

**Lower bumblebee colony reproductive success in
agricultural compared to urban environments**

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Manuscripts

1 **Lower bumblebee colony reproductive success in agricultural**
2 **compared to urban environments**

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11

12 **Abstract**

13 Urbanisation represents a rapidly growing driver of land-use change. While it is clear that
14 urbanisation impacts species abundance and diversity, direct effects of urban land-use on animal
15 reproductive success are rarely documented. Here we show that urban land-use is linked to long-term
16 colony reproductive output in a key pollinator. We reared colonies from wild-caught bumblebee
17 (*Bombus terrestris*) queens, placed them at sites characterised by varying degrees of urbanisation
18 from inner city to rural farmland, and monitored the production of sexual offspring across the entire
19 colony cycle. Our land-use cluster analysis identified three site categories, and this categorization was
20 a strong predictor of colony performance. Crucially, colonies in the two clusters characterized by
21 urban development produced more sexual offspring than those in the cluster dominated by agricultural
22 land. These colonies also reached higher peak size, had more food stores, encountered fewer parasite
23 invasions and survived for longer. Our results show a link between urbanisation and bumblebee
24 colony reproductive success, supporting the theory that urban areas provide a refuge for pollinator
25 populations in an otherwise barren agricultural landscape.

26 **Keywords**

27 Urbanisation, *Bombus terrestris*, reproductive success, land-use, pollinator ecology, bee

28 **Background**

29 We are living in the “Urban Age” (1): over half the world’s human population currently resides in
30 cities (2) and an estimated three-fold increase in global urban land cover is predicted between 2000
31 and 2030 (3). Although urbanization has been shown to impact negatively upon species abundance
32 and diversity for many taxa (4), some groups successfully exploit anthropogenic habitats (5) and there
33 is evidence to place wild bees among this number. For example, areas subject to urban expansion
34 have lost fewer pollinator species than agricultural areas over the past 80 years (6) and species
35 richness has been found to be higher in urban than agricultural areas (7). These community level
36 studies give reason to view urban environments as a potential refuge within barren agricultural
37 landscapes, which have been associated with reduced floral resources (8) and exposure to
38 environmental contaminants (9). Yet, the crucial question of whether land-use directly affects fitness
39 – the ultimate driver of ecological success and evolutionary change – remains a largely neglected
40 missing link in the correlations between urbanisation and species abundance in both bees and other
41 taxa (10-12).

42 Bumblebees comprise an important part of the pollinator community, but are currently subject to a
43 multitude of threats that include changes in forage availability associated with land-use change (8)
44 and pressure from emerging parasites and disease (13). Alteration of floral resources is likely to be an

45 important driver of urban effects on bees (14), with cities and towns often offering high floral
46 abundance and diversity in the form of gardens and parks (15). However, many horticultural plant
47 varieties are unattractive to bees or invest energy in visual displays at the expense of reward provision
48 (16), and competition may also affect forage availability: increased popularity of urban beekeeping
49 has increased honeybee hive densities in urban areas (17), possibly increasing competitive interactions
50 with wild bees (18). Parasite prevalence has also been linked to urbanisation, with higher parasite
51 loads in urban areas reported in bumblebees (19, 20). Pesticide use has been identified as a threat to
52 bees (9) and exposure may vary across degrees of urbanisation (21). In the context of this array of
53 potentially interacting drivers of urban effects, it is not clear how inhabiting urban areas affects
54 bumblebee success at the colony level. This is because ethical concerns preclude the release of
55 reproductive offspring from commercially-obtained bumblebee colonies (24-26), meaning that
56 previous experiments have studied commercial colonies placed into the field only up to the very
57 beginning of the period when reproductive offspring begin to emerge. Thus, while there is evidence
58 that bumblebee colony early weight gain may be enhanced in suburban compared to agricultural areas
59 based on studies of pre-reproductive colonies (22) (but cf. ref. 26), to date no study has monitored the
60 critical, extensive reproductive period of the colony life-cycle and thus assessed the effects of
61 urbanisation on lifetime reproductive success itself.

62 Here, we addressed this gap by rearing colonies from wild-caught queens to investigate the effect of
63 urbanisation on life-history and reproductive output in the bumblebee *Bombus terrestris audax*. Using
64 locally sourced queens allows ecologically relevant quantification of the impact of land-use on
65 locally-adapted populations, rather than commercial bees that have been subject to artificial selection
66 (27) and may differ from locally-adapted natural populations (26). It also overcomes concerns
67 associated with the use of commercial bees, including negative environmental impacts such as
68 hybridisation (24), pathogen spillover (25) and competition (26). A crucial outcome is that colonies
69 can be monitored for their entire reproductive lifetime. We selected 38 sites across central London, its
70 suburbs and the surrounding agricultural land (Fig. 1a), and categorized each site based on land-use
71 through cluster analysis of principle components derived from 80 land-use variables. Through
72 frequent censusing and sampling of colonies placed at these sites, we tracked for the first time the
73 growth, reproductive output, nutritional status, and parasite prevalence of each colony from eclosion
74 of the first cohort of workers until the end of the colony life cycle. To our knowledge, this represents
75 the first experimental study in any taxon to demonstrate a direct relationship between urbanisation and
76 reproductive success, with previous research typically employing an observational approach (e.g. 11,
77 28).

