1	Family-living and cooperative breeding in birds are associated with the number of avian
2	predators
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## 27 Abstract

Cooperative breeding occurs when individuals contribute parental care to offspring that are not their own. Numerous intra- and inter-specific studies have aimed to explain the evolution of this behaviour. Recent comparative work suggests that family living (i.e., when offspring remain with their parents beyond independence) is a critical steppingstone in the evolution of cooperative breeding. Thus, it is key to understand the factors that facilitate the evolution of family living. Within-species studies suggest that protection from predators is a critical function of group living, through both passive benefits such as dilution effects, and active benefits such as prosocial antipredator behaviours in family groups. However, the association between predation risk and the formation and prevalence of family groups and cooperative breeding remains untested globally. Here we use phylogenetic comparative analyses including 2984 bird species to show that family living and cooperative breeding are associated with increased occurrence of avian predators. These cross-species findings lend support to previous suggestions based on intraspecific studies that social benefits of family living, such as protection against predation, could favour the evolution of delayed dispersal and cooperative breeding.

#### 53 Introduction

54 Cooperative breeding is a form of cooperation where non-breeding individuals contribute parental 55 care to the offspring of others. It occurs across a wide range of taxa and is common in birds (Cockburn 56 2006). Many studies have examined its evolutionary drivers (Cockburn 2020), and found support for 57 a role of environmental unpredictability (Rubenstein and Lovette 2007; Jetz and Rubenstein 2011; 58 Griesser et al. 2017; Lukas and Clutton-Brock 2017; Johnson et al. 2023), or in contrast productive 59 habitats with a predictable environment (Gonzalez et al. 2013; Griesser et al. 2017; Johnson et al. 60 2023). Multiple studies also revealed an association with various life-history attributes, such as 61 cooperative breeders often having high survival (Arnold and Owens 1998; Griesser et al. 2017; 62 Cockburn 2020). Associations with ecological factors have also been uncovered, with for instance 63 cooperative breeders being more likely to occur where brood parasites are also present (Feeney et al. 64 2013). Across cooperative breeders, the majority of helpers are offspring or relatives of the breeding 65 pair that have delayed the onset of dispersal and independent reproduction (Koenig et al. 1992; Kokko 66 and Ekman 2002; Riehl 2013; Griesser et al. 2017; Kingma et al. 2021), although unrelated individuals 67 can also help (Riehl 2013). Thus, it is essential to understand the factors favouring the formation of 68 families, whereby offspring remain in close association with their parents beyond nutritional 69 independence but do not help them with reproduction-related tasks (Covas and Griesser 2007; 70 Drobniak et al. 2015). Family formation is considered a stepping stone in the evolutionary transition 71 from non-family living towards cooperative breeding (Griesser et al. 2017). However, in spite of the 72 large number of comparative analyses focusing on the factors associated with the evolution of 73 cooperative breeding, only a single comparative study investigated the factors associated with family 74 formation (Griesser et al. 2017).

Group living is an important behavioural mechanism to reduce predation risk (Alexander 1974;
Ebensperger 2001; Beauchamp and Krams 2023) and increase survival rates (Zhu et al. 2023).
Generally, all individual group members, regardless of kinship, can benefit through lower vigilance
levels (Beauchamp 2019), thereby increasing foraging efficiency (Schoener 1971; Pulliam 1973; Hintz

