

Remoteness promotes biological invasions on islands worldwide

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One of the best-known general patterns in island biogeography is the species–isolation relationship (SIR), a decrease in the number of native species with increasing island isolation that is linked to lower rates of natural dispersal and colonization on remote oceanic islands. However, during recent centuries, the anthropogenic introduction of alien species has increasingly gained importance and altered the composition and richness of island species pools. We analyzed a large dataset for alien and native plants, ants, reptiles, mammals, and birds on 257 (sub) tropical islands, and showed that, except for birds, the number of naturalized alien species increases with isolation for all taxa, a pattern that is opposite to the negative SIR of native species. We argue that the reversal of the SIR for alien species is driven by an increase in island invasibility due to reduced diversity and increased ecological naiveté of native biota on the more remote islands.

island biogeography | alien species | isolation | island invasibility | naturalization

Islands harbor a disproportionately high number of evolutionarily unique, geographically restricted species, and thus contribute significantly to global biodiversity (1). Native species richness on islands, which arose through colonization events and evolution over geological time scales, follows positive species–area relationships and negative species–isolation relationships (SIRs), as predicted by the theory of island biogeography (2–5). While the negative SIR for native species is a well-documented pattern in ecology (2, 6, 7), it is less clear whether or how the number of alien species on islands is related to isolation.

On the one hand, globalization in trade and transport has considerably reduced the effective isolation of islands worldwide and has led to a breakdown of biogeographical barriers (8). While natural dispersal to remote islands is extremely rare and has had a strong influence on island native species richness and composition, human-aided transport increases the frequency of introduction events by orders of magnitude; as a result, SIR patterns may decrease or even vanish (2, 9). Alternately, economic theory predicts that insularity (characterized by smallness and remoteness) has a strong effect on the socioeconomic structure of an island (10). Small markets, dependence on sea and air transport, and exclusion from major transport routes, together with higher costs generally, mean that fewer commodities are transported to more remote islands (10). Hence, fewer intentional and accidental alien introductions (i.e., lower propagule and colonization pressures), and thus lower colonization rates, might be expected for more remote islands (11). Still, another line of reasoning suggests that invasibility

should be highest on the most remote islands because their impoverished and evolutionarily naive biota provide greater ecological opportunities for introduced species to establish (12–14). Further, alien species establishment might lead to the extinction of native species through enhanced competition or predation, thereby increasing the establishment odds for additional aliens. These hypotheses would predict alien species richness on islands to be positively correlated, negatively correlated, or uncorrelated with isolation, depending on the balance between colonization pressure and establishment probabilities. Empirical studies have so far provided ambiguous results, with no correlations [for plants (15, 16) and birds (16)] or positive correlations [for birds (17), plants (18), and ants (19)] between alien species richness and island isolation. Since these studies vary in methods, predictor variables, and spatial and taxonomic extent, we are so far unable to draw general conclusions regarding the SIR for alien versus native species.

Significance

Islands are hotspots of alien species invasions, and their distinct biodiversity is particularly vulnerable to invading species. While isolation has shaped natural colonization of islands for millions of years, globalization in trade and transport has led to a breakdown of biogeographical barriers and subsequent colonization of islands by alien species. Using a large dataset of 257 subtropical and tropical islands, we show that alien richness increases with increasing isolation of islands. This pattern is consistent for plants, ants, mammals, and reptiles, and it cannot simply be explained by island economics and trade alone. Geographical isolation does not protect islands from alien species, and island species richness may reach a new dynamic equilibrium at some point, likely at the expense of many endemic species.

