1 Food availability limits avian reproduction in the city: an experimental study on great 2 tits (Parus major) 3 4 Gábor Seress^{1*}, Krisztina Sándor², Karl, L. Evans³, András Liker² 5 6 ¹ Department of Limnology, University of Pannonia, Veszprém, Hungary 7 ² MTA-PE Evolutionary Ecology Research Group, University of Pannonia, Veszprém, Hungary 8 ³ Department of Animal and Plant Sciences, University of Sheffield, Sheffield S10 2TN, United 9 Kingdom 10 * Corresponding author (seressg@almos.uni-pannon.hu) 11

ABSTRACT

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1. The altered ecological and environmental conditions in towns and cities strongly affect demographic traits of urban animal populations, with reduced avian reproductive success providing a common example. Previous work suggests that this is partly driven by low insect availability during the breeding season, but robust experimental evidence that supports this food limitation hypothesis is not yet available. 2. We tested core predictions of the food limitation hypothesis using a controlled experiment that provided supplementary insect food (nutritionally enhanced mealworms supplied daily to meet 40-50% of each treatment brood's food requirements) to great tit nestlings in urban and forest habitats. 3. We measured parental provisioning rates and estimated the amount of supplementary food consumed by control and experimental nestlings, and assessed their body size and survival rates. 4. Provisioning rates were similar across habitats and control and treatment broods, but treatment (and not control) broads consumed large quantities of supplementary food. As predicted by the food limitation hypothesis we found that nestlings in (1) urban control broods had smaller body size and nestling survival rates than those in forest control broods, (2) forest treatment and control broods had similar body size and survival rates, (3) urban treatment nestlings had larger body size and survival rates than those in urban control broods, and crucially (4) urban treatment broods had similar body size and survival rates to nestlings in forest control broods. 5. Our results provide rare experimental support for the strong negative effects of food limitation during the nestling rearing period on urban birds' breeding success. Furthermore, the fact that supplementary food almost completely eliminated habitat differences in survival rate and nestling body size suggest that urban stressors other than food shortage contributed relatively little to the reduced avian breeding success in cities. Finally, given the impacts of the amount of supplementary food that we provided and taking clutch size differences into account, our results suggest that urban insect populations in our study system would need to be increased by a factor of at least 2.5 for urban and forest great tits to have similar reproductive success.

INTRODUCTION

Population growth and socio-demographic factors are rapidly increasing the number and spatial extent of urban settlements across much of the globe (United Nations 2016). Urbanisation rates and associated human population densities concentrate in regions with high species richness and biodiversity hotspots (Luck 2007, Seto et al. 2012). As urban areas – especially their core regions – typically support fewer species and less diverse biotic communities than surrounding semi-natural or natural landscapes (Aronson et al. 2014, Batáry et al. 2018) urbanisation is increasingly contributing to the extinction crisis (Mcdonald et al. 2008, Chaudhary et al. 2018). Improved understanding of the factors that limit urban biodiversity is needed to devise urban management strategies that can enhance species' occurrence and population sizes in towns and cities, thus contributing to local, and sometimes global, conservation objectives (Ives et al. 2016, Lepczyk et al. 2017).

Urban biodiversity is limited by numerous factors including the spatial extent, composition and structure of vegetation, exposure to a range of pollutants (e.g. chemical, noise, heat), human disturbance and reduced availability of high quality resources including food (Williams et al. 2009, Moretto and Francis 2017, Aronson et al. 2017). Urban environments typically contain large amounts of anthropogenic food which is readily consumed by a range of species and can comprise a substantial proportion of individual animals' diets (e.g. arthropods (Youngsteadt et al. 2016), birds (Robb et al. 2008), mammalian carnivores (Bateman and Fleming 2012)). These anthropogenic food sources, however, are typically of lower nutritional quality than natural dietary components, and their consumption is often associated with adverse impacts on animals' physiology (e.g. Schulte-Hostedde et al. 2018), behaviour and disease risk (e.g. Murray et al. 2015, 2016), and reproductive success (Mennechez and Clergeau 2006, Plummer et al. 2018).

These impacts have been particularly well studied in birds and may contribute to the general pattern of urban avian populations having lower reproductive success (e.g. fewer and smaller offspring) than conspecifics in non-urban environments (Chamberlain et al. 2009, Sepp et al. 2017). The extent to which these reductions in breeding success are ultimately driven by reduced abundance of natural dietary components in urban locations is, however, unclear. Most passerines provision their young with a diet rich in insects, the diversity and abundance of which is severely decreasing worldwide (Sánchez-Bayo

and Wyckhuys 2019). Whilst insect responses to urbanization are diverse and taxon-specific, several studies have found that urban areas generally support fewer insects than more natural habitats (Jones and Leather 2012, New 2015). Indeed, cities typically have reduced abundance of lepidopteran larvae (reviewed by Seress et al. 2018), that are key components of the nestling diet in many passerine species (Cholewa and Wesołowski 2012). In combination, the abundant anthropogenic food sources and the scarcity of urban arthropods may thus drastically alter the quantity and quality of food for urban insectivorous birds, suggesting limited availability of high quality food during the brood rearing period (Seress and Liker 2015).

