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6	Authors: Brian C. Weeks ^{a,b} , David E. Willard ^c , Marketa Zimova ^a , Aspen A. Ellis ^b , Max L.
7	Witynski ^c , Mary Hennen ^c , Benjamin M. Winger ^b
8	
9	Author Affiliations: a School for Environment and Sustainability, University of Michigan, Dana
10	Natural Resources Building, 440 Church St, Ann Arbor, MI 49109. b Museum of Zoology and
11	Department of Ecology and Evolutionary Biology, University of Michigan, Biological Sciences
12	Building, 1105 N. University Avenue, Ann Arbor, MI 48109. ° Gantz Family Collection Center,
13	The Field Museum, 1400 S. Lake Shore Dr., Chicago, IL 60605.
14	Email Addresses: BCW, bcweeks@umich.edu; DEW, dwillard@fieldmuseum.org; MZ,
15	mzimovaa@umich.edu, AAE, boriellis@gmail.com; MLW, birdmax922@gmail.com; MH,
16	mhennen@fieldmuseum.org; BMW, wingerb@umich.edu
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24	Corresponding Author: Benjamin M. Winger; address: 2018 Biological Sciences Building,
25	1105 N. University Avenue, Ann Arbor, MI 48109; tel: (734) 763-3379; wingerb@umich.edu.
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27	ABSTRACT
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THIS IS THE AUTHOR MANUSCRIPT ACCEPTED FOR PUBLICATION AND HAS UNDERGONE FULL PEER REVIEW BUT HAS NOT BEEN THROUGH THE COPYEDITING, TYPESETTING, PAGINATION AND PROOFREADING PROCESS, WHICH MAY LEAD TO DIFFERENCES BETWEEN THIS VERSION AND THE <u>VERSION OF RECORD</u>. PLEASE CITE THIS ARTICLE AS <u>DOI: 10.1111/ELE.13434</u>

29 Increasing temperatures associated with climate change are predicted to cause reductions in body 30 size, a key determinant of animal physiology and ecology. Using a four-decade specimen series 31 of 70,716 individuals of 52 North American migratory bird species, we demonstrate that 32 increasing annual summer temperature over the 40-year period predicts consistent reductions in 33 body size across these diverse taxa. Concurrently, wing length—an index of body shape that 34 impacts numerous aspects of avian ecology and behavior—has consistently increased across 35 species. Our findings suggest that warming-induced body size reduction is a general response to 36 climate change, and reveal a similarly consistent and unexpected shift in body shape. We 37 hypothesize that increasing wing length represents a compensatory adaptation to maintain 38 migration as reductions in body size have increased the metabolic cost of flight. An improved 39 understanding of warming-induced morphological changes is important for predicting biotic 40 responses to global change.

41 **INTRODUCTION**

42

43 Body size is an important determinant of animal ecology and life history (Brown 1995; 44 McGill et al. 2006), influencing physiological (Hudson et al. 2013) and morphological (Gould 45 1966; Outomuro & Johansson 2017) functions, as well as ecological and social interactions 46 (Yodzis & Innes 2002; McGill et al. 2006; Prum 2014). Within species, there is evidence that 47 individuals tend to be smaller in the warmer parts of their ranges, a pattern often interpreted as an 48 intraspecific derivative of Bergmann's rule (Bergmann 1847; Rensch 1938; Mayr 1956; 49 Blackburn et al. 1999). This association between warmer temperatures and smaller bodies 50 suggests that anthropogenic climate change may cause intraspecific shifts toward smaller body 51 size in a temporal analog to geographic patterns. However, despite the widespread appreciation 52 of the fundamental importance of body size for ecological and evolutionary processes, the 53 drivers and universality of temperature-body size relationships across space and time remain 54 contested (Watt et al. 2010; Forster et al. 2011; Gardner et al. 2011; Riemer et al. 2018). 55 Determining whether rapid body size reductions are occurring in response to increasing 56 temperatures is important for understanding how climate change will influence the phenotypes 57 and ecological dynamics of species in a warming world.

58 Although the possibility of body size reduction in response to global warming has been 59 suggested for decades (Smith *et al.* 1995; Yom-Tov 2001), empirical support remains mixed

60 (Gardner et al. 2014; Salewski et al. 2014; Teplitsky & Millien 2014; Dubos et al. 2018). This 61 uncertainty may be due, in part, to a scarcity of morphological time series datasets containing 62 sufficiently dense sampling to test the influence of temporal fluctuations in climate on body size 63 (as opposed to simply associating long-term morphological trends with periods of global 64 warming), and to do so across co-distributed species that experience similar climatic regimes. By 65 contrast, those datasets that have sampled large numbers of individuals consistently across time 66 frequently do not have measurements from enough morphological characters to distinguish 67 changes in body size from changes in body shape that may be driven by alternate selection 68 pressures. Consequently, the influence of warming-driven changes in body size on ecologically-69 important dimensions of body shape remains largely unknown.

