

1 Short running title: City variation predicts the traits of birds

2 **Title: Socioeconomic variation across multiple cities predicts avian**
3 **life-history strategies**

4 Kinnunen RP¹ *, Fraser K¹, Schmidt C¹, Garroway CJ¹ *

5 *Authors:* Riikka P Kinnunen (RPK), Kevin Fraser (KF), Chloé Schmidt (CS), Colin J Garroway
6 (CJG)

7 *Affiliations:* kinnuner@myumanitoba.ca, Kevin.Fraser@umanitoba.ca,
8 schmid46@myumanitoba.ca, Colin.Garroway@umanitoba.ca, Department of Biological
9 Sciences, Biological Sciences Building, University of Manitoba, Winnipeg, MB, Canada R3T
10 2N2

11 *Statement of authorship:* RPK, CS, and CJG conceived of the study. RPK and KF collected data
12 and RPK built the dataset. RPK performed statistical analyses with input from CS and CJG. All
13 authors contributed to data interpretation. RPK and CJG wrote the first draft of the manuscript,
14 and all authors contributed to subsequent revisions.

15

16 **Correspondence:*

17 Riikka Kinnunen
18 Biological Sciences Building, University of Manitoba
19 50 Sifton Rd
20 Winnipeg, MB, Canada R3T 2N2
21 email: kinnuner@myumanitoba.ca

22

23 Colin Garroway
24 Biological Sciences Building, University of Manitoba
25 50 Sifton Rd
26 Winnipeg, MB, Canada R3T 2N2
27 phone: (204) 474-8267; email: colin.garroway@umanitoba.ca

28

29 **Abstract**

30 Cities are the planet's newest ecosystem and thus provide the opportunity to study community
31 formation directly following major permanent environmental change. The human social and built
32 components of environments can vary widely across different cities, yet it is largely unknown
33 how these features of a city covary with the traits of colonizing species. We constructed a new
34 dataset from open-source data with 44,670 observations of 160 Passerine species observed 1,908
35 urban areas across the United States. We found that as a city's housing density and median
36 income increased it tended to support more migratory species and species with smaller body
37 sizes and shorter lifespans. This suggests that differential survival and reproduction at the
38 species-level can quickly generate geographical patterns of species trait variation across urban
39 environments similar to those found in natural settings without the need for evolutionary change.

40

41 **Introduction**

42 Spatial gradients of species life-history traits can occur if species with similar phenotypes tend to
43 co-occur in similar environments (e.g., Vellend 2016; Pontarp et al. 2019). This is ecological
44 selection (in the sense of Vellend 2016)—the phenotype-based differential survival and
45 reproduction of members of different species due to environmental filtering (Kraft et al. 2015)
46 and biotic interactions. Together with ecological drift, dispersal, and speciation, ecological
47 selection contributes to the formation of spatial gradients in species richness, abundance, and
48 composition (Vellend 2016). When environments change rapidly, ecological selection should be
49 fast-acting with detectable effects in contemporary timeframes—species with sufficient access to
50 a new environment either can or cannot persist in it. Ecological selection should be particularly

51 important for shaping communities immediately following disturbances and setting the stage for
52 future evolutionary change in the new environment. Here we use the creation of cities as an
53 instance of new habitat formation suited to exploring contemporary ecological selection.

54 Cities are the planet's newest ecosystems—ones where human social and built environments
55 interact with natural physical and biological environments to shape ecosystem dynamics (Hobbs
56 et al. 2006; Pickett et al. 2017). Cities cover ~3% of habitable land globally (Liu et al. 2014) with
57 continued growth forecasted (Seto et al. 2011). Thus, city building has created a natural
58 experiment with which we can explore how ecological selection shapes biodiversity following
59 the rapid creation of a major new habitat type. While we know that cities are causing
60 evolutionary change in urban species (e.g., Johnson & Munshi-South 2017; Schmidt et al. 2020),
61 the ecological processes that shape initial biodiversity patterns—the starting material for
62 subsequent evolutionary change—are less well known. To explore this, we analyzed how trait
63 variation in native Passerines breeding in cities in the United States varies with socioeconomic
64 features of different cities. We focused on socioeconomic heterogeneity because it reflects
65 different aspects of resource availability and environmental disturbance levels, two factors
66 known to correlate well with life-history trait variation. A city's socioeconomics directly reflects
67 human activities—the defining feature of urban environments (Pickett et al. 2017). Despite this
68 likely importance, the influence of socioeconomic heterogeneity on community formation is not
69 well understood (Pickett et al. 2017).

70 Some species-level traits show clinal variation—thought to reflect adaptations to environmental
71 variation (Lack 1947; James 1970; Evans et al. 2006; Olson et al. 2009). Resource availability
72 and environmental stability in natural settings both tend to be negatively correlated with species
73 body size and lifespan and positively related to reproductive output (Lack 1947, 1954; Martin

74 1987; Ricklefs 2000). This is thought to be because 1) large-bodied species are better able to
75 withstand periods of low resource availability; 2) investment in fewer better-quality offspring in
76 poor environments increases their likelihood of survival; 3) and being long-lived allows for
77 multiple reproductive attempts given higher offspring mortality rates (Sol et al. 2012). Migration
78 is another important life-history strategy associated with resource availability that allows species
79 to cope with seasonality and periods of low productivity, particularly among birds, and migratory
80 species generally select resource-rich stable habitats during the breeding season (Somveille et al.
81 2015).

82 There is now considerable evidence from both birds and mammals suggesting that cities filter for
83 subsets of local species that have traits suited to population persistence in urban environments
84 (Chace & Walsh 2006; Kark et al. 2007; Croci et al. 2008; Leveau 2013; Meffert & Dziock
85 2013; Meillère et al. 2015; Aronson et al. 2016; Silva et al. 2016; Jokimäki et al. 2016; Alberti et
86 al. 2017; Leveau et al. 2017; Sepp et al. 2018; Santini et al. 2019; Hensley et al. 2019). Relative
87 to non-urban species, successful urban colonizers tend to have larger body masses, bigger brains
88 and be tolerant of a broad range of environments (Bonier et al. 2007; Croci et al. 2008;
89 Maklakova et al. 2011; Lowry et al. 2013; Iglesias-Carrasco et al. 2019). The use of cities by
90 migratory species is relatively unexplored, but there is some evidence that migratory birds may
91 be underrepresented in urban ecosystems (Allen & O'Connor 2000; Kluza et al. 2000; Poague et
92 al. 2000). Additionally, habitat suitability in cities represents a strong filter against tree and
93 ground nesting birds compared to species that nest in artificial cavities, or on buildings (Lim &
94 Sodhi 2004; Conole & Kirkpatrick 2011; Lizée et al. 2011; Jokimäki et al. 2016). Much of this
95 previous work has focused on urban–rural species trait comparisons that treat different cities as
96 homogeneous with respect to the features of species that can colonize them. However, it is

97 notable that in instances where species filtering has been explored across multiple cities different
98 cities seem to filter for slightly different subsets of traits (Hensley et al. 2019). This finding
99 suggests that different cities may be suited to different life-history strategies.