Food supplementation experiments are widely used in bird populations, but studies manipulating nestling food quantity and/or quality in urban environments are rare and have produced inconsistent evidence for the link between food limitation and reduced breeding success. Such experiments have reported positive effects of extra food on some traits (nestling body size and blood heterophil-to-lymphocyte ratio) but not others(several other blood parameters; Bańbura et al. 2011), whilst other food supplementation experiments have found negligible (Meyrier et al. 2017) or even negative (Demeyrier et al. 2017) impacts on body size and/or nestling survival. We are aware of only of two studies that compared the effects of food supplementation between urban and non-urban populations. Supplementary food had similar positive effects on house sparrow *Passer domesticus* nestling survival and number of fledglings in suburban and rural gardens, suggesting that urbanisation did not increase food limitation (Peach et al. 2014). This study, however, did not control for the confounding effects of brood size, nestling age and the amount of supplementary food obtained by different broods. A study on American crows *Corvus brachyrhynchos* found larger body size in urban supplemented nests, whilst in rural areas supplementary food reduced body size but was limited by extremely small sample sizes with a total of just 7 supplemented nests (Heiss et al. 2009).

In a recent study we showed that lower breeding success of urban great tits is primarily driven by increased nestling mortality, for which starvation was the most likely explanation (Seress et al. 2018). Here, we build upon this finding and experimentally test the hypothesis that limited insect food availability drives lower nestling body size and reduced breeding success in urban great tits using a food supplementation experiment in urban and forest populations. We regularly provisioned extra insect food

throughout the brood rearing period to manipulate nestlings' diet, and compared parental provisioning behaviour, nestling body size and survival between supplemented and non-supplemented (control) broods within and between habitat types. We predicted that (1) control broods in the urban habitat would have reduced provisioning rates, nestling body size and survival compared to control broods in forest, indicating that food availability during the nestling phase limits breeding success in urban but not in forested areas, and thus (2) control and supplementary fed broods in forested locations would exhibit negligible differences in provisioning rate, body size and nestling survival, whilst (3) urban treatment broods would have significantly increased provisioning rates, nestling body size and survival compared to urban control broods. Finally, if food limitation is indeed a major factor limiting breeding success and nestling development in cities, we expect to find that (4) extra insect food would eliminate or considerably mitigate the differences in reproductive success between urban treatment and forest control groups.

METHODS

Data collection and experimental design

We studied great tits breeding in nest boxes at an urban and a forest site in Hungary in 2017. The urban study site is located in the city of Veszprém (47°05'17.29"N, 17°54'29.66"E; the study plot covers c. 9.4 ha), where the nest boxes were placed in public parks, a cemetery, a bus station and university campuses. All of these public green-spaces are surrounded by built-up areas and roads and experience frequent anthropogenic disturbance. The forest study site, Vilma-puszta, is located c. 3 km from the edge of Veszprém in mature deciduous woodland characterized mainly by downy oak (*Quercus cerris*) and South European flowering ash (*Fraxinus ornus*; 47°05'06.7"N, 17°51'51.4"E; the study plot covers c. 12.8 ha). This latter study location is a Natura 2000 site which is relatively free from human disturbance, e.g. it has no paved roads, has only one nearby farm and no logging activity.

To test the food limitation hypothesis we manipulated nestlings' diet in a field experiment, in which great tit broods were allocated to a food supplementation treatment (treatment group) or received no extra food (control group). We monitored nest boxes at least twice a week from 1st March to early

June to record laying and hatching dates and the number of eggs and nestlings in active great tits nests. At each study site, we randomly assigned the first brood of the season to the treatment or control group, and then sequentially allocated each additional brood to the treatment or control groups to ensure similar sample sizes in each group and to avoid the potential for treatment type to be confounded with date. The experiment only includes first broods (note that at these study sites the majority of great tit pairs do not initiate a second seasonal brood and most nestlings are produced by first broods (Seress et al. 2018)). During the incubation period we equipped all nest boxes with a feeder box, which was a small (125 ml) plastic container attached to the nest box a few centimetres below the entrance (Appendix1: Fig.S1). The bottom of the feeder boxes had small holes (1 mm diameter) that enabled rainwater drainage but did not allow supplementary food (mealworms) to escape. Feeder boxes were not transparent to decrease the conspicuousness of mealworms to reduce the potential for other species or great tits other than the focal parents to detect and utilise the supplementary food (such events were rare, see Results).

