relate individual behaviour to real-world conditions (Levin et al. 2017; Hausmann et al. 2018). For example, digital footprints in the form of geotagged photographs proportionally reflect human visitation rates at freshwater lakes and reservoirs (Keeler et al. 2015). However, broader incorporation of these data formats into freshwater management remains limited and user-generated data continue to be under-utilised in scientific studies (Venturelli et al. 2017).

Recreational freshwater fishing generates significant net economic benefits in the United States and Canada by engaging over 30 million participants annually, whose equipment and trip expenditures total in the tens of billions USD each year (U.S. Department of the Interior 2016; Fisheries and Oceans Canada 2019). However, high rates of participation in fishing have significant social, ecological and economic consequences. Anglers have repeatedly been implicated as vectors of non-indigenous species by entraining organisms in bait buckets, on fishing lines and on boat motors, hulls and trailers (Rothlisberger et al. 2010; Drake and Mandrak 2014; Smith et al. 2020). Insufficient gear-cleaning allows hitchhiking invaders to be moved overland between water-bodies, promoting both their initial introduction into new catchments and secondary spread into adjacent lakes and reservoirs (Anderson et al. 2014). Angling activity frequently moves invasive species over short distances, but can also distribute them across regions and nations via jump dispersal (Buchan and Padilla 1999; Wilson et al. 2009). In North America, higher numbers of non-native species have been found to coincide with areas of greater recreational fishing demand (Davis and Darling 2017). Examples of ubiquitous nuisance species whose translocation has been partly attributed to angling and boat movements include zebra mussel Dreissena polymorpha, Eurasian milfoil Myriophyllum spicatum, spiny water flea Bythotrephes longimanus and rusty crayfish Orconectes rusticus (Lodge et al. 2000; Minchin et al. 2003; Rothlisberger et al. 2010; Kerfoot et al. 2011).

Mobile technologies provide new opportunities to understand angler movement behaviour in ways that have traditionally challenged researchers. Emerging methods for tracing angler movement include trip logs on online fishing forums and mobile applications, remote traffic counters, geocoding wildlife recreational licences, text and data mining of social media and personal fishing gear with enhanced technological capabilities (e.g. Martin et al. 2014; Mogollón and Villamagna 2014; Papenfuss et al. 2015; Monkman et al. 2018; van Poorten and Brydle 2018). These new mobilebased data offer prospects for more robust spatiotemporal estimation of angler activity (Venturelli et al. 2017). This contrasts with conventional approaches that rely on in-person surveys at boat launches and mail-in questionnaires to licensed anglers and thus only provide a limited snapshot in time of angling activity at a particular location (Rothlisberger et al. 2010; Anderson et al. 2014). Moreover, the shift in demographics of recreational fishing towards younger and more technologically savvy anglers (Recreational Boating and Fishing Foundation 2018) suggests that mobile-based data may shed novel insights into the movement behaviour of individuals who are less likely to engage with long-standing survey instruments.

Given the pivotal role anglers play in transporting harmful freshwater invasive species, understanding when and where fishing activity occurs is critical for providing information for more strategic preventative measures (Muirhead and MacIsaac 2005; Vander Zanden and Olden 2008). Human transportation networks determine the large-scale geographic pathways available to anglers and, hence, the routes by which invasive species may hitchhike between water-bodies. Preventative measures are placed adjacent to these pathways and at the water-body access points they connect (Drake and Mandrak 2010; Meekan et al. 2017). Joining angler movement data with existing invasive species distributions allows for the identification of invasion hubs – areas from which non-indigenous species are frequently moved into nearby locales (Muirhead and MacIsaac 2005; Stewart-Koster et al. 2015). Enhancing our knowledge of human movement behaviour will improve our ability to deploy vector management and prioritise locations for a suite of preventative approaches, including early detection monitoring at access points, roadside boat and gear inspection stations and education in the form of billboards and awareness signs (Sharp et al. 2017; Cimino and Strecker 2018; Reaser et al. 2020).

The potential for invasive species introduction into new water-bodies via anglerdriven vectors is constrained not only by the spatial distributions of nuisance species and angler movement, but also by those factors that influence survival during transport, such as species' desiccation tolerance (Havel 2011; Wood et al. 2011; Leuven et al. 2014; Coughlan et al. 2018). Thus, it is important to account for the duration over which angler movement occurs across the landscape after potential entrainment of non-indigenous propagules in an angler transportation pathway (Johnson et al. 2001). In comparison to recreational boaters, anglers may enhance the likelihood for dispersing aquatic invasive species as they are more capable of accessing smaller water-bodies in remote locations (Drake and Mandrak 2010). Previous studies, however, have been unable to account for time when assessing risk of invasive species' introduction and spread via angler movement because such fine-scale data are not generated from conventional survey approaches. Consideration of the temporal dimension of angler movement provides greater resolution into this invasion vector by allowing for explicit consideration of movement events that are shorter in duration and likely to entrain viable propagules (Jerde et al. 2012; Banha and Anastácio 2014). Additionally, this approach has the advantage of integrating species-specific information (i.e. desiccation tolerance) into vector-based invasive species risk assessments.

In this study, we demonstrate how large-scale angler movement behaviour -a major contributor to the spread of invasive species -can be estimated from data col-

lected by mobile fishing technology. Specifically, we used angler location data from ReelSonar's iBobber – a sonar-enabled castable fish-finder with over 5,000,000 georeferenced global records of fishing activities uploaded since the device's launch – to analyse spatial patterns in angler movement across the continental United States. iBobber devices passively collect data upon submersion in water and, thus, have the advantage of representing all angling activity regardless of whether a user actively records a fish catch. Our objectives were to assess the geography of angler activities and movement dynamics while explicitly accounting for spatial distributions of aquatic nuisance species and limitations on propagule viability between water-bodies according to species' desiccation tolerance. The findings of this research offer novel insights into spatiotemporal patterns of angler behaviour and carry important implications for predicting and preventing future transmission of aquatic invasive species via recreational fishing.

## Methods

## iBobber technology and data processing

iBobbers are small castable, personal fish-finders that sync through Bluetooth with a smartphone application to provide users with real-time information on fish and vegetation presence in the water column, map water-body depth and estimate water and air temperature, wind speed and direction and a suite of additional weather variables. iBobber users include shore-based anglers and those fishing from kayaks, canoes and other boats. iBobbers (distributed by ReelSonar of Seattle, WA) are widely available for purchase in stores and on the web and are primarily used in North America, Europe and east Asia.

Anonymised data were acquired from all iBobber devices that were used over a two-year period (January 2017 – December 2018). When submerged in water, each bobber records a "hotspot" of its geographic location in 30-second intervals, along with time, date, fish presence, depth and a host of other variables. Each device is identified by its unique bobber ID code and iBobber users can view these metrics in real-time using the iBobber phone app. As owners often test their devices initially in their home sinks and pools, we first filtered the data spatially by excluding hotspots that were located outside of a 50-m buffer of the > 379,000 lakes and reservoirs contained in the National Hydrography Dataset, v2 (NHD) for the continental U.S. (U.S. Geological Survey 2018). Timestamped locations were then compiled into single fishing trips by pooling hotspots with the same bobber ID, water-body and date.

## Angling trip and water-body metrics

We calculated summary metrics to describe angler fishing activities according to iBobber records, including the number of trips (i.e. distinct visits to a water-body in time) by each user, total trips per month and day of the week across all water-bodies and users and density of trips (# km<sup>2</sup>) across the continental U.S. Water-body characteristics were obtained from the EPA's LakeCat Dataset, which classifies lakes and reservoirs within the NHD by surrounding land use and lithography, size, surface area and additional variables (Hill et al. 2018). We compared the percent urban land cover in the contributing basin of water-body and the maximum depth and surface area of water-bodies fished by iBobber users to that of all water-bodies within LakeCat using a parametric comparison of means according to a two-sample Z-test. In addition, we identified which lakes were reservoirs with USGS' Reservoir Morphology Dataset (Rodgers 2017), compared the likelihood of natural lakes and reservoirs being fished by iBobber users with a two-tailed chi-squared test of independence and assessed the effect size of this likelihood using the odds ratio.

## Angler movement events and duration between water-bodies

Least-cost ground transportation distances between consecutive anglers' trips to water-bodies were determined by routing angler locations through GraphHopper's route optimiser, which uses OpenStreetMap as a base map. This is termed an angler (interwater-body) movement event. GraphHopper routes geographic coordinates through the closest road access point for each water-body, thus most often estimating the transportation distance between public boat launches. We calculated the duration of each angler movement event as the number of days between consecutive trips by iBobber users. Furthermore, we conducted a literature search to identify all nuisance freshwater invasive species with reported tolerated exposure to desiccation (the length of time) in an overland vector, resulting in values for hydrilla Hydrilla verticillata (16 hours: Barnes et al. 2013), Eurasian milfoil (2 days: Barnes et al. 2013), New Zealand mudsnail Potamopyrgus antipodarum (3 days: Havel et al. 2014), zebra mussel (5 days: Ricciardi et al. 1995), Asian clam Corbicula fluminea (23 days: Collas et al. 2014) and Chinese mystery snail Cipangopaludina chinensis (63 days: Havel et al. 2014). We then calculated the number of movement events that fell within each species desiccation tolerance range. Lastly, we visualised a subset of angler movements in a region of Wisconsin, U.S. to demonstrate high traffic road routes utilised by anglers and to assess the frequency of movements from non-invaded to invaded water-bodies. We first determined whether angling was a potential vector for a range of invasive species using the USGS Nonindigenous Aquatic Species database (2018) and then classified invaded water-bodies within the angler movement subset as those containing at least one of the identified species (Asian clam, banded mystery snail Viviparus georgianus, curly-leaf pondweed Potamogeton crispus, Chinese mystery snail, Eurasian milfoil, flowering rush Butomus umbellatus, purple loosestrife Lythrum salicaria, ornamental water lilies Nymphaea sp., rusty crayfish, spiny water flea, zebra mussel) according to presence/absence records from the Wisconsin Department of Natural Resources (2016).

## Comparison to other angler participation data

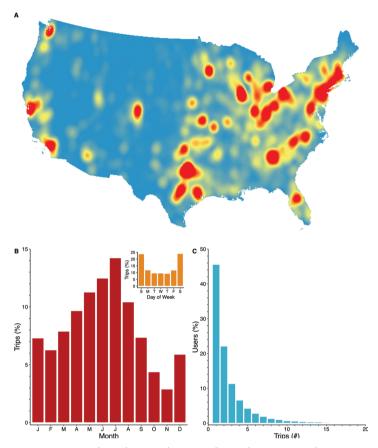
We evaluated the correspondence of angling activity, based on iBobber data with existing creel-based data collected at the scale of individual lakes and states of the U.S. The lake-level analysis obtained data from a state-wide survey of lake users on 86 lakes in Iowa over 5 years (2002–2005 and 2009) (Evans et al. 2009), which we compared with the proportion of trips by lake according to iBobber activity. The state-level analysis compared the percent distribution of annual fishing trips by state reported in the U.S. Fish & Wildlife Service's (USFWS) 2011 National Survey (U.S. Department of the Interior et al. 2011) to the calculated percent of trips made annually to each state by iBobber users. Great Lakes trips were attributed to the state with the nearest shoreline to the trip's coordinates, but North Dakota was excluded as the state did not report data for the 2011 survey. Both lake- and state-level comparisons were measured by the Pearson correlation coefficient. All spatial analyses were completed in ESRI ArcMap version 10.0 (Redlands, CA) and all statistical analyses were completed in R 3.5.1 (R Core Team).

# Results

An extensive geographic footprint of angler activities exists across the continental United States according to 66,918 trips taken by 10,768 iBobber users over a two-year period (Fig. 1A). Angler trips were concentrated in more urbanised regions, particularly in the eastern and western states. As expected, trip frequency peaked during the late spring-early summer months (June-July) and was at its lowest in late autumn-early winter (October-November) (Fig. 1B). Moreover, the frequency of trips on weekends (24%) was more than double that of midweek days (Fig. 1B inset). Over half (55%) of iBobber users made more than one trip during the study period (Fig. 1C), up to a maximum of 88 trips.