100 While cities are more similar to each other than they are to nearby rural lands, there is also clear
101 variation across different cities in both their built and human social components. For example,
102 plant diversity and vegetation cover—important predictors of urban biodiversity—are higher in
103 wealthier areas (Talarchek 1990; Iverson & Cook 2000; Hope et al. 2003; Kinzig et al. 2005;
104 Leong et al. 2018). At more local scales avian biodiversity is affected by features such as urban
105 canopy cover, the composition of landscape plantings and the presence of lawns, the prevalence
106 of bird feeders, and human food waste (Thompson et al. 2003; Lepczyk et al. 2004; Smith et al.
107 2005, 2006; Tryjanowski et al. 2015). These features will be correlated with aspects of city-wide
108 socioeconomic status and therefore biodiversity patterns across different urban areas. If
109 ecological selection is important for community formation in urban environments we should
110 expect that species best able to tolerate conditions in a particular city would share the phenotypic
111 traits that enable persistence, just as we see trait variation converge across natural environments
112 (Cleary et al. 2007; Jetz et al. 2008).

113 Here we ask whether socioeconomic heterogeneity across cities is predictive of the traits of
114 Passerine species that colonize them. We used housing density, human population size, and
115 median income as socioeconomic metrics likely to capture different axes of resource availability
116 across cities. We hypothesized that wealthier cities would provide stable food and nesting
117 resources similar to more natural and semi-natural resources in less disturbed contexts. We
118 additionally hypothesized that cities with high housing densities and large human populations
119 would provide more anthropogenic food resources due to supplemental feeding and food waste

120 and might provide more nesting opportunities for species that nest on built structures or artificial
121 cavities. However, highly populated, densely housed cities will also be the most disturbed,
122 polluted, and fragmented—all factors that could modify the relationship between traits and
123 resources. We consequently predicted that cities with higher median incomes would impose
124 ecological selection pressures similar to stable, resource-rich environments, favoring small,
125 short-lived species with high reproductive outputs. In contrast cities with high housing densities
126 and large human populations, which are more disturbed and stochastic environments, would
127 select for larger, long-lived species that invest more in offspring quality over quantity.

128

129 **Methods**

130 *Data compilation*

131 We compiled a new dataset from open data sources (see SI Fig 1 for detailed data compilation
132 process). First, we downloaded the eBird Basic Dataset for the United States from eBird.org
133 (Sullivan et al. 2009). eBird is an online bird abundance and distribution checklist program
134 jointly coordinated by the Cornell Laboratory of Ornithology and the National Audubon Society.
135 The eBird project relies on citizen science volunteer observers who submit georeferenced
136 observations of species to a centralized database. Regional reviewers identify outliers and verify
137 each species observation based on sighting coordinates (Wood et al. 2011). The eBird Basic
138 Dataset is a publicly available large core dataset with >100,000,000 observations worldwide
139 (available from <https://ebird.org/>). We used eBird observations of Passerines from the United
140 States so that we were working with related trophically similar species across cities with
141 relatively comparable histories. We focused on Passerines because they are a broadly

142 comparable group with many species that have colonized cities. More precisely, we focused on
143 native Passerines present and thought to be breeding in cities in the United States, and discarded
144 observations of transient birds likely on route to their breeding grounds and observations of birds
145 from outside of the breeding season. This ensured that our observations were focused on a period
146 of high resource demand. We chose observations from May 27th to July 7th as our breeding
147 season, following the practices of the North American Breeding Bird Survey (available from
148 <https://www.pwrc.usgs.gov/bbs/index.cfm>). Our observations were filtered to include only those
149 between 2010–2017 to match data availability for city variables which were last measured in
150 2010 and to allow for the maximum accumulation of species detections in cities. The observation
151 dates were filtered using the R package *auk* (version 0.3.3; Strimas-Mackey et al. 2018) in R
152 version 3.5.0 (R Core Team 2018).

153 We extracted species-level data for body mass, clutch size, and longevity from the Amniote life-
154 history database (Myhrvold et al. 2016). This is a systematically compiled database of
155 life-history traits for birds, mammals, and reptiles built for comparative life-history analyses
156 (Myhrvold et al. 2015). Bird species that are typically present in a single U.S. state year-round
157 were classified as residents, and birds that do not have a year-round presence in a state (i.e.,
158 migrate from elsewhere to breed) were classified as migrants. Next, we searched for data on
159 nesting site preferences on the Cornell Lab of Ornithology Birds of North America online page
160 (available from <https://birdsoftheworld.org/bow/home>) and filled in missing information with
161 information from the Handbook of the Birds of the World (Del Hoyo et al. 2003-2011).

162 We assigned georeferenced eBird species records to urban areas using U.S. Census-defined
163 urban area maps provided by the U.S. Census Bureau (U.S. Census Bureau 2010a). The urban
164 area shapefiles define an urban area as a densely developed territory with at least 2500 people

165 (U.S. Census Bureau 2010a). We used the R packages *sp* (version 1.3-1; Bivand et al. 2013),
166 *rgdal* (version 1.3-4; Bivand et al. 2018), and *maps* (version 3.3.0; Becker & Wilks 2018) for
167 this merge. Next, we calculated socioeconomic features for these urban areas using census data
168 from the U.S. Census Bureau (U.S. Census Bureau 2010b). Data were available for the year 2010
169 and not the full span of our bird observation data. We thus assume that these data have remained
170 comparable.

171 We were interested in species presence or absence in an urban area during a breeding season, not
172 the number of observations of each species, and so our final data set was made up of presence
173 data for each species observed in each city. We then excluded vagrants, introduced, and
174 accidental observations of bird species from each state (see SI Tab. 1), as well as the brood
175 parasites, Bronzed Cowbird (*Molothrus aeneus*) and Brown-headed Cowbird (*Molothrus ater*)
176 from the family Icteridae, as brood parasites do not carry the fitness cost of reproduction in the
177 same way that other species do.

178 *Data analyses*

179 Human population size, housing density (housing units per square mile), and median household
180 income were not strongly correlated (SI Fig 3) and were treated as independent variables in a
181 series of mixed models that used species traits as dependent variables. These species-level traits
182 were clutch size, longevity (the lifespan of an individual in years), body mass (mass of an
183 individual in grams), migratory status (migratory or resident), and nesting habitat (tree nesting,
184 ground nesting or cavity nesting). Data were scaled to standardize the range of independent and
185 dependent variables to make model effects comparable.

186 Clutch size, longevity, and body mass were treated as dependent variables in a series of linear
187 mixed-effects models (LMMs). All urban variables were fit in each model. We also included
188 taxonomic family and U.S. state as random effects allowing intercepts to vary. Random
189 intercepts estimate between-group variation in means, as well as variation within groups in each
190 of our dependent variables. Model residuals were plotted against the expected values and we saw
191 no strong violations of the models' assumptions, except for body mass. We \log_{10} -transformed
192 body mass to ensure the normality of residuals.

193 Migratory status and nesting preference were binary variables and so we fit these models using
194 generalized linear mixed-effects models (GLMMs) with a binomial error structure and logit link
195 function. The model structure was similar to that for LMMs with family and state treated as
196 random effects and the city traits fit as independent variables. Migratory status was coded 1 for
197 migratory species and 0 for residents. We used a similar series of models to explore nesting
198 habits with tree nesters, ground nesters, and cavity nesters coded as 1 in three separate models
199 and compared against all other nesting habits coded as 0.

200

201 **Results**

202 Our final dataset included 44,670 observations of 160 bird species from 26 families that had been
203 observed at least once in 1,908 cities during at least one breeding season (Fig 1). Both housing
204 density and median income were negatively related to species longevity and body mass. There
205 were no detectable relationships between clutch size and any socioeconomic measure and no
206 relationship between population size and any life-history trait (Fig 2; Tab. 1). Additionally, as
207 housing density and median income increased, the likelihood of species being migratory
208 increased (Fig 3; Tab. 2). There was a negative relationship between housing density and cavity
209 nesters. There were no other detectable relationships identified in our models.

