

# Effect of habitat area and isolation on fragmented animal populations

Laura R. Prugh<sup>a,1</sup>, Karen E. Hodges<sup>b</sup>, Anthony R. E. Sinclair<sup>c</sup>, and Justin S. Brashares<sup>a</sup>

<sup>a</sup>Department of Environmental Science, Policy, and Management, University of California, 137 Mulford Hall, Berkeley, CA 94720; <sup>b</sup>Centre for Species at Risk and Habitat Studies, University of British Columbia Okanagan, 3333 University Way, Kelowna, BC, Canada V1V 1V7; and <sup>c</sup>Centre for Biodiversity Research, University of British Columbia, 6270 University Boulevard, Vancouver, BC, Canada V6T 1Z4

Edited by Monica G. Turner, University of Wisconsin, Madison, WI, and approved October 29, 2008 (received for review June 25, 2008)

Habitat destruction has driven many once-contiguous animal populations into remnant patches of varying size and isolation. The underlying framework for the conservation of fragmented populations is founded on the principles of island biogeography, wherein the probability of species occurrence in habitat patches varies as a function of patch size and isolation. Despite decades of research, the general importance of patch area and isolation as predictors of species occupancy in fragmented terrestrial systems remains unknown because of a lack of quantitative synthesis. Here, we compile occupancy data from 1,015 bird, mammal, reptile, amphibian, and invertebrate population networks on 6 continents and show that patch area and isolation are surprisingly poor predictors of occupancy for most species. We examine factors such as improper scaling and biases in species representation as explanations and find that the type of land cover separating patches most strongly affects the sensitivity of species to patch area and isolation. Our results indicate that patch area and isolation are indeed important factors affecting the occupancy of many species, but properties of the intervening matrix should not be ignored. Improving matrix quality may lead to higher conservation returns than manipulating the size and configuration of remnant patches for many of the species that persist in the aftermath of habitat destruction.

incidence function | island biogeography | logistic regression | metaanalysis | occupancy

Habitat loss and fragmentation are major threats to terrestrial biodiversity (1). Globally,  $\approx 40\%$  of land has been converted for agricultural use (2), and regions as diverse as the eastern United States, the Philippines, and Ghana have lost  $>90\%$  of their natural habitat (3, 4). Conservation theory and practice are founded on the principle that large habitat patches have more species than small ones and connected patches have more species than isolated ones (5). Although few would dispute this basic premise, we still do not know the general value of patch area and isolation as predictors of species occupancy in fragmented terrestrial systems. Despite hundreds of patch occupancy studies over  $>4$  decades, there has been no quantitative synthesis of these findings. Several syntheses have examined species-area and diversity relationships (6, 7), but the species occupancy patterns that underlie diversity patterns in fragmented landscapes have been overlooked (8). How important is patch isolation relative to patch size in determining where species occur, and how consistent are these effects across diverse taxonomic groups? These are foundational, yet unanswered, questions for ecology and conservation biology.

We synthesized patch occupancy data from 89 studies of terrestrial fauna on 6 continents (Table S1) to determine how patch area and isolation affect species' occurrence patterns. Collectively, these studies recorded the occurrence of 785 animal species (Table 1) in 1,015 population networks surveyed in 12,370 discrete habitat patches. We use the term "population network" to refer to a spatially-structured population that occupies habitat patches embedded in a matrix of land cover

deemed unsuitable for the species. Most of the population networks in our analysis were probably metapopulations linked by dispersal events, but few studies provided the necessary evidence for these linkages. Animals ranged in size from the 0.2-mm false spider mite (*Pentamerismus* sp.) to the 500-kg American bison (*Bos bison*), and habitat patches varied in isolation and area by 8 and 12 orders of magnitude, respectively (within-study order of magnitudes ranged from 0.2 to 4.4 for isolation and 0.8 to 5.4 for area). The dataset presents a global representation of faunal occurrence patterns in ecosystems made patchy both by humans (via agriculture, forestry, and urbanization; 72% of studies) and natural processes (28% of studies). We begin with the broad question: are patch area and isolation good predictors of occupancy for animals in terrestrial habitat fragments?