70 Migratory birds are an important but complex system for understanding the 71 morphological responses of biota to increasing temperatures. The extreme energetic demands of 72 long-distance migration have shaped the morphology of migratory birds for efficient flight 73 (Winkler & Leisler 1992; Lockwood et al. 1998). Because migratory birds are under strong 74 selection for high site fidelity, perturbations that hinder an efficient return to the breeding 75 grounds are likely to reduce reproductive success (Winger et al. 2019). If warming temperatures 76 cause body size reductions in migratory birds, concurrent changes in body shape related to the 77 allometry of flight efficiency may be necessary to maintain migratory patterns. Although 78 migratory species have garnered significant attention from researchers interested in biotic 79 responses to rapid environmental change, particularly as they relate to phenology and geographic 80 range, the extent to which migratory birds are changing size and shape in response to 81 anthropogenic global warming remains uncertain (Van Buskirk et al. 2010; Goodman et al. 82 2012; Salewski et al. 2014; Collins et al. 2017a, b; Dubos et al. 2018).

83 A persistent challenge in understanding recent morphological changes in migratory birds 84 is the characterization of avian size and shape. Frequently used indices to assess changes in avian 85 body size through time, such as mass and wing length, may be problematic in migratory birds; 86 mass is highly variable for migratory species, given rapid fat gains and losses during migration 87 (Alerstam & Lindström 1990; Morris et al. 1996), and wing length is positively correlated with 88 migratory distance (Zink & Remsen 1986; Förschler & Bairlein 2011). Nevertheless, studies on 89 recent body size changes in birds in migratory species have often represented body size using 90 wing length or mass (Yom-Tov et al. 2006; Salewski et al. 2010; Van Buskirk et al. 2010;

Goodman *et al.* 2012), making it difficult to identify changes in body size and to disentangle
them from shifts in shape that may be driven by other factors.

Here, using a large specimen time series of 52 North American migratory bird species with measurements from multiple morphological features, we studied changes in body size and shape between 1978 and 2016. We found remarkably consistent reductions in body size, leading us to test the hypothesis that increases in temperature over this four-decade period are associated with the observed declines in body size. We exploit the densely sampled nature of our data to test the relationship between temperature and body size not only over the whole study period but also across shorter-term fluctuations in temperature.

100 In addition to decreases in body size, we also found a notable change in body shape: 101 as multiple metrics of body size have declined, wing length has increased among nearly all 102 species in the study. Longer and more pointed wings are associated with more efficient flight in 103 birds, particularly for long distance flights (Pennycuick 2008; Møller et al. 2017), suggesting that 104 some aspect of recent global change may be selecting for more efficient flight across this diverse 105 set of migratory birds. Given the consistent trends of decreasing body size that we observed 106 alongside consistent increases in wing length, we hypothesized that these dynamics may be 107 coupled. Specifically, we hypothesized that the observed change in wing allometry may be an 108 adaptive compensation for reductions in body size to efficiently accomplish migration with 109 powered flight. If decreasing body size precipitated selection for longer wings, we predict that 110 species with faster rates of body size decline will exhibit faster rates of increase in wing length. 111 Although morphological responses to climate change can be driven by complex ecological 112 dynamics (Van Gils et al. 2016; Bosse et al. 2017), selection on allometric relationships that 113 couple changes in size with changes in shape may also be an important dimension of phenotypic 114 responses to climate change.

115

116 Methods

Specimen and data collection.—Since 1978, The Field Museum's collections personnel
and volunteers have operated a salvage operation to retrieve birds that collided with buildings in
Chicago, IL, USA during their spring or fall migrations (Fig. S1). On every individual bird, a
single person (David E. Willard) measured: 1) tarsus and bill length using digital calipers; 2) the
length of the relaxed wing using a wing rule; and 3) mass using a digital scale. All measurements

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were taken on fresh or thawed carcasses prior to preparation as specimens, which, given the ease 123 of manipulation, is expected to improve the precision of measurements compared to 124 measurements of live birds or dried specimens. Sex was determined based on gonadal inspection, 125 and skull ossification enabled aging to Hatch Year (HY; fall birds hatched that summer) or After 126 Hatch Year (AHY; all spring birds and all fall birds at least one year old).

127 We filtered the dataset to 70,716 individuals from 52 species from 1978-2016 that were 128 consistently sampled and measured across time (for details, see SI Data Filtering). These species 129 are from 11 families and 30 genera of mostly passerines (Table S1). All species in the dataset are 130 migratory. Most breed in boreal or temperate forest or edge habitats, but some species are 131 grassland or marsh specialists, and their winter ranges, habitats, migratory distances, life 132 histories and ecologies are diverse (SI Ecology and Natural History).