210

211 **Discussion**

212 The typical lifespans, body masses, and migratory status of species found across different cities
213 varied with housing density and median income (Fig 4). This presumably reflects differences in
214 the average fitness of a species given the local features of a particular city. This suggests that
215 ecological selection—in this case associated with aspects of socioeconomics—plays an
216 important role in determining biodiversity at the earliest stage of community formation following
217 the emergence of new environments. Like environmental variation in natural habitats, cities vary
218 in the details of their composition and different life-history strategies are better suited to different
219 types of city.

220

221 It is generally expected that as the typical body size of a species increases, its reproductive
222 output decreases, and lifespan increases (Bielby et al. 2007). This trait combination is thought to
223 reflect trade-offs between current and future reproduction and survival given resource
224 availability. We found that species body mass and lifespan varied together as expected if cities
225 with high housing density and median income were relatively stable resource-rich environments
226 (see description below). As the median income and housing density of a city increased the city
227 tended to support smaller shorter-lived species. Contrary to our predictions, we found no
228 evidence that clutch size covaried with either these life-history traits or the socioeconomic status
229 of a city. Recent explorations of life-history trait variation have also found that mean number of
230 offspring was not well correlated with other traits associated with the fast–slow continuum for
231 birds and suggested that annual reproductive effort represents a second life-history strategy axis
232 of variation (Healy et al. 2019). This could happen if trade-offs associated with reproduction do
233 not always result in changes in annual reproductive output (Healy et al. 2019). More natural
234 areas with plentiful and stable resources tend to support greater numbers of small-bodied species
235 that prioritize reproduction at the expense of lifespan, due to high offspring survival rates.
236 Stochastic or resource-poor environments tend to support larger, longer-lived species that
237 prioritize adult survival over producing many offspring. This strategy is thought to buffer against
238 the consequences of reproductive failures by spreading the risk of offspring mortalities across
239 multiple breeding attempts during a longer lifetime. If this interpretation holds for different
240 cities, it suggests that cities with high housing density and median income may be relatively
241 stable, predictable habitats with readily available resources for urban birds. Our results further
242 suggest that human population size is not a strong ecological filter for these traits.
243

244 The results for migratory species support our resource and environmental variability-based
245 interpretation of a city's housing density and median income. Urban areas with higher median
246 income and greater housing densities tended to support relatively more migratory species,
247 whereas again the human population size of a city was not important. Migratory species breed in
248 cities less often than natural areas (Poague et al. 2000; Croci et al. 2008) and generally choose
249 breeding sites with an excess of resources that are not completely exploited by resident birds
250 (Dalby et al. 2014; Somveille et al. 2015). That more migratory species choose to breed in cities
251 with high housing densities and higher median incomes suggests that they may be choosing these
252 cities, at least in part, based on resource availability (Martin & Karr 1986; Faaborg et al. 2010;
253 Jenkins et al. 2017).

254

255 Cities with more economic resources and higher housing densities might provide more stable,
256 high-quality habitats for birds in many ways. There is a well-recognized positive correlation
257 between urban plant diversity, vegetation cover, and wealth in cities (Iverson & Cook 2000;
258 Hope et al. 2003; Kinzig et al. 2005; Leong et al. 2018). Higher housing density typically also
259 means more backyards and gardens in people's yards in a city, and these diverse plant
260 communities can provide important sources of food, cover, and nesting resources for birds
261 (Thompson et al. 2003; Smith et al. 2005, 2006; Narango et al. 2018). In addition to vegetation,
262 cities also provide stable year-round access to food sources via bird feeders and human food
263 waste (Lepczyk et al. 2004; Tryjanowski et al. 2015) which influences urban bird community
264 structure and breeding success (Robb et al. 2008; Galbraith et al. 2015). Wildlife feeding is a
265 popular activity among people with recent estimates of ~ 59% of U.S. households providing food
266 for mainly birds (U.S. Fish & Wildlife Service 2016). Bird feeders are also more concentrated in

267 densely populated areas of higher socioeconomic class (Fuller et al. 2008, 2013). Bird feeders
268 can act as particularly important resources to Passerines, as many species are mainly granivores.
269 Corvids, on the other hand, can as omnivores easily exploit human food waste. Our results also
270 showed that as the housing density of a city increased, it tended to support fewer cavity nesting
271 species. This suggests that fewer cavity-bearing trees and snags may be present in these cities,
272 and that—for most species—artificial cavities and other human-associated structures cannot
273 replace more natural nesting resources (Blewett & Marzluff 2005).

274
275 Interestingly, housing density and human population size were only moderately correlated in our
276 data, yielding more nuanced insights into the effects of human activity versus city structure.
277 Traits fell along our housing density axis similarly to median income, indicating that housing
278 density, like wealth, creates stability in resources and habitat. We speculate that highly populated
279 cities are the most disturbed in terms of traffic levels, noise, artificial light, and pollution
280 (McKinney 2001, 2002; Luck 2007; Isaksson 2018; Strohbach et al. 2019). Each of these factors
281 could make highly populated areas generally poor habitat for birds.

282
283 Explaining the general geographical patterns of species trait variation (e.g., body size variation)
284 has been difficult, and the topic remains controversial (Blackburn et al. 1999; Meiri & Dayan
285 2003; Meiri & Thomas 2007; Olson et al. 2009). For example, body size in birds has been linked
286 to temperature, resource availability, seasonality, and environmental stability (James 1970;
287 Murphy 1985; Olson et al. 2009; Sun et al. 2017). Our results demonstrate that ecological
288 selection can quickly generate patterns of species trait variation across cities similar to those

289 found in natural settings. In this case, we did not find gradual spatial clines, but rather
290 heterogeneous patches across which life-history traits vary similarly to those seen across natural
291 environments. Although cities are generally more similar to each other than to their natural
292 surroundings, our results suggest that from a bird's eye view, they are heterogeneous habitats
293 supporting different life-history strategies that in part depend on socioeconomic factors and the
294 built environment. When using cities as replicates in studies of urban wildlife (Szulkin
295 et al. 2020) the assumption that different cities are directly comparable should be made with
296 care. As the world's most rapidly growing ecosystem, understanding what kinds of species
297 initially colonize cities provides important information about how the distribution of biodiversity
298 will change following rapid, human-caused environmental shifts in an era of global change. It is
299 also important for us to understand how cities support nature because it is now within cities that
300 most people interact with and benefit from local biodiversity (e.g., through recreational activities
301 and ecosystem services; Bolund and Hunhammar 1999). Finally, although cities tend to support
302 fewer species than nearby natural areas (Chace & Walsh 2006), on average urban biodiversity is
303 primarily comprised of native species (Aronson et al. 2014). These findings in addition to our
304 results suggest that cities could play a more important role in conservation and management than
305 they currently do.

306

307

308 **Acknowledgments**

309 We particularly want to thank Alyssa Garrard for collecting data on Passerine nesting site
310 preferences as well as the other members of the Population Ecology & Evolutionary Genetics

311 Group for their helpful comments on manuscript drafts. We also want to acknowledge the work
312 done by the eBird citizen-science observers. This study was supported by a discovery grant of
313 the Natural Sciences and Engineering Research Council of Canada (NSERC) to CJG. RPK and
314 CS were additionally supported by the University of Manitoba Graduate Fellowships and a
315 University of Manitoba Graduate Enhancement of Tri-council funding grant to CJG.

