Bees need larger brains to thrive in urban environments

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Abstract

The rapid conversion of natural habitats to anthropogenic landscapes is threatening insect pollinators worldwide, raising concern on the consequences for their fundamental role as plant pollinators. However, not all pollinators are negatively affected by habitat conversion, as certain species find in anthropogenic landscapes appropriate resources to persist and proliferate. The reason why some species thrive in anthropogenic environments while most 21 find them inhospitable remains poorly understood. The cognitive buffer hypothesis, widely supported in vertebrates but untested in insects, offers a potential explanation. This theory 23 suggests that species with larger brains have enhanced behavioural plasticity, enabling them to confront and adapt to novel challenges. To investigate this hypothesis in insects, we 25 measured brains for 335 individuals from 89 bee species, and evaluated the species-level association between brain size and habitat preferences. Our analyses revealed that bee species 27 that prefer urban habitats had larger brains relative to their body size than those who prefer forested or agricultural habitats. Additionally, urban bees exhibited larger body sizes and, consequently, larger absolute brain sizes. Our results provide the first empirical support for the cognitive buffer hypothesis in invertebrates, suggesting that a large brain in bees could 31 confer behavioural advantages to tolerate urban environments.

33 Keywords: relative brain size, habitat preference, Apoidea, urbanisation, pollinators

1. Introduction

Pollinators deliver a fundamental ecosystem service on which the earth's vegetation and human economy depend [1]. Regrettably, there is increasing evidence of recent declines in pollinator populations [2–4]. One of the main contributing factors to the current pollinator declines is the alteration and loss of their habitat due to human activity [5,6]. Anthropogenic landscapes present new challenges for the survival and reproduction of organisms, increasing their risk of extinction by maladaptation [7,8,9]. Yet, not all pollinator species are negatively affected by land use change. For instance, some bee species are able to tolerate human-altered environments [10–12] or even to thrive [e.g., Bombus terrestris; 13,14].

Human-dominated habitats —notably cities— drastically modify the original conditions where pollinators evolved, but can also offer unique ecological opportunities in the form of new nesting spots, shelter from phytosanitary products, reduced predation pressure and high food availability associated with non-indigenous plants [7,12,15]. The question is then why only some species are able to tolerate and exploit urban environments. The "cognitive buffer hypothesis" provides an explanation for this conundrum, suggesting that in novel environments the chances to successfully survive and reproduce depends on cognition [16], that is, the processes involved in gathering, storing and reacting to environmental information [17]. While the "cognitive buffer hypothesis" receives ample support from studies of vertebrates [18–21], similar evidence is lacking for insects.

Insects have been long associated with the most basic types of learning due to their miniature brain [22,23]. However, numerous recent studies have shown that bees and other insects have sophisticated cognition that goes beyond simple associative learning or conditioning [24–26]. Some of these more complex forms of cognition involve the use of simple tools, attention, social learning or metacognitive processes [22,23]. In addition, there is also evidence for substantial variation across species in brain size—both in absolute terms and relative to body size—with species that have larger brains also exhibiting enhanced cognitive performance, at least for some tasks such as conditional learning [27]. Therefore, we can ask whether the varying success of insects in human-altered habitats might be explained by variation in brain size.

Here, we report the first test of the "cognitive-buffer hypothesis" in insects. Our test is based on a unique database of brain measures for 89 European and North American bee species. By means of detailed georeferenced information of species occurrences (GBIF; http://www.gbif.org/), we characterise habitat preferences for all the species, and use a phylogenetically-informed comparative analysis to assess whether bees that proliferate in human-altered habitats have enlarged brains compared to those that avoid them.

⁵⁹ 2. Methods

(a) Brain measurements

Our dataset contains measurements of brain and body size for bee specimens captured on flowers by hand netting in different areas of the East Coast of the United States and Europe (Spain and the Netherlands). These specimens were collected opportunistically mostly in semi-natural habitats. The dataset includes information of 335 female individuals from 89 species that represent 6 families and 31 genera. We only considered female specimens because: (i) they are involved in a greater diversity of tasks than males, and hence are expected to experience greater environmental pressures; and (ii), have brains that are structurally and functionally different from those of males [28,29]. Brain size was measured as the weight of fixed brains [30] and body size as intertegular span [[31]; see supplementary text S1]. Given that brain size scales allometrically with body size [30], we considered for our analysis the size of the brain relative to the body.