133 *Quantifying change in measurements through time.*—We examined temporal change in 134 four aspects of morphology: tarsus, mass, wing length, and the first axis of a principle 135 component analysis (PCA) of tarsus, wing, bill length, and mass. We modelled each aspect of 136 morphology as the dependent variable in linear mixed-effects models using the 'lmer' function 137 from the R package lme4 (Bates et al. 2015b) in R (R Core Team 2018). We log transformed 138 each measurement because the 52 species differed in the magnitude of measurements, and to 139 facilitate comparison of relative rates of change among morphological traits. To test the change 140 in each trait through time, we included year (continuous, transformed to start at zero to facilitate 141 model fitting), sex, and age (HY or AHY) as fixed effects, and included a random intercept and 142 slope for year for each species. We assessed significance of parameters using the Satterthwaite 143 method, implemented in the R package ImerTest (Kuznetsova et al. 2017). We also conducted 144 analogous multilevel Bayesian models that accounted for phylogenetic relatedness (SI Bayesian 145 Modeling).

146 We conducted the PCA using the logarithms of tarsus, wing length, bill length, and the 147 cube root of mass (because it represents a volume) for all specimens with complete data. We 148 used the 'princomp' function in the stats package in R, constructing the axes using a covariance 149 matrix as the scale of variables was similar; the loadings on PC1 were nearly indistinguishable if 150 a correlation matrix was used. We interpreted scores on the first axis of the PCA (PC1) as a 151 metric of body size, following common practice (e.g. Grant & Grant 2008). Because all variables 152 were positively loaded onto PC1 and are expected to scale positively with body size, we

interpreted PC1 scores as positively related to body size. We transformed all PC1 scores to be
positive (by adding the absolute value of the minimum score, plus 0.01 to all scores).

155 Testing environmental determinants of morphological change.— To test hypotheses on 156 the environmental drivers of changes in body size, we generated species-specific estimates of 157 climatic and environmental variables (temperature, precipitation, and Normalized Difference 158 Vegetation Index [NDVI], a proxy for resource availability) on the breeding and wintering 159 grounds. First, we cropped breeding, wintering and resident ranges for all species (BirdLife 160 International 2015) to exclude unlikely breeding destinations for birds migrating through 161 Chicago (Fig. S1). For each species, we then calculated mean temperature, precipitation, and 162 mean maximum NDVI during June and December of each year (1981-2016) in the region 163 representing each species' likely breeding and wintering grounds, respectively (SI Environmental 164 *Data*). We also tested the sensitivity of our results to variation in how ranges were cropped (Fig. 165 S1).

166 We used linear mixed models to quantify the impacts of these species-specific 167 environmental variables on body size. We considered tarsus length to be the most appropriate and precise univariate metric of intraspecific variation in body size (Rising & Somers 1989; 168 169 Senar & Pascual 1997), given high variation in mass observed within individuals during 170 migration and the correlation between migratory distance and wing length often observed among 171 individuals (Zink & Remsen 1986, Förschler & Bairlein 2011). We also modelled PC1 as the 172 dependent variable to ensure that our results are robust to different characterizations of body 173 size. In these models, year, the environmental variables (i.e., precipitation, temperature, and 174 NDVI on the breeding and wintering grounds), sex, and season of collection were included as 175 fixed effects and random intercepts were included for each species. Models with random slopes 176 for all environmental variables did not converge, suggesting the data do not support such a 177 complex model (Bates *et al.* 2015a); therefore, we made the simplifying assumption that all 178 species are responding similarly to environmental conditions. All environmental variables were 179 scaled to a mean of zero and a standard deviation of one. These models only included AHY 180 birds, as HY birds had not experienced winter conditions, and the environmental covariates from 181 the season immediately prior to collection (i.e., season t). In addition, we fitted the model using 182 all age classes but included only the summer environmental variables, and age, as fixed effects. 183 Analogous multilevel Bayesian models that accounted for phylogenetic relatedness were

184 conducted (*SI Bayesian modeling*). Because the exact year of birth (and development) for AHY
185 birds is unknown, we tested for the impact of uncertainty in the age of AHY birds by running
186 two alternative models with environmental covariates from each of the two years preceding
187 collection (i.e., seasons *t*-1, and *t*-2, *SI Sensitivity of Results to Time Lag*).

188Testing environmental predictors of fluctuation in body size.—To further explore changes189in body size in relation to the climatic and environmental variables, we tested whether190fluctuations in tarsus were correlated and temporally synchronized with fluctuations in each of191the environmental variables identified as significant (i.e. P < 0.05) in the linear mixed-effects192models. We fit generalized additive models (GAMs) to each significant variable, modeling them193as a function of time and with a random effect for species. We used the 'gam' function in the R194package mgcv (Wood 2011) with default smoothing parameters determined by the model fitting.