316 **References**

- 317 Alberti, M., Marzluff, J. & Hunt, V.M. (2017). Urban driven phenotypic changes: empirical
318 observations and theoretical implications for eco-evolutionary feedback. *Philos. Trans. R.*
319 *Soc. B Biol. Sci.*, 372, 20160029.
- 320 Allen, A.P. & O'Connor, R.J. (2000). Hierarchical correlates of bird assemblage structure on
321 northeastern U.S.A. lakes. *Environ. Monit. Assess.*, 62, 15–37.
- 322 Aronson, M.F.J., Nilon, C.H., Lepczyk, C.A., Parker, T.S., Warren, P.S., Cilliers, S.S. et al.
323 (2016). Hierarchical filters determine community assembly of urban species pools. *Ecology*,
324 97, 2952–2963.
- 325 Aronson, M.F.J., La Sorte, F.A., Nilon, C.H., Katti, M., Goddard, M.A., Lepczyk, C.A. et al.
326 (2014). A global analysis of the impacts of urbanization on bird and plant diversity reveals
327 key anthropogenic drivers. *Proc. R. Soc. B Biol. Sci.*, 281, 20133330–20133330.
- 328 Becker, R. & Wilks, A. (2018). Original S code. R version by Ray Brownrigg. Enhancements by
329 Thomas P Minka and Alex Deckmyn. maps: Draw Geographical Maps.
- 330 Bielby, J., Mace, G.M., Bininda-Emonds, O.R.P., Cardillo, M., Gittleman, J.L., Jones, K.E. et al.
331 (2007). The fast-slow continuum in mammalian life history: An empirical reevaluation. *Am.*
332 *Nat.*, 169, 748–757.
- 333 Birds of North America Online. (2019). Cornell Lab of Ornithology, Ithaca, NY, USA. Available
334 from <https://birdsoftheworld.org/bow/home>.
- 335 Bivand, R., Keitt, T.H., Rowlingson, B. & Pebesma, E. (2018). rgdal: Bindings for the
336 Geospatial Data Abstraction.
- 337 Bivand, R.S., Pebesma, E., Gómez-Rubio, V., Bivand, R.S., Pebesma, E. & Gómez-Rubio, V.
338 (2013). Hello world: Introducing spatial data. In: *Appl. Spat. Data Anal. with R*. Springer
339 New York, pp. 1–16.
- 340 Blackburn, T.M., Gaston, K.J. & Loder, N. (1999). Geographic gradients in body size: A
341 clarification of Bergmann's rule. *Divers. Distrib.*, 5, 165–174.
- 342 Blewett, C.M. & Marzluff, J.M. (2005). Effects of urban sprawl on snags and the abundance and
343 productivity of cavity-nesting birds. *Condor*, 107, 678–693.
- 344 Bolund, P. & Hunhammar, S. (1999). Ecosystem services in urban areas. *Ecol. Econ.*, 29, 293–
345 301.
- 346 Bonier, F., Martin, P.R. & Wingfield, J.C. (2007). Urban birds have broader environmental
347 tolerance. *Biol. Lett.*, 3, 670–673.
- 348 Chace, J.F. & Walsh, J.J. (2006). Urban effects on native avifauna: a review. *Landsc. Urban*
349 *Plan.*, 74, 46–69.
- 350 Cleary, D.F.R., Boyle, T.J.B., Setyawati, T., Anggraeni, C.D., Van Loon, E.E. & Menken, S.B.J.
351 (2007). Bird species and traits associated with logged and unlogged forest in Borneo. *Ecol.*
352 *Appl.*, 17, 1184–1197.

- 353 Conole, L.E. & Kirkpatrick, J.B. (2011). Functional and spatial differentiation of urban bird
354 assemblages at the landscape scale. *Landscape Urban Plan.*, 100, 11–23.
- 355 Croci, S., Butet, A. & Clergeau, P. (2008). Does urbanization filter birds on the basis of their
356 biological traits? *Condor*, 110, 223–240.
- 357 Dalby, L., McGill, B.J., Fox, A.D. & Svenning, J.C. (2014). Seasonality drives global-scale
358 diversity patterns in waterfowl (Anseriformes) via temporal niche exploitation. *Glob. Ecol.
359 Biogeogr.*, 23, 550–562.
- 360 eBird. (2017). eBird: An online database of bird distribution and abundance [web application].
361 eBird, Cornell Lab of Ornithology, Ithaca, New York. Available from <http://www.ebird.org>.
- 362 Evans, K.L., James, N.A. & Gaston, K.J. (2006). Abundance, species richness and energy
363 availability in the North American avifauna. *Glob. Ecol. Biogeogr.*, 15, 372–385.
- 364 Faaborg, J., Holmes, R.T., Anders, A.D., Bildstein, K.L., Dugger, K.M., Gauthreaux, S.A. et al.
365 (2010). Recent advances in understanding migration systems of New World land birds.
366 *Ecol. Monogr.*, 80, 3–48.
- 367 Fuller, R.A., Irvine, K.N., Davies, Z.G., Armsworth, P.R. & Gaston, K.J. (2013). Interactions
368 between people and birds in urban landscapes. In: *Urban Bird Ecol. Conserv.* University of
369 California Press, pp. 249–266.
- 370 Fuller, R.A., Warren, P.H., Armsworth, P.R., Barbosa, O. & Gaston, K.J. (2008). Garden bird
371 feeding predicts the structure of urban avian assemblages. *Divers. Distrib.*, 14, 131–137.
- 372 Galbraith, J.A., Beggs, J.R., Jones, D.N. & Stanley, M.C. (2015). Supplementary feeding
373 restructures urban bird communities. *Proc. Natl. Acad. Sci. U. S. A.*, 112, E2648–E2657.
- 374 Healy, K., Ezard, T.H.G., Jones, O.R., Salguero-Gómez, R. & Buckley, Y.M. (2019). Animal
375 life history is shaped by the pace of life and the distribution of age-specific mortality and
376 reproduction. *Nat. Ecol. Evol.*, 3, 1217–1224.
- 377 Hensley, C.B., Trisos, C.H., Warren, P.S., MacFarland, J., Blumenshine, S., Reece, J. et al.
378 (2019). Effects of urbanization on native bird species in three southwestern US cities. *Front.
379 Ecol. Evol.*, 7, 71.
- 380 Hobbs, R.J., Arico, S., Aronson, J., Baron, J.S., Bridgewater, P., Cramer, V.A. et al. (2006).
381 Novel ecosystems: Theoretical and management aspects of the new ecological world order.
382 *Glob. Ecol. Biogeogr.*, 15, 1–7.
- 383 Hope, D., Gries, C., Zhu, W., Fagan, W.F., Redman, C.L., Grimm, N.B. et al. (2003).
384 Socioeconomics drive urban plant diversity. *Proc. Natl. Acad. Sci. U. S. A.*, 100, 8788–
385 8792.
- 386 Del Hoyo, J., Elliott, A. & Christie, D.A. (2003-2011). *Handbook of the birds of the world (Vols.
387 8 – 16)*. Barcelona: Lynx editions.
- 388 Iglesias-Carrasco, M., Duchêne, D.A., Head, M.L., Møller, A.P. & Cain, K. (2019). Sex in the
389 city: Sexual selection and urban colonization in passerines. *Biol. Lett.*, 15.
- 390 Isaksson, C. (2018). Impact of urbanization on birds. In: *Bird Species How They Arise, Modify*