During the study period, iBobber users visited 20,049 different water-bodies, of which 46% were visited more than once (Fig. 2A). The most-visited water-body was Lewisville Lake – one of the largest lakes in north Texas – with 427 trips by 128 different anglers. Water-bodies fished by iBobber users were characterised by having statistically significant higher mean catchment urbanisation (24.3% vs. 9.4%, z = 3.02, p = 0.001), maximum depth (8.4 m vs. 2.6 m, z = -2.01, p = 0.022) and surface area (18.3 km<sup>2</sup> vs. 0.65 km<sup>2</sup>, z = -2.31, p = 0.011) compared to all 379,090 water-bodies across the continental United States. iBobber users were over five times more likely to make a trip to reservoirs compared to lakes (two-tailed  $\chi^2$ , df = 1, p < 0.001, logistic regression odds ratio = 5.68).

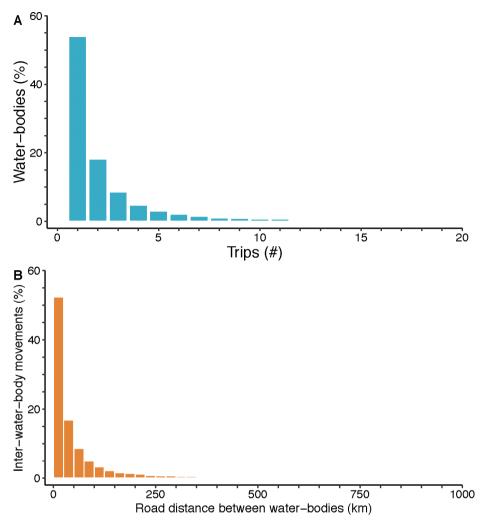
Anglers engaged in wide-ranging travel distances and durations amongst fished water-bodies. According to 23,363 movements between two successive water-bodies by iBobber users, mean and median road distance travelled was 93 km (SD = 277 km) and 23 km, respectively, ranging from short-distance movements of < 1 km to long-distance movements of ca. 300 km (Fig. 2B). The GraphHopper routing algorithm



**Figure 1.** From January 2017 through December 2018 **A** trip density across the continental U.S. ranging from zero (blue) to 1,523 (red) trips per km<sup>2</sup> **B** percentage of trips by month and **(inset)** day of the week and **C** iBobber users (%) by total number of trips taken, truncated at 20 trips (bin size =1).

returned a road distance of zero for 7% of inter-water-body movements (N = 1,677 movements), indicating users walked between water-bodies or travelled on roads not contained in the Open Street Map data layer. Nearly half of inter-water-body movements by iBobber users occurred over a timespan of two days or less, which falls well within the desiccation tolerance window of many prevalent invasive species (Fig. 3). For example, the literature search for invasive species' desiccation tolerance revealed the species with the shortest and longest quantified desiccation tolerance was Hydrilla (16 hours) and Chinese mystery snail (63 days), respectively (Barnes et al. 2013; Havel et al. 2014). This results in 32% (Hydrilla) to 89% (Chinese mystery snail) of all interlake movements having a duration that falls within the range of desiccation tolerance.

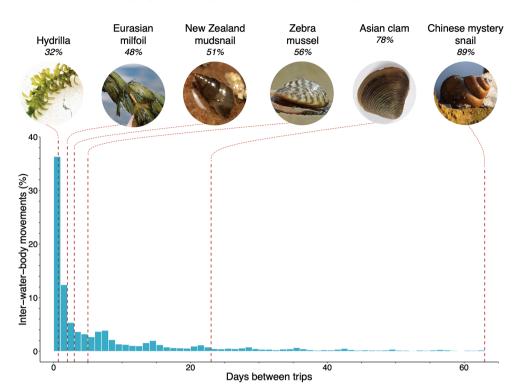
Estimates of angler visitation frequency, according to iBobber user records, corresponded with previous estimates according to creel surveys. Lake-level visitation by iBobber users was correlated with surveyed visitation of Iowa lake users ( $R^2 = 0.425$ ,



**Figure 2. A** Percentage of water-bodies according to the number of trips taken by iBobber users, truncated at 20 trips (bin size = 1) and **B** the frequency (%) of movements between two subsequently visited water-bodies by road distance (km) (bin size = 25), truncated at 1,000 km.

p < 0.001, N = 53) (Fig. 4A). Similarly, for the continental United States, the state-level visitation frequency by iBobber users was positively correlated with relative angling activity by state reported in the most recent USFWS National Survey ( $R^2 = 0.342$ , p < 0.001, N = 47) (Fig. 4B). Amongst states, Texas had the greatest disparity between percentage of angling activity in the iBobber (11.6%) and USFWS (5.5%) datasets.

The utility of data from mobile fishing apps to elucidate regional-scale angler movement behaviour was demonstrated using water-bodies around Milwaukee, WI (Fig. 5). For 29 water-bodies, we observed 50 angler trips along 41 visualised road routes – demonstrating the diffuse geographic routes by which non-native species could be

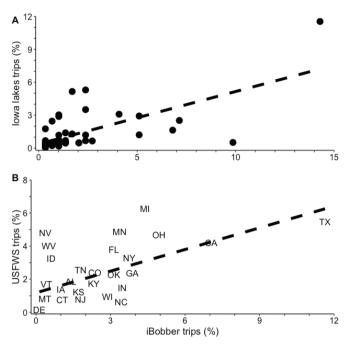


**Figure 3.** Percentage (%) of iBobber user movements between water-bodies according to the number of days between trips. Vertical lines represent published estimates of survival time when exposed to desiccation in an overland vector for indicated invasive species (% of total movements stated). Photo credits: "Bay grasses on the Susquehanna Flats in Harford County, Md." by chesbayprogram is licensed under CC BY-NC 2.0, "Eurasian Watermilfoil, Susquehanna Flats" by chesbayprogram is licensed under CC BY-NC 2.0, Potamopyrgus antipodarum" by fturmog is licensed under CC BY-NC-SA 2.0, "File:Dreissena polymorpha (Zebra mussel), Arnhem, the Netherlands.jpg" by Bj.schoenmakers is licensed under CC0 1.0, "File:Muschel Aller 7987.jpg" by NobbiP is licensed under CC BY-SA 3.0, "Chinese Mystery Snails in winter" by brentsview is licensed under CC BY-NC 2.0.

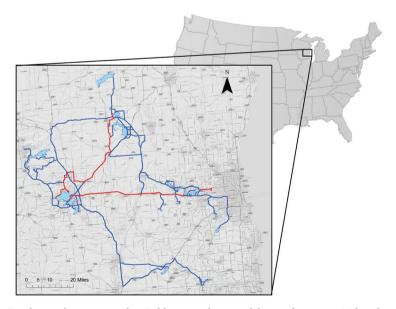
transported. Movements tended to originate from a small number of water-bodies (i.e. hubs), with four lakes (Beaver Dam Lake, Lake Monona, Fox Lake, Pewaukee Lake) serving as the origin lake for 64% of movements, which terminated at 20 destination lakes. According to the current distribution of aquatic nuisance species in the region, 100% of angler movements involved visiting an invaded water-body and 8% of movements were from an invaded lake to a non-invaded lake (Fig. 5).

# Discussion

Mobile technologies offer new insights into risks of human-assisted transport of aquatic invasive species. Our investigation of user-generated angling data from iBobber users



**Figure 4. A** Total Iowa iBobber user activity by lake (%) versus the total visits by lake (%) as quantified by an Iowa State University state-wide survey ( $p = 7.5 \times 10^{-8}$ ,  $R^2 = 0.425$ ) (Evans et al. 2011) **B** total iBobber user activity by state (%) versus total angling activity by state (%) as quantified by the 2011 USFWS National Survey (U.S. Department of the Interior 2014).



**Figure 5.** Road-routed movements by iBobber users between lakes in the greater Milwaukee, WI area. Movements between lakes with invasive species present are indicated by blue routes while movements from an invaded lake to a non-invaded lake are indicated by red routes.

across the United States demonstrates the potential to characterise angler site preference and movement activities well beyond the geographical and temporal extent of conventional ground-collected approaches. Furthermore, our mobile data affirms previous observations that fished water-bodies are commonly large, urban reservoirs. Here, we discuss the relevance of our findings for enhanced prevention of invasive species, evaluate the key benefits and challenges of employing new mobile data forms and suggest future steps to enhance the value of mobile data in invasion biology.

User-generated data sources represent a cost-effective means of mapping human geography of interactions with environments (Deville et al. 2014; Toivonen et al. 2019). iBobbers, as well as similar devices and mobile applications, could provide resource managers with information regarding angler traffic at broader spatiotemporal scales than have previously been available (Venturelli et al. 2017). Given the importance of interstate pathways in facilitating transmission of invasive species and waterborne diseases between lake networks (e.g. Buchan and Padilla 1999; Muirhead and MacIsaac 2005; Stewart-Koster et al. 2015), understanding the dynamics of angler movement across traditional jurisdictional boundaries that often serve as spatial limits for conventional creel surveys is vital (Peters and Lodge 2009). Indeed, data that support coordinated management decisions across neighbouring regions are fundamental to successful management of invasive species in complex social landscapes (Epanchin-Niell et al. 2010). We found that the road distance travelled between water-bodies by iBobber users, for example, exceeded estimates for Wisconsin (mean: 93 vs. 34 km: Buchan and Padilla 1999), but was significantly less than Ontario, Canada (median: 23 vs. 292 km: Drake and Mandrak 2010) according to angler surveys.

Use of geotagged angler data from mobile technology allows for seamless crossreferencing of information about angler behaviour with characteristics of source and destination lakes, such as the pool of non-indigenous species available to be entrained into the vector and key environmental determinants of species establishment. For example, by linking to readily-available species distribution databases for a region in Wisconsin, we showed that approximately one-in-ten movements were from lakes containing aquatic invasive species to lakes currently not invaded. For the U.S., we show that the large population of iBobber users fish reservoirs at five times the rate relative to natural lakes, while concurrent research shows that reservoirs are two to 300 times more likely to support established aquatic invasive species (Johnson et al. 2008). Other predictors of angling activity included facility quality (e.g. boat launch presence) and destination size (e.g. lake area), both well-established determinants of site choice in recreational fisheries (Hunt et al. 2019). Taken together, many opportunities exist to integrate angler movement patterns derived from mobile technology with spatiotemporal data describing propagule pressure and factors related to establishment success.

Timestamped mobile-based data offer opportunities to capture the temporal dimension of angler movements across the landscape by estimating the duration of time between visits to water-bodies. As most iBobber user movement between water-bodies occurs over relatively short timeframes, our analysis suggests that a greater diversity of potential hitchhikers transported by users will be viable, according to desiccation tolerance, upon arrival at a destination water-body. If entrained on angling or boating gear, species with a longer desiccation tolerance, such as the Chinese mystery snail, are more likely to survive and establish (89% of inter-water-body movements taken by iBobber users) than species with shorter tolerances, such as Hydrilla (32% of movements) (Havel et al. 2014). As an aside, our literature search returned robust estimates of temporal limitations on desiccation tolerance for relatively few species, suggesting that further studies are needed to clarify the length of time invasive species can withstand exposure out of water.

Mobile technologies also facilitate road routing of angler movement between fishing locations. Geotagged fishing locations are particularly amenable to this method, because they allow us to identify the most likely access point of a water-body, which determines the direction from which anglers may approach a lake or reservoir. Understanding the spatial configuration of human movement helps identify crucial nexuses across time and space for intercepting hitchhiking invaders. For example, junctions at which frequently-travelled routes between invaded and non-invaded lakes converge can be prioritised for interceptive approaches, such as watercraft inspection stations and recent modelling efforts to optimise the operating times and locations of such stations will benefit tremendously from the fine-scale timing and direction data that mobile sources offer (Fischer et al. 2020).

Angler mobile applications represent a cost-effective approach to understand angler-assisted vectors for aquatic invasive species and, in some instances, as in the case of iBobber, offer an opportunity for passive collection of angler activity data. This offers a number of advantages. First, as younger anglers' participation in fishing increases, mobile platforms offer management agencies an opportunity to outreach and learn more about these demographics, as these are also less likely to engage with mail-in or inperson surveys (Fisher 1996; Recreational Boating and Fishing Foundation Outdoor Foundation 2018; Gundeland et al. 2020). Second, mobile-based data provide information about the movement of a largely unknown group of anglers accessing waterbodies using non-motorised recreational boats, such as canoes and kayaks and who are similarly dispersal vectors for aquatic invasive species (Stasko et al. 2012; Anderson et al. 2014), but are not subject to conventional creel surveys conducted at boat launches. In summary, while prior work has demonstrated that actively collected mobile data (i.e. records of angler presence at a location which must be initiated by the user, such as fishing logs or catch records) generally reflect the spatiotemporal distribution of creel surveys, here we have shown that passively collected data are similarly valuable (Martin et al. 2014; Papenfuss et al. 2015). This is an important distinction, as self-initiated logs of angler presence at a water-body may not include all fished locations (we also recognise that iBobber users may not always use their device). Anglers will likely prefer to record and share trips during which they made a catch and, thus, actively collected data may be prone to success bias.