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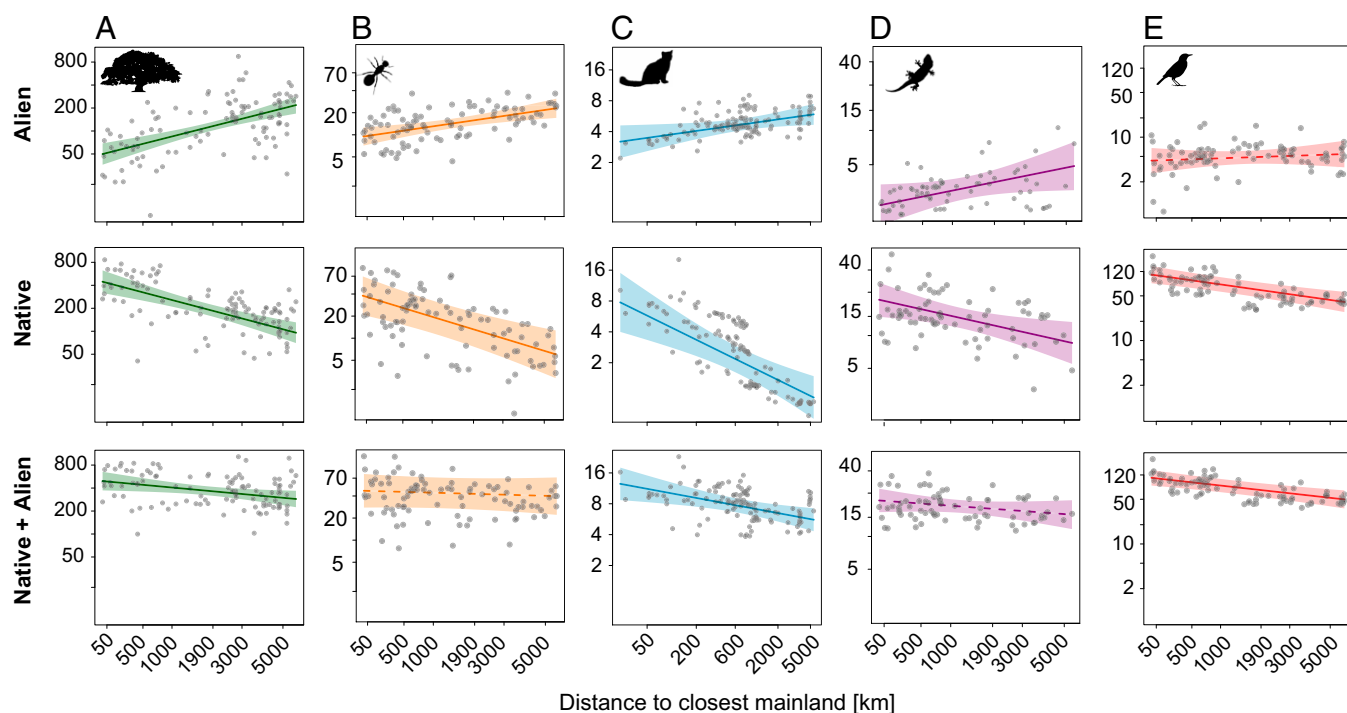


Fig. 2. Alien and native species richness on islands dependent on island isolation for vascular plants (A), ants (B), mammals (C), reptiles (D), and birds (E). Shown are partial residual plots of the species richness–isolation relationships for naturalized alien (Top), native (Middle), and total (Bottom) species richness (log–log space). GLMMs with a Poisson-distributed response were applied to additionally account for island size, heterogeneity (elevational range), climate (temperature and precipitation), and human impact (per capita GDP). Each column represents one taxonomic group. Shading around the regression line indicates its 95% confidence interval. Dashed lines indicate insignificant results. Pictograms courtesy of PhyloPic (www.phylopic.org); (A) Tracy A. Heath, (C and D) Steven Traver, and (E) Ferran Sayol.

this divergence likely increases with geographical (and hence evolutionary) isolation. Moreover, particular functional groups, especially large predators and herbivores (24) but also pathogens and parasites (25), are generally rarer or absent from remote islands. This leads to reduced enemy-escape responses [e.g., island tameness in lizards (26)]. As a consequence, introduced predators might have easier access to resident prey, and introduced

species might experience less predation, herbivory, and pathogen pressure [“enemy release” hypothesis (27)]. In addition, alien species introduce traits that native island biotas have not been exposed to previously [e.g., certain allelopathic secondary chemical compounds (28)] and to which they are naive [“novel weapons” hypothesis (29)], a phenomenon that may increase with isolation as native species become more evolutionarily distinct

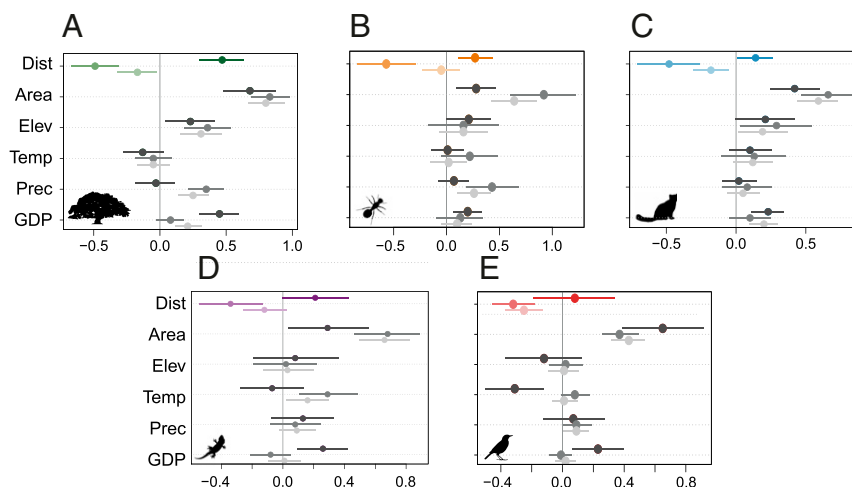


Fig. 3. Regression coefficients and 95% confidence limits for the standardized predictor variables in the GLMMs for vascular plants (A), ants (B), mammals (C), reptiles (D), and birds (E). Dark colors represent the estimates for naturalized alien species, medium colors represent the estimates for native species, and light colors represent the estimates for all species. Area, island area; Dist, distance to the closest mainland; Elev, elevational range; GDP, per capita GDP (the full model output is provided in *SI Appendix, Table S1A*); Prec, annual precipitation sum; Temp, mean annual temperature. Pictograms courtesy of PhyloPic (www.phylopic.org); (A) Tracy A. Heath, (C and D) Steven Traver, and (E) Ferran Sayol.