195 We used cross correlation analysis (CCA) to analyze the relationships between smoothed 196 fluctuations in the dependent variables through time from the GAMs (that is, to test for 197 synchronized fluctuations in tarsus and the climate variables). In CCA, time series data should be 198 stationary such that after removing any temporal trend, the mean and variance do not change 199 over time. We tested whether the predicted values of the GAMs were stationary using the 200 Kwiatkowski Phillips Schmidt Shin test (Koupidis & Bratsas 2019). All climatic and 201 environmental variables were stationary, but the tarsus data were not, so we used the first 202 differences of the tarsus time series (the differences between tarsus at time t and t-1)—which 203 were stationary-to compare fluctuations among tarsus and the environmental variables. The 204 CCA was implemented using the 'ccf' function in the R package tseries (Trapletti & Hornik 205 2017). For visualization purposes, we also calculated the derivatives of the GAMs for summer 206 temperature and tarsus (i.e., the change in slopes of tarsus and environmental variables through 207 time) at 1,000 points along the time series, using the 'derivatives' function in the R package 208 gratia (Simpson 2019).

Association between rates of change of wing and tarsus.—To test whether rates of change of wing length were associated with rates of change in body size, we tested the correlation between the species-specific rates of change of wing and tarsus from the linear mixed-effects models for wing and tarsus, respectively (Figure 2, Tables S2 and S5). We used three methods to calculate the correlation in slopes: a linear model, a phylogenetic generalized least squares (pgls) model implemented in the R package ape (Paradis *et al.* 2004; Pinherio *et al.* 2013), and a pgls 215

approach that treated the standard errors of the random slope estimates in both rates of change of

- 216 wing length and rates of change of tarsus as sampling error (Ives *et al.* 2007), implemented using
- 217 the 'pgls.Ives' function from the R package phytools (Revell 2012). We fit the latter model
- 218 10,000 times and report the mean parameter results.
- 219

220 **RESULTS**

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222 Consistent reduction in body size

223 Despite the ecological and phylogenetic diversity among species, we found consistent reductions in all indices of body size (tarsus, mass, and PC1) across species over the course of 224 225 the study (Fig. 1, Fig. 2). We found significant negative relationships between year and tarsus length (-6.20 x10⁻⁴, SE 2.93 x 10⁻⁵, $P \ll 0.001$), mass (-6.94 x 10⁻⁴, SE 1.19 x10⁻⁴, $P \ll 0.001$), 226 227 and PC1 (-1.76 x 10⁻³, SE 5.82 x 10⁻⁵, $P \ll 0.001$); see Tables S2-S4 for full model results. These 228 declines represent a mean decline of 2.4% in tarsus length and 2.6% in mass from 1978-2016. 229 Nearly all species-specific changes in tarsus were declines, with standard error estimates that did 230 not overlap with zero, and all species with significant changes in mass and PC1 got smaller (Fig. 231 2). The consistency among species is reflected in the extremely low (near zero) slope variances of the random year slopes for species across size indices $(2.45 \times 10^{-8}, 5.51 \times 10^{-7}, \text{ and } 1.22 \times 10^{-7}, 10$ 232 233 for tarsus, body mass and PC1, respectively, Table S2-S4). Similar results were obtained using 234 multilevel Bayesian models that accounted for phylogenetic relatedness (Table S6).

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Consistent increases in wing length resulted in widespread changes in body shape

In contrast to tarsus, mass and PC1, wing length increased through time across nearly all species $(3.29 \times 10^{-4}, \text{SE } 3.35 \times 10^{-5}, P \ll 0.001$, see Table S5 for full results; Fig. 2). This reflects an increase in wing length of 1.3% from 1978-2016. These shifts were consistent across species in our study (Fig. 2), with a slope variance of the random slopes of 4.19 x 10⁻⁸, Table S5). As with the body size traits, Bayesian analysis that accounted for phylogenetic relatedness yielded similar result (Table S6).

243

244 Increasing summer temperatures drive body size decline

245 We recovered several significant relationships between climatic and environmental 246 variables and body size. Results presented here are for the models that include all winter and 247 summer variables, with tarsus as the index of body size (Table S7); results for PC1 were 248 qualitatively similar (Table S8). Mean temperature on the breeding grounds was significantly negatively associated with body size (-1.22 x 10^{-3} , SE 1.93 x 10^{-4} , $P \ll 0.001$). Neither summer 249 250 precipitation nor summer NDVI were significantly negatively associated with body size 251 (precipitation: -2.34 x 10⁻⁴, SE 2.36 x 10⁻⁴, P = 0.32; NDVI: 1.39 x 10⁻⁴, SE 4.57 x 10⁻⁴, P =252 0.76). Of the winter variables, there were significant associations between winter temperature 253 and body size (9.39 x 10^{-4} , SE 1.94 x 10^{-4} , P << 0.001), and winter precipitation and body size (-1.17 x 10⁻³, SE 3.74 x 10⁻⁴, P < 0.01). Winter NDVI was not significantly associated with body 254 255 size (-8.71 x 10^{-5} , SE 2.5 x 10^{-4} , P = 0.73). All results are robust to changes in the environmental 256 variables as a result of different approaches to cropping the breeding ranges (Fig. S1), 257 differences in the modeling approach (Tables S10-S11), considering both age classes and hence 258 the breeding range covariates only (Tables S7-S8) and temporal lagging of the variables (Table 259 S9). The predictor variables were not highly correlated (the highest correlation, between summer 260 NDVI and summer precipitation, was 0.56).