Treatment broods received supplementary food on a daily basis when nestlings were 3-15 days old (hatching day of the first egg = day 1). This ensured that food supplementation did not influence reproductive success by altering clutch sizes or the body condition of incubating females. We adjusted the amount of mealworms according to brood size and nestling age by providing 1.5 g/chick/day between 3-7 days of nestling age (i.e., for 5 days), and 3 g/chick/day between 8-15 days of nestling age (i.e., for 8 days). Thus, a brood with 10 nestlings received daily c. 120 and 240 larvae in the early and late nestling rearing phases, respectively. These quantities are estimated to cover 40-50% of daily food requirements of great tit nestlings (Gibb and Bets 1964, Van Balen 1973, our own unpublished data). Mealworms are widely used in avian food supplementation experiments (Bańbura et al. 2011, Peach et al. 2014, Demeyrier et al. 2017), and are suggested to be a good source of energy and digestible amino acids for birds (Ravzanaadii et al. 2012). To increase the nutritional value of mealworms we transferred the larvae from their usual wheat bran substrate to an ad libitum invertebrate food substrate rich in protein and vitamins (www.bugs-world.com, product code: BW-TT), at least 2-3 days before being provided to birds (for similar approach see e.g. Kaiser et al. 2014). Daily food supplementation occurred between 8:00 and 13:00, and during these visits we also recorded the number of chicks (alive or dead) in the nest, which enabled us to calculate the required amount of supplementary food for each brood. To avoid inducing nest desertion, we never removed brooding parents during these checks – thus, if a parent remained on the nest during nest inspection we used the most recent data on brood size to calculate the required amount of supplementary food. Feeding boxes were cleaned daily and leftover food was weighed (to the nearest g). Control broods did not receive supplementary food but their nests were also checked daily and we spent a similar amount of time (c. 3-4 mins) at the nest during each visit to ensure that control and treatment broods received the same level of human disturbance.

When nestlings reached 15-days of age (i.e., just prior to fledging) we ringed and weighed them (\pm 0.1 g) and also measured the length of the left tarsus (\pm 0.1 mm) and right wing (\pm 1 mm; from the bend of the wing to the tip of the longest primary, following the 'flattened and straightened wing' method by Svensson 1992). In the treatment group a few hours had always passed between the last food supplementation and the measurements ($4.68 \pm 0.14 \, h$) in order to let the birds digest the supplementary food.

The experiment involved 52 broods initially, but five were excluded from analysis due to either complete breeding failure resulting from nest desertion during incubation (n = 1 urban control) or when nestlings were 1-3 days old (i.e., just before the start of the experiment; n = 2 urban control, n = 1 urban treatment). Nest desertions are usually due to parental death (Santema and Kempenaers 2018) and in one of our four cases parental mortality was confirmed. Final sample sizes were thus: urban control 10 broods, urban treatment 14 broods; forest control 12 broods and forest treatment 11 broods (Appendix1: Table S2).

Similarly to previous years, caterpillar abundance was higher in the forest compared to the urban site in 2017 (Appendix1: Fig.S2; Seress et al. 2018), and breeding success of urban and forest pairs that did not receive supplementary food was comparable to that reported between 2013-2016 from the same study sites (Seress et al. 2018; Appendix1: Table S1-S2). During the experiment there was, however, a brief unusual cold spell from 18th-21st April 2017 with occasional snowfalls and low ambient temperatures (Glądalski et al. 2018; Appendix2). During this period most urban nests already contained recently hatched nestlings (Appendix2) whilst forest clutches were still being incubated (reflecting the typical trend for earlier laying in urban sites, see Seress et al. 2018). This adverse weather might have disproportionately affected the early development of urban nestlings. However, the exposure to the cold

spell did not have a significant interaction with the treatment in models of any of our response variables, and control urban nestlings that experienced the cold spell did not have smaller body mass than non-manipulated broods from the same urban site from other years with normal weather conditions (Appendix2). Thus, we conclude that it is highly unlikely that the exposure of urban broods to the cold spell biased the effects of the supplementary food treatment.

Behavioural data collection

Small video cameras (HD Hero, GoPro) mounted in a non-transparent plastic box for camouflage (c. 15 cm from the feeder) were used to monitor use of the feeder and parental provisioning behaviour (Seress et al. 2017). Videos (60 minutes duration) were recorded when chicks were 3-5 days old (mean \pm SE, treatment group: 4.1 ± 0.3 d, control group: 4.3 ± 0.1 d) and 9-11 days old (treatment group: 9.9 ± 0.1 d, control group: 10.0 ± 0.1 d). Due to logistical constraints videos (n = 67) were obtained for 42 broods, of which 25 were recorded at both chick ages, and 17 broods were only recorded when chicks were 9-11 days old. Videos were only taken during favourable weather conditions (i.e. not during heavy rain or strong winds) during the morning or early afternoon.