78 **Methods**

79 **Bumblebee colonies**

80 We collected 176 foraging *Bombus terrestris audax* queens in Windsor Great Park, Surrey, UK during
81 March and April 2016. Queens were chilled and transported to the lab where they were immediately
82 screened microscopically for the endoparasites *Nosema* spp., *Apicystis bombi*, *Sphaerularia bombi*
83 and *Crithidia bombi*, by collecting faeces in a microcapillary (Baubrand Intramark, Wertheim,
84 Germany) and examining the sample under x400 magnification. Parasitised queens (n=6) were
85 excluded from the experiment. Queens were kept in clear acrylic rearing boxes until colony founding
86 (see Supplementary Methods for rearing protocol), after which they were re-screened and transferred
87 to a wooden nest box (W 280 x L 320 x D 160mm) with a clear Perspex lid. Our final sample for
88 placement in the field consisted of 43 colonies.

89 **Field placement**

90 We recruited 114 gardens and farms in South-East England (between central London and
91 Basingstoke), of which 38 sites were selected across a region spanning inner city to countryside on the
92 basis of distribution (> 1.5km apart), land-use type representativeness and accessibility (Fig. 1a). This
93 includes a range of urban and rural land-use types typical of Western Europe (29), from Central
94 Business District, to suburban, to villages and medium-intensity agriculture containing a mixture of
95 grassland and arable fields. Predominant crop types in the agricultural areas were cereals and brassica
96 crops. The wide range of urban land types contained within London means that it is representative of a
97 range of different urban types displayed by smaller cities (30). We placed colonies in the field in
98 protective plastic field boxes during the first week of May 2016, randomised to land-use type
99 according to initial colony size (see Supplementary Methods). Colony placement was staggered over
100 six days, with six or seven sites visited each day during daylight hours (8:00-20:00). Colony
101 monitoring continued until moribundity (see below), which occurred for the last colony on 11th July.

102 **Data collection**

103 Site visits followed approximately the same order as the colony placement, with each site visited
104 weekly during the hours of darkness (21:30-4:30) at the same time each week. We recorded the
105 following data (see Supplementary Methods for additional data): number of bees (average of three
106 counts); queen status (alive, dead or absent); presence of nectar and pollen stores and presence and
107 status of *Bombus vestalis* brood parasites (alive, injured or dead), which we removed to minimise *B.*
108 *terrestris* queen death. To assess reproductive success, gynes were removed until one minute had
109 passed with no gyne seen, and stored for later analysis. The same procedure was repeated for males,
110 with sampling time capped at 15 minutes. Males are considered to leave the nest at two to four days
111 old and gynes at two to eight days old (31) so our weekly removal of males and gynes reflects natural
112 conditions and is unlikely to have impacted the colony's production of future males and gynes.
113 Weekly removal of reproductives allows calculation of total reproductive output over the colony life
114 cycle rather than a snapshot as obtained from traditional colony dissection methods that are carried

115 out at the earliest sign of reproductive emergence (22). We removed one, three or five workers for
116 later parasite analysis depending on colony size (<35, 35-50, >50 workers respectively), which were
117 stored alive in vials for a maximum of 5 hours before freezing at -20°C.

118 For the first two weeks, colonies in which the queen died (n=5 of 43; 1 city, 1 village, 3 agricultural)
119 were replaced with new colonies. Following this, colonies were removed from the field when
120 moribund, defined as <10 workers remaining and queen death or <3 workers remaining with no queen
121 death. Remaining workers were frozen at -20°C and dissected (see below). We obtained daily data
122 for average temperature, average humidity and total rainfall for each site by downloading data from
123 the weather station nearest each site that had data for the full study period (www.wunderground.com).

124 **Sample analysis**

125 Up to three workers per colony per week were dissected. For each bee, the abdomen was placed in
126 Ringer's solution and examined for the presence of conopid fly and braconid wasp larvae and the
127 larger tracheae for the tracheal mite *Locustacarus buchneri*. Sections of the Malpighian tubules,
128 hindgut and fat body were removed, crushed and examined under x400 magnification for the presence
129 of the endoparasites *Crithidia bombi*, *Nosema* spp. and *Apicystis bombi*. Each slide was examined by
130 two researchers. In addition, the ovary development of all collected workers (n=393) and the body fat
131 content of all workers, gynes (n=46), and a random sample of max. 20 males per colony to limit
132 workload (total n=418) were assessed (see Supplementary Methods).

133 **Land-use classification**

134 Following best practice in the field (32, 33) we classified land-use at multiple radii surrounding each
135 site using GIS analysis, based on satellite imagery with additional ground-truthing for agricultural
136 sites. Agricultural sites were surveyed because mass crop blooms may not be detected by satellite
137 images taken outside the bloom period. The land-use classification protocol is described in full in (37)
138 and is available as Supplementary Methods. Briefly, buffers at radii of 750m (*B. terrestris* typical
139 foraging range (34-36)), 500m, 250m and 100m (representing steps of spatial scales at which bees
140 may interact with the surrounding land (12, 37)) were generated around each site. Preliminary
141 analysis showed that the majority of the response variables responded most strongly to land-use at a
142 500m radius so this was selected as our primary land-use variable. Land-use patches were defined by
143 drawing polygons in QGIS v2.16 and categorised visually to one of 80 land-use classes (Table S14)
144 from satellite imagery and ground surveys carried out in May 2016.