79 and Lonzarich 2018), and can also benefit from risk dilution (Hamilton 1971; Foster and Treherne 80 1981). Additional benefits can be gained in groups made of related individuals. Within-species studies 81 suggest that protection from predators is an adaptive benefit of family living. For instance, in Siberian 82 jay Perisoreus infaustus and Belding's ground squirrel Spermophilus beldingi, parents display increased 83 vigilance, alarm calling, or mobbing behaviour particularly when accompanied by related individuals 84 (Sherman 1977; Griesser 2003; Griesser and Ekman 2004, 2005). These nepotistic behaviours have 85 been found to provide incentives for offspring to remain in their family group by increasing survival 86 probabilities (Ekman et al. 2001; Griesser et al. 2006; Griesser 2013). Similar results were found in 87 cooperatively breeding *Neolamprologus* cichlid fishes, where experimental and observational studies 88 showed that increased predation risk was associated with delayed dispersal (Heg et al. 2004) and 89 increased the benefits of group living (Tanaka et al. 2016), hence being the main factor explaining 90 variation in social organisation in this taxon (Groenewoud et al. 2016). Altogether, these studies 91 suggest that living in family groups might be especially beneficial when predation risk is high.

92 Groups can be made of unrelated individuals, but can also be made of stable associations over 93 long time periods, often consisting of family members. In family-living species, groups usually break-94 up before the breeding season, while in cooperative breeders the group is typically together year 95 round (Drobniak et al. 2015; Koenig and Dickinson 2016). Thus, offspring in family-living species leave 96 the group much earlier than in cooperatively breeding species (mean number of days offspring remain 97 with their parent(s) beyond independence: 8 in non-family living species vs. 160 in family-living species 98 vs 360 in cooperatively breeding species; Griesser unpublished data). Therefore, based on the length 99 during which individuals stay in a group, we can expect that the predator avoidance benefits gained 100 by individuals (risk dilution and cooperative or nepotistic antipredator behaviours) gradually increase 101 from non-family living species, to family-living species, to cooperatively breeding species.

While it has been shown that predation can favour group formation through delayed dispersal
(Heg et al. 2004; Kingma et al. 2021), and that delayed dispersal favours the evolution of cooperative
breeding (Groenewoud et al. 2016), the role of predation on fledglings and adults as an evolutionary

105 driver of family formation and cooperative breeding remains untested at a large scale using a 106 comparative cross-species framework. Here, using a global dataset of 2984 bird species and a 107 phylogenetic comparative analysis, we test the hypothesis that species facing higher risk from avian 108 predators should be more likely to live in family groups or to be cooperative breeders. We further 109 expect that the effect of predators on sociality will be stronger for species living in more open habitats 110 due to higher exposure to predators. Since previous studies have found associations between 111 cooperative breeding, environmental predictability and harshness (Jetz and Rubenstein 2011; 112 Gonzalez et al. 2013), and other geographical and life-history attributes such as latitude and body 113 mass (Griesser et al. 2017), we also account for them in our model.

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#### 115 Methods

#### 116 Data collection

Data for social systems, climatic variables and body mass were taken for 2984 species from a published data set (Griesser et al. 2017). Social systems of species were categorised as (i) non-family living when offspring disperse away from their parent(s) within less than 50 days beyond nutritional independence, (ii) family living when offspring remain at least 50 days beyond nutritional independence with their parent(s) but do not engage in cooperative breeding, and (iii) cooperative breeding when offspring remain with their parents and engage in parental care behaviours (see also Drobniak et al. 2015).

To estimate predation pressure, we collected data on the breeding and resident distribution (excluding the wintering range of migratory species) of all focal species in our dataset (N=2984) and their avian predators (N=553) from BirdLife International and Handbook of the Birds of the World (2018). These data were gridded at a 10-min resolution, to be able to analyse the distribution of species with narrow and fragmented ranges. Avian predators have been shown to be the main drivers of predation on juveniles outside the nest and adult birds (Caro 2005; Lima 2009; Valcu et al. 2014). We acknowledge that other taxa could also be locally important predators in some cases. We 131 considered all avian predators mentioned in the literature as predators of adult birds (Valcu et al. 132 2014; Billerman et al. 2022). However, out of these 553 avian predator species, we only included 302 133 species here, as we excluded avian predators that rarely prey upon adult birds (e.g., Circaetus gallicus). 134 In addition, we obtained the average weight of the lightest (n=84) and heaviest (n=176) possible prey 135 for all these predators and performed a predator-prey body mass allometry (Figure 1a) to infer the 136 range of suitable prey mass for each predator species (Gravel et al. 2013; Valcu et al. 2014; Bliard et 137 al. 2020). This method has been shown to produce prey richness estimates for each predator that 138 correlate strongly with bibliographical records (Valcu et al. 2014). Then, we calculated the number of 139 grid cells shared between each predator species and a focal species of suitable mass, and estimated 140 the average specific richness of potential sympatric avian predators across the range of each focal 141 species (Figure 1b). We also calculated the average predator richness considering bird-eating specialist 142 species only (n=113 predator species out of the initial 302 predators), based on the classification by 143 Valcu et al. (2014). The breeding latitude of each focal species was also computed as the mean latitude 144 across all grid cells (breeding and resident distributions) of a species distribution.