261 The three significant climatic predictors of body size (summer temperature, winter 262 temperature and winter precipitation) also showed temporal fluctuations that are significantly 263 associated with temporal fluctuations in body size. The cross correlation of the GAMs (i.e., 264 short-term fluctuations) of mean summer temperature through time and the first differences of tarsus through time was negative and significant at a time lag of zero (correlation = -0.59, P < -0.59265 266 0.05), and the correlation at a one-year lag (i.e., comparing tarsus at year t with summer 267 temperatures at year t-1) was even stronger (correlation = -0.63, P < 0.05; Fig. 3). The cross 268 correlations of the short-term fluctuations in winter temperature were not significant at a time lag of zero (correlation = 0.29, P > 0.05), but were significant and positive (correlation = 0.36, P < 0.05) 269 270 (0.05) at a one-year lag. Fluctuations in winter precipitation was also significantly correlated with 271 fluctuations in tarsus at a time lag of zero (correlation = 0.61, P < 0.05). However, winter 272 precipitation has only changed marginally over the course of the study (SI Climatic and 273 Environmental Variables Through Time).

274 Correlated Rates of Change in Tarsus and Wing Length.— As expected if increases in
 275 wing length are associated with body size decline, we found evidence that species' rates of

276 change in body size were significantly, negatively associated with species' rates of change of 277 wing length (-0.4, SE -0.1, P = 0.01; Fig. 4). In other words, species that were getting smaller faster also underwent more rapid increases in wing length over the 40-year period. The slope of 278 279 this relationship is consistent after correcting for phylogenetic relatedness, however the 280 relationship was not significant (-0.3, SE 0.2, P = 0.16; Fig. 4). After controlling for both 281 phylogenetic relatedness and treating the standard error in the random slope estimates as 282 sampling error, we recovered a similar slope, however the relationship was not significant (mean 283 slope of -0.2 and P = 0.77; Fig. 4).

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285 **DISCUSSION**

287 Over the past four decades, for 52 species of migratory North American birds, body size 288 has declined while wing length has increased. Despite the diversity of natural histories, habitats, 289 and geographic distributions represented by the species in our data, these changes were 290 remarkably consistent (Figs. 1.2). Body size reductions were near-universal across species and 291 were recovered regardless of whether we represented body size with tarsus, mass, or PC1 (Fig. 292 2). In contrast to all other morphological metrics, wing length increased consistently across 293 species (Fig. 2), indicating significant changes in body shape alongside the reductions in body 294 size.

295 As predicted, based on our hypothesis, our model results showed a significant negative 296 relationship between summer temperature and body size after controlling for plausible alternate 297 environmental and climatic drivers of body size for such a diverse group of species. 298 Additionally, summer temperature and body size show significantly correlated and synchronized 299 shorter-term fluctuations, with changes in temperature consistently followed by changes in body 300 size the following year (Fig. 3), providing further evidence that increasing summer temperature 301 may have an important role in driving reductions in body size. Two additional variables (winter 302 temperature and winter precipitation) were associated with body size in our models, though as 303 we discuss below, the results are more difficult to interpret.

Developmental plasticity and selection on heritable variation represent two potential,
 non-exclusive mechanisms underlying the observed changes in body size in our data.
 Experimental studies have shown that higher ambient temperatures during nesting can lead to a

reduction in avian adult body size as a result of developmental plasticity during the growth of
nestlings (Mariette & Buchanan 2016; Andrew *et al.* 2017). This raises the compelling
possibility that the consistent patterns of body size reduction we observe, in concert with the
inverse correlation between body size and summer temperature, may be indicative of a plastic
response to increased temperatures during development operating across the species in our study.
However, the present data alone are not sufficient to distinguish developmental plasticity from
changing selection pressures on body size.