## Results and Discussion

Patch area and isolation were surprisingly poor predictors of occupancy across species. All together, 38% of patches were occupied ( $n = 55,855$  occupancy records). We ran 4 logistic regression models for each population network to determine how well patch area and isolation predicted occupancy: (i) area only, (ii) isolation only, (iii) area + isolation, and (iv) area  $\times$  isolation (see *Methods*). The amount of deviance (i.e., variation) in occupancy explained by each model (*pseudoR*<sup>2</sup>, or *pR*<sup>2</sup>) represents the ability of patch area and/or isolation to predict species occurrence patterns; this statistic is analogous to the *R*<sup>2</sup> of linear regression (9). The *pR*<sup>2</sup> values from each of the 1,015 population networks created distributions that were skewed toward 0, and few species were strongly influenced by patch area or isolation (Fig. 1A). The full area  $\times$  isolation model accounted for a median of 25% of the deviance in occupancy, indicating that at least 75% of occupancy deviance was caused by other factors for most population networks. Area was a better predictor of occupancy than isolation: area alone accounted for a median of 13% of the deviance in occupancy versus 3% accounted for by isolation alone. These results raise 2 questions: first, why does area explain more deviance in occupancy than isolation, and second, why are both metrics such poor predictors of occupancy, given that habitat destruction is the dominant threat to species persistence?

The stronger effect of patch area can be explained by examining the type of isolation measure used in the analysis. Patch isolation is measured in many ways (10), and we used 3 categories to define the isolation measure used in each study: distance to nearest habitat patch of any size (*NH*); distance to nearest large

Author contributions: L.R.P. and K.E.H. designed research; L.R.P. and K.E.H. performed research; L.R.P. analyzed data; and L.R.P., K.E.H., A.R.E.S., and J.S.B. wrote the paper.

The authors declare no conflict of interest.

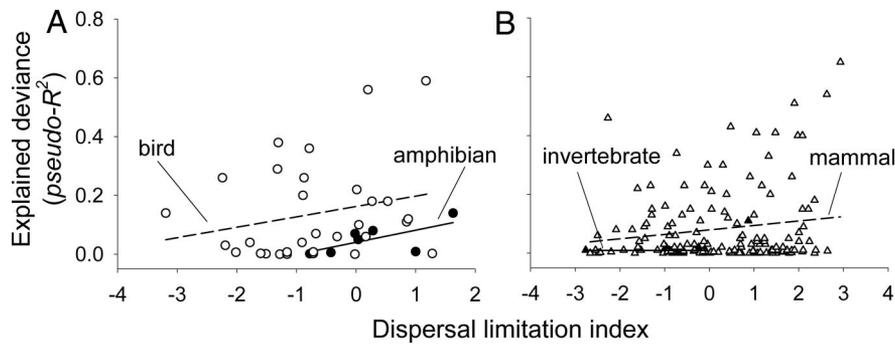
This article is a PNAS Direct Submission.

<sup>1</sup>To whom correspondence should be addressed. E-mail: prugh@nature.berkeley.edu.

This article contains supporting information online at [www.pnas.org/cgi/content/full/0806080105/DCSupplemental](http://www.pnas.org/cgi/content/full/0806080105/DCSupplemental).