Following [30], we estimated relative brain size as the residuals of a log-log phylogenetic linear model of brain mass against body size, using the Bayesian approximation implemented in the function brm from the package brms version 2.18 [32]. The phylogeny was built with the help of a previously published genus-level phylogeny and it was processed with the help of the packages ape 5.6-2 [33], phytools 1.2-0 [34] and MCMCglmm version 2.33 [35]. High values of relative brain size indicate larger brains than expected for their body size and low values denote smaller brains than expected. Our bee dataset showed a strong allometric relationship between brain and body size (Bayesian $R^2 = 0.9$) that was constrained by the evolutionary history of the species (phylogenetic signal of relative brain size, $\lambda = 0.6$; P < 0.01). However, we found considerable variability in relative brain size within and across the different taxonomic groups (i.e., genera and subfamily level; Figure S1; Figure 1A).

₉₃ (b) Diet specialisation

To ensure diet is not acting as a confounding factor we investigated how diet specialisation is associated with both habitat preference and brain size. For this, we used the diet information 95 collected in [30] and complemented the missing information by using the same online resources used in [30]. Bee species were classified as oligolectic when they use a single plant family to 97 feed their broad or polylectic when they use several. We tested for statistical differences in 98 diet specialization per habitat type preference and brain size (i.e., both absolute and relative 99 brain size) by using the Wilcoxon test. We found a low number of specialist species in our 100 dataset with no clear associations with habitat preference or brain size that can explain the 101 relationship between habitat preference and brain size (see details in Figure S2). 102

(c) Habitat preferences

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We downloaded occurrence information for all the measured species from the Global Biodiversity Information Facility (GBIF; http://www.gbif.org/) for North America and Europe.
The data was downloaded through R programming language with the help of the function occ_download from the package rgbif version 3.7.3 [36]. We selected the states or countries

with the highest density of records for our set of species. For North America, we selected states located on the East Coast of the United States (Figure S3A), covering an approximate 109 area of 136,937 km². For Europe, we selected countries located on the north and centre 110 of the continent (Figure S3B), representing a total area of 600,497 km². To further reduce biases in the data, we only included species with a minimum number of 50 records and whose 112 geographic distribution was larger than the sampled area (i.e., excluding species at the edge 113 of their distributions). In addition, we optimised the match between species occurrence and 114 the land cover data by only using georeferenced records obtained between 1990 and 2022 115 with a minimum of two decimals of latitude/longitude coordinates. 116

We assigned a habitat type to each GBIF occurrence by merging land cover information with the georeferenced records of species occurrences. The land cover classification was obtained 118 from the 2006 online inventories of the National Land Cover Database (NLCD) for the United 119 States and the Corine Land Cover (CLC) for Europe. After downloading these inventories as 120 raster files, we used the functions rast and extract from the Terra package version 1.6-41 [37] 121 to read and obtain the cover classification of the different georeferenced records, respectively. 122 To simplify the interpretation and conduct a joint analysis for both regions, we divided the 123 resulting cover classes into three single categories: (i) natural, (ii) agricultural and (iii) urban 124 (see Tables S1 and S2 for details). With this information we can build an occurrence matrix 125 with species in rows, habitats in columns, and cells depicting the number of occurrences per 126 species-habitat combination. 127

Habitat preferences were estimated by assessing whether the occurrences of species in a given habitat were more frequent than expected by chance. For this, we generated 10,000 randomised matrices based on the occurrence matrix with the function nullmodel from the package bipartite version 2.16 [38]. We used the method 'r2dtable', which maintains row and column sums constant by using Patefield's algorithm [39]. This maintains the proportional dominance of the species and habitats constant but reshuffles their associations. We then estimated the percentage of simulated occurrences per species and habitat that were under the observed ones (i.e., percentile). Lastly, we considered that a bee species exhibited a "high preference" for any of the three studied habitats when the number of occurrences observed in this habitat exceeded the 80th percentile of the values obtained from the simulations. On the contrary, the species was considered to exhibit "low preference or avoidance" for the habitat when the observed occurrences were below the 20th percentile. To better understand if our findings are affected by the evolutionary histories of the species, we estimated the phylogenetic signal of relative brain size and habitat preference across habitats for our set of species with the help of the function phylosia from the phytools package.

