The effect of sociality on competitive interactions among birds

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ABSTRACT

Sociality can provide many benefits, including increased foraging success, reproductive opportunities, and defence against predation. How does sociality influence the dominance hierarchies of ecological competitors? Here, we address this question using a large citizen science dataset of competitive interactions among birds foraging at backyard feeders, representing a network of over 55,000 interactions among 68 common species. We first show that species differ in average group size (the number of conspecifics observed together) as a fundamental measure of sociality. When analyzing heterospecific competition, we find that sociality is inversely related to dominance. On average, a single individual from a solitary species is more likely to displace a size-matched opponent than a single individual from a social species. Yet, social species tend to gain an increase in their competitive advantage when in the presence of their conspecifics. Finally, we show that more social species have relatively fewer dominance interactions with heterospecifics, and more with conspecifics. Overall, these results demonstrate that sociality can influence competition in ecological networks. More social species have decreased competitive ability as individuals, but they may gain competitive ability in groups.

INTRODUCTION

Animal sociality can provide many ecological and evolutionary advantages, including increased foraging success [1,2], more frequent mating opportunities [3,4], and improved survival through dilution and confusion effects on predators [5,6]. However, sociality may also incur costs under certain circumstance, such as conflict among conspecific group members that share a similar niche [7,8]. The causes and consequences of animal sociality have historically been of interest in

evolutionary biology, with several different hypotheses for benefits that may explain the

44 evolution of social grouping. One hypothesized benefit of sociality is that social coalitions may

provide an advantage during conflict with competitors [9,10]. While both inter- and intraspecific

46 dominance is often enhanced by body size [11,12] and age/experience [13], there may also be

opportunities for subordinate individuals to gain an advantage over dominant competitors

48 through social coalitions [9,14]. During foraging, animals face competition from both

conspecifics and heterospecifics, but the influence of social grouping on the structure of these

50 competitive systems has not yet been described. Our aim in this study is to evaluate how

sociality influences competition in communities where interactions occur both within and

52 between species.

One system that provides an opportunity to study this is the network of competitive

54 interactions among birds at backyard bird feeders. In many temperate systems, survival in winter

depends on acquiring adequate food resources [15,16]. Moreover, the use of artificial food

56 sources (e.g., bird feeders) during winter foraging has been identified as having important

evolutionary consequences in birds [17,18], including high rates of competitive interactions

58 among and within species foraging at feeder locations [19,20]. These levels of competition may

depend on the rate of resource depletion, where regularly depleted feeders may generate higher

60 levels of resource competition than feeders that are continually replenished [21]. In the context

of sociality, group foraging can provide more opportunities for resource acquisition than

62 foraging independently due to shared vigilance [22,23] (but see [24]), social information

gathering [25,26], and improved dominance over solitary foragers [27]. Individuals in many

64 species have been found to adopt social foraging strategies in the winter when resources are

scarce [28]. Additionally, sociality in the winter has been associated with reproductive

66   advantages in subsequent mating seasons [29,30].

Here, we investigate how sociality influences competition using interactions among birds

68   that visit backyard feeders. Our predictions at the outset of this study were that more social

species may gain a benefit in interspecific conflict, at a cost of increased rates of intraspecific

70   conflict. We tested these predictions using data from Project FeederWatch (PFW), a surveying

program with a network of tens of thousands of observers across North America who monitor the

72   presence and interactions of hundreds of bird species throughout winter (Figure 1). This project

has yielded a rich dataset indicating who competes with whom, and how often (Figure 1D).

74   Previous research using PFW observations has revealed that species body mass is the primary

predictor of competitive dominance within winter bird communities across North America [12].

76   Owing to the large number of interactions observed and variation in competitive outcomes

(Figure 1D), the PFW citizen science program provides an ideal system to test how variation in

78   sociality might influence competitive interactions after accounting for the effects of body size.

Here, we define species differences in winter sociality using a simple metric of

80   conspecific group size (i.e., the number of individuals of a given bird species observed at a given

a location at the same time in the PFW database; Figure 1A-C) [31]. It is important to note that

82   sociality also has other dimensions beyond the simple tempo-spatial aggregation studied here,

such as the stability of group membership, the types of relationships between group members,

84   and other emergent properties of group organization [32,33]. Nevertheless, conspecific

groupings – individuals found in the same place at the same time – represent the most

86   fundamental dimension of sociality that we expect to influence competitive outcomes across

species.