Though user-generated datasets of angling activity derived from mobile technology successfully address a number of limitations of traditional creel surveys in terms of their spatiotemporal resolution, they may also introduce new biases. In our analysis, slightly more than half of users only used their iBobber on more than one trip during the two-year period. However, the substantial number of total iBobber users does allow us to infer movement patterns of a large sample population. Angler activity, according to iBobber users, was found to be comparable to estimates according to creel-based data collected at the scale of individual lakes and entire states of the United States. Much like creel surveys, the demographics of users of a particular mobile application or device are also unlikely to be fully representative of the entire population of interest (Hargittai 2015). For example, the cost of a single iBobber starts at 100 USD, thus imposing a socioeconomic filter on which anglers are likely to purchase and use the device. In fact, the number of iBobber users is estimated to represent less than 1% of anglers across the U.S.; this is similar to the proportion of angler populations represented in traditional survey-based approaches. Additionally, iBobber owners must possess a smartphone, because real-time data from an iBobber is communicated to users via the device's associated phone application. Previous work analysing spatial and demographic biases in other social media applications (Twitter) across the US identified a significant positive influence of higher median income, urbanisation, higher proportion of younger residents and higher proportion of minority residents on the frequency of geotagged posts (Malik et al. 2015). Despite these considerations, it is well recognised that conventional approaches are limited by the tendency to: (1) favour surveying anglers of higher economic status who own boats, (2) demonstrate biases in gender, age and location of respondents to mail questionnaires (Dempson et al. 2012), in part because of non-response and recall bias (Tarrant et al. 1993) and (3) potentially measure intended rather than actual angler behaviour (Venturelli et al. 2017). Moving forward, the extent to which demographic biases may influence the conclusions drawn from user-generated datasets about water-bodies remains unclear and should be a priority for future study.

Creel surveys and other traditional data forms continue to be highly valuable sources of information regarding angler movement of invasive species, particularly when implemented by a dedicated team of resource managers and volunteers aiming to intercept identified target species (Cooke et al. 2015). For example, boat inspection station volunteers at a single location can ask boaters which water-body they visited last and cross-reference their responses in databases of invaded water-bodies. However, for the vast majority of water-bodies with limited local funds and resources dedicated to support such intensive outreach efforts, managers working to prevent invasive introductions into an entire state or region may benefit significantly from insights gained from readily-available, even possibly real-time, mobile data. Despite this, such data are often not publicly available and will require data agreements with technology companies. Moreover, even when data are public (e.g. citizen science initiatives), lack of data sharing with larger initiatives and databases continues to pose a barrier to implementation of emerging data sources in research and management (Johnson et al. 2020). The most effective management strategies will couple an appropriate synthesis of traditional and emerging data sources based on the scope and connectivity of target water-bodies, but this will require a significant investment in web infrastructure to collate, update and disseminate disparate data sources and formats.

The ongoing creation of fishing-orientated technology and mobile applications presents an exciting opportunity for collaboration amongst researchers, technology developers and resource managers. Integration of mobile data into angler network models, for example, could lead to new developments in graph-theory methods to identify the most influential nodes (water-bodies) and edges (pathways between water-bodies) in terms of propagule pressure (Martin et al. 2017), beyond what is currently supported by more limited in-person or mail survey data (e.g. Muirhead and MacIsaac 2005; Stewart-Koster et al. 2015). Ultimately, such network approaches will benefit substantially from incorporation of water-body-level invasive species records to enable identification of movements from invaded to non-invaded water-bodies. Collaborative efforts could also identify long-standing data gaps in understanding angler behaviour (e.g. bait and gear use tendencies) and intentionally request this information in trip logs and user profiles (Venturelli et al. 2017). iBobber users have the option to self-report this information in their application profile, but our analysis of this data revealed that the vast majority leave these fields blank. Application developers often increase platform use through promotional incentives, such as gear giveaways and similar incentives could also be developed to encourage profile completion. Bait and gear use are particularly informative for invasive species prevention, as the pool of potential species moved by anglers is dependent on their gear (e.g. bait buckets) and method (shore versus boat) of fishing (Drake and Mandrak 2014). Incorporating more specific data on the type of fishing engaged in by recreational anglers into our understanding of propagule pressure will allow resource managers to further narrow preventative approaches to target the specific species most likely to be relocated between water-bodies, based on common fishing practices in a given region.

#### Conclusion

Mobile fishing applications and devices such as iBobber represent a valuable new passively-collected mobile data source which, along with other types of actively-collected mobile data (e.g. Papenfuss et al. 2015), offer new opportunities to provide information about invasive species management, particularly as it relates to propagule pressure from angler behaviour. User-generated, mobile data expand spatiotemporal estimates of angling activity beyond what is possible with traditional creel surveys and potentially minimise survey costs. The future holds many exciting possibilities to incorporate both digital user-generated and ground-collected data into modelled social-ecological systems to guide more efficient and effective invasive species prevention campaigns.

#### Acknowledgements

This work was supported by a Data Science Environments project award from the Gordon and Betty Moore Foundation (Award #2013-10-29) and the Alfred P. Sloan Foundation (Award #3835) to the University of Washington eScience Institute. RMF was supported by Edward Allen Power, W.F. Thompson and Mary Gates Endowment scholarships. We thank three anonymous reviewers for comments that improved the final paper.

### References

- Anderson LG, White PCL, Stebbing PD, Stentiford GD, Dunn AM (2014) Biosecurity and vector behaviour: Evaluating the potential threat posed by anglers and canoeists as pathways for the spread of invasive non-native species and pathogens. PLoS ONE 9(4): e92788. https://doi.org/10.1371/journal.pone.0092788
- Banha F, Anastácio PM (2014) Desiccation survival capacities of two invasive crayfish species. Knowledge and Management of Aquatic Ecosystems (413): 1–5. https://doi.org/10.1051/ kmae/2013084
- Barnes MA, Jerde CL, Keller D, Chadderton WL, Howeth JG, Lodge DM (2013) Viability of aquatic plant fragments following desiccation. Invasive Plant Science and Management 6(2): 320–325. https://doi.org/10.1614/IPSM-D-12-00060.1
- Berger-Tal O, Lahoz-Monfort JJ (2018) Conservation technology: The next generation. Conservation Letters 11(6): 1–6. https://doi.org/10.1111/conl.12458
- Buchan LAJ, Padilla DK (1999) Estimating the probability of long-distance overland dispersal of invading aquatic species. Ecological Applications 9(1): 254–265. https://doi. org/10.2307/2641184
- Cimino SA, Strecker AL (2018) Boater knowledge and behavior regarding aquatic invasive species at a boat wash station. Northwest Science 92(3): 1–224. https://doi.org/10.3955/046.092.0308
- Collas FPL, Koopman KR, Hendriks AJ, van der Velde G, Verbrugge LNH, Leuven RSEW (2014) Effects of desiccation on native and non-native molluscs in rivers. Freshwater Biology 59(1): 41–55. https://doi.org/10.1111/fwb.12244
- Cooke SJ, Arlinghaus R, Johnson BM, Cowx IG (2015) Recreational fisheries in inland waters. In: Craig JF (Ed.) Freshwater Fisheries Ecology. John Wiley & Sons, Ltd., 449–465. https://doi.org/10.1002/9781118394380
- Coughlan NE, Cuthbert RN, Kelly TC, Jansen MAK (2018) Parched plants: survival and viability of invasive aquatic macrophytes following exposure to various desiccation regimes. Aquatic Botany 150: 9–15. https://doi.org/10.1016/j.aquabot.2018.06.001
- Davis AJS, Darling JA (2017) Recreational freshwater fishing drives non-native aquatic species richness patterns at a continental scale. Diversity and Distributions 23(6): 692–702. https://doi.org/10.1111/ddi.12557
- Dempson JB, Robertson MJ, Cochrane NM, O'Connell MF, Porter G (2012) Changes in angler participation and demographics: Analysis of a 17-year licence stub return system for Atlantic salmon. Fisheries Management and Ecology 19(4): 333–343. https://doi. org/10.1111/j.1365-2400.2012.00848.x
- Deville P, Linard C, Martin S, Gilbert M, Stevens FR, Gaughan AE, Blondel VD, Tatem AJ (2014) Dynamic population mapping using mobile phone data. Proceedings of the National Academy of Sciences, USA 111(45): 15888–15893. https://doi.org/10.1073/pnas.1408439111
- Drake DAR, Mandrak NE (2010) Least-cost transportation networks predict spatial interaction of invasion vectors. Ecological Applications 20(8): 2286–2299. https://doi. org/10.1890/09-2005.1
- Drake DAR, Mandrak NE (2014) Bycatch, bait, anglers, and roads: Quantifying vector activity and propagule introduction risk across lake ecosystems. Ecological Applications 24(4): 877–894. https://doi.org/10.1890/13-0541.1

- Epanchin-Niell RS, Hufford MB, Asian CE, Sexton JP, Port JD, Waring TM (2010) Controlling invasive species in complex social landscapes. Frontiers in Ecology and the Environment 8(4): 210–216. https://doi.org/10.1890/090029
- Evans KS, Herriges JA, Kling CL (2011) A Report to the Iowa Department of Natural Resources: The Iowa Lakes Valuation Project 2009 Summary and Findings. http://www.card. iastate.edu/lakes/
- Fischer SM, Beck M, Herborg LM, Lewis MA (2020) Managing aquatic invasions: optimal locations and operating times for watercraft inspection stations. arXiv:2003.06092v1
- Fisher DM, Wood SA, White EM, Blahna DJ, Lange S, Weinberg A, Tomco M, Lia E (2018) Recreational use in dispersed public lands measured using social media data and on-site counts. Journal of Environmental Management 222: 465–474. https://doi.org/10.1016/j. jenvman.2018.05.045
- Fisher MR (1996) Estimating the effect of nonresponse bias on angler surveys. Transactions of the American Fisheries Society 125: 118–126. https://doi.org/10.1577/1548-8659(1996)125<0118:ETEONB>2.3.CO;2
- Fisheries and Oceans Canada (2019) Survey of Recreational Fishing in Canada, 2015. https:// waves-vagues.dfo-mpo.gc.ca/Library/40753220.pdf
- Gundeland C, Arlinghaus R, Baktoft H, Hyder K, Venturelli P, Skov C (2020) Insights into the users of a citizen science platform for collecting recreational fisheries data. Fisheries Research 229: 105597. https://doi.org/10.1016/j.fishres.2020.105597
- Hargittai E (2015) Is bigger always better? Potential biases of big data derived from social network sites. Annals of the American Academy of Political and Social Science 659: 63–76. https://doi.org/10.1177/0002716215570866
- Hausmann A, Toivonen T, Slotow R, Tenkanen H, Moilanen A, Heikinheimo V, Di Minin E (2018) Social media data can be used to understand tourists' preferences for nature-based experiences in protected areas. Conservation Letters 11(1): 1–10. https://doi.org/10.1111/ conl.12343
- Havel JE (2011) Survival of the exotic Chinese mystery snail (*Cipangopaludina chinensis malleata*) during air exposure and implications for overland dispersal by boats. Hydrobiologia 668: 195–202. https://doi.org/10.1007/s10750-010-0566-3
- Havel JE, Bruckerhoff LA, Funkhouser MA, Gemberling AR (2014) Resistance to desiccation in aquatic invasive snails and implications for their overland dispersal. Hydrobiologia 741: 89–100. https://doi.org/10.1007/s10750-014-1839-z
- Hill RA, Weber MH, Debbout RM, Leibowitz SG, Olsen AR (2018) The Lake-Catchment (LakeCat) Dataset: Characterizing landscape features for lake basins within the conterminous USA. Freshwater Science 37(2): 208–221. https://doi.org/10.1086/697966
- Hunt LM, Morris DM, Drake DAR, Buckley JD, Johnson TB (2019) Predicting spatial patterns of recreational boating to understand potential impacts to fisheries and aquatic ecosystems. Fisheries Research 211: 111–120. https://doi.org/10.1016/j.fishres.2018.11.007
- Jerde CL, Barnes MA, DeBuysser EK, Noveroske A, Chadderton WL, Lodge DM (2012) Eurasian watermilfoil fitness loss and invasion potential following desiccation during simulated overland transport. Aquatic Invasions 7(1): 135–142. https://doi.org/10.1007/s10530-011-0078-8