- 391 *Vanish*. pp. 235–257. Springer, Cham.
- 392 Iverson, L. & Cook, E. (2000). Urban forest cover of the Chicago region and its relation to
393 household density and income. *Urban Ecosyst.*, 4, 105–124.
- 394 James, F.C. (1970). Geographic Size Variation in Birds and Its Relationship to Climate. *Ecology*,
395 51, 365–390.
- 396 Jenkins, J.M.A., Thompson, F.R. & Faaborg, J. (2017). Species-specific variation in nesting and
397 postfledging resource selection for two forest breeding migrant songbirds. *PLoS One*, 12.
- 398 Jetz, W., Sekercioglu, C.H., Böhning-Gaese, K., Burgess, N. & Powell, G. (2008). The
399 Worldwide Variation in Avian Clutch Size across Species and Space. *PLoS Biol.*, 6, e303.
- 400 Johnson, M.T.J. & Munshi-South, J. (2017). Evolution of life in urban environments. *Science*
401 (80-).
- 402 Jokimäki, J., Suhonen, J., Jokimäki-Kaisanlahti, M.L. & Carbó-Ramírez, P. (2016). Effects of
403 urbanization on breeding birds in European towns: Impacts of species traits. *Urban*
404 *Ecosyst.*, 19, 1565–1577.
- 405 Kark, S., Iwaniuk, A., Schalimtzek, A. & Banker, E. (2007). Living in the city: Can anyone
406 become an “urban exploiter”? *J. Biogeogr.*, 34, 638–651.
- 407 Kinzig, A.P., Warren, P., Martin, C., Hope, D. & Katti, M. (2005). The effects of human
408 socioeconomic status and cultural characteristics on urban patterns of biodiversity. *Ecol.*
409 *Soc.*, 10.
- 410 Kluza, D.A., Griffin, C.R. & Degraaf, R.M. (2000). Housing developments in rural New
411 England: effects on forest birds. *Anim. Conserv.*, 3, 15–26.
- 412 Kraft, N.J.B., Adler, P.B., Godoy, O., James, E.C., Fuller, S. & Levine, J.M. (2015). Community
413 assembly, coexistence and the environmental filtering metaphor. *Funct. Ecol.*, 29, 592–599.
- 414 Lack, D. (1947). The significance of clutch size. *Ibis (Lond. 1859)*, 89, 302–352.
- 415 Lack, D. (1954). *The natural regulation of animal numbers. Nat. Regul. Anim. Numbers*. Oxford:
416 Clarendon Press. London: Geoffrey Cumberlege, Oxford University Press, Amen House,
417 Warwick Square, E.C. 4.
- 418 Leong, M., Dunn, R.R. & Trautwein, M.D. (2018). Biodiversity and socioeconomics in the city:
419 a review of the luxury effect. *Biol. Lett.*
- 420 Lepczyk, C.A., Mertig, A.G. & Liu, J. (2004). Assessing landowner activities related to birds
421 across rural-to-urban landscapes. *Environ. Manage.*, 33, 110–125.
- 422 Leveau, L.M. (2013). Bird traits in urban–rural gradients: how many functional groups are there?
423 *J. Ornithol.*, 154, 655–662.
- 424 Leveau, L.M., Leveau, C.M., Villegas, M., Cursach, J.A. & Suazo, C.G. (2017). Bird
425 communities along urbanization gradients: A comparative analysis among three neotropical
426 cities. *Ornitol. Neotrop.*, 28, 77–87.
- 427 Lim, H.C. & Sodhi, N.S. (2004). Responses of avian guilds to urbanisation in a tropical city.

- 428 *Landsc. Urban Plan.*, 66, 199–215.
- 429 Liu, Z., He, C., Zhou, Y. & Wu, J. (2014). How much of the world's land has been urbanized,
430 really? A hierarchical framework for avoiding confusion. *Landsc. Ecol.*, 29, 763–771.
- 431 Lizée, M.H., Mauffrey, J.F., Tatoni, T. & Deschamps-Cottin, M. (2011). Monitoring urban
432 environments on the basis of biological traits. *Ecol. Indic.*, 11, 353–361.
- 433 Lowry, H., Lill, A. & Wong, B.B.M. (2013). Behavioural responses of wildlife to urban
434 environments. *Biol. Rev.*, 88, 537–549.
- 435 Luck, G.W. (2007). A review of the relationships between human population density and
436 biodiversity. *Biol. Rev.*, 82, 607–645.
- 437 Maklakova, A.A., Immler, S., Gonzalez-Voyer, A., Rönn, J. & Kolm, N. (2011). Brains and the
438 city: Big-brained passerine birds succeed in urban environments. *Biol. Lett.*, 7, 730–732.
- 439 Martin, T.E. (1987). Food as a limit on breeding birds: a life-history perspective. *Annu. Rev.*
440 *Ecol. Syst.*, 18, 453–487.
- 441 Martin, T.E. & Karr, J.R. (1986). Patch utilization by migrating birds: resource oriented? *Ornis*
442 *Scand.*, 17, 165–174.
- 443 McKinney, M.L. (2001). Role of human population size in raising bird and mammal threat
444 among nations. *Anim. Conserv.*, 4, 45–57.
- 445 McKinney, M.L. (2002). Urbanization, biodiversity, and conservation. *Bioscience*, 52, 883–890.
- 446 Meffert, P.J. & Dzioc, F. (2013). The influence of urbanisation on diversity and trait
447 composition of birds. *Landsc. Ecol.*, 28, 943–957.
- 448 Meillère, A., Brischoux, F., Parenteau, C. & Angelier, F. (2015). Influence of urbanization on
449 body size, condition, and physiology in an urban exploiter: A multi-component approach.
450 *PLoS One*, 10.
- 451 Meiri, S. & Dayan, T. (2003). On the validity of Bergmann's rule. *J. Biogeogr.*, 30, 331–351.
- 452 Meiri, S. & Thomas, G.H. (2007). The geography of body size - Challenges of the interspecific
453 approach. *Glob. Ecol. Biogeogr.*, 16, 689–693.
- 454 Murphy, E.C. (1985). Bergmann's Rule, Seasonality, and Geographic Variation in Body Size of
455 House Sparrows. *Evolution (N. Y.)*, 39, 1327.
- 456 Myhrvold, N.P., Baldrige, E., Chan, B., Sivam, D., Freeman, D. L. & Ernest, S.K.M. (2016).
457 An amniote life-history database to perform comparative analyses with birds, mammals,
458 and reptiles. Available from <http://esapubs.org/archive/ecol/E096/269/>.
- 459 Myhrvold, N.P., Baldrige, E., Chan, B., Sivam, D., Freeman, D.L. & Ernest, S.K.M. (2015). An
460 amniote life-history database to perform comparative analyses with birds, mammals, and
461 reptiles. *Ecology*, 96, 3109–000.
- 462 Narango, D.L., Tallamy, D.W. & Marra, P.P. (2018). Nonnative plants reduce population growth
463 of an insectivorous bird. *Proc. Natl. Acad. Sci. U. S. A.*, 115, 11549–11554.