(d) Analysis

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Our macro-ecological approach is justified by: (i) independent data that ensures that any ecological patterns, if present, are likely to be robust and generalizable; (ii) low intraspecific 145 variation of brain and body size in comparison to the interspecific variation (See supplementary text S2 and Figure S4) that provides biological meaning of averaging relative brain sizes per 147 species and the study of the ecological patterns across them.

To evaluate how the association between habitat preference and relative brain size per species changed by habitat type, we used a Bayessian approach to model their association. For this, 150 we first joined the resulting habitat preferences per species with their respective average 151 relative brain sizes. The resulting distribution of habitat preferences for each of the habitats 152 analysed followed a zero-one inflated beta distribution (Figure S5), indicating that there were 153 high frequencies of habitat preferences close to 0 or 1 but low frequencies of intermediate 154 values between 0 and 1. Hence, in our analyses we take a conservative approach and only 155 modelled the extremes of the distribution (i.e., species classified as avoiding or preferring a 156 given habitat). Because we assessed habitat preference as binary ("avoiding" or "preferring"), 157 we specified a Bernouilli distribution where habitat preference was the response variable and 158 relative brain size the predictor. Again, we included the phylogenetic covariance matrix as a 159 random factor. Moreover, we also explored how habitat preference changed by average brain 160 weight and intertegular span independently. For this, we conducted two analogous models 161 with these two different predictors. In addition, we also investigated the different trends for 162 the United States and Europe separately. 163

All our models were run with 4,000 iterations with previous 1,000 warm up iterations, using non-informative or weakly informative priors [32]. Further, the different posterior predictive checks were conducted with the function pp_check , also from the brms package. All our analyses were undertaken in R version 4.0.5 [40], and all data processing and graphics were done with the set of packages from the tidyverse version 1.3.0 [41].

3. Results

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Habitat preference varied substantially across species (Figure 1B) and showed moderate phylogenetic signal (i.e., preference for natural habitat; $\lambda = 0.38$; P = 0.02). In general, most bee species preferred one or two habitat types but more rarely occurred indistinctly in the three habitats (Figure 1B). The most preferred habitats were the agricultural and natural ones with 49 and 48 species over 80% of the values from null models, respectively (Figure 1B and Figure S5). In contrast, most species avoided urban habitats (56 species under the 20th percentile) and just 28 species showed high preference for this habitat type (Figure 1B and Figure S5).