145 We refined the classification to produce a single categorical land-use variable via an established three-
146 step process (32): 1) definition of land-use categories, 2) Principle Components Analysis (PCA) on
147 the categories and 3) cluster analysis based on the PCA output (Fig. S2). Briefly, each land-use class
148 was coded to one of eight categories (e.g. impervious surface, flower-rich habitat; Table S14) and the

149 total area of each category within each site calculated. A PCA was then performed to reduce the
150 dimensionality of the land-use variables, and cluster analysis (Ward's method) was performed on the
151 first two principle components, which in combination captured approximately 85% of the variation
152 (see below for loadings). Following (32, 33, 38), each cluster contained a minimum of five sites.
153 Three clear clusters emerged (Fig. S3a), comprising a group characterised by dense urban
154 development (henceforth named "city"; n=17), a group characterised by patches of housing
155 surrounded by rural land ("village"; n=16) and a group dominated by agricultural fields
156 ("agricultural"; n=5; Fig. 1b). Exploration of model fit confirmed that use of the clustered land-use
157 categories to predict our main response variables explained more of the variance in our data than use
158 of the PCs alone (Fig S3b), and comparison of models containing combinations of the PCs with those
159 containing the clustered variable showed that for all response variables the clustered variable
160 improved model fit (see Supplementary Methods and Table S11 for AIC values), justifying the
161 necessity of the clustering step. Sites in the city cluster contained mean 56.2% (\pm SE: 4.0%)
162 impervious surface and 0.1 (\pm 0.1)% agricultural land cover while village and agricultural sites
163 contained 13.8 (\pm 3.7)% and 8.6 (\pm 4.5)% impervious surface and 34.6 (\pm 7.1)% and 71.2 (\pm 11.5)%
164 agricultural land cover respectively.

165 **Statistical analysis**

166 For each analysis, we built a comparison set of models including the full model (for predictors, see
167 below) and all subsets, including the basic model containing only the constant and residual variance
168 ("all-subset approach"). We selected the model or set of models with the lowest AICc as the best
169 fitting model(s) (39). Where several models were within two AICc units of the best model, model
170 averaging was carried out to obtain parameter estimates derived from the best set of models including
171 the basic model if applicable (40). Final models were examined for spatial autocorrelation by using a
172 Moran's I test on the residuals and graphically assessing the spatial pattern of residuals.

173 To analyse peak colony size linear regression was carried out on log-transformed data. Total
174 production of sexuals (gynes and males) was analysed using zero-altered negative binomial hurdle
175 models, where the response is modelled as a binary process (production of sexuals) and a zero-
176 truncated count process (total sexuals in colonies that produced sexuals) (41). Binomial GAMs
177 (allowing for a non-linear effect of week) with site as a random effect were used to analyse presence
178 of nectar and pollen and ovary development. Queen survival, colony survival and onset of
179 reproduction were subjected to survival analyses using non-parametric Cox proportional hazards
180 models. Proportion of worker samples in each colony containing *Apicystis* and *Crithidia* were
181 analysed using binomial GLMs. Male and worker fat content were analysed using Gaussian GAMs
182 allowing for a non-linear effect of week with site as a random effect. *Bombus vestalis* invasion as a
183 binary response was modelled using binomial GLMs. One factor level (city) for this variable had

184 perfect separation (only zeroes); to deal with this three dummy observations were added for each
185 land-use category with *B. vestalis* invasion set to one and weather variables set to whole-dataset
186 means.

187 To investigate whether our results may have been driven by floral resource availability, we re-
188 analysed the response variables that were found to be significantly affected by land-use (reproductive
189 output, peak colony size, colony survival, queen survival, presence of nectar stores and presence of
190 pollen stores) using proportion of flower-rich habitat as a predictor. We coded each land-use class as
191 described above as flower-rich or flower-poor, based on reference to the literature (e.g. domestic
192 gardens have been shown to support high floral diversity (15) and provide considerable resources to
193 bees (42)) and on ground surveys in agricultural land to identify crop types and wildflower strips, and
194 summed the area of flower-rich land-use patches to generate the proportion of flower-rich habitat at a
195 500m radius for each site. Each response variable was analysed using this predictor as described in the
196 paragraph above. All analyses were conducted in R version 3.2.1 (43); for packages see
197 Supplementary Methods.

198 **Results**

199 Land-use category strongly predicted the number of live sexual offspring (gynes and males) produced
200 over the colony life cycle (Fig. 2a, Table S1a). Village colonies were significantly more likely to
201 produce sexual offspring than agricultural colonies (model averaged estimate (MAE): 2.853, 95%
202 CIs: [0.327 – 5.378], Table S2a), and both city (MAE: 2.789 [0.799 – 4.778]) and village (MAE:
203 2.566 [0.579 – 4.552]) colonies produced significantly higher numbers of sexuals than their
204 agricultural counterparts. Our data suggest that this effect may reflect both the build-up of a larger
205 workforce and, relatedly, longer queen lifespans in village and city colonies. Both village and city
206 colonies displayed significantly higher peak size (number of bees) than agricultural colonies (Table
207 S1b, Fig. 2b; City MAE: 0.918 [0.194 – 1.641], village MAE: 1.047 [0.319 – 1.774], Table S2b), and
208 founding queens survived for longer (Table S1c, S2c; Fig. 3a; MAE of Hazard Ratios (HR) relative to
209 agricultural colonies: City: 0.149 [0.041 – 0.542]); Village: 0.137 [0.039 – 0.488]. City and village
210 colonies also took significantly longer to become moribund than agricultural colonies (City HR: 0.111
211 [0.031 – 0.396], village HR: 0.073 [0.019 – 0.271]; Table S1d; Fig. 3b). There was no significant
212 effect of land-use on ovary development (see Supplementary Results).