From each video we extracted data on food provisioning rates (calculated per nestling). For treatment broods we also categorized food items into three food types: mealworm, non-supplementary food (mainly caterpillars and other arthropods), or unidentified food item (8 of the 1526 feeding events). We recorded if birds (of any species) other than the focal brood's parents took supplementary food from the feeder (parents could be identified by unique colour ring combinations (66 of the 84 focal parents) or unique plumage marks (e.g. width of the breast stripe and overall colouration; the remaining 18 parents). We never captured and ringed adults or measured nestlings before video recording to avoid possible disturbances to birds' behaviour (Seress et al. 2017). Finally, we also recorded if parents consumed supplementary food themselves (through either direct capture of the feeding event on the video or by assuming self-consumption if a parent took supplementary food but did not deliver it to nestlings on its subsequent visit to the nest box).

Statistical analysis

We conducted three analyses to further investigate how parents used the supplementary food. First, we tested if urban and forest treatment birds utilized the same proportion of the supplementary food that was provided during the entire nestling period and compared habitats using a Mann-Whitney test (data distributions did not permit parametric tests). Second, we calculated the proportion of mealworm prey in the nestling diet to investigate how much urban and forest parents supplemented their nestlings' diet with mealworms. We fitted a linear mixed model (LME, package "nlme") in which the response variable was the ratio of mealworms across all prey items (number of mealworms divided by number of all food items; n = 8 unidentified food items were excluded), and predictors were habitat, time of the day (number of minutes from 6:00 a.m. until the start of the video recording), nestling age and brood size. Note that as videos were recorded during the same short nestling age periods (3-5 and 9-11 days post-hatch), we included nestling age as a binary variable with these two age categories. We included brood ID as random factor to control for the non-independence of two video recordings on the same broods. Third, we also calculated the proportion of mealworms consumed by parents, and compared this ratio between habitats. We built a generalized linear mixed-effects model with quasi-binomial error distribution (glmmPQL, package "MASS"), in which the response variable was the ratio of mealworms consumed by the parents (number of consumed mealworms divided by the number of all utilized mealworms), and predictors were habitat, time of the day, nestling age (two-level factor) and brood size; brood ID was a random factor. From this latter analysis we excluded one video recording (an urban brood) because the parents did not consume or provision any mealworms during the 60-min video so we could not calculate this ratio (although field observation and the usually zero amount of leftover food in the feeder confirmed that these parents usually utilized the supplementary food).

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To test our specific predictions for the effects of treatment on reproductive success (outlined in the Introduction) we followed the approach suggested by Ruxton & Beauchamp (2008) and applied preplanned pairwise comparisons between specific groups of habitat and treatment combinations of interest, as this method is a powerful approach for testing a priori hypotheses. We conducted the comparisons in two steps: first we built separate linear models for nestling body size traits, survival rate and nestling provisioning rate and used these models to identify significant confounding variables besides the effects of treatment and habitat. Second, to conduct the pre-planned comparisons, we calculated linear contrasts

between groups of habitat and treatment combinations from linear models that also contained the confounding variables that had significant effects. These steps are described in detail below.

First, we fitted separate LME models for nestling' body mass, tarsus length and wing length (all measured at day 15). In these three models predictors were food supplementation treatment (supplemented or control), habitat, treatment × habitat interaction and brood size, and time of day when modelling body mass. We used brood ID as a random factor in all these models. We also included date (number of days elapsed from the 1st of January until the measurement) in these models, but because forest great tits laid on average 7-8 days later than their urban conspecifics (Seress et al. 2018), we found a moderate level of collinearity between habitat type and date (variance inflation factor (VIF) > 3.26 in all cases, i.e. above the threshold above which collinearity is a concern (Zuur et al. 2010); using function 'vif' from package 'car'). Thus, to reduce multicollinearity we mean-centered the date separately for urban and forest broods, and used this transformed variable in the models.

Thus, we calculated the proportion of nestlings surviving from day 3 to day 15 (i.e., from the start of the experiment until ringing) and built a generalized linear model (GLM) with binomial error distribution, logit link function, in which the response variable was the proportion of nestlings surviving, and predictors were treatment, habitat, treatment × habitat interaction, mean-centred date and brood size. Because in the forest treatment group survival rate was 1.00 (i.e., all nestlings survived), we applied Firth logistic regression (using package "brglm") to handle the problem of separation.