- Johnson LE, Ricciardi A, Carlton JT (2001) Overland dispersal of aquatic invasive species: A risk assessment of transient recreational boating. Ecological Applications 11(6): 1789– 1799. https://doi.org/10.2307/3061096
- Johnson PTJ, Olden JD, Vander Zanden MJ (2008) Dam invaders: Impoundments facilitate biological invasions into freshwaters. Frontiers in Ecology and the Environment 6(7): 357–363. https://doi.org/10.1890/070156
- Johnson BA, Mader AD, Dasgupta R, Kumar P (2020) Citizen science and alien species: An analysis of citizen science initiatives using information and communications technology (ICT) to collect invasive alien species observations. Global Ecology and Conservation 21: e00812. https://doi.org/10.1016/j.gecco.2019.e00812
- Joppa LN (2015) Technology for nature conservation: An industry perspective. Ambio 44(4): 522–526. https://doi.org/10.1007/s13280-015-0702-4
- Keeler BL, Wood SA, Polasky S, Kling C, Filstrup CT, Downing JA (2015) Recreational demand for clean water: Evidence from geotagged photographs by visitors to lakes. Frontiers in Ecology and the Environment 13(2): 76–81. https://doi.org/10.1007/s13280-015-0702-4
- Kerfoot WC, Yousef F, Hobmeier MM, Maki RP, Jarnagin ST, Churchill JH (2011) Temperature, recreational fishing and diapause egg connections: Dispersal of spiny water fleas (*Bythotrephes longimanus*). Biological Invasions 13(11): 2513–2531. https://doi. org/10.1007/s13280-015-0702-4
- Levin N, Lechner AM, Brown G (2017) An evaluation of crowdsourced information for assessing the visitation and perceived importance of protected areas. Applied Geography 79: 115–126. https://doi.org/10.1016/j.apgeog.2016.12.009
- Leuven RSEW, Collas FPL, Koopman KR, Matthews J, van der Velde G (2014) Mass mortality of invasive zebra and quagga mussels by desiccation during severe winter conditions. Aquatic Invasions 9(3): 243–252. https://doi.org/10.3391/ai.2014.9.3.02
- Lodge DM, Taylor CA, Holdich DM, Skurdal J (2000) Reducing impacts of exotic crayfish introductions: New policies needed. Fisheries 25(8): 21–23.
- Malik MM, Lamba H, Nakos C, Pfeffer J (2015) Population bias in geotagged tweets. AAAI Workshop – Technical Report WS-15–18: 18–27. https://www.aaai.org/ocs/index.php/ ICWSM/ICWSM15/paper/view/10662/10551
- Martin DR, Christopher JC, Eskridge KM, Pope KL (2014) Using posts to an online social network to assess fishing effort. Fisheries Research 157: 24–27. https://doi.org/10.1016/j. fishres.2014.03.013
- Martin DR, CJ Chizinski, Pope KL (2017) Network analysis of a regional fishery: Implications for management of natural resources, and recruitment and retention of anglers. Fisheries Research 194: 31–41. https://doi.org/10.1016/j.fishres.2017.05.007
- Meekan MG, Duarte CM, Fernández-Gracia J, Thums M, Sequeira AMM, Harcourt R, Eguíluz VM (2017) The ecology of human mobility. Trends in Ecology and Evolution 32(3): 198–210. https://doi.org/10.1016/j.tree.2016.12.006
- Minchin D, Maguire C, Rosell R (2003) The zebra mussel (*Dreissena polymorpha* Pallas) invades Ireland: Human mediated vectors and the potential for rapid intranational dispersal. Biology and Environment 103(1): 23–30. https://doi.org/10.3318/BIOE.2003.103.1.23

- Mogollón B, Villamagna AM (2014) Updating the manager's toolbox: Mapping spatio-temporal trends in freshwater fishing. Journal of Outdoor Recreation and Tourism 7–8: 89–95. https://doi.org/10.1016/j.jort.2014.09.009
- Monkman GG, Kaiser MJ, Hyder K (2018) Text and data mining of social media to map wildlife recreation activity. Biological Conservation 228: 89–99. https://doi.org/10.1016/j. biocon.2018.10.010
- Muirhead JR, MacIsaac HJ (2005) Development of inland lakes as hubs in an invasion network. Journal of Applied Ecology 42(1): 80–90. https://doi.org/10.1111/j.1365-2664.2004.00988.x
- Papenfuss JT, Phelps N, Fulton D, Venturelli PA (2015) Smartphones reveal angler behavior: A case study of a popular mobile fishing application in Alberta, Canada. Fisheries 40(7): 318–327. https://doi.org/10.1080/03632415.2015.1049693
- Peters JA, Lodge DM (2009) Invasive species policy at the regional level: A multiple weak links problem. Fisheries 34(8): 373–380. https://doi.org/10.1577/1548-8446-34.8.373
- Pimm SL, Alibhai S, Bergl R, Dehgan A, Giri C, Jewell Z, Joppa L, Kays R, Loarie S (2015) Emerging technologies to conserve biodiversity. Trends in Ecology and Evolution 30(11): 685–696. https://doi.org/10.1016/j.tree.2015.08.008
- van Poorten BT, Brydle S (2018) Estimating fishing effort from remote traffic counters: Opportunities and challenges. Fisheries Research 204: 231–238. https://doi.org/10.1016/j. fishres.2018.02.024
- Reaser JK, Burgiel SW, Kirkey J, Brantley KA, Veatch SD, Burgos-Rodríguez J (2020) The early detection of and rapid response (EDRR) to invasive species: a conceptual framework and federal capacities assessment. Biological Invasions 22(1): 1–19. https://doi.org/10.1007/s10530-019-02156-w
- Recreational Boating and Fishing Foundation (2018) 2018 Special Report on Fishing. https://outdoorindustry.org/wp-content/uploads/2015/03/2018-Special-Report-on-Fishing\_FI-NAL.pdf
- Ricciardi A, Serrouya R, Whoriskey FG (1995) Aerial exposure tolerance of zebra and quagga mussels (*Bivalvia: Dreissenidae*): Implications for overland dispersal. Canadian Journal of Fisheries and Aquatic Sciences 52: 470–477. https://doi.org/10.1139/f95-048
- Rodgers KD (2017) A reservoir morphology database for the conterminous United States. Page Data Series. Reston. https://doi.org/10.3133/ds1062
- Rothlisberger JD, Chadderton WL, McNulty J, Lodge DM (2010) Aquatic invasive species transport via trailered boats: What is being moved, who is moving it, and what can be done. Fisheries 35(3): 121–132. https://doi.org/10.1577/1548-8446-35.3.121
- Sharp RL, Cleckner LB, DePillo S (2017) The impact of on-site educational outreach on recreational users' perceptions of aquatic invasive species and their management. Environmental Education Research 23(8): 1200–1210. https://doi.org/10.1577/1548-8446-35.3.121
- Smith ERC, Bennion H, Sayer CD, Aldridge DC, Owen M (2020) Recreational angling as a pathway for invasive non-native species spread: awareness of biosecurity and the risk of long distance movement into Great Britain. Biological Invasions 22(3): 1135–1159. https://doi.org/10.1007/s10530-019-02169-5

- Stasko AD, Patenaude T, Strecker AL, Arnott SE (2012) Portage connectivity does not predict establishment success of canoe-mediated dispersal for crustacean zooplankton. Aquatic Ecology 46: 9–24. https://doi.org/10.1007/s10452-011-9378-4
- Stewart-Koster B, Olden JD, Johnson PT (2015) Integrating landscape connectivity and habitat suitability to guide offensive and defensive invasive species management. Journal of Applied Ecology 52(2): 366–378. https://doi.org/10.1111/1365-2664.12395
- Tarrant MA, Manfredo MJ, Bayley PB, Hess R (1993) Effects of recall bias and nonresponse bias on self-report estimates of angling participation. North American Journal of Fisheries Management 13(2): 217–222. https://doi.org/10.1577/1548-8675(1993)013<0217:EO RBAN>2.3.CO;2
- Toivonen T, Heikinheimo V, Fink C, Hausmann A, Hiippala T, Järv O, Tenkanen H, Di Minin E (2019) Social media data for conservation science: A methodological overview. Biological Conservation 233: 298–315. https://doi.org/10.1016/j.biocon.2019.01.023
- U.S. Department of the Interior, U.S. Fish and Wildlife Service, U.S. Department of Commerce, U.S. Census Bureau (2011) National Survey of Fishing, Hunting, and Wildlifeassociated Recreation. https://www.census.gov/library/publications/2014/demo/fhw-11nat.html
- U.S. Department of the Interior, U.S. Fish and Wildlife Service, U.S. Department of Commerce, U.S. Census Bureau (2016) National Survey of Fishing, Hunting, and Wildlifeassociated Recreation. https://www.census.gov/library/publications/2018/demo/fhw-16nat.html
- U.S. Geological Survey (2018) Nonindigenous Aquatic Species Database. Gainesville, Florida. [Accessed 6/1/2018] https://nas.er.usgs.gov/
- U.S. Geological Survey (2019) National Hydrography Dataset (ver. USGS National Hydrography Dataset Best Resolution (NHD) for Hydrologic Unit (HU) 4 – 2001). [Accessed 4/10/2019] https://www.usgs.gov/core-science-systems/ngp/national-hydrography/accessnational-hydrography-products
- Venturelli PA, Hyder K, Skov C (2017) Angler apps as a source of recreational fisheries data: opportunities, challenges and proposed standards. Fish and Fisheries 18(3): 578–595. https://doi.org/10.1111/faf.12189
- Wisconsin Department of Natural Resources (2016) Surface Water Integrated Monitoring System. [Accessed 9/20/2019] http://dnr.wi.gov/topic/surfacewater/swims/
- Wilson JRU, Dormontt EE, Prentis PJ, Lowe AJ, Richardson DM (2009) Something in the way you move: dispersal pathways affect invasion success. Trends in Ecology and Evolution 24(3): 136–144. https://doi.org/10.1016/j.tree.2008.10.007
- Wood AM, Haro CR, Haro RJ, Sandland GJ (2011) Effects of desiccation on two life stages of an invasive snail and its native cohabitant. Hydrobiologia 675(1): 167–174. https://doi. org/10.1007/s10750-011-0814-1
- Wood SA, Guerry AD, Silver JM, Lacayo M (2013) Using social media to quantify nature-based tourism and recreation. Scientific Reports 3(1): 1–2976. https://doi.org/10.1038/srep02976

RESEARCH ARTICLE



# Estimating the benefit of quarantine: eradicating invasive cane toads from islands

Adam S. Smart<sup>1</sup>, Reid Tingley<sup>1,2</sup>, Ben L. Phillips<sup>1</sup>

I School of BioSciences, University of Melbourne, Parkville, VIC, 3010, Australia **2** School of Biological Sciences, Monash University, Clayton, VIC, 3800, Australia

Corresponding author: Adam S. Smart (asmart1@student.unimelb.edu.au)

Academic editor: B. Webber	Received 28 March 2019   Accepted 15 May 2020   Published 1 October 2020

**Citation:** Smart AS, Tingley R, Phillips BL (2020) Estimating the benefit of quarantine: eradicating invasive cane toads from islands. NeoBiota 60: 117–136. https://doi.org/10.3897/neobiota.60.34941

#### Abstract

Islands are increasingly used to protect endangered populations from the negative impacts of invasive species. Quarantine efforts on islands are likely to be undervalued in circumstances in which a failure incurs non-economic costs. One approach to ascribe monetary value to such efforts is by modeling the expense of restoring a system to its former state. Using field-based removal experiments on two different islands off northern Australia separated by > 400 km, we estimate cane toad densities, detection probabilities, and the resulting effort needed to eradicate toads from an island. We use these estimates to conservatively evaluate the financial benefit of cane toad quarantine across offshore islands prioritized for conservation management by the Australian federal government. We calculate density as animals per km of freshwater shoreline, and find striking concordance of density estimates across our two island study sites: a mean density of 352 [289, 466] adult toads per kilometre on one island, and a density of 341 [298, 390] on the second. Detection probability differed between our two study islands (Horan Island: 0.1 [0.07, 0.13]; Indian Island: 0.27 [0.22, 0.33]). Using a removal model and the financial costs incurred during toad removal, we estimate that eradicating cane toads would, on average, cost between \$22 487 [\$14 691, \$34 480] (based on Horan Island) and \$39 724 [\$22 069, \$64 001] AUD (Indian Island) per km of available freshwater shoreline. We estimate the remaining value of toad quarantine across islands that have been prioritized for conservation benefit within the toads' predicted range, and find the net value of quarantine efforts to be \$43.4 [28.4-66.6] - \$76.7 [42.6-123.6] M depending on which island dataset is used to calibrate the model. We conservatively estimate the potential value of a mainland cane toad containment strategy – to prevent the spread of toads into the Pilbara Bioregion – to be \$80 [52.6-123.4] - \$142[79.0–229.0] M. We present a modeling framework that can be used to estimate the value of preventative management, via estimating the length and cost of an eradication program. Our analyses suggest that there is substantial economic value in cane toad quarantine efforts across Australian offshore islands and in a proposed mainland containment strategy.