© 2008 by The National Academy of Sciences of the USA



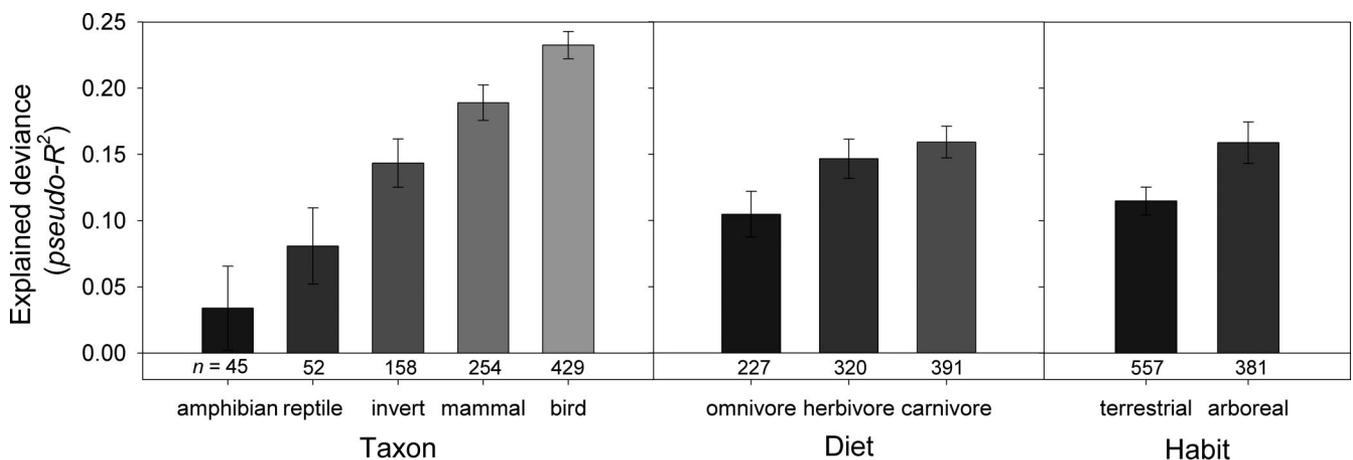


**Fig. 2.** Relationship between the dispersal limitation of a species and its sensitivity to patch isolation. The ability of patch isolation to predict occupancy was weakly related to dispersal limitation for all species combined ( $F_{1,192} = 4.04$ ,  $R^2 = 0.02$ ,  $P = 0.05$ ). See *Scale in Results and Discussion* for calculation of dispersal limitation. Relationships were stronger for amphibians and birds (A) than for invertebrates and mammals (B) but were not significant for any individual taxonomic group (amphibians:  $n = 7$ ,  $R^2 = 0.45$ ,  $P = 0.1$ ; birds:  $n = 31$ ,  $R^2 = 0.06$ ,  $P = 0.2$ ; mammals:  $n = 142$ ,  $R^2 = 0.02$ ,  $P = 0.06$ ; invertebrates:  $n = 13$ ,  $R^2 < 0.001$ ,  $P = 0.98$ ). Patch isolation included all 3 measures (nearest patch, mainland, or source). When restricted to nearest source, the relationship was similarly weak ( $F_{1,30} = 3.31$ ,  $R^2 = 0.10$ ,  $P = 0.08$ ). Alternative analyses using the slope parameter as a measure of effect size rather than  $pR^2$  showed no relationship between dispersal limitation and isolation sensitivity ( $F_{1,175} = 1.82$ ,  $R^2 = 0.01$ ,  $P = 0.18$  with all measures;  $F_{1,30} = 1.25$ ,  $R^2 = 0.04$ ,  $P = 0.27$  with nearest source only).

of magnitude greater than the maximum distance between patches. Limitation indices ranged from  $-3.2$  for the red-tailed hawk (*Buteo jamaicensis*) in Mexico (41) to  $2.9$  for the northern pocket gopher (*Thomomys talpoides*) in Washington (42), and nearly half (49%) of the species were not dispersal-limited according to this index. Dispersal records are notoriously poor and often rely on chance observations, so maximum dispersal distances are likely underestimated for many species. Thus, the number of dispersal-limited species may be fewer than indicated by this index. If a lack of dispersal limitation explains the low influence of isolation on occupancy, then sensitivity to isolation should increase as dispersal limitation increases. There was a positive relationship between isolation sensitivity and dispersal limitation across species, indicating that the poor performance of isolation as a predictor of occupancy may be caused due by inappropriate scaling. However, the relationship between isolation sensitivity and dispersal limitation was weak, particularly for mammals and invertebrates (Fig. 2). Use of mean dispersal distances and mean or minimum patch distances to create the dispersal limitation index produced similar results. Although the scale of patch area and isolation may have been inappropriate for some species, scale issues are insufficient to explain the

weak overall effect of area and isolation on species occurrence patterns.

**Species Traits.** Sensitivity to area and isolation may have been low if particularly sensitive taxonomic groups, or species with certain life history traits, were poorly represented in the database. We examined the effects of taxonomic group, diet, specialization, habit (terrestrial or arboreal), and fecundity on area and isolation sensitivity by using general linear models. None of these factors significantly affected isolation sensitivity, but area sensitivity was affected by taxonomic group, diet, and habit (Fig. 3). Birds and mammals were most sensitive to area whereas amphibians were least sensitive, carnivores (including insectivores) were more sensitive than omnivores, and arboreal species were more sensitive than terrestrial species. It is notable that specialists, which should be more restricted to habitat patches than generalists, did not have increased sensitivity to patch area or isolation, despite inclusion of several individual studies that showed higher area sensitivity of specialists (e.g., ref. 43). This finding contrasts the idea that the habitat island paradigm fits terrestrial systems best when species that use matrix habitats are excluded from analyses (15, 16). The groups with relatively high area sensitivity (birds, mammals, and carnivores) were those



**Fig. 3.** Influence of species traits on the strength of patch area effects. The ability of patch area to predict occupancy was affected by the taxonomic group, diet, and habit of the species (full model  $F_{7,930} = 14.2$ ,  $R^2 = 0.10$ ,  $P < 0.0001$ ; taxon  $F_4 = 12.5$ ,  $P < 0.0001$ , diet  $F_2 = 5.2$ ,  $P = 0.005$ , habit  $F_1 = 7.7$ ,  $P = 0.007$ ). Diets were grouped such that "carnivore" included insectivores and parasitoids and "herbivore" included frugivores, nectivores, granivores, and detritivores. Habit was grouped such that "terrestrial" included fossorial and semiaquatic species. Least-squared means and SE bars are shown.