- 464 North American Breeding Bird Survey. (2018). USGS Patuxent Wildlife Research Center.
465 Laurel, MD, USA. Available from <https://www.pwrc.usgs.gov/bbs/index.cfm>.
- 466 Olson, V.A., Davies, R.G., Orme, C.D.L., Thomas, G.H., Meiri, S., Blackburn, T.M. et al.
467 (2009). Global biogeography and ecology of body size in birds. *Ecol. Lett.*, 12, 249–259.
- 468 Pickett, S.T.A., Cadenasso, M.L., Rosi-Marshall, E.J., Belt, K.T., Groffman, P.M., Grove, J.M.
469 et al. (2017). Dynamic heterogeneity: a framework to promote ecological integration and
470 hypothesis generation in urban systems. *Urban Ecosyst.*, 20.
- 471 Poague, K.L., Johnson, R.J. & Young, L.J. (2000). Bird Use of Rural and Urban Converted
472 Railroad Rights-of-Way in Southeast Nebraska. *Wildl. Soc. Bull.*, 28, 852–864.
- 473 Pontarp, M., Bunnefeld, L., Cabral, J.S., Etienne, R.S., Fritz, S.A., Gillespie, R. et al. (2019).
474 The Latitudinal diversity gradient: Novel understanding through mechanistic eco-
475 evolutionary models. *Trends Ecol. Evol.*, 34, 211–223.
- 476 R Core Team. (2018). R: A language and environment for statistical computing. R Foundation for
477 Statistical Computing, Vienna, Austria.
- 478 Ricklefs, R.E. (2000). Density dependence, evolutionary optimization, and the diversification of
479 avian life histories. *Condor*, 102, 9–22.
- 480 Robb, G.N., McDonald, R.A., Chamberlain, D.E., Reynolds, S.J., Harrison, T.J.E. & Bearhop, S.
481 (2008). Winter feeding of birds increases productivity in the subsequent breeding season.
482 *Biol. Lett.*, 4, 220–223.
- 483 Santini, L., González-Suárez, M., Russo, D., Gonzalez-Voyer, A., von Hardenberg, A. &
484 Ancillotto, L. (2019). One strategy does not fit all: determinants of urban adaptation in
485 mammals. *Ecol. Lett.*
- 486 Schmidt, C., Domaratzki, M., Kinnunen, R.P., Bowman, J. & Garroway, C.J. (2020). Continent-
487 wide effects of urbanization on bird and mammal genetic diversity. *Proc. R. Soc. B Biol.*
488 *Sci.*, 287, 20192497.
- 489 Sepp, T., McGraw, K.J., Kaasik, A. & Giraudeau, M. (2018). A review of urban impacts on
490 avian life-history evolution: Does city living lead to slower pace of life? *Glob. Chang. Biol.*,
491 24, 1452–1469.
- 492 Seto, K.C., Fragkias, M., Güneralp, B. & Reilly, M.K. (2011). A meta-analysis of global urban
493 land expansion. *PLoS One*, 6.
- 494 Silva, C.P., Sepúlveda, R.D. & Barbosa, O. (2016). Nonrandom filtering effect on birds: Species
495 and guilds response to urbanization. *Ecol. Evol.*, 6.
- 496 Smith, R.M., Gaston, K.J., Warren, P.H. & Thompson, K. (2005). Urban domestic gardens (V):
497 Relationships between landcover composition, housing and landscape. *Landsc. Ecol.*, 20,
498 235–253.
- 499 Smith, R.M., Thompson, K., Hodgson, J.G., Warren, P.H. & Gaston, K.J. (2006). Urban
500 domestic gardens (IX): Composition and richness of the vascular plant flora, and
501 implications for native biodiversity. *Biol. Conserv.*, 129, 312–322.

- 502 Sol, D., Maspons, J., Vall-llosera, M., Bartomeus, I., García-Peña, G.E., Piñol, J. et al. (2012).
503 Unraveling the life history of successful invaders. *Science* (80-.), 337, 580–583.
- 504 Somveille, M., Rodrigues, A.S.L. & Manica, A. (2015). Why do birds migrate? A
505 macroecological perspective. *Glob. Ecol. Biogeogr.*, 24, 664–674.
- 506 Strimas-Mackey, M., Miller, E., Hochachka, W. (2018). *auk: eBird Data Extraction and*
507 *Processing with AWK. R package version 0.3.3.*
- 508 Strohbach, M.W., Döring, A.O., Möck, M., Sedrez, M., Mumm, O., Schneider, A.K. et al.
509 (2019). The “hidden urbanization”: Trends of impervious surface in low-density housing
510 developments and resulting impacts on the water balance. *Front. Environ. Sci.*, 7, 29.
- 511 Szulkin M., Garroway C.J., Corsini M., Kotarba A.Z., Dominoni D (2020) How to quantify
512 urbanisation when testing for urban evolution? In: Urban Evolutionary Biology. Edited by
513 Marta Szulkin, Jason Munshi-South and Anne Charmantier: Oxford University Press. Pgs
514 13-35
- 515 Sullivan, B.L., Wood, C.L., Iliff, M.J., Bonney, R.E., Fink, D. & Kelling, S. (2009). eBird: A
516 citizen-based bird observation network in the biological sciences. *Biol. Conserv.*, 142,
517 2282–2292.
- 518 Sun, Y., Li, M., Song, G., Lei, F., Li, D. & Wu, Y. (2017). The role of climate factors in
519 geographic variation in body mass and wing length in a passerine bird. *Avian Res.*, 8, 1.
- 520 Talarchek, G.M. (1990). The urban forest of New Orleans: An exploratory analysis of
521 relationships. *Urban Geogr.*, 11, 65–86.
- 522 Thompson, K., Austin, K.C., Smith, R.M., Warren, P.H., Angold, P.G. & Gaston, K.J. (2003).
523 Urban domestic gardens (I): Putting small-scale plant diversity in context. *J. Veg. Sci.*, 14,
524 71–78.
- 525 Tryjanowski, P., Skórka, P., Sparks, T.H., Biaduń, W., Brauze, T., Hetmański, T. et al. (2015).
526 Urban and rural habitats differ in number and type of bird feeders and in bird species
527 consuming supplementary food. *Environ. Sci. Pollut. Res.*, 22, 15097–15103.
- 528 U.S. Census Bureau. (2010a). TIGER/Line Shapefiles: Urban Areas. Available from
529 <https://www.census.gov/geo/maps-data/data/tiger-line.html>.
- 530 U.S. Census Bureau. (2010b). 2010 Census. Available from
531 <https://factfinder.census.gov/faces/tableservices/jsf/pages/productview.xhtml?src=bkmk>.
- 532 U.S. Fish & Wildlife Service. (2016). *National Survey of Fishing, Hunting, & Wildlife-*
533 *Associated Recreation (FHWAR)*. Arlington, VA.
- 534 Vellend, M. (2016). *The theory of ecological communities*. Princeton University Press, Princeton
535 and Oxford.
- 536 Wood, C., Sullivan, B., Iliff, M., Fink, D. & Kelling, S. (2011). eBird: Engaging birders in
537 science and conservation. *PLoS Biol.*, 9.
- 538