213 Agricultural colonies were found to contain less stored food than their city or village equivalents.
214 Colonies in city (nectar MAE: 2.015 [0.520 – 3.509], Table S1f, S2f; pollen MAE: 2.109 [1.045 –
215 3.173], Table S1g, S2g) and village (nectar MAE: 1.902 [0.410 – 3.394]; pollen MAE: 2.038 [0.973 –
216 3.102]) land-use clusters were significantly more likely to contain nectar (Fig. 4a) and pollen (Fig. 4b)
217 stores than agricultural colonies, in which we found almost no nectar stores and limited pollen after

218 four weeks of development. We found no effect of land-use on the fat content of workers or males
219 (Tables S5b & c).

220 Land-use had no effect on the prevalence of *Apicystis bombi* in colonies, although further analysis
221 suggested that land-use in the immediate area surrounding the colony may have an effect (see
222 supplementary results, Table S5g). Similarly, there was no effect of land-use on *Crithidia bombi*
223 presence (Table S5f). Only three bees were parasitised by *Syntretus* sp. (one city site and one village
224 site), and no *Nosema bombi* or *Locustacaris buchneri* was found in any of our samples. The brood
225 parasite *Bombus vestalis* was present in our study area, and hence we carefully monitored colonies to
226 detect attempted parasite invasions. We recorded 14 invasion attempts by *B. vestalis* queens (max. 4
227 in a single colony). Land-use category was a significant predictor of the probability of an invasion
228 attempt (Table S2h), with city (MAE: -3.776 [-6.304 – -1.249]) and village (MAE: -2.943 [-5.444 – -
229 0.442]) colonies being less likely to be invaded than agricultural colonies (Table S2h, Fig. 3c).

230 Accordingly, we investigated the possibility that increased brood parasite invasions explain the poorer
231 development of colonies in agricultural sites by performing a separate analysis in which three models
232 were compared for each response variable: 1) the best model from the original analysis, 2) the same
233 model but with parasite invasion events replacing land-use as a predictor and 3) a model with both
234 parasite invasion and land-use. For all variables, the model containing land-use only or land-use and
235 invasions fit the data better than the model containing invasions alone (i.e. had a lower AICc value,
236 Table S9). In other words, although parasite invasions explain some of the variance in our data, land-
237 use influences colony performance irrespective of invasion status.

238 Our land classification protocol (44) allows investigation into the aspects of the land-use that may
239 underlie the effects found, by examining the variables that contribute to the clustering of land-use
240 types. High domestic infrastructure, impervious surface and road cover, and low agricultural land
241 cover, contributed strongly to Principle Component (PC) 1 (eigenvalue score >0.4 or >-0.4 (45)),
242 while PC2 was defined by high tree cover and low open and flower-rich habitat cover (Table S10).
243 The city cluster was characterised by positive scores on PC1 (mean 2.00 ± SE 0.07) and near-zero
244 scores on PC2 (-0.27±0.17), suggesting a highly urbanised semi-open land type; the village cluster
245 had medium negative scores on PC1 (-1.40±0.37) and positive PC2 scores (0.94±0.37), suggesting
246 low intensity urbanisation with moderate tree cover; the agricultural cluster had low PC1 scores (-
247 2.33±0.64) and low PC2 scores (-2.08±0.32), suggesting open land with very little urbanisation and
248 high agricultural cover (Fig. S3a). Analysis of the PCs suggested it was the combination of both
249 attributes of the land-use that drove the effects seen (see Supplementary Methods and Table S12 &
250 S13 for results of these analyses). Investigation of the effect of the proportion of flower-rich habitat
251 on the response variables as a possible key driver of the results showed no significant effect
252 (Supplementary methods; Tables S3 & S4).

253 Discussion

254 Our results demonstrate a direct association between urbanisation and higher reproductive output in a
255 key insect pollinator, *B. terrestris*. We found increases in reproductive output, colony growth and
256 food stores as well as lower brood parasitism by *B. vestalis* in colonies placed in urbanised areas
257 compared to sites dominated by agriculture. Previous research has described correlative evidence for
258 higher abundance of bees (e.g. 46) and higher bumblebee nest densities (42, 47) in urban areas, but
259 whether this may be driven by migration between land-use types or effects of land-use on population
260 dynamics has remained unclear (48). Our experimental design, whereby colonies reared from wild-
261 caught queens were placed in different land-use types over the full colony life cycle in order to
262 measure reproductive output, provides evidence for a causal link between reproductive success and
263 urbanisation, elucidating a potential mechanism behind these observed differences in pollinator
264 populations between urban and rural areas. Our use of colonies established from locally-sourced
265 queens gives our findings direct ecological relevance to the impacts of land-use change on wild
266 bumblebee populations.