matrix attributes should greatly increase our ability to predict and enhance species' persistence probabilities in fragmented systems (33–36). Identification of key features that determine whether a species will occupy an area should also improve both occupancy modeling and habitat restoration efforts. Minimizing the impact of threats that accompany habitat destruction, such as the spread of exotic species, overexploitation, and degradation of habitat within patches may have larger conservation returns than focusing on the amount and configuration of remaining habitat (37, 38), at least for those populations that persist in the aftermath of habitat destruction.

## Methods

**Data Acquisition.** In contrast to traditional metaanalyses, which are constrained by the often inconsistent statistical summaries reported in original publications, we maximized the size, accuracy, and standardization of our dataset by obtaining raw data directly from authors and conducting statistical analyses ourselves. Studies were found by a comprehensive search using the Web of Science in March 2005 with the terms "patch occupancy," "habitat occupancy," "metapopulation," "island biogeography," and "incidence function." Forward and backward citations of articles found in these searches were also used to locate studies. Studies were included if 10 or more discrete terrestrial habitat patches (of the same general habitat type) were surveyed and raw occupancy data for birds, mammals, invertebrates, reptiles, or amphibians could be obtained. True island archipelagos were excluded. Hundreds of articles were screened, and 280 were examined in detail, 109 of which were found to be suitable for inclusion. Twenty of these studies were not included because raw data could not be obtained from the authors or their papers. The landscapes of the 89 studies included in the metaanalysis had been fragmented for a minimum of 30 years before surveys.

**Logistic Regression Models.** Patch occupancy data were analyzed in the program *R* by using logistic regression models. In each model, presence/absence was used as the dependent variable for single-year studies ( $n = 67$ ) and years present versus years surveyed was used for multiyear studies ( $n = 22$ ). A binomial distribution was assumed, and data were generally not overdispersed or underdispersed (dispersion =  $1.08 \pm 0.51$  SD). When patch area and isolation were both available, 4 models were run for each population network with the following predictors: (i) patch area only, (ii) patch isolation only, (iii) area plus isolation (additive), and (iv) area  $\times$  isolation (interactive). Univariate models were run when only area or isolation was available. Patch area (hectares) and isolation (meters) were log-transformed before analyses to allow for direct comparison of area and isolation regression coefficients; these coefficients (i.e., slopes of the logistic regressions) indicate the change in occupancy probability given an order of magnitude change in area or isolation. Analyses were also conducted on untransformed data, and results were similar. Population networks were treated independently; adding "study" as a random effect did not change results.

In addition to the slopes, intercepts, and associated errors, we also calculated the  $pR^2$  of each model as:

$$\frac{\text{null deviance} - \text{residual deviance}}{\text{null deviance}}.$$

Null and residual deviances are analogous to the sum-of-squares estimates of linear regression (39). Although  $pR^2$  does not have all of the statistical prop-

erties of the ordinary least-squares  $R^2$  (such as a straightforward connection to the  $F$  statistic), it provides analogous goodness-of-fit estimates (9).

**Paired  $t$  Tests on Slopes.** To determine the relative strength of area and isolation effects, we used paired  $t$  tests of the coefficients (i.e., slopes) of univariate logistic regression models by using area and isolation as predictors ( $n = 590$  population networks with both variables). A paired  $t$  test of area and isolation slopes should not differ from 0 if the strengths of area and isolation effects on occupancy are equal, because area slopes should be positive (occupancy increases with patch area) and isolation slopes should be negative (occupancy decreases with patch isolation). Positive differences in slopes indicate stronger area effects.

**Weighting.** In traditional metaanalyses, effect sizes are weighted by the inverse of the associated error estimates, so that studies with more precise estimates are given more weight in analyses (40). We did not weight analyses presented here, but see Figs. S2–S4 and *SI Text* for alternative analyses with weighted effect sizes. Weighting was not possible when comparing area and isolation slopes because there were 2 estimates of error (1 for each slope) and 1 estimate of effect size (the difference between the slopes). We did not weight  $pR^2$  values shown in Figs. 1–3 to facilitate ease of interpretation and display the distribution of  $pR^2$  values. Results from weighted and unweighted analyses were very similar.