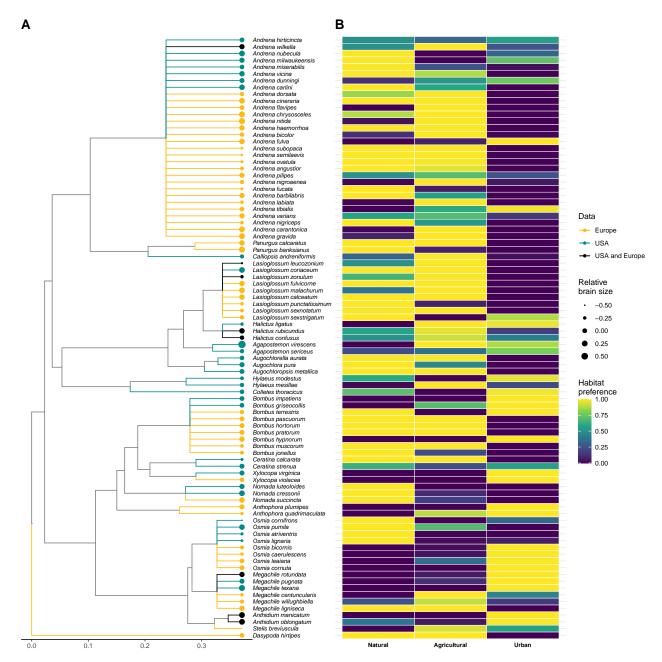


Figure 1. Phylogenetic relationship and habitat preferences for the selected bee species with brain weight and intertegular distance information (N=89). A) Phylogenetic tree at the genus level. Tree branches are coloured based on the geographical location of the different bee species (North of Europe, East Coast of the United States or from both regions). The deviation of the brain size in relation to the body (i.e., residuals) is represented with filled circles of proportional area to the residuals at the end of the tip branches. Larger circles indicate larger brains in proportion to their body size and vice versa. B) Heatmap showing the habitat preference for each bee species. The columns delimit the habitat type (i.e., natural, agricultural and urban) and the rows the different bee species.

We found that bee species relative brain size is associated with the habitat type preference (Figure 2A; Bayesian $R^2 = 0.11$). Specifically, we found that bees with larger brains relative 179 to body size showed a higher preference for urban habitats than bees with smaller relative 180 brain sizes (Figure 2A). Contrarily, bee species with smaller relative brains showed higher 181 preference in natural and agricultural habitats than bees with larger relative brain sizes 182 (Figure 2A). The models of the association between absolute brain size and intertegular span 183 with habitat preference also showed a marked differences between habitat types (Figures 184 2B and 2C; Bayesian $R^2 = 0.25$; Bayesian $R^2 = 0.23$, respectively). Specifically, we found 185 that bees with larger brains and body sizes tend to appear more in urban habitats and 186 bees with smaller brains and body sizes are more common in natural and agricultural ones 187 (Figures 2B and 2C). These findings were consistent with the analogous analyses separated 188 by geographical regions (United States and Europe; Figure S6). 189

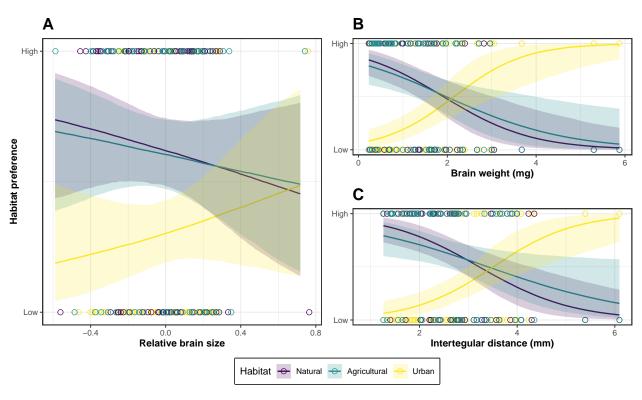


Figure 2. Association between relative brain size (A), brain weight (B) and intertegular distance (C) with habitat preference by habitat type (i.e., natural, agricultural and urban). The shaded and coloured areas by habitat type represent 95% credible intervals.

4. Discussion

Using data from two different continents and 89 bee species, we find that bee species with a preference for inhabiting urban habitats tended to have larger brains relative to their body while those with forest or agricultural preferences had relatively smaller brains. These results are in line with the cognitive buffer hypothesis [16], which predicts that a large relative brain should provide enhanced behavioural plasticity to persist and thrive in novel environments. In urban environments, individuals are frequently exposed to a variety of new challenges such as novel resources or human disturbances that can change fast in time and space [42]. In such scenarios, a large brain could confer the cognitive flexibility needed to efficiently exploit novel resources while avoiding risks. While the exact mechanisms are unclear, we expect cognitive flexibility to be essential in a variety of contexts such as the use of human-made materials for the nest [43] or the need to collect pollen and nectar from exotic flowers [44].

Also in line with the cognitive buffer hypothesis [45], we find that bees that proliferate in urban habitats have bigger bodies and larger absolute brains. Larger species require longer development times and obtain greater net benefits from exploring and learning, especially in heterogeneous environments [46,47]. For example, the large carpenter bees of the genus Xylocopa can live up to two years and are frequent urban dwellers, while small Andrena forest specialists complete their adult life cycle in a few weeks. The patchiness of urban resources also seems to favour larger body sizes, as suggests the observation that foraging distance is positively associated with body size in bees [31,48]. There are also shreds of evidence that associate increased tolerance to urbanisation with wider ecological niches [49–51], and both larger bodies and relative brains are thought to be features that can facilitate broader diets and niche expansion. Only a few bee specialists are analyzed in this paper, and further understanding how different life styles facilitate urban exploitation represent an important avenue of future research.