As a first step in this study, we established that winter sociality differs across bird species by quantifying the repeatability of group size (Figure 1A). We also estimated the phylogenetic

signal of average group size, which describes the extent to which this trait is more similar among closely related species (Figure 1B). Next, we analyzed the outcome of >55,000 heterospecific

dominance interactions (a subset of these is shown in Figure 1D). Our aim was to evaluate whether average group size (as a species-level trait) is associated with species differences in

dominance against size-matched opponents, and whether the presence of conspecifics would positively or negatively impact each species' competitive ability (hereafter, we refer to this

impact as the "conspecific effect"). We expected that more social species would have greater dominance over size-matched opponents, and a more positive conspecific effect. Finally, we

analyzed the frequencies of conspecific and heterospecific interactions (Figure 1D), to determine whether sociality is associated with variation in the most common sources of conflict.

MATERIALS AND METHODS

102   *(a) Data sources*

We used a dataset collected by Project FeederWatch (PFW), an extensive, comprehensive and

104   ongoing monitoring program with over 9 million observations of birds at winter feeding locations in North America during the months of November through April. For this study, we

106   collected PFW data from the period November 2015 – April 2020. Participants were invited to monitor their chosen feeding location during weekly two-day observation periods throughout the

108   winter. Participants recorded which species they observed and the maximum number of co-occurring individuals that they observed simultaneously at the feeding location for each species.

110   Some participants also recorded displacement interactions, used in our analysis of competition

described in section (c) of the Methods below. Additionally, as a measure of observation effort,

112   each participant indicated the number of 2-hour monitoring sessions performed (up to a

maximum value of four monitoring sessions per two-day observation period). Collected PFW

114   data routinely undergo a data validation protocol (highlighted in [34]) to reduce biases in species

reporting and identification often associated with citizen science [35]. For the purpose of the

116   present study, we focused our analyses on a set of the most common species that had at least 100

displacement interactions (n = 68 species, Table S2). All data analyses were performed in R

118   (version 4.0.3) [36].

120   *(b) Quantifying species differences in sociality*

As our measure of sociality, we used group size, defined as the maximum number of individuals

122   of a given species observed simultaneously during a given monitoring session (see examples in

Figure 1A). To assess whether focal species differ in their average winter sociality, we analyzed

124   the repeatability of this metric using the "rptR" package [37]. Hence, repeatability is defined as

the proportion of total variation in group size that is attributed to differences among species. A

126   high value of repeatability in this analysis indicates that most of the variation in group size is due

to differences among species, whereas a low value (near 0) indicates that species differences in

128   this trait are not detected. Because the size of the dataset was so large (n = 8,575,748

observations of the 68 focal species), we used a bootstrapping approach to estimate repeatability.

130   For each bootstrap iteration, we randomly selected a subset of data with 1,000 observed group

sizes for each of the 68 focal species (randomly chosen from the full dataset available for each

132   species). We used this subset to compute conditional repeatability, adjusted by observation

effort, using the Poisson distribution and log link as appropriate for these count data. This

134   procedure was repeated 100 times to derive a distribution of repeatability estimates for species

differences in average group size.

136   Upon finding that average group size differs among species, we estimated each focal

species' average group size as our measure of winter sociality for further comparative analyses.

138   To do this, we fit a regression model for each focal species where the response variable was the

observed group size (log-transformed; n = 3,200 – 551,026 observations, depending on the

140   species), with a fixed effect of observation effort. From the fitted models, we defined each

species' sociality as its predicted average group size on a log scale given an effort of one

142   monitoring session (Figure 1B; Table S2). We also estimated Pagel's lambda for species-average

group size [38]. Values of lambda closer to 1 would indicate that closely related species have

144   similar group size values, and values near 0 would indicate that variation in group size is

independent of phylogenetic relatedness.