145 Analysis

146 We assessed whether predation risk is associated with sociality, while accounting for potential 147 confounders. We used N=2984 bird species with known social system. Due to the ordered nature of 148 the social system data (see Griesser et al. 2017), we analysed the data using an ordinal cumulative 149 logistic regression with the three levels of sociality. A cumulative logistic regression is a regression that 150 allows for more than two categories that are ordered. It estimates several intercepts, but a single 151 slope per predictor variable. We used the average richness of potential predators faced by each 152 species as an explanatory variable. This model assumes that predator richness equally affects both 153 transitions (from non-family living to family living, and from family living to cooperative breeding), 154 which matches with our hypothesis that species get gradually more antipredator benefits from non-155 family living to cooperative breeding, as the association time of offspring with their parents increases. 156 We also included habitat openness because it was shown to be a correlate of sociality using a similar

157 dataset (Griesser et al. 2017), and its interaction with predator richness because we expect the effect 158 of predators to be stronger in open habitats. We note that our measure of predator richness was not 159 correlated with habitat openness (r=-0.07), nor was it strongly correlated with any of the other 160 variables included (Table S1). We also included the following explanatory variables that could act as 161 confounders: absolute latitude, and for both rainfall and temperature, we calculated mean, within-162 year variance, and between-year predictability (obtained from Griesser et al. 2017). Note that some 163 collinearity might exist among these environmental variables, but collinearity of predictors is not an 164 issue in multiple regression analyses (Morrissey and Ruxton 2018; Vanhove 2021). We also included 165 log body mass and its quadratic effect, as it could have an influence on species sociality and is also 166 likely influencing our proxy of predation risk through the predator-prey body mass allometry, with 167 intermediate species more likely to have higher estimated predation risk. The same analysis was also performed using the richness of predator species that specialise in hunting adult birds (Table S3). 168 169 Because few cooperative breeders occur in the Holarctic (Cockburn 2020), we also performed the 170 same model on a subset of N=2299 bird species, excluding all Holarctic and widespread species (Table 171 S4). In addition, since migratory species are less social (Griesser et al. 2017), and because our metric 172 of predation pressure did not account for predation risk on wintering grounds, we also ran the model 173 excluding migratory species, on a subset of N=2503 species (Table S5). All continuous variables were 174 centred and scaled before analysis (mean-centred and divided by their standard deviation).

175 The models were deployed in R v.4.0.5 (R Core Team 2021), using the R packages brms v.2.14.4 176 (Bürkner 2017, 2018) as a frontend and *cmdstanr* (Gabry and Češnovar 2020) as a backend, using a 177 Bayesian framework by implementing Hamiltonian Monte Carlo simulation in Stan (Carpenter et al. 178 2017). The model ran on 3 chains of 2000 iterations, with a warm-up period of 1000 iterations, and no 179 thinning, resulting in a total of 1000 samples per chain. We applied a phylogenetic correction in the 180 model by including the phylogeny in the form of a variance-covariance matrix as a random effect. We 181 did not account for phylogenetic uncertainty (Villemereuil et al. 2012) due to computational 182 limitations. Instead, we used a composite tree of the phylogeny of Prum et al. (2015) as backbone and