We also analysed the provisioning rates of parents in an LME model in which the response variable was provisioning rate (transformed as $log_e(x + 0.5)$), and predictors were treatment, habitat, treatment × habitat, mean-centred date, time of the day and nestling age (two-level factor); random factor was brood ID. We report the results for all full models in the Appendix1 (Table S3).

In the second step, we used separate linear models to compare the means of the response variables (i.e., the three nestling body size traits, survival rate and nestling provisioning rate) between specific habitat-treatment combinations. These models always contained the habitat × treatment term, plus any other confounding variable that was significant in the above described models (Appendix1: Table S3), specifically: date in the tarsus length and survival rate models, and nestling age (as two-level factor) in

the nestling provisioning rate model; the random factor was brood ID (except for the model on nestling survival). We calculated linear contrasts between groups and used function "glht" (in package "multcomp") to test whether these contrast differed from zero after applying the false discovery rate (fdr) method for correcting *P*-values for multiple pairwise comparisons. Specifically, we compared the means of the above five response variables between the following groups: (1) forest control vs. urban control (to confirm the effect of habitat on control broods); (2) forest control vs. forest treatment and (3) urban control vs. urban treatment (to test for the effects of supplementary food within habitat types); and finally, (4) forest control vs. urban treatment (to test whether the food-supplementation was sufficient to eliminate or considerably mitigate differences between habitats).

To aid the interpretation of nestling survival analyses, we calculated survival probabilities of nestlings in the four groups from the model's parameter estimates. We used the same GLM as in the linear contrast analysis (see above), and transformed the habitat-treatment group mean estimates (b, provided on a logit scale) of the proportion of survived nestlings to survival probabilities (p) using the formula: $p = \exp(b) / (1 + \exp(b))$ (Zuur et al. 2009) – this is referred to as the survival probability in the rest of the manuscript.

All analyses were conducted in R (v. 3.5.2, R Core Team). We checked the validity of statistical assumptions for each linear model described above (Zuur et al. 2009), and the calculated VIF values for all our models (VIF < 2.55) were below the threshold at which results are influenced by collinearity (Zuur et al. 2010). We define the two-tailed statistical significance level at P < 0.05.

RESULTS

Acceptance of supplementary food and provisioning behaviour of the parents

Videos showed that birds in both habitats used most of the supplementary food, and we found no significant difference in the ratio of the amount of leftover food between urban (1.4%) and forest (4.2%) treatment nests (Mann-Whitney, n = 25, W = 66, P = 0.542). Videos also revealed that birds other than the nest owners occasionally visited the nest boxes both in the control and in the treatment groups. Visitor birds appeared on 16.7% (5 out of the 30) of the control videos, and on 27% (10 out of 37) of

the treatment videos, stealing mealworms from the feeders in 7 out of the 10 videos. However, on these 7 videos (6 urban, 1 forest), the amount of food stolen (57 mealworms in total, mean \pm SE: 8.14 ± 3.12 per video) was small compared to the amounts utilized by the focal parents (390 mealworms, 55.71 ± 11.14 ; paired-test, t_6 =3.72, P = 0.009). Visitor species were mainly great tits (7 cases), but great spotted woodpeckers *Dendrocopos major* (3), collared flycatchers *Ficedula albicollis* (2), tree sparrows *Passer montanus* (2) and a blue tit *Cyanestes caeruleus* were also recorded. We did not record any great tits from the control group stealing supplementary food from the feeders on treatment nest boxes.

In treatment nests we found that parents readily fed their chicks with the supplementary food, as the proportion of mealworms in nestlings' diet was 81.1% in urban and 75.3% in forest broods, but neither habitat type (LME, b \pm SE: 0.02 ± 0.09 , $t_{21} = 0.192$, P = 0.849), nor any other predictor had significant influence on the proportion of mealworm in the diet of treatment nestlings (P > 0.351 in all cases). Investigating the proportion of mealworms that parents consumed, we found a marginally non-significant habitat effect (GLM, b \pm SE: 0.55 ± 0.31 , $t_{20} = 1.77$, P = 0.093), with urban parents tending to consume more mealworms (24.7%) than forest parents (18.1%). We also found a significant effect of nestling age, as parents consumed more extra food themselves when they were raising younger nestlings (3-5 days old) compared to when they were provisioning older chicks (9-11 days) (GLM, b \pm SE: -0.80 \pm 0.28, $t_{13} = -2.83$, P = 0.014).

Nestling provisioning rate was similar between treatment groups and habitats, and none of the four pre-planned pairwise comparisons revealed significant differences between groups (Table 1a). Provisioning rate was significantly higher in the 9-11 day compared to the 3-5 day old age category (Appendix1: Table S3).