146   As an additional check on our metric of group size, we collected information on the

natural history each focal species during winter from species accounts in the Birds of the World

148   online resource [39]. We used these descriptive accounts to classify each focal species into one

of three categories: often flocking (clear descriptions of winter flocking and/or group behaviour),

150   sometimes flocking (indicators of occasional winter flocking and/or participation as a satellite

member), and rarely flocking (described as independent in winter).

(c) Modelling heterospecific competition

154   We modelled heterospecific dominance interactions by using a dataset of displacement events,

defined as instances when one individual purposefully takes over, or dislodges, another bird from

156   the feeding location (see supplement for further details). PFW participants recorded 88,988

displacement interactions among 196 bird species in the 2016-17, 2017-18, 2018-19 and 2019-20

158   winter seasons, with most of these observations (71%) collected in winters of 2017-18 and 2018-

19. In this analysis, we used displacement interactions that involved two different species,

160   wherein at least one of the two interactors belonged to a focal species (n = 55,483 interactions).

It is important to note that these interactions involved one bird displacing another, and did not

162   include collective events such as mobbing (see supplement for details).

        We used a binomial mixed-effects regression model in the "lme4" package [40] to model

164   the outcome of these heterospecific interactions. The aim of this model was to evaluate whether

average group size (as a species-level trait) is associated with species differences in dominance

166   against size-matched opponents, and whether the presence of conspecifics impacts competitive

ability differently across species. The model had two random effects: the identity of the

168   "primary" species, and the identity of its opponent species. These identities were assigned

randomly in a bootstrapping procedure, with details below. The response variable was the

170   outcome of the displacement interaction (i.e., whether the primary species was dominant in the

displacement interaction). The model included fixed effects of the primary species' average body

172   mass (log-transformed), the primary species' average group size (log-transformed), its relative

group size during that particular observation session (expressed relative to its species average),

174   and the relative body mass of its opponent (defined as the difference in log-transformed species-

average body masses, opponent – primary). In this binomial model, the slope parameter for the

176   primary species' average group size captures the association between species-level differences in

sociality and species-level differences in dominance (we also describe further comparative

178   analyses of this relationship in section (d) below). The slope parameter for relative group size

captures the "conspecific effect". A positive estimate for this slope parameter would indicate that

180   the presence of additional conspecifics can boost competitive ability, whereas a negative slope

would indicate that the presence of conspecifics can hinder competitive ability. To test whether

182   the conspecific effect is species-specific, we included a random slope for the relative group size

parameter. This allows the conspecific effect to vary among species. We then compared the fit of

184   the model with this random slope to a simpler model that lacked the random slope using AIC and

the likelihood ratio test. Stronger support for the random slope model would indicate that the

186   conspecific effect varies significantly among species.

To account for the fact that both species in a heterospecific interaction may be considered

188   as primary, we bootstrapped this analysis by repeating the procedure described above 100 times.

In each bootstrap iteration, the primary and opponent positions for each interaction were

190   randomly assigned. Hence, the bootstrapping procedure ensured that each displacement

interaction was only represented once, such that the analysis did not pseudoreplicate the data.

(d) Comparative analyses of species dominance in relation to sociality

194   To test our main hypotheses about the relationships between dominance and winter sociality, we

used the bootstrapped model fits to quantify two further species traits for comparative analysis:

196   the 'competitive dominance' and 'conspecific effect' of a species. Competitive dominance was

defined as the predicted probability that a single focal individual (group size of 1) would be the

198   displacer in a dominance interaction against a same-sized (equal body mass) heterospecific

opponent. We extracted these predictions from the 100 bootstrapped models, and took the

200   average for each species as our measure of its competitive dominance when alone and facing

size-matched opponents.

To examine variation in the conspecific effect, we extracted the random (species-specific) slopes for relative group size. Negative slope values indicate that a species' dominance decreases

in the presence of conspecifics, whereas positive slope values indicate that a species' dominance increases in the presence of conspecifics. A value of 0 would indicate that the presence of

conspecifics does not affect a given species' dominance. As above, we extracted these values from 100 bootstrapped models, and took the average for each species as its 'conspecific effect'.

We consider analyses of this trait to be conservative because the PFW observers reported only one group size per species per monitoring session (the maximum group size they observed). As a

result, our estimates for the conspecific effect hinge on the assumption that species group sizes are relatively stable at a given feeder within a short span of time (e.g., [41–43]). Alternatively, if

species group sizes are highly variable over the span of a few hours, it would reduce our ability to detect conspecific effects.