Copyright Adam S. Smart et al. This is an open access article distributed under the terms of the Creative Commons Attribution License (CC BY 4.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

#### **Keywords**

Cane Toad, density, detection probability, eradication, islands, quarantine

#### Introduction

It is a truth universally acknowledged that an ounce of prevention is worth a pound of cure. In alien invasive species management, prevention of impact is achieved by conducting routine surveillance programs aimed at early detection (Holden et al. 2015), and by minimizing human-mediated dispersal of non-indigenous species (Chen et al. 2018). Despite the regular use of such quarantine approaches, conservation managers rarely explicitly value this preventative management. Preventative measures are increasingly being adopted to save imperiled taxa (Burns et al. 2012; Commonwealth of Australia 2015), but without explicitly valuing these efforts, we risk falling prey to cognitive biases (e.g., immediacy bias) and so will tend to commit substantially more money and effort to tactical, "cure" type approaches, than to strategic "prevention". Indeed, vastly more resources are spent controlling the spread and impact of invaders than are spent on preventing their arrival and establishment (Hoffman and Broadhurst 2016).

Quarantine is particularly likely to be undervalued in circumstances in which a failure incurs non-economic costs (e.g., biodiversity loss) (Leung et al. 2002) or when costs or damages persist over long-time scales (Epanchin-Niell et al. 2015). In cases where restoration is feasible, one way to place monetary value on such quarantine efforts is to calculate the cost of restoring the system to its former state (Kimball et al. 2014; Rohr et al. 2016). In the case of an invasive species with primarily noneconomic impacts, where invasion is certain or extremely likely, we can calculate the ongoing benefit of quarantine as this expense, i.e., a subsequent eradication program. Such a valuation is a lower bound on the benefit of quarantine for a number of reasons. First, the same quarantine effort typically protects against many potential invasive species, while eradication costs would apply separately to each species. In addition, any impact that an invasive species has before it is eradicated (e.g., local extinction of a native species) must be added to the cost of restoration (Hoffmann and Broadhurst 2016; Jardine and Sanchirico 2018). Lastly, as more area is invaded the value ascribed to remaining quarantined areas will be of greater value. Thus, the cost of eradicating a single invader is a very conservative estimate of the true value of quarantine efforts. Given the above it is important to note that it is unlikely that all potential islands will be invaded, and as such, the estimated costs of eradication have the potential to be significantly lower than 'worse case' cost modeling. Even in the face of reduced costs it is prudent to recognize the likelihood that governments and land managers will respond to the large eradication cost of inaction, or the withstanding preference to attempt eradication when incursions inevitably happen.

Islands are important resources for conservation quarantine because they offer a natural barrier to the spread of invasive species. Conservation biologists routinely exploit this property of islands, not only to protect species that naturally occur on islands, but also to provide refuge for species under threat on the mainland (Thomas 2011; Tershy et al. 2015; Legge et al. 2018). In Australia alone, a minimum of 47 conservation translocations to islands have been carried out to date (Department of the Environment, Water, Heritage and the Arts 2009). In these circumstances - where the conservation value of an island has been artificially bolstered - the subsequent arrival of invasive species can have a larger impact than they otherwise would. Typically, island quarantine is used by conservation managers to protect native species from wildlife disease (e.g, Tasmanian devil facial tumor disease; McCallum et al. 2009) or invasive predators (e.g., foxes, cats, weasels, rats). In Australia, however, islands are also used to mitigate the impact of cane toads (Rhinella marina) on native predators (Moro et al. 2018; Ringma et al. 2018). Cane toads were introduced to northeastern Australia in the 1930s and, in northern Australia, continue to spread westerly at a rate of ~50 km per year (Phillips et al. 2010). This invasion has had major impacts on populations of native predators, many of which have no resistance to the toad's toxin (Greenlees et al. 2010; Nelson et al. 2010; Llewelyn et al. 2014). In response to declines of multiple predator species (e.g., dasyurids, monitors, snakes) the Australian government implemented the Cane Toad Threat Abatement Plan (2011), which aimed to identify, and where possible reduce, the impact of cane toads on native species (Shanmuganathan et al. 2010). A lack of viable methods for broad-scale control, however, has since led the Australian government to place an increased emphasis on containment (on the mainland) and on quarantine (on offshore islands) to mitigate the biodiversity impacts of cane toads (Tingley et al. 2017).

While quarantine is currently the best available strategy, it is not a panacea: cane toads have already established themselves on at least 48 islands across northern Australia (McKinney et al. 2018 unpub data), with potential for further self and anthropogenic introductions. In addition, whilst many methods are being proposed to combat the spread of toads, the most likely control method is quarantine (Tingley et al. 2017), possibly aided by targeted gene flow. Thus, execution of the strategy outlined in the Cane Toad Threat Abatement Plan requires ongoing quarantine, eradication, and containment efforts. Here we estimate the lower bound of the monetary value of these ongoing efforts by estimating the effort required to eradicate cane toads from two islands in northern Australia and generalizing this cost to islands and areas that are currently free of toads. We approach this problem by estimating the density and detection probability of toads on each island and use these estimates to calculate the amount of time and money it would take to remove toads across a subset of islands prioritized for conservation in Australia.

#### Materials and methods

#### **Study Area**

This study was carried out on two islands in northern Australia: Horan Island on Lake Argyle, Western Australia and Kabal (Indian Island) in the Northern Territory. Lake

Argyle, located within the East Kimberly region, is Western Australia's largest constructed reservoir covering > 880 km<sup>2</sup>. The study site is composed of exposed spinifexcovered hilltops and sparse savanna woodland. Freshwater is available year-round, with the lake contracting from May–November. Toads are thought to have colonized islands on the lake in the wet seasons of 2009/2010 (Somaweera and Shine 2012). Indian Island is an offshore island, 40 km west of Darwin in the Northern Territory. It supports predominantly savanna woodland and monsoonal vine thicket, with a large ephemeral freshwater swamp located on the northern tip of the island. Depending on the magnitude of the wet season, standing water can be present in this swamp year-round or dry up by late September. Toads are thought to have colonized Indian Island via rafting events around 2008. Access to Indian Island was granted by Kenbi Traditional Custodians (Northern Land Council permit 82368).

#### **Field sampling**

Cane toad surveys occurred over six nights, on each island, denoted,  $t = \{0, 1, ..., 5\}$ , during November 2017 (Horan Island) and October 2018 (Indian Island). Surveys commenced at sundown each evening and lasted four hours, with ambient temperatures ranging from 24–35 °C. As Horan Island sits within a freshwater lake, the entire island was walked around each night (7.6 km) by two people using head torches; one individual focused on the higher part of the shoreline, the other on the lower shoreline. Indian Island is an oceanic island, with the northern half (an area of 6.28 km<sup>2</sup>) separated from the southern half by a tidal saltmarsh. The island contains a single freshwater swamp present in the dry season (circumference of 1.1 km). This swamp was navigated each night by two people using head torches over a period of four hours, with shoreline areas being surveyed more than once each night due to the reduced shoreline. On both islands, every toad encountered was collected and humanely killed on site in accordance with The University of Melbourne animal ethics protocol (1714277.1) and State laws regarding handling of non-native species. Each night, we recorded the number of individual toads collected, c. Surveys were conducted immediately prior to the breeding season so that only post-metamorphic age classes were encountered.

#### Statistical analysis

We do not encounter every individual on a given night, and so incorporate imperfect detection. For each island, we aim to estimate two parameters:  $N_0$ , the true number of toads on the island at the commencement of surveys and p the mean per-individual detection probability. Due to our experimental design we hold p constant across time but recognize that adding variance in p will likely increase costs. We can then use these to estimate  $\alpha$ , the length of time (in days) required to eradicate toads from our treat-

ment areas. The number of individuals collected each night,  $c_t$ , can be considered a draw from a binomial distribution:

$$c_t \sim \operatorname{Binom}(N_t, p)$$
.

Where  $N_0$ , the pre-sampling population size, is a latent variable with a mean and variance equal to  $\lambda$ , such that:

$$N_0 \sim \text{Pois}(\lambda)$$
.

For *t* > 0:

$$N_t = N_0 - \sum_0^{t-1} c_t \cdot$$

We used a Jefferys prior (Jefferys 1961) to model our prior distributions for p (beta (0.5,0.5)). We specify  $\lambda$  as uniform between 200–10 000 (Indian Island) or 1500–10 000 (Horan Island) respectively. The lower bound of priors for  $\lambda$  are informed by densities of cane toads in their native range (Lampo and Bayliss 1996) and represent a conservative lower bound.

The length of time required to remove a population,  $\alpha$  from a treatment area is described via the relationship:

$$\alpha = \frac{\ln(r_{crit})}{\ln(1-p)},$$

where,  $r_{crit}$ , the critical removal threshold (i.e. the proportion of the population remaining if there are less than two individuals left), is equal to  $1/N_0$  (see Suppl. material 1: File S1 for workings).

Models were fitted with Markov chain Monte Carlo (MCMC) in JAGS v.4.6.0, run through R v3.4.1 via the package rjags v4.6.0 (Plummer 2013). Three model chains were run for 30,000 iterations, with the first 10,000 iterations discarded as a burn-in, which was sufficient for the MCMC chains to converge. Convergence was checked using the Gelman-Rubin diagnostic (Gelman and Rubin 1992); all chains produced potential scale reduction factors < 1.1, indicating convergence of chains. The remaining samples were thinned by a factor of 2, resulting in 10,000 samples per chain for post-processing.

We denote a successful eradication to have occurred when only a single toad remains (i.e., no further breeding pairs remain). In order to successfully eradicate a population, the number of immigrants (i.e., propagule pressure) must be controlled prior to eradication efforts. We assume that our system is closed for the six consecutive nights of sampling. We then apply the outputs of our model to estimate the removal cost of toads across a range of Australian islands, under the assumption that immigration is zero for the duration of any subsequent eradication program.

#### Cost analysis

We estimate the cost of eradicating toads on prioritized islands (see below) from incurred personnel, consumable, and travel costs during toad collection (Table 1). Relative to most islands across northern Australia, both Horan and Indian Islands are readily accessible, thus our travel costs are modest. We assume that eradication is conducted by a fully equipped organization; thus, we do not include vehicle/boat purchase or hire (i.e., set-up costs), nor do we consider organizational in-kind associated with utilizing existing capital. Removal efforts are carried out in subsequent five-day blocks until eradication is reached; and we assume that travel to and from our site is incurred weekly in order to resupply staff. Travel costs include a \$85/hour consultant rate (for travel time) plus the additional costs of fuel, insurance, and vehicle maintenance (an extra \$36/hour). Thus, total travel costs are \$111/hour of travel. For Horan Island we assume a travel duration of four hours each way (to and from Katherine). For Indian Island the travel time is also four hours each way (to Darwin).

#### **Cost Scenarios**

We use our estimates of the length of time required to eradicate toads from our treatment areas on Horan and Indian Islands (with their attendant detection probabilities) to explore the potential of quarantine efforts on a subset of high priority islands (Table 2). Our chosen islands are drawn from a list of 100 oceanic islands that the Australian Commonwealth has prioritized for conservation, due to their biodiversity

<b>Table I.</b> Example areal metric costing and assumptions associated with a cane toad eradication program
on Horan Island. Derived from incurred field costs and estimated mean removal estimates (75 days). All
figures are in Australian Dollars (\$AU).