Nestling body size

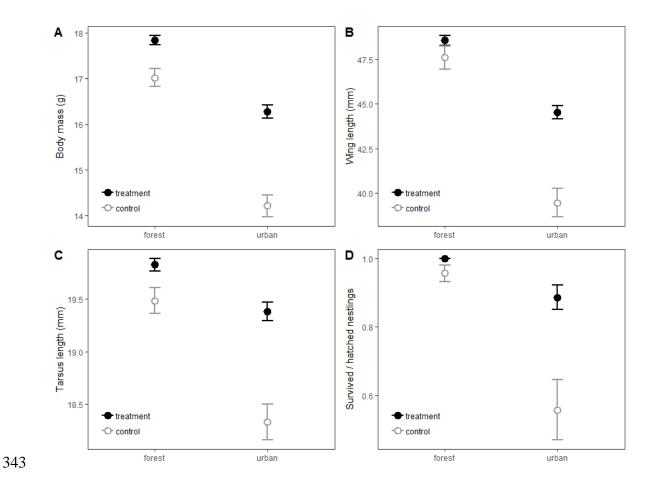
The results of the pre-planned pairwise comparisons for body mass, wing and tarsus lengths confirmed that (1) forest control nestlings were significantly larger than urban control nestlings for all three body size metrics (Fig.1a-c, Table 1b-d). In line with our expectations, we found that (2) forest control and forest treatment groups did not differ significantly in any variables, whereas (3) supplementary feeding significantly increased body mass, wing and tarsus lengths in urban treatment nestlings compared to the

control group (Fig.1a-c, Table 1b-d). Finally, (4) supplementary feeding effectively mitigated the differences in body mass, wing and tarsus lengths that occurred between control forest and urban broods (Fig.1a-c, Table 1b-d). Although the difference between forest control and urban treatment groups was close to statistical significance in body mass (Table 1b) and was statistically significant in wing length (Table 1c), the magnitude of these differences were small (body mass (g): 0.90 ± 0.46 , wing length (mm): 3.58 ± 1.58).

Nestling survival

Nestling survival probabilities, estimated from the GLM model, were 1.00 and 0.95 in forest treatment and control broods, respectively, while this was 0.88 in the urban treatment and only 0.58 in urban control broods. The pre-planned pairwise comparisons indicated significant differences in nestling survival probabilities between (1) forest control and urban control groups (Table 1e; Fig.1d). The difference between (2) forest treatment and forest control groups was close to statistical significance but remained slight (0.05, back transformed value from logit scale), whereas (3) nestling survival was significantly and considerably higher in the urban treatment compared to the urban control groups (Table 1e; Fig.1d). Finally, whilst we found that the difference (4) between the forest control and urban treatment groups was close to statistical difference its magnitude was small (0.07, back transformed value from logit scale; Table 1e; Fig.1d).

Fig. 1. Differences (means \pm SE) in 15-days old great tit nestlings' (a) body mass, (b) wing length, (c) tarsus length and (d) nestling survival in the groups of different habitat \times treatment combinations.



DISCUSSION

Urbanisation can be associated with adverse impacts on demographic traits (Sepp et al. 2017), and these impacts probably contribute to the reduced biodiversity of towns and cities (Aronson et al. 2014). The mechanisms driving reduced demographic success in urban environments are, however, poorly understood (Rodewald and Gehrt 2014). In this study we used a food supplementation experiment, using mealworms fed on an enriched diet, to test if the reduced abundance of insect food sources in urban environments (e.g. Seress et al. 2018) explains reduced reproductive success and smaller nestling size in an insectivorous bird.

As predicted by the food limitation hypothesis control broods that did not receive supplementary food were smaller and had lower survival rates in the urban site than the forest site – matching previous studies of reproductive success in unmanipulated great tit populations (Bailly et al. 2016, Seress et al. 2018). Crucially, urban supplemented broods had considerably higher fledging success and produced

larger nestlings than urban control pairs, whereas supplementary feeding of forest broods had only small and statistically non-significant effects on these traits. Furthermore, supplementary fed urban broods had similar body sizes and survival rates to those of control broods in the forest environment. Collectively, these results provide rare and strong experimental evidence that the negative impacts of urbanization on avian nestling size and survival is caused by the reduced availability of high quality invertebrate food sources, and these effects can be mitigated by providing supplementary food. Our experiment suggests that food limitation can strongly influence even successful urban adapter species such as the great tit, which across its range is one of the commonest birds in towns and cities (Gosler and Clement 2007). The very small differences in nestling size and survival between urban supplemented and forest control chicks suggest that food availability alone can explain much of the reduction in reproductive success in urban environments. Other urban stressors, such as habitat modification and light pollution, thus seem likely to play only a limited direct role in lowering productivity of insectivorous passerines in cities.