To test the relations between species dominance and sociality, we ran two comparative analyses using the "brms" package [44] (n = 68 focal species). The response variables were

species' competitive dominance, and the conspecific effect, respectively, modelled with Gaussian error distributions. The predictor of interest was species-average group size (log

transformed). We ran these models both with and without accounting for the phylogenetic relationships among species in the random effects structure. If the phylogenetically adjusted

model estimated a weaker effect size for a given predictor than the simpler model, it would indicate that the relationship is driven by differences among broader lineages. We ran models for

10,000 iterations using two chains and verified that Rhat values were all between 1.00 and 1.05, indicating model convergence. We verified that residuals for Gaussian regression models were

normally distributed with no heteroscedasticity.

(e) Sources of conflict

Sociality may also influence the occurrence of competition (as well as its outcome). To compare

228   the typical sources of conflict for each species with those expected by chance, we used a null

model that was spatially constrained by region. The null model was computed as follows: within

230   each ith region (defined by latitude and longitude rounded to the nearest degree), we first

determined the proportion of total interactors for each jth focal species, p_{ij}. Then, we calculated

232   the expected number of conspecific and heterospecific interactions for each species, under the

assumption that interaction rates are determined by the composition of interactors in that region.

234   We took p_{ij}^2 as the expected probability of a conspecific interaction, and 2 x p_{ij} x $(1 - p_{ij})$ as the

expected probability of a heterospecific interaction for each species-region. We then multiplied

236   these probabilities by the number of interactions in the region to obtain expected counts. Finally,

we took the sum of the expected counts across all regions to get the total expected frequencies

238   for each focal species and compared these null expectations with observed values.

To test whether a species' social behaviour predicts variation in the sources of conflict,

240   we fit a regression model where the response variable was the observed proportion of

interactions against heterospecific opponents (one value per focal species). The predictor in this

242   analysis was the species-average group size. This model was fit using the Bayesian brms

package as described above, and we examined the model with and without accounting for the

244   phylogenetic relationships among focal species. We verified that residuals for this model were

normally distributed with no heteroscedasticity.

RESULTS

248 *(a) Species differ in the degree of sociality*

There is substantial variation both among and within species in average group size, as indicated

250 by significant repeatability for this trait ($R_{\text{link-scale}} = 0.36$, 95% CI = [0.29, 0.44]; Figure 1A, n =

68 focal species). Species-average group size also has a strong phylogenetic signal (lambda =

252 0.99, p < 0.001), indicating that closely related species share a very similar degree of sociality

(Figure 1B). Species-average group size also corresponds to broad descriptions from natural

254 history accounts (Figure 1C). Notably, our metric captures variation in group size both within

and among species.

(b) Species dominance in relation to sociality

258 In the bootstrapped model of all interactions, we found a strong negative association between

heterospecific dominance and species-average sociality (Figure 2A). Consistent with this result,

260 comparative analysis confirmed that competitive dominance is negatively related to sociality

(Figure 2B, Table S3). Hence, a single individual from a more social species is much less likely

262 to dominate size-matched opponents, as compared to a single individual from a less social

species. This conclusion is upheld when accounting for phylogeny (Table S3).

264 We found strong support for species differences in the 'conspecific effect' (bootstrap

average of ΔAIC = 40.0 in favour of random slope models; all LRT p-values < 0.005). Some

266 species, like the pine siskin (*Carduelis pinus*), gain a large increase in competitive ability when

more conspecifics are present (Figure 2C). Other species, like the blue jay (*Cyanocitta cristata*),

268 become less dominant when more conspecifics are present (Figure 2D). We found that the

conspecific effect tends to be more positive in more social species (Figure 2E, Table S4). Thus,

270 more social species gain a greater boost in dominance from the presence of conspecifics, as

compared to less social species. This association, while weak, was upheld when accounting for

272   phylogeny (Table S4).