Item Description	Item	Unit type	Number	Cost per	Total Cost	Assumption	
	Category		of units	unit			
Conducting toad	Personnel	Per hour	1500	\$85	\$127 500	Hourly rate of \$85. Removal efforts are based on two	
surveys/removal						people each getting paid for ten hours a day at survey rates.	
Motorized travel to	Travel	Per hour	120	\$111	\$13 320	Hourly rate of \$111 per hour of vehicle use (survey rate,	
and from study site						insurance, maintenance and fuel). Return travel nearest	
						town is 4 hours. Field member returning to town to	
						resupply once per week (75 days/5 = 15 trips of 8 hours).	
Motorized travel	Travel	Per hour	75	\$36	\$2 700	Additional hourly rate of \$36 per hour of in-site vehicle	
within site						use. This captures insurance, maintenance and fuel costs.	
						One hour of in-site travel each day.	
Food and sustenance	Consumable	Per day	75	\$60	\$4 500	Food at \$30 per head, per day.	
AA Batteries for	Consumable	Per four	75	\$14	\$1 050	Single set of batteries required for each sampling night.	
night surveys							
Refill of CO <sub>2</sub> canister	Consumable	Per canister	1	\$150	\$150	Single canister required for euthanizing cane toads.	
(8kg)							
Calico Bags for	Consumable	Per bag	63	\$1	\$63	A Calico bag required for every 20 individuals removed	
holding individuals		_				(n = 1251).	
Theoretical cost to eradicate cane toads from Horan				\$149 283			
Island (0.78km <sup>2</sup> )							

**Table 2.** Islands included in analyses from the top 100 islands prioritized by the Australian Commonwealth for conservation actions (Department of the Environment, Water, Heritage and the Arts (2009)). Estimates for the benefit of quarantine are in '000s (AUD). Mean benefit reports the cost of removal, averaging over costs calculated with the detection probabilities of each of our island systems.

Jurisdiction	Island Name	Toads Present	Distance to mainland (km)	Area (km <sup>2</sup> )	Length of freshwater shoreline (km)	Mean benefit of quarantine (000s)	Lower Est.	Upper Est.
New South Wales	Lord Howe Island	No	570	11	1	18	10	28
Western Australia	Barrow Island	No	56	139	21	373	200	580
	Bernier Island	No	38	171	2	36	19	55
	East Intercourse Island	No	5.5	51	2	36	19	55
	Faure Island	No	6.1	8	2	36	19	55
Queensland	Badu Island	Yes	90	53	10	178	95	276
	Bentineck Island	Yes	25	269	5	89	48	138
	Boigu Island	Yes	7.8	6	55	977	524	1519
	Darnley Island	Yes	70	195	0	18	10	28
	Dunk Island	Yes	4	170	1	18	10	28
	Goold Island	Yes	15	101	1	18	10	28
	Hammond Island	Yes	18	104	3	53	29	83
	Horn Island	Yes	16.7	396	8	142	76	221
	Macleay Island	Yes	3	16	0.7	12	7	19
	Magnetic Island	Yes	6.3	6	2	36	19	55
	Moa Island	Yes	52	72	21	373	200	580
	Moreton Island	Yes	20	7	54	959	514	1491
	Mornington Island	Yes	29	1662	102	1812	971	2817
	North Stradbroke Island	Yes	3.8	1001	105	1865	1000	2900
	Prince of Wales Island	Yes	16	148	27	480	257	746
	Sweers Island	No	30	7	4	71	38	110
Northern Territory	Bathurst Island	No	61	235	137	2434	1305	3783
	Centre Island	Yes	7.8	64	20	355	190	552
	Croker Island	No	3	11	152	2700	1447	4197
	Groote Eylandt	No	45	42	203	3606	1933	5606
	Marchinbar Island	No	21	5	59	1048	562	1629
	Melville Island	No	24	2	1054	18724	10036	29106
	North Island	Yes	28	13	3	53	29	83
	Peron Island	No	3.4	3	3	53	29	83
	Raragala Island	No	36	52	11	195	105	304
	Vanderlin Island	Yes	7	6	68	1208	647	1878
	West Island	Yes	4	576	30	533	286	828
	Yabooma Island	No	2.7	2	3	53	29	83

value and the presence of species listed under the Environment Protection and Biodiversity Conservation Act (Department of the Environment and Energy [DEE] 1999). To ascertain feasible islands for quarantine, we refine this list to include only islands that are  $\geq 2$  km from the Australian mainland and occur within the potential distribution of cane toads in Australia (Kearney et al. 2008). For each island in our dataset, we map the length of permanent freshwater shoreline available, using either satellite maps, government/landholder records, or a combination of both – resulting in a net kilometer length of shoreline for each island in our dataset (Table 2). We apply our survey effort per unit length that our estimates are based upon across the resultant length of shoreline. For islands in our dataset which possess a large length of shoreline we assume organizations have adequate staff to maintain the survey effort on which our estimates are based (see field sampling). All islands were cross-checked for the presence of cane

toads via the 'Feral Animals on Offshore Islands' database (DEE, 2016) in addition to the presence of human settlement. In cases where islands had no permanent freshwater but did have human settlement (or known livestock presence), a one-kilometer circumference was assumed around dwellings and visible watering points.

In addition to the islands derived from this report, we explore the value of a potential cane toad containment strategy outlined in a revised version of the Cane Toad Threat Abatement Plan (Tingley et al. 2013). This strategy aims to develop a 'waterless barrier' on the Australian mainland by excluding cane toads from artificial water bodies on cattle stations between Broome and Port Hedland in Western Australia. If implemented successfully, this strategy could keep toads out of the Pilbara (and subsequent regions) – an effective quarantine of 268 000 km<sup>2</sup> of the Australian mainland (see Florance et al. 2011; Tingley et al. 2013; Southwell et al. 2017 for further information). Using a dataset on the presence of bore holes, cattle watering points, dams, and permanent freshwater bodies in the Pilbara Bioregion (see Southwell et al. 2017) we estimate the economic benefit of the proposed barrier. A one-kilometer circumference was applied to all waterpoints, dams and pools, in addition to a per-kilometer of shoreline rate along permanent watercourses within the region.

#### Results

The number of cane toads removed from both Horan and Indian Island,  $c_p$ , declined over time (Figure 1). Across the duration of our surveys, we captured and removed a total of 1550 cane toads (1251 on Horan Island, 299 on Indian Island). The estimated posterior probability of detecting an individual toad on a given night differed between our two study sites (Horan Island: mean p [95% credible interval] = 0.10 [0.07, 0.13]; Indian Island: 0.27 [0.22, 0.33]) (Suppl. material 4: Figure S3). Given site-specific detection probabilities, the estimated number of toads present at the initiation of our surveys ( $N_0$ ) was much higher on Horan Island (2696 [2183, 3549]) than on Indian Island (353 [308, 407]) (Suppl. material 5: Figure S4).

Horan Island – situated in a freshwater lake – has a circumference of 7.63 km, which translates to a cane toad density of 352 [287, 466] individuals per kilometer of freshwater shoreline. The freshwater source on Indian Island has a circumference of 1.04 km, translating to a density of 341 [298, 391] individuals per kilometer of freshwater shoreline. We could also express toad density as animals per km<sup>2</sup> of island, in which case we calculate an average density of individuals of 56/km<sup>2</sup> on Indian Island and 2899/km<sup>2</sup> on Horan Island.

#### **Cost Sensitivity**

Applying our parameter estimates derived from our Horan Island site, we estimate a removal cost of \$22 487 [\$14 691, \$34 480] per kilometer of freshwater shoreline, or

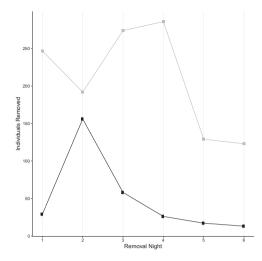


Figure 1. Numbers of individual cane toads captured per night on Horan (gray) and Indian (black) Islands.

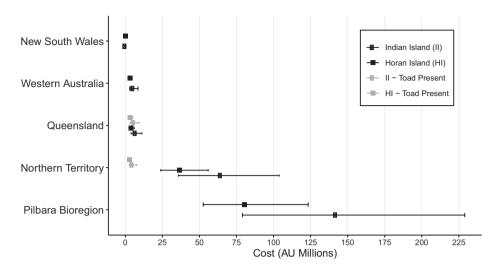
\$184 564 [\$120 582, \$282 998] per km<sup>2</sup> of land. Using the values derived from our Indian Island site, we estimate it would cost \$39 724 [\$22 069, \$64 001] per kilometer of freshwater shoreline, or \$6 559 [\$3 644, \$10 568] per km<sup>2</sup> of land.

#### Benefit of quarantine on Prioritized Australian Islands

Using our estimates of eradication costs per-kilometer of freshwater shoreline, we examine the economic benefit of cane toad quarantine on all toad-free islands (by jurisdiction), as well as the cost to restore all toad-inhabited islands to a toad-free state (Figure 2). The current economic benefit of quarantine on all prioritized toad-free islands is estimated to be between \$43.4 [28.4–66.6] million (based on Horan Island) and \$76.7 [42.6–123.6] million (Indian Island). We estimate it would cost, on average, between \$6.0 [3.9–9.2] million (Horan Island) and \$10.6 [5.9–17.0] million (Indian Island) to remove toads from all prioritized islands currently occupied by toads. Finally, we estimate the economic benefit of the 'waterless barrier' protecting the Pilbara to be between \$80.5 [52.6–123.4] million (Horan Island) and \$142.1 [79.0–229.0] million (Indian Island).

#### Discussion

As the number of alien invasive species requiring management increases, practitioners must identify efficient strategies for allocating resources to various management activities. Although conventional wisdom places emphasis on prevention measures, the practice of valuing such actions in the face of non-economic costs can be challenging.



**Figure 2.** Distribution of the benefit of cane toad quarantine across different jurisdictions within Australia. Toad present distributions denote areas where toads are known to occur and represent the cost to remove toads. No islands in either New South Wales, Western Australia or the Pilbara Bioregion have confirmed toad presence.

Placing monetary value on a conservation benefit will most often require some value judgement as to the monetary worth of biodiversity. Using estimates of a species' detectability, population density, and subsequent eradication costs, we aim to sidestep such value judgement when investigating the benefit of quarantine measures in combatting the impact of the invasive cane toad across Australia's prioritized offshore islands.

Despite substantial community and research effort into cane toad removal via trapping and hand capture, there are only a handful of published detection estimates for the species (Griffiths and McKay 2007). Our detection estimate is, of course, specific to the details of our survey. Nonetheless, it is surprisingly low for our large-shoreline site (Horan Island). Here, the length of shoreline meant we only passed each location once per night, and individual toads in this closed system had, on average, a 0.10 [0.07-0.13] probability of being seen on any given night. This contrasts with our small-shoreline site (Indian Island), where we were able to make multiple passes of the same point each night. Here, individual toads had a 0.27 [0.22–0.33] probability of being detected on a given survey night. Whilst individual toads are relatively easy to see when they are active, our results suggest that this might give a misleading impression of their detectability, especially if the size of area surveilled prevents more than a single pass during each survey. Additionally, physiological correlates are likely to affect individual detection probability, with both sex and body condition linked to activity levels (and hence detectability) of adult cane toads (Yeager et al. 2014). Further work is required to examine how both physiological and environmental correlates influence cane toad detectability as they invade into, and interact with novel environments in Australia.

We compared two density metrics: linear density (per km) and areal density (per km<sup>2</sup>). Our areal density estimate for Horan Island (2 893 individuals/km<sup>2</sup>) is similar to estimates derived from previous studies of invasive cane toads in the Solomon Islands archipelago (1 035/km<sup>2</sup>; Pikacha et al. 2015), the islands of Papua New Guinea (3 000/km<sup>2</sup>; Zugg et al. 1975; Freeland et al. 1986), and density estimates of an analogous invasive toad on Madagascar (3 240/km<sup>2</sup>; Reardon et al. 2018). A single study conducted on the Australian mainland reported densities as high as 256 300 individuals per km<sup>2</sup> (Cohen and Alford 1993), but this estimate was predominantly of the metamorph life stage, which occurs at very high densities prior to dispersal. Metamorphs are strongly constrained to the edges of water bodies (Child et al. 2008), and typically suffer high mortality from predation and desiccation before reaching maturity (Ward-Fear et al. 2010). While an areal density would make sense in a habitat where animals are constrained by some factor that scales with area (e.g., primary productivity), it is clear that toads in northern Australia are often constrained by access to water in the dry season, and thus length of shoreline is more appropriate. Length of shoreline not only defines access to water, but also the density of infectious parasites (such as Rhabdias pseudosphaerocephala) that use moist conditions and high toad densities along shorelines as opportunities for transmission (Kelehear et al. 2011, 2013). It is also likely that the survival rate of emergent metamorphs is dependent on length of shoreline, because this will set the density of conspecifics and so moderate the rate at which these conspecifics cannibalize each other (Pizzatto and Shine 2008). In comparing the areal and linear densities between our sites, we find a large difference between sites in the areal metric, but a strikingly similar density value across sites in the linear metric. Our results suggest that across these two different systems, adult toads achieve a density of around ~350 adults per kilometer of shoreline.