314 Cold weather metabolic demands are often invoked to explain Bergmann's rule (or are 315 considered an integral part of the rule; Watt et al. 2010)), with the smaller ratio of surface area to 316 volume that accompanies increased body size considered beneficial in colder climates (Gardner 317 et al. 2011; Sheridan & Bickford 2011; Teplitsky & Millien 2014). As such, warming winter 318 temperatures could conceivably relax directional selection for larger body size, indirectly 319 resulting in body size reduction, though we note that the migratory birds in our study vacate the 320 coldest parts of their ranges during the winter, making cold weather selection on body size 321 perhaps less relevant than for non-migratory organisms (Zink & Remsen 1986). In our linear 322 mixed-models, winter temperature was significantly associated with body size and there was 323 some evidence of coincidence in short-term fluctuations in body size and winter temperature (Fig 324 S2). However, the association was positive, with increasing winter temperature predicted to yield 325 larger bodies. Winter precipitation also predicted body size declines over the short- and long-326 term (Fig. S2 and Tables S7-S8, S10), but winter precipitation changed only subtly over the 327 course of the study (SI Climate and Environmental Variable through Time). Winter precipitation 328 has been shown to have a positive impact on the food availability and body condition (mass) of 329 birds wintering in precipitation-limited regions of the subtropics (Studds & Marra 2007). 330 However, it is not clear how winter precipitation would lead to increased body size per se, and 331 whether such dynamics are relevant across the 52 species in our study that winter in a wide 332 variety of habitats, latitudes and climatic conditions. Thus, the influence of winter temperature 333 and winter precipitation on body size remains uncertain.

More complex ecological dynamics of global change, such as food limitation as a result of climate change-driven phenological mismatches (Both *et al.* 2006; Van Gils *et al.* 2016), may also contribute to body size reduction. Given the observational nature of our data, it is not possible to completely rule out alternative, non-climatic selective pressures (e.g., reduced food 338 availability), particularly if these processes are themselves driven by cyclical fluctuations in 339 temperature. However, because the relationship between summer temperature and body size is 340 evident after controlling for the long-term trends in the data, an alternative mechanism would 341 need to exhibit both a 40-year correlation with body size as well as a significant relationship with 342 body size after controlling for long-term trends. We did not find such a relationship for either 343 winter or summer NDVI. Further, the consistent change in size across the species in our study — 344 which are ecologically diverse and breed and winter in a wide variety of habitats with different 345 phenological dynamics — supports a role for fundamental metabolic or physiological processes 346 (e.g., temperature-body size relationships) influencing the observed trends.

347 Why has wing length increased as body size has declined in nearly all 52 species in our 348 study? Avian wing length reflects a complex balance of selection pressures ranging from 349 predator avoidance (Witter & Cuthill 1993; Kullberg et al. 1996; Swaddle & Lockwood 1998; 350 Martin et al. 2018), to foraging behavior (Norberg 1979; Fitzpatrick 1985), to flight efficiency 351 (Rayner 1988; Pennycuick 2008). One possibility is that increasing selection for proportionately 352 longer wings during the migratory period could be a result of increasing migratory distance 353 through time. Migratory distance is positively correlated with wing length both within and across 354 species in passerines (Winkler & Leisler 1992; Förschler & Bairlein 2011), suggesting that 355 increases in wing length through time could be a response to northward shifts in breeding ranges 356 if lower latitude wintering ranges have remained static. However, trajectories of warming-357 induced range shifts have been idiosyncratic across North American bird species (Tingley et al. 358 2009), and there is some evidence that the winter ranges of migratory may be moving northwards 359 as well (La Sorte & Thompson 2007; Visser et al. 2009; La Sorte & Jetz 2012). By contrast, the 360 observed increase in wing length is remarkably consistent across the species in our dataset (Fig. 361 2). Additionally, our data should be robust to changes in geographic distribution, as has been 362 noted in other studies examining morphological change in migratory species (Van Buskirk et al. 363 2010). This is because all individuals sampled in our study are from populations that breed north 364 of Chicago and winter south of Chicago, meaning that individuals from across the latitudinal 365 breadth of the breeding grounds (Fig. S1) are likely to have been sampled in Chicago. As such, 366 the majority of our data are likely consistently derived from individuals that breed within the 367 core of their species' range (Van Buskirk et al. 2010), whereas range shifts should lead to 368 selection for longer wing lengths at the southern and northern edges of the range. However,

identifying the geographic provenance of individuals in our dataset will be necessary to directly
 test the relationship between range shifts and morphological change.

371 Birds that migrate earlier and arrive first on the breeding grounds have been found to 372 have longer wings than birds that arrive later (Bowlin 2007; Hahn et al. 2016), raising the 373 possibility that advancing spring phenology may select for longer wings (Møller et al. 2017). 374 Additional data are necessary to test this hypothesis. As with range shifts, evidence for 375 phenological changes in timing of migration in North American birds has been variable 376 (Knudsen et al. 2011; Mayor et al. 2017; Socolar et al. 2017; Horton et al. 2019), in contrast to 377 the consistently increasing wing lengths observed among the species in our study. Further 378 research should also address the possibility that habitat fragmentation may select for longer 379 winged individuals due to increased distances between migratory stopover points or dispersal 380 distances (Desrochers 2010).