**Species and Landscape Traits.** The effect of species traits on sensitivity to patch area and isolation was examined by using general linear models. Because body size, maximum lifespan, and fecundity were highly correlated ( $r = -0.65$  for body size and fecundity,  $r = 0.76$  for body size and lifespan), only fecundity was included in models because it had the strongest relationship with area and isolation sensitivity. The starting model included the following predictors: taxonomic group, diet, fecundity, specialization, and habit (see Table S2 for a full list of species and traits). Habit was categorized as arboreal (species primarily living in trees) and terrestrial (species primarily living on the ground, below ground, or in low shrubs). Diet was categorized as carnivorous (including insectivores and parasitoids), herbivorous (including frugivores, nectivores, granivores, and detritivores), or omnivorous (consuming plant and animal material). Reclassifying detritivores as omnivores did not affect results. Species were classified as specialists (primarily use 1 habitat or food item, e.g., monophagous insects) or generalists (use several habitats or foods). Sources for all species traits are available on request. The stepAIC modeling function in program *R* was used for analyses, in which forward and backward stepwise regression and Akaike Information Criterion (AIC) values were used to rank models. A Gaussian link was used. The model with the lowest AIC value was retained as the best model (Fig. 2 and Fig. S4).

The effect of matrix quality on area and isolation sensitivity was examined by an ANOVA comparing the  $pR^2$  values among population networks in landscapes with different matrix types. Matrix types were classified as natural (e.g., meadows, forests), urban, agricultural, or clearcut. Landscapes containing multiple matrix types were classified according to the most prevalent type. ANOVAs were weighted such that each landscape contributed equally to the analysis to avoid overrepresentation of landscapes with occupancy records for large numbers of species (16).

**ACKNOWLEDGMENTS.** We thank all of the researchers cited in *SI Text* for raw data for this metaanalysis; A. Jacob and A. Pelletier for help building the database; L. Harmon for assistance with programming in *R*; and D. Srivastava, D. Schluter, J. Goheen, G. Stewart, and anonymous reviewers for helpful comments and advice. This work was supported by a grant from Environment Canada.

- Baillie J, Hilton-Taylor C, Stuart SN (2004) *2004 IUCN Red List of Threatened Species: A Global Assessment* (International Union for Conservation of Nature, Cambridge, UK).
- Foley JA, et al. (2005) Global consequences of land use. *Science* 309:570–574.
- Noss RF, Roe ETL, Scott JM (1995) *Endangered Ecosystems in the United States: A Preliminary Assessment of Loss and Degradation* (U.S. Department of the Interior, National Biological Service, Washington, DC).
- World Resources Institute (1998) *A Guide to World Resources 1998–1999: Environmental Change and Human Health* (World Resources Institute, Washington DC).
- MacArthur RH, Wilson EO (1967) *The Theory of Island Biogeography* (Princeton Univ Press, Princeton).
- Drakare S, Lennon JJ, Hillebrand H (2006) The imprint of the geographical, evolutionary and ecological context on species-area relationships. *Ecol Lett* 9:215–227.
- Watling JI, Donnelly MA (2006) Fragments as islands: A synthesis of faunal responses to habitat patchiness. *Conserv Biol* 20:1016–1025.
- Ovaskainen O, Hanski I (2003) The species-area relationship derived from species-specific incidence functions. *Ecol Lett* 6:903–909.
- Hagle TM, Mitchell GE (1992) Goodness-of-fit measures for probit and logit. *Am J Pol Sci* 36:762–784.
- Moilanen A, Nieminen M (2002) Simple connectivity measures in spatial ecology. *Ecology* 83:1131–1145.
- Pavlacky DC, Anderson SH (2007) Does avian species richness in natural patch mosaics follow the forest fragmentation paradigm? *Anim Conserv* 10:57–68.
- Ferraz G, et al. (2007) A large-scale deforestation experiment: Effects of patch area and isolation on Amazon birds. *Science* 315:238–241.
- Zuckerberg B, Porter WF, Corwin K (2008) The consistency and stability of abundance-occupancy relationships in large-scale population dynamics. *J Anim Ecol*, in press.
- He FL, Gaston KJ (2000) Estimating species abundance from occurrence. *Am Nat* 156:553–559.
- Cook WM, Lane KT, Foster BL, Holt RD (2002) Island theory, matrix effects, and species richness patterns in habitat fragments. *Ecol Lett* 5:619–623.
- Bender DJ, Contreras TA, Fahrig L (1998) Habitat loss and population decline: A meta-analysis of the patch size effect. *Ecology* 79:517–533.