Because toads in dry conditions require regular re-hydration (Seebacher and Alford 2002; Tingley and Shine 2011) it is a logical step to conduct removal efforts when toads are restricted to a subset of semi-permanent hydration points during drier sections of the year (Letnic et al. 2015). Given the ecological reasons discussed above, and the fact that the linear density metric is so concordant across sites, we suggest that the linear metric should be used to calculate eradication costs. Certainly, if we use the areal metric, we find a wide gulf in the possible eradication values relative to our shoreline metric (Suppl. material 3: Figure S2). Encouragingly, our cost estimates using the shoreline metric are similar to estimates derived from a successful eradication program associated with removing the American bullfrog from two locations in Canada (\$8 200–\$23 000 CAN per kilometer of freshwater shoreline).

To our knowledge, there is only one instance in which the cost to eradicate cane toads from an island has been documented (Wingate 2011). Carried out on Nonsuch Island in Bermuda, this removal occurred over six years and included countless volunteer hours, hand collection and fencing methods, and an investment of \$10 000 USD (~\$14 330 AUD) to remove toads from an area of 0.6 km<sup>2</sup>. In addition, two successful eradications from extralimital mainland sites have been documented, occurring beyond

the southern border of the cane toads' current range in Australia (White 2010; Greenlees et al. 2018). The low incidence of successful removals of the invasive cane toad mirrors a broad trend in the eradication of invasive amphibian populations globally (Adams and Pearl 2007; Kraus 2009; Beachy et al. 2011; Orchard 2011). As such, there is scant information available to guide policy makers and management agencies when evaluating the feasibility of implementing amphibian quarantine and eradication measures.

Hand removal of individuals is required if eradication is to be successful. In landscapes where hydration points are localized or scarce, the use of fencing to exclude individuals from waterbodies can be a cost-effective solution (e.g., Wingate 2011). In these cases, the effectiveness of fencing relies predominantly on the proportion of the population excluded outside the fence (those not excluded still need to be removed by hand), as well as the cost of materials and the person hours associated with installing and maintaining the fence (see Brooke et al. 2004 for a full costing). For small waterbodies where fencing is feasible, the cost will be directly reduced by the proportion of the population retained outside the fence. Our goal was to provide a general cost metric comparable across prioritized islands and jurisdictions, and to place a lower bound on the value of cane toad quarantine more generally. As such, we refrain from exploring a multi-method approach, although acknowledge this may reduce the overall cost of an eradication program in some instances.

If we are to shift away from tactical, post-invasion approaches, to a preventative strategic approach, management practitioners require an estimate of the economic value that quarantine holds. Our analysis of the feasibility and benefit of cane toad quarantine is timely, given renewed emphasis on Australia's offshore islands as safe havens to buffer biodiversity against cane toad impacts. Sixty-two Australian offshore islands designated as 'high conservation status' fall within the cane toad's predicted distribution; more than a third of these (21) have already been colonized by toads. Given our criteria (see Methods), we estimate the remaining value of toad quarantine across toad-free islands in northern Australia to be up to \$77 [43–124] million. This value is conservative for a number of reasons. It is a reasonable expectation that as islands become home to increasing numbers of insurance populations or endangered species, the benefit of maintaining those islands as pest-free (measured as the cost of restoration) will increase. In addition, as toads establish themselves in an increasing number of these islands, those remaining toad-free will, by their scarcity alone, attain a greater environmental value.

At the same time, our estimate of the remaining value of toad quarantine across toad-free islands may overestimate the total quarantine benefit because it is unlikely that all islands without quarantine will be invaded. For example, islands that only contain hydration opportunities in the form of cultivated lawns or watering gardens (e.g., Darnly Island, Table 2) may be suitable for toads to invade, but reproduction and longterm persistence are unlikely. The benefit of quarantine within our dataset is held primarily by a few large islands (e.g., Melville Island, Table 2). These larger islands often have human settlements, competing management objectives (e.g., economic growth activities, multi-species quarantine), or more convoluted invasion pathways associated with anthropogenic activity. For those that contain large human settlements, the use of organized community groups to conduct local removals or population suppression may reduce costs, although eradication is unlikely without a defined management goal and coordinated effort. In short, quarantine needs to be prioritized and carefully managed on these large islands.

Eradication efforts for taxa other than toads have been successful on large islands, such as a goat eradication program on Santiago Island (5 465 km<sup>2</sup> at a cost of \$7.08 million) (Cruz et al. 2009) or rat eradication carried out on Macquarie island (128 km<sup>2</sup> at a cost of \$21.25 million) (Raymond et al. 2011). These efforts on larger islands require careful planning, intersectional management, and investment in post-eradication surveillance and monitoring (Moore et al. 2010; Rout et al. 2011; Carwardine et al. 2012) and the monetary cost associated with a successful eradication will vary depending on the biology of the target species in question.

The vanguard of the cane toad invasion is currently sweeping across Western Australia at ~50 km per annum, but recent research suggests that a waterless barrier between the Kimberley and the Pilbara could halt the toad invasion (Florance et al. 2011; Tingley et al. 2013; Southwell et al. 2017; Gregg et al. 2019). This barrier represents the only option remaining to exclude cane toads from realizing their entire potential distribution across the Australian mainland. Applying our results to this management strategy revealed that the benefit of quarantine over such an area (\$80–142 M) is roughly double the value of quarantine across all offshore islands combined (\$49–77 M). The cost of quarantine in this case has been rigorously estimated at around \$5 million dollars over 50 years (Southwell et al. 2017), only a fraction of what we estimate it would cost to eradicate toads from this area.

Here we demonstrate the immense benefit of toad quarantine across northern Australia. We avoid value judgement and simply calculate the cost of eradication in the case of quarantine failure. Our valuation is certainly a lower bound on the true benefit, but valuing preventative management is important and will become more so as conservation actions increasingly rely on offshore islands and fenced areas as cost-effective avenues to protect biodiversity from the impacts of alien invasive species. Quarantine measures often protect against multiple potential invaders but our results suggest that even when considering a single species, the monetary value of quarantine can be substantial. Prevention, it seems, is worth more than we might naively guess, even with aphorisms to remind us.

#### Acknowledgments

We recognise and thank the Kenbi Traditional Custodians (Raylene and Zoe Singh) for land access permission. We thank Chris Jolly, John Moreen and the Kenbi Ranger Group for their aid in the field, and for logistical support. Corrin Everitt, John Llewelyn, Ruchira Somaweera, and Greg Clarke provided constructive comments and advice. We also thank Greg Smith from Lake Argyle Cruises for his input and local knowledge, and Jane Austen for the opening line. All procedures were approved by the University of Melbourne Animal Ethics Committee (1714277.1). This research was supported by an Australian Research Council Future Fellowship to BP (FT160100198) and an Australian Research Council DECRA to RT (DE170100601). Land access was granted via the Northern Land Council (permit 82368).

#### References

- Adam MJ, Pearl CA (2007) Problems and opportunities managing invasive bullfrogs: is there any hope? In: Gherardi F (Ed.) Biological Invaders in Inland Waters: Profiles, Distribution, and Threats. Springer, The Netherlands, 679–693. https://doi.org/10.1007/978-1-4020-6029-8\_38
- Beachy JR, Neville R, Arnott C (2011) Successful control of an incipient invasive amphibian: *Eleutherodactylus coqui* on O'ahu, Hawai'i. Island invasives: eradication and management. IUCN, Gland, Switzerland, 140–147.
- Burns B, Innes J, Day T (2012) The use and potential of pest proof fencing for ecosystem restoration and fauna conservation in New Zealand. In: Sommers MJ, Hayward M (Eds) 'Fencing for Conserva8tion'. Springer, New York, 65–90. https://doi.org/10.1007/978-1-4614-0902-1\_5
- Brook BW, Whitehead PJ, Dingle JK (2004) Potential cane toad short to medium term control techniques – the biological feasibility and cost of exclusion as a mitigation control strategy. Key Centre for Tropical Wildlife Management. Research School of Environmental Studies, Institute of Advance Studies, Charles Darwin University, Australia.
- Carwardine J, O'Connor T, Legge S, Mackay B, Possingham HP, Martin TG (2012) Prioritizing threat management for biodiversity conservation. Conservation Letters 5: 196–204. https://doi.org/10.1111/j.1755-263X.2012.00228.x
- Child T, Phillips BL, Brown GP, Shine R (2008) The spatial ecology of cane toads (*Bufo marinus*) in tropical Australia: Why do metamorph toads stay near water? Austral Ecology 33: 630–640. https://doi.org/10.1111/j.1442-9993.2007.01829.x
- Cohen MP, Alford RA (1993) Growth, Survival and Activity Patterns of Recently Metamorphosed *Bufo marinus*. Wildlife research 20: 1–13. https://doi.org/10.1071/WR9930001
- Commonwealth of Australia (2015) Threatened species strategy. Commonwealth of Australia, Canberra. http://www.environment.gov.au/biodiversity/threatened/publications/strategy-home
- Cruz F, Carrion V, Campbell KJ, Lavoie C, Donlan CJ (2009) Bio-Economics of Large-scale eradication of feral goats from Santiago island, Galapagos. Journal of wildlife management 73: 191–200. https://doi.org/10.2193/2007-551
- Cuicui C, Epanchin-Niell R, Haight R (2018) Optimal inspection of imports to prevent invasive pest introduction. Risk Analysis 38: 603–619. https://doi.org/10.1111/risa.12880
- Department of the Environment and Energy (2011) Environment Protection and Biodiversity Conservation Act 1999 (EPBC Act). http://www.environment.gov.au/epbc
- Department of Environment and Energy (2011) The biological effects, including lethal toxic ingestion, caused by Cane Toads (*Bufo marinus*). http://www.environment.gov.au/system/files/resources/2dab3eb9-8b44-45e5-b249-651096ce31f4/files/tap-cane-toads.pdf

- Department of the Environment, Water, Heritage and the Arts (2009) Prioritization of high conservation status offshore islands. https://www.environment.gov.au/system/files/resources/5325cdf1-b56f-43b3-8bef-052d740d93fd/files/offshore-islands.pdf
- Department of the Environment and Energy (2016) Feral Animals on Offshore Islands Database. http://www.environment.gov.au/biodiversity/invasive-species/feral-animals-australia/offshore-islands
- Epanchin-Niell R, Leibhold A (2015) Benefits of invasion prevention Effect of time lags, spread rates, and damage persistence. Ecological Economics 116: 146–153. https://doi.org/10.1016/j.ecolecon.2015.04.014
- Freeland W (1986) Populations of cane toad *Bufo marinus* in relation to time since colonization. Wildlife Research 13: 321–330. https://doi.org/10.1071/WR9860321
- Florance D, Webb JK, Dempster T, Kearney MR, Worthing A and Letnic M (2011) "Excluding Access to Invasion Hubs Can Contain the Spread of an Invasive Vertebrate." Proceedings of the Royal Society B: Biological Sciences 278: 2900–2908. https://doi.org/10.1098/rspb.2011.0032
- Gelman A, Rubin DB (1992) Inference from Iterative Simulation Using Multiple Sequences. Statistical Science 7: 457–511. https://doi.org/10.1214/ss/1177011136
- Greenlees MJ, Phillips BL, Shine R (2010) Adjusting to a Toxic Invader: Native Australian Frogs Learn Not to Prey on Cane Toads. Behavioral Ecology 21: 966–71. https://doi. org/10.1093/beheco/arq095
- Greenlees MJ, Harris S, White A, Shine R (2018) The establishment and eradication of an extra-limital population of invasive cane toads. Biological Invasions 20: 2077–2089. https:// doi.org/10.1007/s10530-018-1681-8
- Gregg E, Tingley R, Phillips BL (2019) The on-ground feasibility of a waterless barrier to stop the spread of invasive cane toads in Western Australia. Conservation Science and Practice 1: e74. https://doi.org/10.1111/csp2.74
- Griffiths A, McKay JL (2007) Cane toads reduce the abundance and site occupancy of Merten's water monitor (*Varanus mertensi*). Wildlife Research 34: 609–615. https://doi. org/10.1071/WR07024
- Hoffmann BD, Broadhurst LM (2016) The Economic Cost of Managing Invasive Species in Australia. NeoBiota 31: 1–18. https://doi.org/10.3897/neobiota.31.6960
- Holden M, Nyrop J, Ellner S (2016) The economic benefit of time-varying surveillance effort for invasive species management. Journal of Applied Ecology 53: 712–721. https://doi. org/10.1111/1365-2664.12617
- Jardine SL, Sanchirico JN (2018) Estimating the Cost of Invasive Species Control. Journal of Environmental Economics and Management 87: 242–257. https://doi.org/10.1016/j. jeem.2017.07.004
- Jeffreys H (1938) The theory of probability. OUP, Oxford.
- Kelehear C, Webb JK, Shine R (2003) *Rhabdias pseudosphaerocephala* infection in *Bufo marinus*: ling nematodes reduce viability of metamorph cane toads. Parasitology 138: 919–927. https://doi.org/10.1017/S0031182009006325
- Kelehear C, Brown GP, Shine R (2011) Influence of lung parasites on the growth rates of freeranging and captive adult cane toads. Oecologia 165: 585–592. https://doi.org/10.1007/ s00442-010-1836-5