Tables and Figures

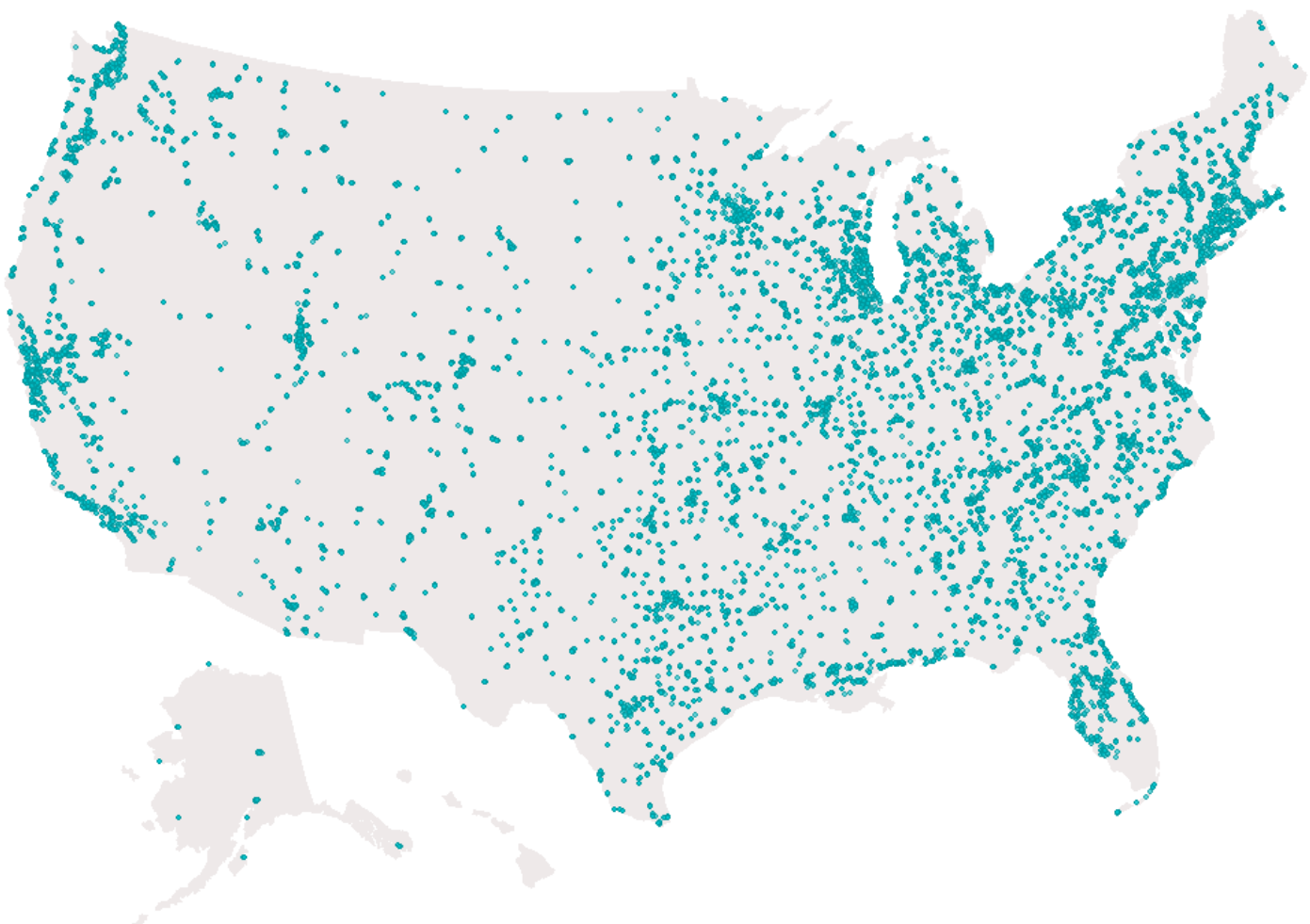


Figure 1

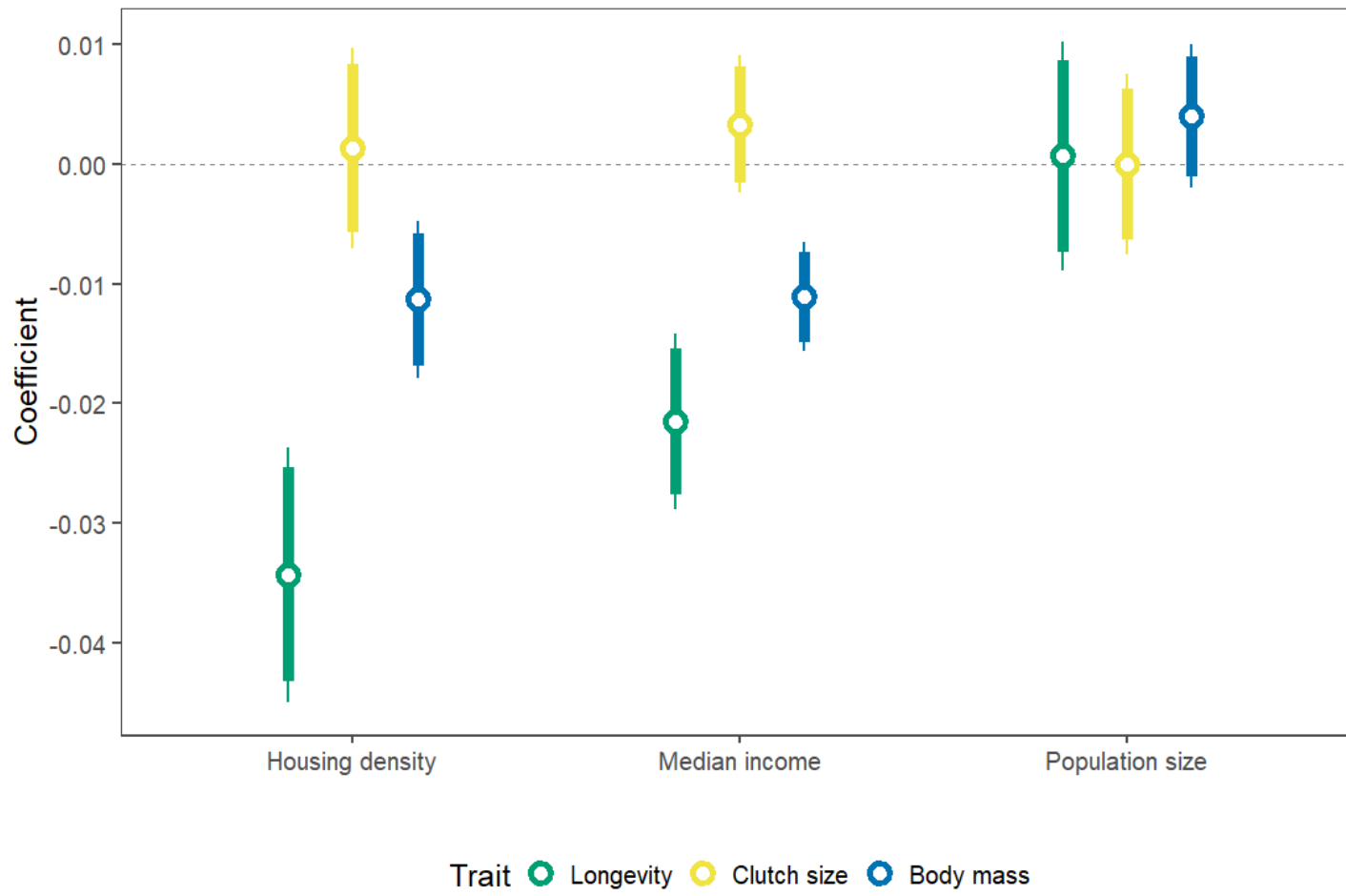


Figure 2



Figure 3

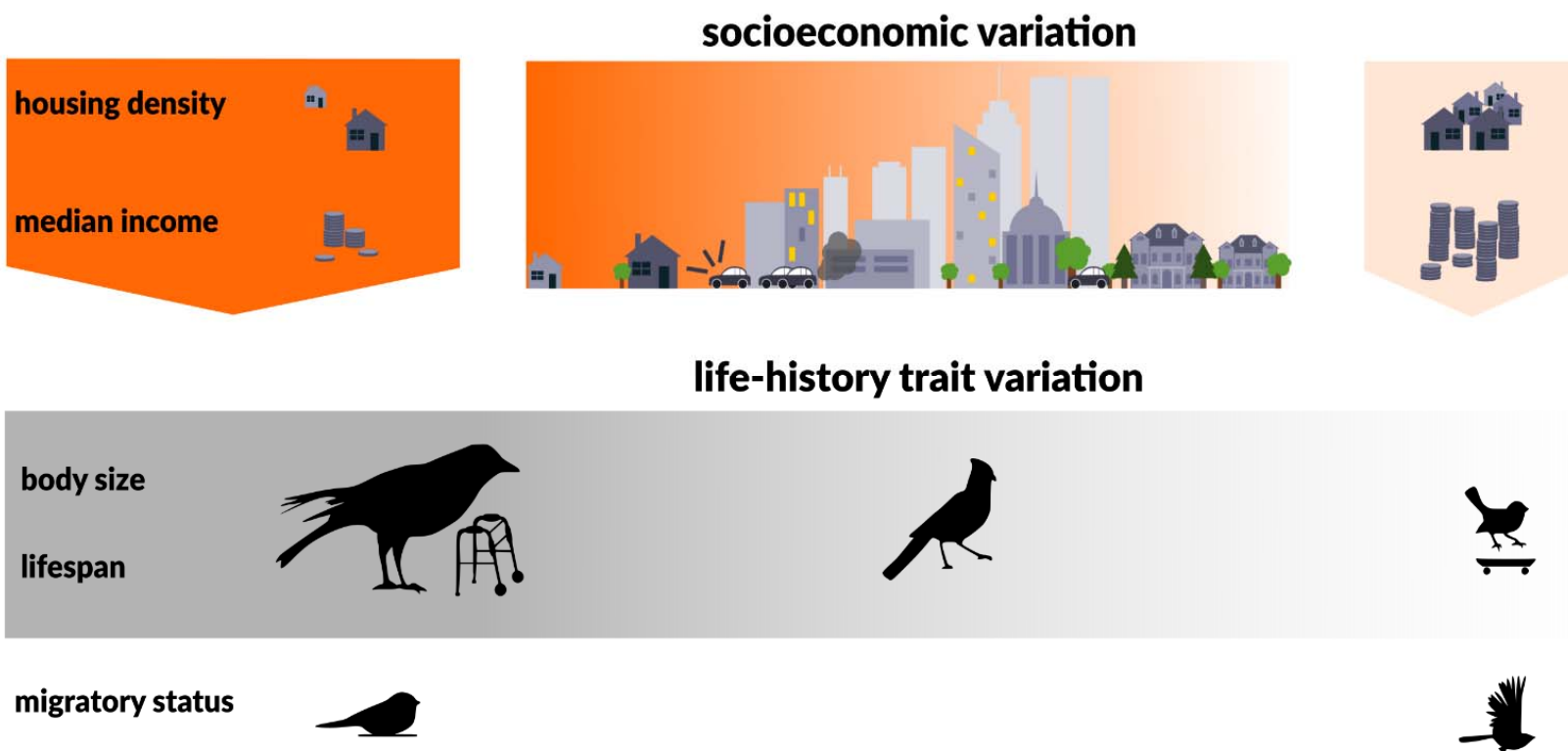


Figure 4

Table 1.

<i>Predictors</i>	Longevity		Clutch size		Body mass	
	<i>Estimates</i>	<i>95% CI</i>	<i>Estimates</i>	<i>95% CI</i>	<i>Estimates</i>	<i>95% CI</i>
Intercept	-0.334	-0.672 – 0.005	0.344	-0.119 – 0.807	3.170	2.869 – 3.471
Housing density	-0.034	-0.045 – -0.024	0.001	-0.007 – 0.010	-0.011	-0.018 – -0.005
Median income	-0.022	-0.029 – -0.014	0.003	-0.002 – 0.009	-0.011	-0.016 – -0.007
Population size	0.001	-0.009 – 0.010	0.000	-0.008 – 0.008	0.004	-0.002 – 0.010
Random Effects						
σ^2	0.50		0.31		0.20	
τ_{00}	0.01 _{State}		0.00 _{State}		0.00 _{State}	
	0.75 _{family}		1.44 _{family}		0.60 _{family}	
N	26 _{family}		26 _{family}		26 _{family}	
	49 _{State}		49 _{State}		49 _{State}	

Table 2.

<i>Predictors</i>	Migratory status		Tree nesting		Ground nesting		Cavity nesting	
	<i>Odds Ratios</i>	<i>95 % CI</i>	<i>Odds Ratios</i>	<i>95% CI</i>	<i>Odds Ratios</i>	<i>95% CI</i>	<i>Odds Ratios</i>	<i>95% CI</i>
Intercept	1.551	0.053 – 45.176	0.000	0.000 – 0.018	0.046	0.002 – 1.317	0.000	0.000 – 0.000
Housing density	1.141	1.087 – 1.198	1.035	0.993 – 1.079	1.002	0.959 – 1.046	0.918	0.864 – 0.975
Median income	1.098	1.064 – 1.133	0.997	0.968 – 1.026	1.015	0.983 – 1.048	0.973	0.935 – 1.014
Population size	1.026	0.975 – 1.079	0.977	0.940 – 1.015	1.011	0.970 – 1.054	1.015	0.957 – 1.075
Random Effects								
σ^2	0.65		0.68		0.57		0.40	
τ_{00}	0.21 State		0.01 State		0.01 State		0.06 State	
	92.60 family		161.40 family		84.77 family		508.98 family	
N	26 family		26 family		26 family		26 family	
	49 State		49 State		49 State		49 State	

Figure 1. Map of 44,670 bird observations of 160 Passerine species in 1,908 urban areas across the United States. Circles represent the longitude and latitude coordinates of bird observations.

Figure 2. Linear mixed-effects model coefficients for urban predictors of passerine life-history traits in the United States. Open circles represent coefficient estimates, bold whiskers are 90% confidence intervals, and narrow whiskers are 95% confidence intervals. Body mass was \log_{10} -transformed. Sample size is the same for all variables ($n = 44,670$).