267 We employed a high-resolution approach to measuring reproduction, collecting almost all males and
268 gynes present in the nest at weekly night-time inspections, over the entire colony life cycle from first
269 worker emergence to moribundity. This builds on traditional methods of dissecting nests at the very
270 onset of reproduction (22, 49, 50), capturing a higher proportion of the total reproductive output and
271 allowing worker and male production to be distinguished (10), which may explain our detection of a
272 strong effect of urban land-use on reproduction in contrast to previous studies (22, 23, 51).

273 Furthermore, consideration of asymmetrical reproductive investment in gynes and males means our
274 results are potentially conservative. Gyne production requires greater resource investment than male
275 production (52), and in our study, agricultural colonies failed to produce even a single gyne. Gyne
276 production is likely to have a particularly strong effect on population dynamics, as queens hibernate
277 and found new colonies (53), so our findings suggest that agricultural populations may not be self-
278 sustaining (54). Queens of common bumblebee species may migrate long distances (55), raising the
279 possibility that cities may act as a source of new queens to replenish such agricultural population
280 sinks and therefore support the pollination of crops in agriculturally intense landscapes.

281 Parasite pressure presents a significant emerging threat to wild bee populations (13) and previous
282 research has provided evidence for a link between land-use and parasite prevalence in bumblebees
283 (19, 20). However, no effect of land-use was found on *Crithidia bombi* presence and levels of *Nosema*
284 *bombi*, *Syntretus* sp. and *Locustacaris buchneri* were either zero or too low for analysis. Conversely,
285 invasions by the brood parasite *B. vestalis* were strongly affected by land-use, with higher invasion
286 rates in agricultural and village colonies than city. This may reflect lower *B. vestalis* abundance or
287 even complete absence in the urban areas studied, although surveys have recorded the species in cities

288 (e.g. 56). Alternatively, stronger colonies in city sites may have been more able to resist invasion (57),
289 or volatiles from colonies may have been masked by air pollution (58), rendering them more difficult
290 to locate (59). Reductions in forage availability in modern agricultural landscapes have been
291 identified as a potential major driver of bee population declines (8). Accordingly, we found less stored
292 pollen and nectar in agricultural colonies than in city or village colonies, suggesting forage
293 availability may be a contributing factor to poor performance at agricultural sites. This is consistent
294 with evidence from honeybees, where urbanisation has been shown to have a positive effect on food
295 storage (60) (but cf. ref. 38), and supports research suggesting modern agricultural land provides
296 insufficient forage resources for bees (8)

297 Investigation into the underlying attributes of our land-use classification indicates that it appears to be
298 the shared attributes of high agricultural cover and low urbanisation that group the poor performing
299 colonies in our study. A reasonable hypothesis from previous research showing higher colony weight
300 gain in suburban areas than agricultural (22) would be that low intensity urban areas are most valuable
301 to bee populations due to the combination of abundant gardens and proximity to semi-natural habitat;
302 our finding that colonies in densely urbanised areas performed similarly to those in lower intensity
303 urbanisation nonetheless fails to support this. We found no direct effect of the proportion of flower-
304 rich habitat surrounding colonies on colony success. However, this may reflect the fact that fine
305 resolution floral abundance surveys, taking into account floral density and species identity, are not
306 possible in urban areas due to access restrictions to gardens. Future research could aim to investigate
307 forage provision in urban areas using modelling approaches (62) to further assess floral availability as
308 a driver in urban habitats. Floral factors differing between agricultural and built-up areas that may
309 have contributed to a reduced ability to collect food may include the spatial distribution and
310 composition of flower-rich patches (16, 63), the duration for which they are available (63), or
311 potential effects of environmental contaminants on foraging behaviour (64).

312 Exposure to agrochemicals has been shown to impact on colony function and success in bumblebees
313 (50, 64), including reproductive output (50) and parasite prevalence (65), and high levels of pesticide
314 contamination are often found in both crop and wildflower resources in agricultural areas (66). There
315 is evidence that bees in urban areas may be subject to lower pesticide exposure (21, but cf. ref. 67)
316 offering another possible mechanism for our findings of lower colony success in agricultural areas.
317 Ground surveys of the agricultural sites in this experiment showed a variety of crops in the
318 surrounding farmland, with one site near a field of oilseed rape. This may represent a route of
319 pesticide exposure (68), although the study took place after the EU moratorium restricting
320 neonicotinoid use in flowering crops (69). However, neonicotinoids may remain in the soil and the
321 nectar and pollen of non-target plants for prolonged periods following use on nearby crops (70), and
322 other pesticides may also negatively affect bees (64). In general, fields around the agricultural sites
323 were more commonly arable than pasture, compared to the village sites which more often contained

324 pasture and woodland in undeveloped areas, providing the potential for different pesticide exposure
325 between these land-use types, and the high incidence of gardens and parks in city areas may expose
326 bees to a different suite of horticultural pesticide applications, about which little is known (70). Our
327 findings highlight that the question of how bee exposure to pesticides varies with urbanisation is a
328 major knowledge gap that requires exploration.

329 We show for the first time that the reproductive output of *B. terrestris* colonies placed in built-up
330 areas is higher than in agricultural areas, suggesting that the current urban expansion may have
331 positive consequences for generalist bumblebee species. Our findings suggest that abundance and
332 diversity differences found in previous studies (71) may be driven by a direct impact of land-use on
333 fitness, rather than migration between land-use types, and support the growing evidence that some
334 types of agricultural land represent a barren landscape for pollinators (8, 12). Given that agricultural
335 land is the most common primary land-use in Europe (72), our finding that urban areas are linked to
336 higher reproductive success suggests that developed land may provide a refuge for bumblebee
337 populations within a landscape dominated by intensive farming.