- Kimball S, Lulow M, Sorenson Q, Balazs K, Fang Y, Davis S, O'Connell M, Huxman T (2014) Costeffective ecological restoration. Restoration Ecology 23. https://doi.org/10.1111/rec.12261
- Kraus F (2009) Alien Reptiles and Amphibians: a Scientific Compendium and Analysis. Springer Science and Business Media B. V., Dordrecht. https://doi.org/10.1007/978-1-4020-8946-6
- Lampo M, Bayliss P (1996) Density estimates of cane toads from native populations based on mark-recapture data. Wildlife Research 23: 305–315. https://doi.org/10.1071/ WR9960305
- Legge S, Woinarski J, Burbidge A, Palmer R, Ringma J, Radford J, Mitchell N, Bode M, Wintle Br, Baseler M, Bentley J, Copley P, Dexter N, Dickman C, Gillespie G, Hill B, Latch P, Letnic Mi, Tuft K (2018) Havens for threatened Australian mammals: the contributions of fenced areas and offshore islands to the protection of mammal species susceptible to introduced predators. Wildlife Research. https://doi.org/10.1071/WR17172
- Leung B, Lodge DM, Finnoff D, Shogren JF, Lewis MA, Lamberti G (2002) An Ounce of Prevention or a Pound of Cure: Bioeconomic Risk Analysis of Invasive Species. Proceedings of the Royal Society B: Biological Sciences 269(1508): 2407–2413. https://doi.org/10.1098/ rspb.2002.2179
- Llewelyn J, Schwarzkopf L, Phillips BL, Shine R (2014) After the Crash: How Do Predators Adjust Following the Invasion of a Novel Toxic Prey Type?: Adjusting to a Novel Toxic Prey Type. Austral Ecology 39(2): 190–197. https://doi.org/10.1111/aec.12058
- Letnic M, Webb JK, Jessop TS, Dempster T (2015) Restricting access to invasion hubs enables sustained control of an invasive vertebrate. Journal of Applied Ecology 52: 341–347. https://doi.org/10.1111/1365-2664.12390
- McCallum H, Jones M, Hawkins C, Hamede R, Lachish S, Sin DL, Beeton N, Lazenby B (2009) Transmission dynamics of Tasmanian devil facial tumor disease may lead to diseaseinduced extinction. Ecology 90: 3379–3392. https://doi.org/10.1890/08-1763.1
- Moore JL, Rout TM, Hauser CE, Moro D, Jones M, Wilcox C, Possingham HP (2010) Protecting islands from pest invasion: optimal allocation of biosecurity resources between quarantine and surveillance. Biological Conservation 143: 1068–1078. https://doi. org/10.1016/j.biocon.2010.01.019
- Moro D, Ball D, Bryant S [Eds] (2018) Australian Island Arks: Conservation, Management and Opportunities. CSIRO publishing, Clayton South. https://doi. org/10.1071/9781486306619
- Moseby K, Read J, Paton D, Copley P, Hill B, Crisp H (2011) Predation determines the outcome of 10 reintroduction attempts in arid South Australia. Biological Conservation 144: 2863–2872. https://doi.org/10.1016/j.biocon.2011.08.003
- Nelson DWM, Crossland MR, Shine R (2010) Indirect Ecological Impacts of an Invasive Toad on Predator-prey Interactions Among Native Species. Biological Invasions 12(9): 3363–3369. https://doi.org/10.1007/s10530-010-9729-4
- Orchard SA (2011) Removal of the American bullfrog *Rana* (*Lithobates*) catesbeiana from a pond and a lake on Vancouver Island, British Columbia, Canada. In: Veitch CR, Clout MN, Towns DR (Eds) Island Invasives: Eradication and Management. IUCN, Gland,

Switzerland. In: Gherardi F (Ed.) Biological Invaders in Inland Waters: Profiles, Distribution, and Threats. Springer, The Netherlands, 679–693.

- Phillips BL, Brown GP, Shine R (2010) Evolutionarily Accelerated Invasions: The Rate of Dispersal Evolves Upwards During the Range Advance of Cane Toads: Dispersal Evolution During Range Advance. Journal of Evolutionary Biology 23(12): 2595–2601. https://doi.org/10.1111/j.1420-9101.2010.02118.x
- Pikacha P, Lavery T, Leung LKP (2015) What Factors Affect the Density of Cane Toads (Rhinella Marina) in the Solomon Islands? Pacific Conservation Biology 21(3): 1–200. https:// doi.org/10.1071/PC14918
- Pizzatto L, Shine R (2008) The behavioral ecology of cannibalism in cane toads (*Bufo marinus*). Behavioral Ecology and Sociobiology 63: 123–133. https://doi.org/10.1007/s00265-008-0642-0
- Plummer M (2013) rjags: Bayesian graphical models using MCMC. R package version 3–10. URL: http://CRAN.R-project.org/package=rjags
- Raymond B, McInnes J, Dambacher MJ, Way S, Bergstrom MD (2011) Qualitative modelling of invasive species eradication on subantarctic Macquarie Island. Journal of Applied Ecology 48: 181–191. https://doi.org/10.1111/j.1365-2664.2010.01916.x
- Reardon JT, Kraus F, Moore M, Rabenantenaina L, Rabiniv A, Nantenaina H, Randrianasolo H, Randrianasolo R (2018) Testing tools for eradication the invasive toad *Duttaphynus melanosticus* in Madagascar. Conversation Evidence 15: 12–19.
- Ringma J, Legge S, Woinarski J, Radford J, Wintle B, Bode M (2018) Australia's mammal fauna requires a strategic and enhanced network of predator-free havens. Nature Ecology & Evolution 2: 410–411. https://doi.org/10.1038/s41559-017-0456-4
- Rohr JR, Farag AM, Cadotte MW, Clements WH, Smith JR, Ulrich CP, Woods R (2016) Transforming ecosystems: When, where, and how to restore contaminated sites. Integrated environmental assessment and management 12: 273–283. https://doi.org/10.1002/ieam.1668
- Rout TM, Moore JL, Possingham HP, McCarthy M (2011) Allocating biosecurity resources between preventing, detecting, and eradication island invasions. Ecological Economics 71: 54–62. https://doi.org/10.1016/j.ecolecon.2011.09.009
- Seebacher F, Alfrod RA (2002) Shelter microhabitats determine body temperature and dehydration rates of a terrestrial amphibian (*Bufo marinus*). Journal of Herpetology 36: 69–75. https://doi.org/10.1670/0022-1511(2002)036[0069:SMDBTA]2.0.CO;2
- Shanmuganathan T, Pallister J, Doody S, McCallum H, Robinson T, Sheppard A, Hardy C, Halliday D, Venables D, Voysey R, Strive T, Hinds L, Hyatt A (2010) Biological Control of the Cane Toad in Australia: A Review: Biological Control of Cane Toad. Animal Conservation 13: 16–23. https://doi.org/10.1111/j.1469-1795.2009.00319.x
- Somaweera R, Shine R (2012) The (non) impact of invasive cane toads on freshwater crocodiles at Lake Argyle in tropical Australia. Animal Conservation 15: 152–163. https://doi. org/10.1111/j.1469-1795.2011.00500.x
- Southwell D, Tingley R, Bode M, Nicholson E, Phillips BL (2017) Cost and Feasibility of a Barrier to Halt the Spread of Invasive Cane Toads in Arid Australia: Incorporating Expert Knowledge into Model-Based Decision-Making. Journal of Applied Ecology 54(1): 216–24. https://doi.org/10.1111/1365-2664.12744

- Tershy BR, Shen K, Newton KM, Holmes ND, Croll DA (2015) The importance of islands for the protection of biological and linguistic diversity. Bioscience 65: 592–597. https://doi. org/10.1093/biosci/biv031
- Thomas CD (2011) Translocation of Species, Climate Change, and the End of Trying to Recreate Past Ecological Communities. Trends in Ecology & Evolution 26(5): 216–221. https:// doi.org/10.1016/j.tree.2011.02.006
- Tingley R, Shine R (2011) Desiccation risk drives the spatial ecology in an invasive anuran (*Rhinella marina*) in the Australian Semi-desert. PLoS ONE 6: e25979. https://doi.org/10.1371/journal.pone.0025979
- Tingley R, Phillips BL, Letnic M, Brown GP, Shine R, Baird SJE (2013) Identifying Optimal Barriers to Halt the Invasion of Cane Toads *Rhinella Marina* in Arid Australia. Journal of Applied Ecology 50(1): 129–137. https://doi.org/10.1111/1365-2664.12021
- Tingley R, Ward-Fear G, Schwarzkopf L, Greenlees MJ, Phillips BL, Brown G, Clulow S, Webb J, Capon R, Sheppard A, Strive T, Tizard M, Shine R (2017) New weapons in the toad toolkit a review of methods to control and mitigate the biodiversity impact of invasive cane toad (*Rhinella Marina*). The Quarterly Reviews of Biology 92: 123–149. https://doi. org/10.1086/692167
- Ward-Fear G, Brown GP, Shine R (2010) Using a Native Predator (the Meat Ant, *Iridomyrmex Reburrus*) to Reduce the Abundance of an Invasive Species (the Cane Toad, *Bufo Marinus*) in Tropical Australia. Journal of Applied Ecology 47(2): 273–80. https://doi.org/10.1111/j.1365-2664.2010.01773.x
- White A (2010) Cane toad outbreak: Taren Point, (2010) Report prepared by Biosphere Environmental Consultants Pty. Ltd. For Sutherland Shire Council, NSW.
- Wingate DB (2011) The successful elimination of Cane Toad, *Bufo marinus*, from an island with breeding habitat off Bermuda. Biological Invasions 13: 1487–1492. https://doi. org/10.1007/s10530-010-9925-2
- Woinarski J, Burbridge A, Harrion P (2014) The Action Plan for Australian Mammals 2012. CSIRO Publishing, Melbourne. https://doi.org/10.1071/9780643108745
- Yeager A, Commito J, Wilsom A, Bower D, Schwarzkopf L (2014) Sex, light, and sound: location and combination of multiple attractants affect probability of cane toad (*Rhinella marina*) capture. Journal of Pest Science 87: 323–329. https://doi.org/10.1007/s10340-014-0555-9
- Zug G, Lindgren E, Pippet J (1975) Distribution and ecology of the marine toad, Bufo marinus, in Papua New Guinea. Pacific Science 29: 31–50.

## Supplementary material I

### File S1

Authors: Adam S. Smart, Reid Tingley, Ben L. Phillips

Data type: statistical data

- Explanation note: Working to support the formulation of the critical removal threshold  $(r_{crit})$  the number of days required to reduce a population to less than two individuals.
- Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.34941.suppl1

### Supplementary material 2

# Figure S1. Estimated density of cane toads on each island using density calculated per km of shoreline, and per km<sup>2</sup> of landmass

Authors: Adam S. Smart, Reid Tingley, Ben L. Phillips

Data type: statistical data

Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.34941.suppl2

# Supplementary material 3

# Figure S2. Costs of eradication calculated per km of shoreline and per square kilometre of landmass

Authors: Adam S. Smart, Reid Tingley, Ben L. Phillips

Data type: statistical data

Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.34941.suppl3

#### Supplementary material 4

# Figure S3. Posterior distributions of the detection probabilities of cane toads on Horan and Indian Islands

Authors: Adam S. Smart, Reid Tingley, Ben L. Phillips

Data type: statistical data

Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.34941.suppl4

#### Supplementary material 5

#### Figure S4. Posterior distributions of cane to ad population size $(N_0)$ before removal effort

Authors: Adam S. Smart, Reid Tingley, Ben L. Phillips

Data type: statistical data

Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/neobiota.60.34941.suppl5