Introduction bias: Imbalance in species introductions may obscure the identification of traits associated with invasiveness

Supplementary Material

Estibaliz Palma, Jian Yen, Peter A. Vesk, Monserrat Vilà, Jane A. Catford

Panel A1 Invasions as individual, population or species-level phenomena.

While species introductions are individual-level events, establishment and persistence are population or species-level events (Blackburn et al. 2011). Invasions are commonly understood as species-level phenomena across the scientific and management literature (i.e. a species becomes naturalized, a species becomes invasive). Due to the individual vs. species dichotomy, trait distributions may be drawn using either individual-level values or species-level mean values. This decision may have considerable implications, especially for the introduction stage: an individual-level approach accounts for the strength with which each species (and therefore their trait values) have been introduced, a species-level approach assumes that each species has been introduced equally (species contribute a single trait value to the distribution, i.e. their mean). The former approach seems more appropriate to accurately represent the distribution of trait values that have been introduced by incorporating the propagule pressure for each introduced species. However, information on introduction patterns is usually not easily available, and therefore taking an individual-level approach is usually challenging.

The theoretical framework presented in this paper (Figure 3) assumes that species' probability to be transported and introduced is independent from their distributional range and abundance worldwide; thus, it does not incorporate the idea that the propagule pressure for each introduced species is unequal. To examine the implications of this assumption, we compare the worldwide distribution of four traits - SLA, height, seed mass and woodiness - when species worldwide availability (and therefore the probability that they are picked up and introduced outside their natural range) is either ignored or acknowledged (Figure A1). We concluded that the shape of the trait distribution based on species-level mean values and the shape of the distribution based on weighted mean values were similar enough to assume little effect of the chosen approach on the conclusions drawn from the theoretical framework.

Panel A2 Code for simulations

Define probability functions

```
normal_probability <- function (x, mean, sd) {
    out <- exp(( -(x - mean) ** 2) / (2 * (sd ** 2)))
    out <- out / sum(out)
    out
    }
linear_probability <- function (x, intercept, slope) {
    out <- intercept + slope * x
    out <- out / sum(out)
    out
    }
log_linear_probability <- function (x, intercept, slope) {
    out <- exp(intercept + slope * x)
    out <- out / sum(out)
    out
    }
}</pre>
```

Simulation of introduction scenarios

```
Random_introduction <- runif (10000, min = 1, max = 100)
Biological_bias <- rlnorm (10000, mean_norm =20, sd_norm = 10)
Human_preference_bias <- sample (x = Biological_bias, size = 10000, prob =
normal_probability (Biological_bias, mean=50, sd=10), replace = TRUE)</pre>
```

```
Human_preference_bias: Mean for main framework: 40 Means for extension of the framework: 30, 45, 60
```

Simulation of establishment scenarios

```
Established_pool_noeffect <- sample (x = Introduced_pool, size = 1000, prob = rep
(1, length (Introduced_pool)), replace = FALSE)
Established_pool_effect <- sample (x = Introduced_pool, size =1000, prob =
linear_probability (Introduced_pool, intercept = 0, slope = 0.005), replace =
FALSE)</pre>
```

Introduced_pool can be Random_introduction, Biological_bias or Human_preference_bias
Effect for main framework: 0.005
Effects for extension of the framework:
prob = log_linear_probability (Introduced_pool, intercept, slope)
slope = 0.0025, 0.05, 0.25

Simulation of invasion scenarios

```
Invasive_pool_noeffect <- sample (x = Established_pool, size = 100, prob = rep (1,
length (Established_pool)), replace = FALSE)
```

```
Invasive_pool_effect <- sample (x = Established_pool, size = 100, prob =
linear_probability (Established_pool, intercept = 0, slope = 0.005), replace =
FALSE)</pre>
```

Effect for main framework: 0.005
Effects for extension of the framework:
prob = log_linear_probability (Established_pool, intercept, slope)
slope = 0.0025, 0.05, 0.25

Table A1 Descriptors of distributions presented in the theoretical framework (Figure 3), including mean, standard deviation and kurtosis. Kurtosis of a standard normal distribution is 3. Values of kurtosis above 3 represent a pointier distribution and values below 3, a flatter distribution.

		Random introduction			Biologically biased introduction			Human biased introduction		
		Mean	SD	Kurtosis	Mean	SD	Kurtosis	Mean	SD	Kurtosis
Α.	INTRODUCTION									
	Introduced pool	50.476	28.614	1.797	19.992	10.264	14.678	39.254	9.742	2.987
В.	NATURALIZATION - trait involved									
	Established pool	66.499	23.247	2.372	24.310	13.278	29.946	41.628	9.710	2.859
	Failures	48.695	28.602	1.800	19.512	9.756	6.994	38.990	9.710	3.004
D.	INVASION - trait involved									
	Invasive pool	76.249	17.179	2.529	30.320	17.445	11.441	44.853	10.308	2.216
	Non-invasive pool	65.416	23.586	2.291	23.642	12.568	35.955	41.270	9.580	2.993
Ε.	INVASION - trait irrelevant									
	Invasive pool	67.049	22.492	2.214	25.398	16.507	15.596	41.487	9.229	3.097
	Non-invasive pool	66.438	23.341	2.384	24.189	12.875	32.934	41.644	9.766	2.834
С.	NATURALIZATION - trait irrelevant									
	Established pool	48.674	28.428	1.819	20.511	10.203	5.773	39.941	9.586	3.086
	Failures	50.676	28.630	1.794	19.934	10.269	15.665	39.178	9.756	2.976
F.	INVASION - trait involved									
	Invasive pool	64.252	25.404	2.262	26.150	13.329	5.536	41.768	9.904	2.919
	Non-invasive pool	46.944	28.231	1.841	19.884	9.602	4.831	39.738	9.534	3.123
G.	INVASION - trait irrelevant									
	Invasive pool	47.008	29.605	1.796	22.630	12.780	5.830	40.955	9.383	2.899
	Non-invasive pool	48.860	28.305	1.825	20.275	9.856	5.334	39.828	9.606	3.097

Figure A1 Distribution of worldwide values of specific leaf area, height and seed mass, and frequency of categories woody and non-woody. Continuous lines and black bars represent the relative frequency of trait values when each species contributes equally to the distributions (one species = one record); dashed lines and white bars represent the relative frequency of trait values when species' contributions are weighted based on species' occurrence worldwide (one species = as many records as number of countries where it has been found, so species with large geographic range will contribute more). The datasets include 2,912 (SLA); 3,456 (height); 2,446 (seed mass) and 5,313 species (woodiness). Records of species' trait and species' global distribution were collected from the BIEN database (Enquist et al. 2016, Maitner et al. 2018).