381 Shifting geographic ranges, phenological changes and habitat fragmentation are plausible 382 and non-exclusive selection pressures that could increase wing length among species. However, 383 we suggest that the near-universal change in wing length across the ecologically diverse species in our dataset may be evidence of a more fundamental physiological impact of rapid climate 384 385 change on migratory birds. Specifically, we propose that longer wings relative to body size 386 confers a selective advantage as body size declines in migratory birds due to decreased metabolic 387 efficiency (increased energy required per unit mass; Hudson et al. 2013) as individuals get 388 smaller, coupled with the increase in flight efficiency associated with longer, more pointed wings 389 (Bowlin & Wikelski 2008; Pennycuick 2008). As expected if wing length is increasing to 390 compensate for reductions in body size, those species that are getting smaller faster are also the 391 species that are increasing in wing length faster; Fig. 4). The complexities of the physics of flight 392 and their relationship with migration (Alerstam & Lindström 1990; Pennycuick 2008; Møller et 393 al. 2017), coupled with the dynamic environmental context of migration as the world changes, 394 preclude definitively identifying a mechanistic link between reductions in body size and an 395 increase in wing length to maintain migration. Understanding if the observed morphological 396 changes in body size and wing length represent a coupled response to global warming-versus decoupled trends driven by alternate forces-is an important avenue of future research, given the 397 398 consistency with which body size and wing length have changed across this diverse group of 399 species.

400

401 Conclusions

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403 Across 52 species of migratory birds, we find near-universal reductions in size over the 404 past four decades. We identify a significant relationship between summer temperatures and body 405 size after controlling for year and a suite of climatic and environmental factors; in addition, we 406 find correlated and synchronized short-term fluctuations in summer temperature and body size 407 that are consistent with long-term size reduction across species. Taken together, we interpret this 408 as strong evidence that warming temperatures are driving reductions in body size across this 409 diverse group of taxa. The observed concomitant increase in wing length may have expansive 410 ecological implications (Norberg 1990), particularly as the divergent trends in body size and 411 wing length combine to drive a change in shape that may face opposing selective pressures. 412 Should size and shape be a coupled response to increasing temperatures, understanding how 413 these changes interact with macroecological responses to climate change, including shifts in 414 phenology and geographic range, may be an important dimension of predicting biotic responses 415 to global warming.

416

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602	
603	Figure Legends
604	Fig. 1. Body size has become smaller through time. Tarsus length declined in nearly all
605	species in the dataset (Fig. 2A) with the nine most highly sampled species shown here. Dashed
606	lines have a slope of zero and an intercept equal to the mean tarsus length for each species.
607	
608	Fig. 2. Morphological change has been consistent across species and metrics of body size.
609	Across species, the rates of change in tarsus, PC1, mass, wing length, and relative wing length
610	(represented as log(wing/tarsus)) have been remarkably consistent, with the indicators of body

size declining (a-c) and wing length (d) and relative wing (e) length increasing from 1978-2016

- 612 in nearly all species. Points represent species-specific rates of change in each morphological
- 613 trait, with the bars showing their respective standard errors, derived from the linear mixed-effects
- models. Grey points and bars indicate species where the standard error overlaps with zero. Note
- that due to the properties of ratios, modelling log(wing/tarsus) as a dependent variable is
- 616 equivalent to modelling log(wing) as the dependent variable and including log(tarsus) as the

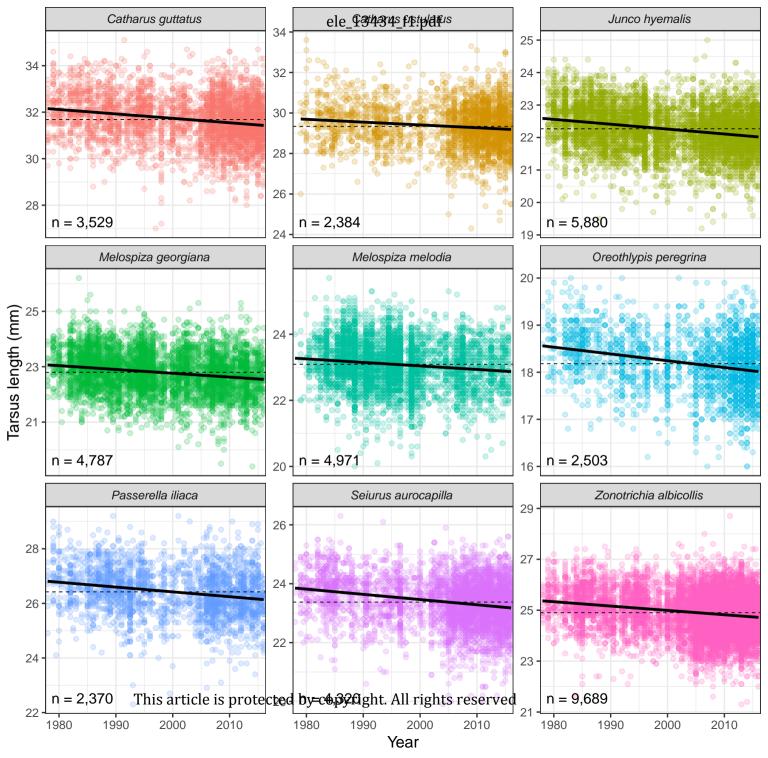
617 predictor variable. Fixed effect estimates for year are shown for all response variables (f).