Overall, our findings support and expand previous evidence found in vertebrates that having a large brain size can allow survival in novel environments [52,53], highlighting that a cognitive buffer is possible even with tiny brains. The use of the entire brain size as a proxy for cognitive performance is not exempt from criticism [24,54]. Our analyses focused on brain size mainly for reasons of data availability. The use of brain size is justified by the existence of previous evidence that enlarged brains enhance some aspects of cognitive performance in bees, such as learning [27]. Moreover, brain size is less subject to measurement error or context-dependent biases in comparison with other experimental measures of cognition [24,54]. Although the use in the future of finer measures like neuropils size or mushroom bodies [the suspected centres of cognitive processes in bees; 55,56,57] is likely to help improve our understanding of bee cognitive abilities. Further, there are other alternative explanations beyond the cognitive buffer hypothesis for the enlargement of brains in urban environments. Here, we only investigated the role of diet specialisation as a potential confounding factor but other ecological and physiological factors cannot be discarded as potential drivers of this pattern. Downscaling our analysis to the individual specimen level where brain size, habitat use and cognitive performance can be tracked through their lifespan would be a challenging but promising next step. Overall, our findings highlight the importance of behavioural responses for understanding the dynamics of insect populations in altered environments and

233 stresses the need to avoid viewing them as passive agents of external pressures.

Data accessibility

All occurrence data used in this study can be downloaded from https://doi.org/10.15468 /dl.5s5kuf. In addition, bee trait data and code can be found in the online repositories of Zenodo https://doi.org/10.5281/zenodo.8049996 and Github https://github.com/ibartomeu s/declines_brain.git.

239 Authors' contributions

²⁴⁰ IB, MAC and JBL designed the study. MAC and FS collected the data. JBL led the analysis with help from MAC and IB. JBL and IB wrote the manuscript with contributions from all authors.

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249 Conflict of interest declaration

250 We declare we have no competing interests.

References

- Ollerton J. 2017 Pollinator diversity: Distribution, ecological function, and conservation.

 Annual review of ecology, evolution, and systematics 48, 353–376.
- Bartomeus I, Stavert J, Ward D, Aguado O. 2019 Historical collections as a tool for assessing the global pollination crisis. *Philosophical Transactions of the Royal Society B* 374, 20170389.
- Potts SG, Biesmeijer JC, Kremen C, Neumann P, Schweiger O, Kunin WE. 2010 Global pollinator declines: Trends, impacts and drivers. *Trends in ecology & evolution* **25**, 345–353.
- Scheper J, Reemer M, Kats R van, Ozinga WA, Linden GT van der, Schaminée JH, Siepel H, Kleijn D. 2014 Museum specimens reveal loss of pollen host plants as key factor driving wild bee decline in the netherlands. *Proceedings of the National Academy of Sciences* 111, 17552–17557.
- Harrison T, Winfree R. 2015 Urban drivers of plant-pollinator interactions. Functional Ecology 29, 879–888.
- Harrison T, Gibbs J, Winfree R. 2018 Forest bees are replaced in agricultural and urban landscapes by native species with different phenologies and life-history traits.