The positive effects of supplementary food on urban nestlings' body size and survival were clearly detectable and strong compared to previous studies in urban great tit populations (Bańbura et al. 2011, Demeyrier et al. 2017). Although these earlier studies differ in several methodological details from our experiment (measured traits, length of food supplementation, type of food etc.) the much stronger effect we found may arise primarily due to the enhanced quality of mealworms and the higher amounts of extra food per nestling we provided throughout most of the brood rearing period. Alternatively or additionally, the natural availability of arthropods may be lower in our urban site than in the habitats involved in the above studies, making supplementary food more valuable and effective in our experiment (Ruffino et al. 2014). The estimated biomass of arboreal caterpillars (the optimal nestling food for many passerines; Cholewa and Wesołowski 2012) during the brood-rearing period in our urban site was extremely low (approximately 8-times higher in the forest site; and similar even more dramatic differences in caterpillar biomass occur in other years (2013-2016, Appendix1: Fig.S2; Seress et al. 2018), but we consider such differences to be a common feature of urban environments (e.g. Marciniak et al. 2007, Pollock et al. 2017).

The strong treatment effect that we found on urban but not forest birds' breeding success is unlikely to be driven by the more extensive use of supplementary food by urban parents than those in the forest habitat for three reasons. First, the amounts of leftover food was very low in both habitats, and consecutive nest checks on day 15 (i.e. food supplementation and later that day, nestling measurements) also indicated that birds usually consumed all the provided food within a few hours. Second, the video recordings confirmed that the supplemented mealworms were utilized predominantly by treatment parents in both habitats. Finally, the videos confirmed that the proportion of mealworms in the nestling diet was high in both urban (81%) and forest (75%) treatment broods. It thus appears clear that forest birds are not food limited, and importantly that supplementary feeding with nutritionally enhanced mealworms provided forest treatment pairs with a food source that was of broadly similar nutritional quality to the food sources utilised by forest control pairs – otherwise one would expect treatment pairs to have lower nestling body size and survival rates than the controls.

Besides the presumable direct (calorific and nutritional) benefits of the extra arthropod food on urban broods, indirect mechanisms might also have played a role in improving brood performance. The parents of treatment broods consumed significant proportions of the mealworms themselves and this tended to be higher in urban pairs. The resultant reduction in the time parents needed to invest in foraging for themselves, and potentially higher body condition, may have enabled females to invest more in brooding and feeding young nestlings. Additionally, food supplementation can also enhance breeding success by increasing parents' nest defence behaviour, for example because parents can spend more time in the proximity of their nest and thus defend it against predators (see Vafidis et al. 2018 and references). We did not record brood losses attributable to nest predation in any of our experimental groups, thus it is unlikely that this latter mechanism played an important role in our case – although it may be important in other regions or species with higher rates of nest predation.

Finally, our data can provide a broad indication of the magnitude of urban food limitation. Supplying 40-50% of urban nestlings' food requirements enabled them to more or less match the performance of forest broads. This implies that, at current densities and broad sizes, urban caterpillar populations need to be doubled if urban and rural chicks are to have similar performance without supplementary food. Urban great tit broad sizes are, however, typically c. 75% those of forest broads in

our study areas (Seress et al. 2018). Assuming that such reductions are driven by food limitation and that clutch size linearly increases with food availability it seems likely that urban caterpillar populations need to be increased by at least a factor of 2.5 to equalise urban and forest great tit brood size and performance. However, much higher increases are likely to be required given that other urban passerine species, such as blue tits, also depend on caterpillars for provisioning their young and will thus compete to some extent with great tits. Achieving such large increases will be challenging, although there is substantial capacity to increase the volume of urban tree canopy through tree planting (Kroeger et al. 2018) the benefits take time to accumulate and many urban trees fail to come close to their mature size due to high mortality rates (Widney et al. 2016).