274   *(c) Sources of conflict*

Nearly all species experience less conflict with heterospecifics, and more conflict with

276   conspecifics, than expected in a null model (Figure 3A-B). When examining species differences

in the sources of conflict, we find that more social species have proportionately less conflict with

278   heterospecifics (and hence, a greater proportion of their conflict is with conspecifics; Figure 3C,

Table S5). This association was weaker when accounting for phylogeny, indicating that it is

280   primarily driven by differences among lineages within our sample (Table S5).

282   **DISCUSSION**

Here, we examine the effect of social clustering on competition among winter resident birds. We

284   find that species vary in their average group size, and that certain phylogenetic clades are more

social than others. Contrary to our initial prediction, we find that individuals from more social

286   species are also weaker competitors when facing size-matched heterospecific opponents (Figure

2B). This result suggests that there may be an evolutionary trade-off whereby the evolution of

288   greater sociality is associated with reduced competitive ability of an individual against other

species. Our results also show that more social species experience an increase in competitive

290   ability when in the presence of their conspecifics (Figure 2E). Collectively, these results suggest

that more social species have reduced competitive ability as individuals, but gain a boost in

292   competitive ability in groups.

We can hypothesize several potential mechanisms that may drive the patterns in Figure 2.

294   First, the inverse relationship between species differences in sociality and competitive

dominance may be due to a loss of aggressive or antagonistic behaviours against heterospecifics

296   during the evolution of sociality. It is also possible that social species simply invest less into

competition with other species over food, for example if it is more beneficial for social species to

298   limit their interactions to conspecific competitors, or if social species are less motivated to

compete because they can rely on other strategies for finding food (e.g., social information

300   transfer) [45,46]. To test these hypotheses, further studies are required to test behavioural

differences under conditions where motivation and experience can be controlled.

302   We can also propose several hypotheses that may explain variation in the conspecific

effect, and the fact that it is generally more positive in more social species (Figure 2E). One

304   possibility is that the conspecific effect may be driven intrinsically, as a consequence of other

species-level traits. For example, social species may have increased plasticity in aggression,

306   boldness, and/or vigilance that allows them to adjust their agonistic behaviour depending on the

context [47,48]. The evolution of sociality has also been shown to be associated with enhanced

308   cognition [49] and collective intelligence [50], which could also underly this effect. Yet another

possibility is that the conspecific effect could be a by-product of within-species dominance

310   hierarchies in more social species. For example, when a social flock visits a feeder, access may

be biased toward the most dominant and aggressive individual(s) in the group, who may in turn

312   be more likely to prevail against heterospecific competitors. The conspecific effect may also be

driven extrinsically by opponent responses (e.g., if larger groups of a more social species are

314   more coordinated in ways that generate more intimidating visual and/or acoustic signals). These

intrinsic and extrinsic explanations for the conspecific effect are not mutually exclusive. Testing

316 causal hypotheses will require careful experimentation.

Our results examining sources of conflict suggest that the evolution of sociality leads to

318 less frequent conflict with heterospecific competitors, and more frequent conflict among

conspecifics. In the presence of many conspecifics, individuals may interact more often,

320 especially if they are collecting similar resources [7,8]. Members of a group may experience

increased rates of aggressive interactions at times of food scarcity [51,52]. One way to reduce

322 competition pressures between conspecifics may be through participation in mixed-species

flocks. Mixed-species flocks have been found to provide members with greater advantages than

324 conspecific coalitions, including increased foraging rates and reduce vigilance effort [1]. While

some evidence suggests that members of mixed-species flocks are more similar than expected

326 [53], they undoubtedly vary more in their ecological needs than same-species flocks and

therefore may demonstrate a reduced level of within-group conflict than a conspecific coalition

328 [54–56]. A key question for future research is whether mixed-species flocking can reduce the

frequency of within-group conflict.

330 Our results raise interesting questions for future research on other ecological factors. For

example, low resource availability is expected to generate higher levels of competition [21]. It

332 would be interesting to test whether environmental harshness influences the magnitude of the

conspecific effect. It is possible that social species experience even stronger conspecific effects

334 when resources are more limited. Additionally, weather conditions such as precipitation and

temperature may constrain foraging behaviour and may affect the costs and benefits of

336 competitive interactions as well as social clustering behaviour [57]. Further studies are thus

required to investigate how these environmental challenges may affect the structure of

338   competitive dominance networks.