338

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354 **Author Contributions**

355 A.E.S. and E.L. conceived the initial idea; A.E.S., E.L. and M.J.F.B designed the experiments; R.J.G.
356 provided feedback on the experimental design; A.E.S. performed the experiment and the statistical

357 analyses; A.E.S. wrote the manuscript draft and E.L., R.J.G., M.J.F.B. and A.E.S. provided the final
358 edit.

359 **Data Accessibility**

360 Raw data are archived in Dryad (entry doi: 10.5061/dryad.c68cj62).

361

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533

534

535 **Figure 1.** a) Location of 38 sites in South-East England at which a *B. terrestris* colony was placed for up to 10 weeks from
536 May to July. Inset circles show land-use classification at a 500m radius for three typical sites (left to right: agricultural,
537 village, city). b) Cluster dendrograms of land-use of 38 sites at a 500m radius. Cluster analyses using Ward's method were
538 performed on a set of principle components describing land-use to group sites into categorical land-use types (red boxes). At
539 the terminus of each branch the two-letter site name is given with an image of the GIS land classification (see Table S14 for
540 colour key).

541 **Figure 2.** a) Mean number of sexual offspring (gynes + males) with 95% confidence intervals (CIs) for colonies of
542 *B. terrestris* in agricultural, village and city sites based on land-use at a 500m radius. Letters indicate significant differences
543 between land-use types based on 95% CIs on parameter estimates from both the binomial (presence/absence of sexuals) and
544 count (number of sexuals produced) components of a zero-inflated hurdle model. b) Mean (\pm SE) colony size (number of
545 bees) from weekly night-time bumblebee colony censuses. To analyse peak colony size linear regression was carried out on
546 log-transformed data.

547 **Figure 3.** Kaplan-Meier curves of a) queen survival and b) colony survival for colonies of *B. terrestris* in agricultural, village
548 and city sites based on land-use at a 500m radius. Each step in the Kaplan-Meier curves represents the week at which (a)
549 queens died or (b) colonies were removed from the field; for example, all queens in agricultural sites had died by week 5. c)
550 Proportion of colonies invaded by *Bombus vestalis* in agricultural, village and city sites, analysed as a binary response.
551 Letters indicate significant differences between land-use types based on 95% CIs on model-averaged parameter estimates
552 from a) and b) Cox proportional hazards models and c) binomial GLMs.

553 **Figure 4.** Mean (\pm SE) proportion of *B. terrestris* colonies containing a) nectar and b) pollen stores over 10 weeks in
554 agricultural, village and city sites based on land-use at a 500m radius. Binomial GAMs allowing for a non-linear effect of
555 week with site as a random effect were used to analyse presence of nectar and pollen. Nectar data were collected from week
556 3 due to provision of sucrose during week 1.

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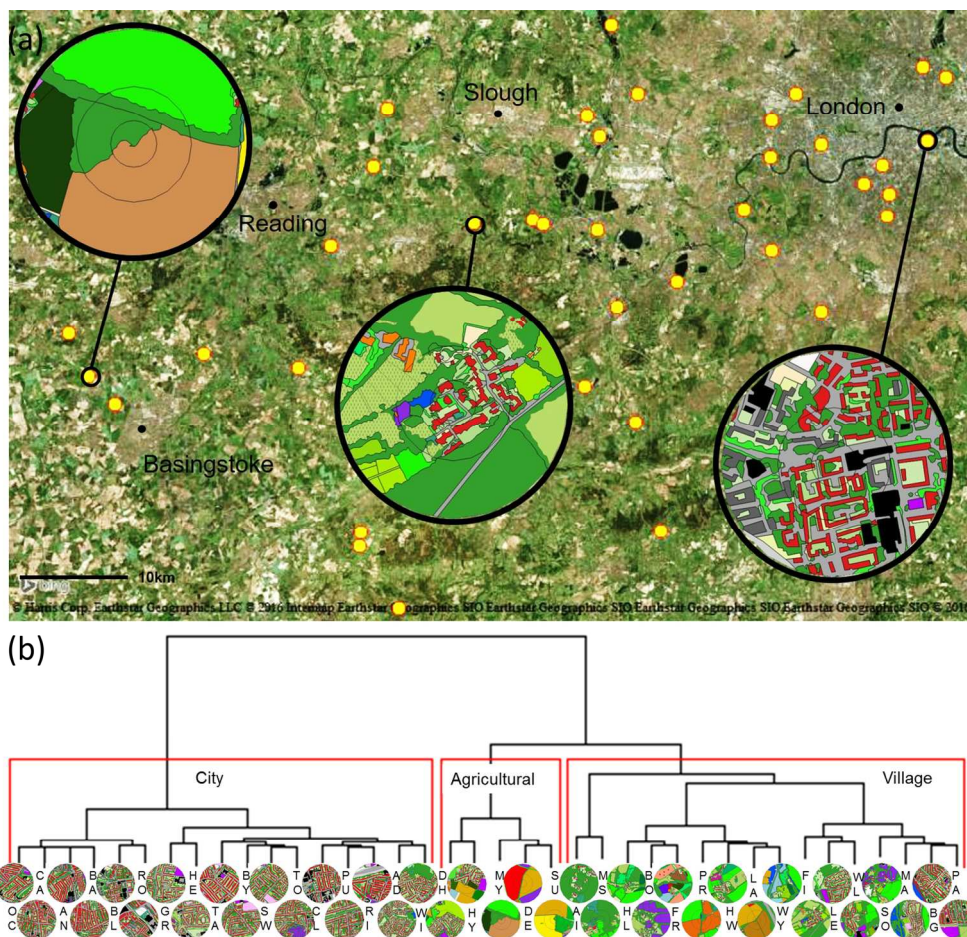