Figure 3. Generalized linear mixed-effects model coefficients for the predictors of passerine migratory status and nesting preferences in the United States. Open circles are coefficient estimates, bold whiskers are 90% confidence intervals, and narrow whiskers are 95% confidence intervals. Species are classed as migratory = 1 or resident = 0; tree nesting, ground nesting and cavity nesting = 1 or other places = 0. An odds ratio greater than one indicates that the chance of finding a migrant bird or a species with a certain nesting preference in the area is higher than a chance of finding a resident or a bird with any other nesting preference, and vice versa. The sample size is the same for all the variables ($n = 44,670$).

Figure 4. Our results suggest that from a bird's eye view cities are heterogeneous habitats supporting different life-history strategies that depend on the socioeconomic variation across cities. As a city's housing density and median income increased it supported species with smaller body sizes and shorter lifespans, and more migratory species. This suggests that differential survival and reproduction at the species-level can quickly generate geographical patterns of

species trait variation across urban environments similar to those found in natural settings without the need for evolutionary change.

Table 1. Model summaries and the number of observations for the urban predictors of passerine life-history traits and the predictors of passerine migratory status in the United States. One model was fit to data per response variable, including all the urban characteristics: housing density, median income, and human population size. Body mass was log₁₀-transformed. The coefficient of variation is an indicator of model fit. Random effects were specified as (1 | family) and (1 | state), where each level of the grouping factors, family and state, had their own random intercept. The symbol σ^2 is the residual variance; τ_{00} is the variance among the random effects; and N the total number of groups. Number of observations is the same for all the variables (n = 44,670).

Table 2. Model summaries for urban predictors of passerine migratory status and nesting preferences in the United States. One model was fit to data per response variable, including all the urban characteristics. The coefficient of variation is an indicator of model fit. Species are classed as migratory = 1 or resident = 0; tree nesting, ground nesting and cavity nesting = 1 or other places = 0. An odds ratio greater than one indicates that the chance of finding a migrant or a bird with a specific nesting preference is higher than the chance of finding a resident or a species with any other nesting preference. Random effects were specified as in Table 1. The symbol σ^2 is the residual variance; τ_{00} is the variance among the random effects; and N the total number of groups. Number of observations is the same for all the variables (n = 44,670).