groupings among regions, and a random effect intercept term for island geological setting [i.e., oceanic islands vs. islands situated on continental shelves (46)] accounted for possible differences in colonization due to historic connections with continents (22). We additionally ran the models including oceanic islands only. The results did not change for native species of all taxonomic groups. For alien reptiles ($P = 0.071$) and mammals ($P = 0.628$), the relationship with distance to the nearest mainland became non-significant, but a positive trend remained. This most likely resulted from a truncation of the isolation gradient by excluding continental islands, as well as from a reduction of the sample size. Finally, an additional observation-level random effect term accounted for overdispersion (47). To improve symmetry and linearity, and to stabilize variances, numerical predictors were subjected to appropriate transformations (natural log) for island area, elevational range, and distance to the mainland (square root for precipitation sum and per capita GDP), and finally standardized (scaled to a mean of 0 and SD of 1). The magnitude of regression coefficients therefore represented the relative effect size. We fitted individual models for alien, native, and total (alien plus native) species numbers for every taxonomic group. Additionally, we fitted models for all introduced birds as a response. Model residuals were assessed for spatial autocorrelation by using spline (cross-) correlograms, and no spatial autocorrelation was found (SI Appendix, Figs. S1 and S2).

All statistical analyses were performed using R (version 3.3.1). For GLMM analyses, we used the function `glmer` from the package `lme4` for fitting (48) and the function `effect` from the package `effects` for partial effect plots. For spline correlograms, we used the function `spline.correlog` from the package `ncf` (49).

Sensitivity Analysis. To test the robustness of the assessed relationships between alien species richness and island isolation, we performed a sensitivity analysis. The aim of this analysis was to exclude systematic biases in the data that might stem from heterogeneous sampling intensity or overrepresentation of selected geographical regions, as well as from variable data quality depending on data sources. Therefore, we first systematically excluded islands of a given geographical region (based on TDWG level 2 classifications) from the datasets. Then, the number of excluded islands was resampled from the remaining islands to ensure constant sample sizes. Subsequently, we fitted the same GLMMs as were used for the main analysis to the resampled datasets. This procedure was repeated 500 times, and 95% confidence intervals were calculated for the regression coefficients (SI Appendix, Table S2). Similarly, we assessed source reliability by assigning all sources hierarchically to seven categories: (i) peer-reviewed publications, (ii) scientific monographs and books, (iii) reports of renowned and established organizations (e.g., the Convention on Biological Diversity, International Union for Conservation of Nature), (iv) reports from gray literature, (v) renowned webpage repositories (e.g., Caribherp, Charles Darwin Foundation), (vi) other webpages, and (vii) personal communications. We then excluded less reliable data sources (i.e., categories vi and vii), resampled from the remaining islands, and recalculated the models.

The exclusion of islands and references revealed no qualitative difference in the SIR (i.e., the positive trend of the relationship remained; SI Appendix, Table S2). However, for alien mammals and alien reptiles, the regression coefficient for isolation dropped more strongly when excluding islands of some selected regions (e.g., mammals: western Indian Ocean and Australian islands; reptiles: north-central and northwestern Pacific islands). However, the positive trend of the relationship remained. For the reptile data, which were more sensitive to the exclusion of certain islands compared with other groups, the relation to distance was least significant for the whole dataset ($P = 0.049$; SI Appendix, Table S1) in the first place and had the lowest sample size of all groups. Systematics and taxonomy of reptiles changed radically in the last decades (50), and it is possible that these changes might not have been fully acknowledged by all data sources used in this study, making the species numbers less robust. Moreover, the global reptile distribution seems to be more erratic than in other groups, even for native species. For instance, Hawaii has no native reptiles, but in similar remote islands, such as Samoa or the Cook Islands, native reptiles are present. However, even the exclusion of all Caribbean islands (56 islands for mammals and 30 islands for reptiles) did show a strengthening, rather than a weakening, of the positive SIR for alien species. We did not run a sensitivity analysis for birds, since the relationship of alien species richness with isolation was nonsignificant.

Data Availability. All data analyzed during the current study are included in this published article and SI Appendix, Table S4 or in the sources where the available datasets are provided (SI Appendix, Tables S3 and S5).

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