Figure 1. a) Location of 38 sites in South-East England at which a *B. terrestris* colony was placed for up to 10 weeks from May to July. Inset circles show land-use classification at a 500m radius for three typical sites (left to right: agricultural, village, city). b) Cluster dendrograms of land-use of 38 sites at a 500m radius. Cluster analyses using Ward's method were performed on a set of principle components describing land-use to group sites into categorical land-use types (red boxes). At the terminus of each branch the two-letter site name is given with an image of the GIS land classification (see Supplementary Material for colour key).

170x158mm (300 x 300 DPI)

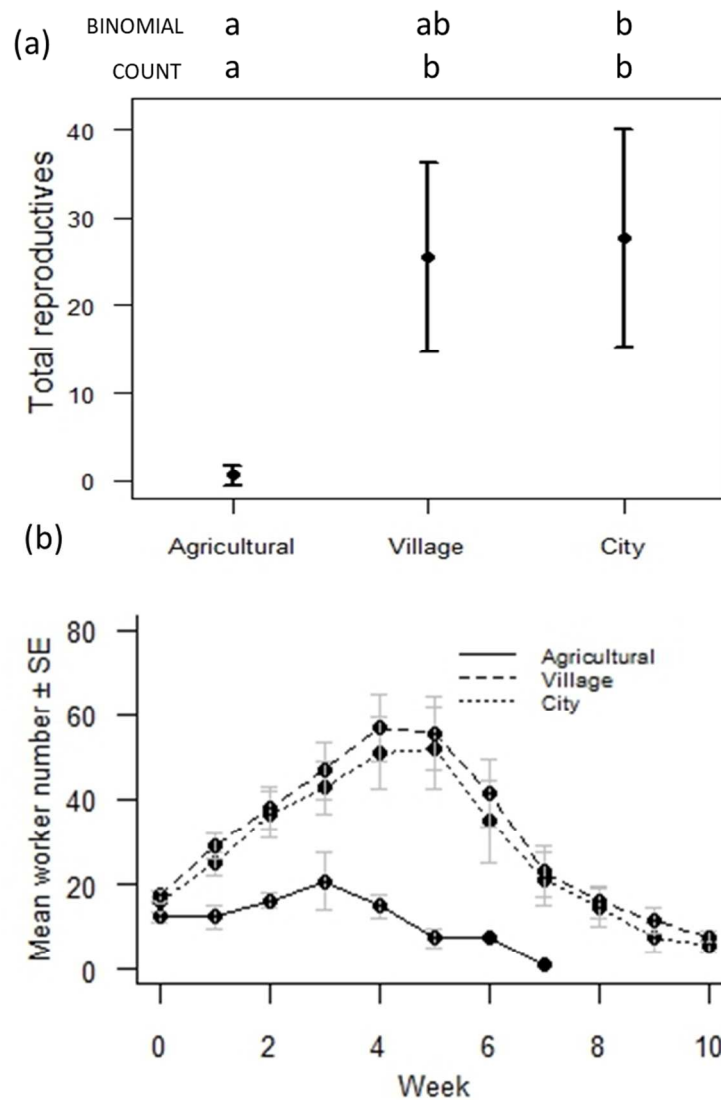


Figure 2. a) Mean number of sexual offspring (gynes + males) with 95% confidence intervals (CIs) for colonies of *B.terrestris* in agricultural, village and city sites based on land-use at a 500m radius. Letters indicate significant differences between land-use types based on 95% CIs on parameter estimates from both the binomial (presence/absence of sexuals) and count (number of sexuals produced) components of a zero-inflated hurdle model. b) Mean (\pm SE) colony size (number of bees) from weekly night-time bumblebee colony censuses. To analyse peak colony size linear regression was carried out on log-transformed data.

190x281mm (300 x 300 DPI)