 Global Change Biology 24, 287–296.
- Winfree R, Bartomeus I, Cariveau DP, et al. 2011 Native pollinators in anthropogenic habitats. Annual Review of Ecology, Evolution and Systematics 42, 1–22.
- Brown MJ, Paxton RJ. 2009 The conservation of bees: A global perspective. *Apidologie* **40**, 410–416.
- Harrison T, Gibbs J, Winfree R. 2019 Anthropogenic landscapes support fewer rare bee species. *Landscape Ecology* **34**, 967–978.
- Biesmeijer JC *et al.* 2006 Parallel declines in pollinators and insect-pollinated plants in britain and the netherlands. *Science* **313**, 351–354.
- 272 11. Bartomeus I, Ascher JS, Gibbs J, Danforth BN, Wagner DL, Hedtke SM, Winfree R. 2013 Historical changes in northeastern US bee pollinators related to shared ecological traits. *Proceedings of the National Academy of Sciences* **110**, 4656–4660.
- ²⁷⁴ 12. Collado MÁ, Sol D, Bartomeus I. 2019 Bees use anthropogenic habitats despite strong natural habitat preferences. *Diversity and Distributions* **25**, 924–935.
- Rasmont P, Coppée A, Michez D, De Meulemeester T. 2008 An overview of the bombus terrestris (l. 1758) subspecies (hymenoptera: apidae). In *Annales de la société entomologique de france*, pp. 243–250. Taylor & Francis.
- Theodorou P et al. 2020 Urban areas as hotspots for bees and pollination but not a panacea for all insects. Nature communications 11, 576.
- ²⁸⁰ 15. Cane JH, Minckley RL, Kervin LJ, Roulston TH, Williams NM. 2006 Complex responses within a desert bee guild (hymenoptera: Apiformes) to urban habitat fragmentation. *Ecological applications* 16, 632–644.
- Sol D. 2009 Revisiting the cognitive buffer hypothesis for the evolution of large brains. Biology letters 5, 130–133.

284 17. Shettleworth SJ. 2009 Cognition, evolution, and behavior. Oxford university press.

285

299

- Sol D, Bacher S, Reader SM, Lefebvre L. 2008 Brain size predicts the success of mammal species introduced into novel environments. the american naturalist 172, S63–S71.
- Amiel JJ, Tingley R, Shine R. 2011 Smart moves: Effects of relative brain size on establishment success of invasive amphibians and reptiles. *PLoS One* **6**, e18277.
- 290 20. Sayol F, Maspons J, Lapiedra O, Iwaniuk AN, Székely T, Sol D. 2016 Environmental variation and the evolution of large brains in birds. *Nature Communications* 7, 13971.
- Howell KJ, Walsh MR. 2023 Transplant experiments demonstrate that larger brains are favoured in high-competition environments in trinidadian killifish. *Ecology Letters* **26**, 53–62.
- ²⁹⁴ 22. Giurfa M. 2015 Learning and cognition in insects. Wiley Interdisciplinary Reviews: Cognitive Science 6, 383–395.
- Perry CJ, Barron AB, Chittka L. 2017 The frontiers of insect cognition. Current Opinion in Behavioral Sciences 16, 111–118.
- ²⁹⁸ 24. Chittka L, Niven J. 2009 Are bigger brains better? Current biology 19, R995–R1008.
- Avargues-Weber A, Deisig N, Giurfa M. 2011 Visual cognition in social insects. *Annual review of entomology* **56**, 423–443.
- Sheehan MJ, Tibbetts EA. 2011 Specialized face learning is associated with individual recognition in paper wasps. *science* **334**, 1272–1275.
- ³⁰⁴ 27. Collado MÁ, Montaner CM, Molina FP, Sol D, Bartomeus I. 2021 Brain size predicts learning abilities in bees. *Royal Society open science* **8**, 201940.
- Streinzer M, Kelber C, Pfabigan S, Kleineidam CJ, Spaethe J. 2013 Sexual dimorphism in the olfactory system of a solitary and a eusocial bee species. *Journal of Comparative Neurology* **521**, 2742–2755.
- Roselino AC, Hrncir M, Cruz Landim C da, Giurfa M, Sandoz J-C. 2015 Sexual dimorphism and phenotypic plasticity in the antennal lobe of a stingless bee, melipona scutellaris. *Journal of Comparative Neurology* **523**, 1461–1473.
- Sayol F et al. 2020 Feeding specialization and longer generation time are associated with relatively larger brains in bees. Proceedings of the Royal Society B 287, 20200762.
- 31. Kendall LK *et al.* 2019 Pollinator size and its consequences: Robust estimates of body size in pollinating insects. *Ecology and Evolution* **9**, 1702–1714.
- 32. Bürkner P-C. 2017 Brms: An r package for bayesian multilevel models using stan.