adding the tips of the maximum clade credibility tree from Jetz et al. (2012), constructed following the
method described in Cooney et al. (2017). We also conducted the same model with maximum clade
credibility trees computed from a random sample of 100 trees with the Ericson backbone and the
Hackett backbone (Jetz et al. 2012) to ensure robustness of the results (Table S6, Table S7).
Convergence and mixing of the 3 chains were confirmed visually and using the Gelman-Rubin
diagnostic (Gelman and Rubin 1992), with potential scale reduction factors all inferior to 1.01.

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#### 190 <u>Results</u>

191 Phylogenetic comparative models indicated a likely association between richness of potential avian 192 predators and bird sociality. Species in sympatry with a larger number of potential predator species 193 were more likely to occur in family groups or cooperatively breeding groups (Table S2, Figure 2, Figure 194 3), and this result also held when considering only predators that specialise in preying on birds (Table 195 S3). Excluding Holarctic species did not change the mean effect size of predator richness on sociality 196 (Table S4). Similar results for the effect of predator richness were also found when excluding migratory 197 species (Table S5). We found moderate evidence for habitat openness to be negatively associated with 198 sociality (Table S2, Figure 2). However, the interaction between predator richness and habitat 199 openness was negligible, with no evidence for an effect (Table S2, Figure 2), even though the mean 200 estimate was slightly positive. Body mass was positively associated with sociality (Table S2, Figure 2), 201 while latitude and rainfall variables were not found to be associated with sociality (Table S2, Figure 2). 202 We found temperature variables to be associated with sociality, with cooperative breeders and family-203 living species more often inhabiting warmer, less variable, and more predictable environments (Table 204 S2, Figure 2). However, these variables were only included to control for their effect as potential 205 confounders of the relationship between predator richness and sociality, thus these estimates are not 206 discussed further (Westreich and Greenland 2013).

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208 Discussion

Our results suggest that species living in areas with a higher number of avian predator species tend to live more often in family groups and to breed cooperatively. This association suggests a potential role of adult predation on the evolution of family living and cooperative breeding, providing inter-specific support for results previously found at the intra-specific level (Griesser et al. 2006; Groenewoud et al. 2016; Tanaka et al. 2016). Hence, our results also provide support for previous hypotheses suggesting that benefits of delayed dispersal and philopatry are in themselves an important route to cooperative breeding (Griesser et al. 2006; Covas and Griesser 2007; García-Ruiz et al. 2022).

216 We acknowledge that the metric we computed for predation pressure, i.e., the average 217 richness of potential predators, is imperfect. As argued by Suraci et al. (2022), a spatial overlap 218 between predators and preys does not necessarily result in actual predator-prey interactions, as many 219 ecological and environmental factors can influence encounter and depredation probabilities. For instance, dissimilar activity patterns for species of predator and prey could reduce the true predation 220 221 risk (Smith et al. 2019). Nonetheless, despite its limitations, predator richness is a commonly used 222 proxy of predation pressure (Valcu et al. 2014; Ciccotto and Mendelson 2016; Kotrschal et al. 2017; 223 Matthews et al. 2018; Bliard et al. 2020), and the only one available for such a large-scale comparative 224 study, where information on predator-prey encounters or predator densities is lacking. In addition, 225 we computed predator richness as the average of potential predators across the geographical range 226 of species using a method that does not inflate the predation pressure of wide-ranging species (Bliard 227 et al. 2020; in contrast with e.g., Valcu et al. 2014). This leads to a more meaningful proxy of predation 228 pressure for a study at the global scale and, given the data available, it arguably represents the best 229 possible approach.