It is important to note that while we define sociality as the aggregation of individuals in

340   space and time, there are other dimensions of sociality that are also expected to play a role in

influencing competition. For example, members of a temporary flock with short-term social

342   bonds may experience a weaker influence of conspecifics than members in a structured

dominance hierarchy with long-term, persistent bonds [12,58–60]. This raises interesting

344   questions for future work that can be addressed by tracking specific individuals within groups.

For example, how does the strength of social bonds and the organization of a group influence a

346   species' competitive ability? Do such effects on competition change with temporal variation in

species social organization? Within a species, how does the strength of a coalitionary

348   relationship affect the dominance of one group over others?

Previous studies have examined the benefits of coalitionary behaviour on within-species

350   conflict [9,14,61]. Our results here demonstrate how sociality can also influence the dynamics of

ecological competition, and how a species' tendency to form social groups can be associated

352   with the evolution of reduced competitive ability as individuals. These findings provide valuable

insight into the fundamental effects of grouping behaviour on competitive interactions during

354   foraging. Further questions remain as to the effects of specific social bonds and the emergent

properties of groups on competitive interactions, along with the effects of additional influential

356   variables, such as cognitive ability, resource abundance, and environmental conditions on the

relationships between sociality and competition.

FIGURE LEGENDS

Figure 1. Bird species differ in winter sociality and competitive dominance. A) Example of
362   daily average group sizes (± SE) for seven bird species during winter 2017-18, with average
group size indicated by colour of the line. These species were chosen for visualization purposes
364   to represent a wide range of avian families. B) Phylogeny of 68 focal bird species with average
group size shown by the size and colour of the outer bars. Note that the colour gradient
366   throughout this figure follows the legend in (A). C) Species-average group size in relation to
descriptions from natural history accounts. Horizontal lines indicate medians. D) Competitive
368   network illustrating dominance interactions among a subset of common species, chosen for
visualization purposes, with at least 2,000 displacement interactions. Each row represents a
370   species, and the thickness of grey connecting lines indicates the frequency of competitive
interactions. Horizontal connections represent competitive interactions with conspecifics.
372   Species nodes are ordered vertically (top to bottom) from the most to least dominant and
coloured by average group size. Labels represent species common names (see Table S1 for
374   details).

376   **Figure 2. Relationship between sociality and heterospecific dominance.** A) There is a strong
negative association between species-average sociality and heterospecific dominance. This
378   density plot shows the distribution of effect sizes from the bootstrapped models of heterospecific
interactions in PFW. B) Scatterplot showing each species' competitive dominance (the predicted
380   probability of a single individual winning a heterospecific competition) in relation to species-
average group size (n = 68 focal species). C-D) Examples illustrating how species differ in the
382   relationship between dominance and the presence of conspecifics. Panels C-D show partial
residual plots for two species: the pine siskin, where larger group sizes are associated with
384   increased competitive ability, and the blue jay, where larger group sizes are associated with
reduced competitive ability. E) Scatterplot showing the conspecific effect in relation to species-
386   average group size (n = 68 focal species). In B and E, the datapoints show bootstrapped average
y-values and the grey lines show model fits based on 100 bootstrapped estimates (see methods
388   for details).

390   **Figure 3. Conflict with heterospecifics occurs less often than expected, especially in more
social lineages.** Observed frequencies of (A) heterospecific and (B) conspecific dominance
392   interactions in relation to null expected values for 68 focal species. Along the red dotted 1:1
lines, the observed frequency equals the expected value. (C) Scatterplot showing the proportion
394   of conflict with heterospecifics in relation to species-average group size. Note that the line of
best fit does not account for phylogeny (see Table S5 for additional details).

396 DATA ACCESSIBILITY
All data and R scripts are available at: https://figshare.com/s/1cd6708a27a541029409
398 The repository will be made public when the final version of the study is published.

400 AUTHOR CONTRIBUTIONS
IB and RD designed the study with input from ETM. ETM developed the behavioural
402 interactions methodology in Project FeederWatch. IB and RD analyzed the data and wrote the
manuscript. All authors edited the manuscript.
404
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406 We have no competing interests.

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416

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Figure 1

Figure 2

Figure 3