 Journal of statistical software 80, 1–28.
- Paradis E, Blomberg S, Bolker B, Brown J, Claude J, Cuong HS, Desper R, Didier G. 2019 Package 'ape'. Analyses of phylogenetics and evolution 2, 47.
- Revell LJ. 2012 Phytools: An r package for phylogenetic comparative biology (and other things). *Methods in ecology and evolution*, 217–223.

- Hadfield JD. 2010 MCMC methods for multi-response generalized linear mixed models: The MCMCglmm r package. *Journal of statistical software* **33**, 1–22.
- Chamberlain S, Ram K, Barve V, Mcglinn D, Chamberlain MS. 2017 Package 'rgbif'.

 Interface to the Global Biodiversity Information Facility 'API 5, 0–9.
- 324 37. Hijmans RJ, Bivand R, Forner K, Ooms J, Pebesma E, Sumner MD. 2022 Package 'terra'.
- Dormann CF et al. 2008 Prediction uncertainty of environmental change effects on temperate european biodiversity. Ecology letters 11, 235–244.
- Patefield W. 1981 Algorithm AS 159: An efficient method of generating random r× c tables with given row and column totals. *Journal of the Royal Statistical Society*.

 Series C (Applied Statistics) 30, 91–97.
- R Core Team. 2021 R: A language and environment for statistical computing. Vienna, Austria: R Foundation for Statistical Computing. See https://www.R-project.org/.
- Wickham H et al. 2019 Welcome to the tidyverse. Journal of Open Source Software 4, 1686.
- Wheater CP. 2002 *Urban habitats*. Routledge.

335

- Allasino ML, Marrero HJ, Dorado J, Torretta JP. 2019 Scientific note: First global report of a bee nest built only with plastic. *Apidologie* **50**, 230–233.
- Lowenstein DM, Matteson KC, Minor ES. 2019 Evaluating the dependence of urban pollinators on ornamental, nonnative, and weedy floral resources. *Urban Ecosystems* **22**, 293–302.
- Ducatez S, Sol D, Sayol F, Lefebvre L. 2020 Behavioural plasticity is associated with reduced extinction risk in birds. *Nature Ecology & Evolution* 4, 788–793.
- Bateman PW, Fleming PA. 2012 Big city life: Carnivores in urban environments.

 Journal of Zoology 287, 1–23.
- Theodorou P, Baltz LM, Paxton RJ, Soro A. 2021 Urbanization is associated with shifts in bumblebee body size, with cascading effects on pollination. *Evolutionary Applications* **14**, 53–68.
- Greenleaf SS, Williams NM, Winfree R, Kremen C. 2007 Bee foraging ranges and their relationship to body size. *Oecologia* **153**, 589–596.
- Geslin B, Gauzens B, Thébault E, Dajoz I. 2013 Plant pollinator networks along a gradient of urbanisation. *PloS one* **8**, e63421.
- Buchholz S, Egerer MH. 2020 Functional ecology of wild bees in cities: Towards a better understanding of trait-urbanization relationships. *Biodiversity and Conservation* **29**, 2779–2801.
- Prendergast KS, Dixon KW, Bateman PW. 2022 A global review of determinants of native bee assemblages in urbanised landscapes. *Insect Conservation and Diversity* 15, 385–405.

- Santini L, González-Suárez M, Russo D, Gonzalez-Voyer A, Hardenberg A von, Ancillotto L. 2019 One strategy does not fit all: Determinants of urban adaptation in mammals. *Ecology Letters* **22**, 365–376.
- Sayol F, Sol D, Pigot AL. 2020 Brain size and life history interact to predict urban tolerance in birds. Frontiers in Ecology and Evolution 8, 58.
- Lihoreau M, Latty T, Chittka L. 2012 An exploration of the social brain hypothesis in insects. Frontiers in physiology 3, 442.
- Barth M, Heisenberg M. 1997 Vision affects mushroom bodies and central complex in drosophila melanogaster. *Learning & Memory* 4, 219–229.
- Withers G, Fahrbach S, Robinson G. 1995 Effects of experience and juvenile hormone on the organization of the mushroom bodies of honey bees. *Journal of neurobiology* **26**, 130–144.
- Fahrbach SE, Robinson GE. 1995 Behavioral development in the honey bee: Toward the study of learning under natural conditions. Learning & Memory 2, 199–224.