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This study provides rare experimental evidence for strong effects of food limitation in urban areas on avian nestling size and survival rates. Provision of mealworms that are fed on an enriched diet largely mitigated the marked differences in nestling size and survival rates between non-supplemented urban and forest broods. Our focal species specialises on provisioning nestlings with caterpillars, which is a common strategy in many groups of birds occurring in urban areas across the temperate zone including tits, chickadees, finches or woodpeckers. Thus, food limitation may be a similarly major factor limiting reproductive success in several other urbanized bird species. Provision of higher quality supplementary food to such species during the breeding season may increase the body size and nestling survival rates in their urban populations. The increased growth might also yielded additional fitness advantages for urban supplemented broods given that effects of early nutritional conditions can be carried to adulthood, affecting adult body size (e.g. Cleasby et al. 2011) or even cognitive abilities such as song learning (Nowicki et al. 2002). Urban nestlings' benefit from the arthropod-rich food was especially prominent in their pre-fledging body mass (ca. 2 grams), which might have also increased their recruitment rate (Schwagmeyer and Mock 2008) given that pre-fledging body mass correlates positively with postfledging survival in many passerine species, including great tits (Magrath 1991). To what extent could the increased nestling survival and development contribute to urban populations' size and stability, is still an unanswered question though. For example, whilst supplementary feeding improved breeding success in sub-urban house sparrows (Peach et al. 2014) this did not generate an increase in population size (Peach et al. 2018). Whilst further work on the impacts of supplementary feeding on population dynamics is certainly needed it is clear that limited abundance of key arthropod food sources in urban areas can limit avian reproductive success. Thus, management methods that overcome this limitation are likely to be beneficial in supporting and enhancing urban biodiversity, especially considering the marked and ongoing decline of global insect populations (Sánchez-Bayo and Wyckhuys 2019). **ACKNOWLEDGEMENTS** This research was supported by a grant from the National Research, Development and Innovation Office (NKFIH) of Hungary (K112838) and by the 1783-3/2018/FEKUSTRAT grant of the Hungarian Ministry of Human Capacities. G. Seress was supported by an NKFIH postdoctoral grant (PD 120998). We are also thankful to Ferdi Seelje and Flemming Versloot (undergraduate students of the University of Groningen) for their immense help during the fieldwork, and to Veronika Bókony for her advices in the statistical analyses. The study was licensed by the Middle Transdanubian Inspectorate for Environmental Protection, Natural Protection and Water Management (permission numbers: 24861/2014). **AUTHOR CONTRIBUTIONS** GS and AL conceived the ideas; GS and KS designed methodology, collected and prepared the data; GS analysed the data; GS, KLE and AL interpreted the data and wrote the manuscript. All authors gave final approval for publication. **DATA ACCESSIBILITY Dryad Digital Repository**

Table 1. The results of the pre-planned pairwise comparisons showing the differences in (a) great tit parents' provisioning rates (log-transformed using the formula $log_e(x+0.5)$, and in their nestlings' (b-d) body size and (e) proportion of survived nestlings (on a logit scale) between groups of treatment × habitat combinations. The linear contrasts between groups were calculated from linear models (LME for a-d, and GLM for e), containing the habitat × treatment interaction, plus any confounding variable that was proven to be significant in the full model (Appendix1: Table S3). Statistically significant (P < 0.05) differences are highlighted in bold and marginally non-significant (0.05 < P < 0.10) differences are shown in italic.

Pairwise comparisons	$contrast \pm SE$	Z	adj. P
(a) Provisioning rate (feeding/nestling/hour) 1			
forest control – urban control	0.20 ± 0.21	0.94	0.654
forest control – forest treatment	-0.09 ± 0.20	-0.45	0.654
urban control – urban treatment	-0.31 ± 0.20	-1.53	0.502
forest control – urban treatment	-0.12 ± 0.17	-0.66	0.654
(b) Nestling body mass $(g; day 15)^2$			
forest control – urban control	2.90 ± 0.52	5.54	< 0.001
forest control – forest treatment	-0.78 ± 0.48	-1.61	0.107
urban control – urban treatment	-2.00 ± 0.51	-3.92	< 0.001
forest control – urban treatment	0.90 ± 0.46	1.97	0.066
(c) Nestling wing length (mm; day 15) ²			
forest control – urban control	9.13 ± 1.79	5.10	< 0.001
forest control – forest treatment	-0.73 ± 1.66	-0.44	0.662
urban control – urban treatment	-5.55 ± 1.74	-3.19	0.003
forest control – urban treatment	3.58 ± 1.58	2.27	0.031
(d) Nestling tarsus length (mm; day 15) ²			
forest control – urban control	1.25 ± 0.35	3.59	0.001
forest control – forest treatment	-0.34 ± 0.31	-1.12	0.348
urban control – urban treatment	$\textbf{-}1.06 \pm 0.34$	-3.09	0.004
forest control – urban treatment	0.19 ± 0.29	0.66	0.512
(e) Nestling survival (between day 3-15) ³			
forest control – urban control	2.67 ± 0.50	5.33	< 0.001
forest control – forest treatment	-2.48 ± 1.49	-1.67	0.096
urban control – urban treatment	$\textbf{-1.68} \pm 0.37$	-4.49	< 0.001
forest control – urban treatment	0.99 ± 0.53	1.86	0.084

¹ Number of broods (control/treatment): urban: 8/13, forest: 11/10

² Number of nestlings (nr. of broods; control/treatment): urban: 45 (9)/96 (14), forest: 99 (12)/104 (11)

³ Number of broods (control/treatment): urban: 10/14, forest: 12/11

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