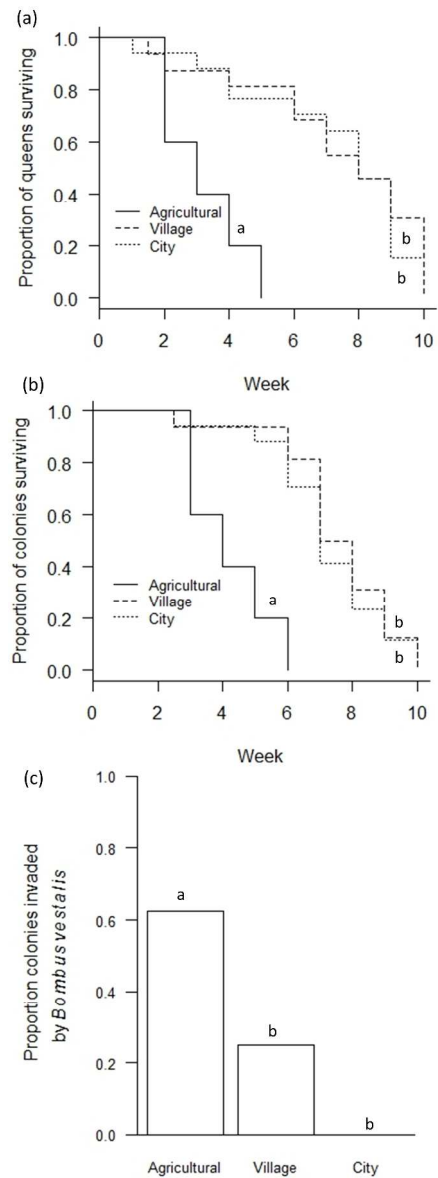


Figure 3. Kaplan-Meier curves of a) queen survival and b) colony survival for colonies of *B. terrestris* in agricultural, village and city sites based on land-use at a 500m radius. Each step in the Kaplan-Meier curves represents the week at which (a) queens died or (b) colonies were removed from the field; for example, all queens in agricultural sites had died by week 5. c) Proportion of colonies invaded by *Bombus vestalis* in agricultural, village and city sites, analysed as a binary response. Letters indicate significant differences between land-use types based on 95% CIs on model-averaged parameter estimates from a) and b) Cox proportional hazards models and c) binomial GLMs.

383x1025mm (300 x 300 DPI)

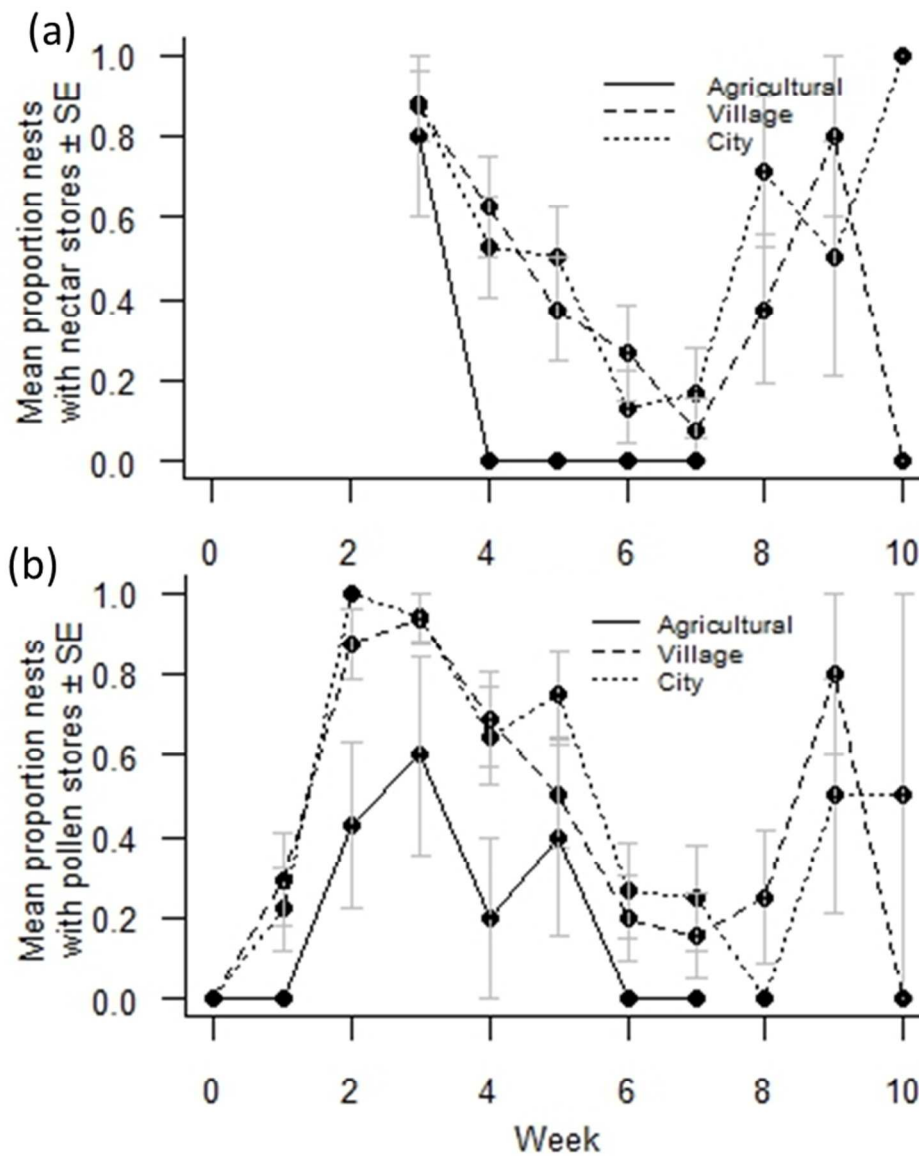


Figure 4. Mean (\pm SE) proportion of *B. terrestris* colonies containing a) nectar and b) pollen stores over 10 weeks in agricultural, village and city sites based on land-use at a 500m radius. Binomial GAMs allowing for a non-linear effect of week with site as a random effect were used to analyse presence of nectar and pollen. Nectar data were collected from week 3 due to provision of sucrose during week 1.

168x207mm (300 x 300 DPI)