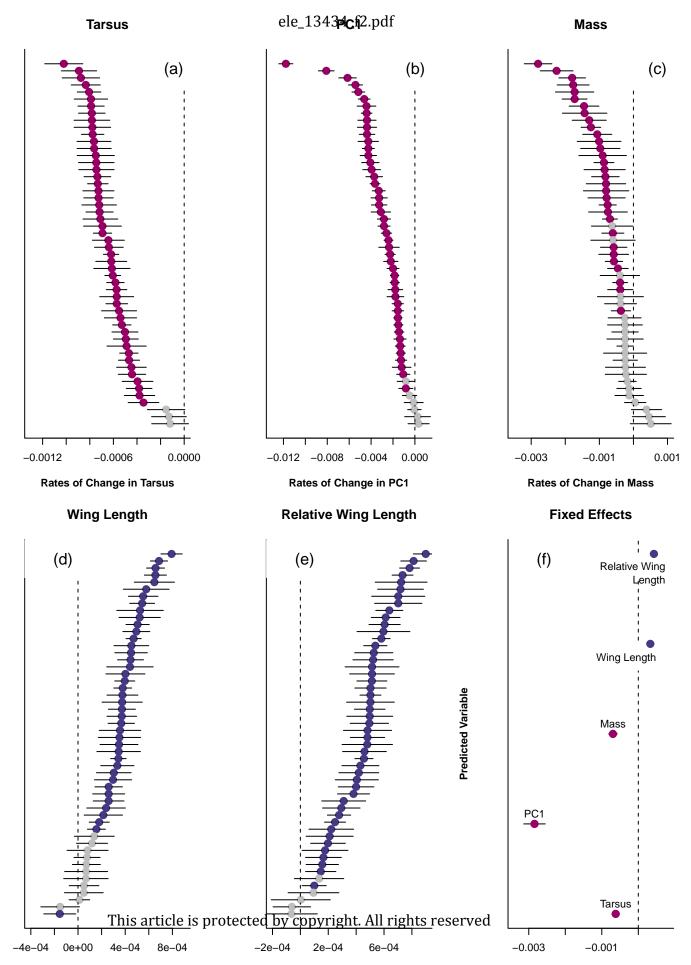
618

Fig. 3. Evidence for temperature-related body size declines. In addition to the long-term negative relationship between summer temperature and tarsus after controlling for climatic and environmental variables, short-term fluctuations in tarsus (a) and summer temperature (b) are significantly, inversely correlated. For ease of visualization, we also present the GAM slope derivatives (c), which show that periods of rapid change in temperature are often followed closely by periods of rapid, inverse changes in tarsus. The points depict inflection points in the slopes (c).

626

627Fig. 4. Species that are getting smaller faster are increasing in wing length faster. Species-628specific estimates of rates of change in tarsus are significantly associated with species' rates of629change in wing length (purple line; P < 0.05). Specifically, species with the fastest rates of tarsus630declines (more negative slopes) also had higher rates of wing increase (positive slopes).631Although this relationship is not significant after accounting for phylogenetic non-independence632(peach dashed line) or accounting for both phylogenetic relatedness and error in the slope633estimates (magenta dashed line), there is a consistent negative relationship among the models.





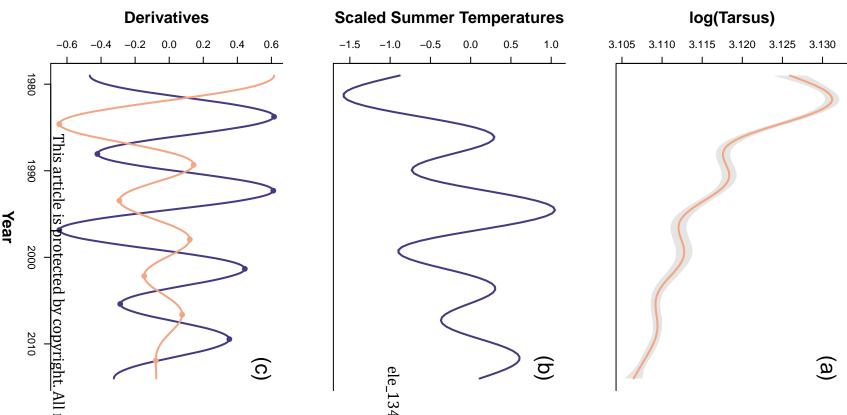
Rates of Change in Wing Length

Species

Species

Rates of Change in Relative Wing Length

Year Coefficient



Rate of Wing Length Change