Our results provide evidence that the richness of potential predators is likely associated with increased sociality across bird species. This study being correlational, results could also have arisen from unaccounted confounders favouring simultaneously increased sociality and increased predator richness, and the directionality of the relationship can only be hypothesised. However, group formation as a response to predator pressure is well established in birds and other animals. Predation 235 risk was found to be a driver of delayed dispersal in Siberian jays and cichlid fishes (Heg et al. 2004; 236 Griesser et al. 2006; Tanaka et al. 2016), and work comparing cichlid populations experiencing 237 different predation risk found that predation pressure influenced social structure by increasing the 238 benefits of staying in the natal group (Groenewoud et al. 2016). The direct fitness benefits of living in 239 groups were also found to be more important than indirect fitness benefits as evolutionary drivers of 240 delayed dispersal (García-Ruiz et al. 2022). Predation risk has therefore the potential to favour the 241 evolution of family living (see also Griesser et al. 2017). Since cooperatively breeding groups usually 242 live together throughout the year, group members can be expected to receive increased benefits in 243 terms of protection from predators. Thus, our results support previous suggestions that the formation 244 of family groups as a response to predation risk could favour the evolution of cooperative breeding.

245 Despite our finding of a likely positive association between average predator richness and 246 sociality, the estimated effect size is small (Møller and Jennions 2002), although similar to what is 247 commonly found in broad-scale comparative studies (Jetz and Rubenstein 2011; Lukas and Clutton-248 Brock 2017; Stoddard et al. 2017; Mikula et al. 2021; but see Griesser et al. 2023). Small effect sizes 249 can be expected if several distinct, possibly antagonistic, processes are leading to a similar outcome, 250 which is the case for cooperative breeding and its evolutionary drivers (Griesser et al. 2017; Shen et 251 al. 2017). Therefore, scaling down and studying the role of predation risk on the evolution of sociality 252 focusing on a smaller geographical scale (Cockburn and Russell 2011) could potentially offer additional 253 insights. Here, we conducted an analysis excluding Holarctic species, where the frequency of 254 cooperative breeding is low compared to other geographic regions (Cockburn 2006, 2020), but 255 obtained a similar effect size for the association of predator richness and sociality. An alternative 256 would be to conduct studies within specific avian families with varying degrees of sociality (e.g., 257 Gonzalez et al. 2013). Smaller scale studies would also allow to collect more detailed data on predation 258 risk, to estimate predator densities based on bird surveys or citizen-science data (Sullivan et al. 2009; 259 Fink et al. 2020).

260 Contrary to our expectations, we found no clear effect of habitat openness on the association 261 between predation risk and sociality. The effect of predators in open habitats, like savannahs or 262 grasslands, was expected to be stronger given the lower availability of refuges when escaping from 263 predators, and hence leading to the expectation that forming groups would be an important strategy 264 for predator avoidance in these habitats. However, other factors could influence this relationship. For 265 instance, many species inhabiting open areas appear to rely on being cryptic to avoid predators (Negro 266 et al. 2019; Nokelainen et al. 2020; but see Somveille et al. 2016), in which case group formation would 267 not be favoured. We did, however, find moderate evidence for a negative association between habitat 268 openness and sociality, with species being more social in habitats with denser vegetation. This is 269 similar to what was found with an almost identical dataset by Griesser et al. (2017), and supports an 270 association of delayed dispersal and family group formation with more vegetated, and hence productive, environments. This result is in line with the findings of Gonzalez et al. (2013) for hornbills 271 272 (Bucerotidae), but contrasts with previous results based on a global dataset that found higher 273 prevalence of cooperative breeding in regions characterized by low rainfall and high precipitation 274 uncertainty (Jetz and Rubenstein 2011). These contrasting results may arise from the different 275 categorisation of social systems, as climatic variables do not have the same effects on the prevalence 276 of non-family and family-living species (Griesser et al. 2017), but they were merged in the same 277 category in previous analyses.

278 Previous comparative studies showed that the evolution of cooperative breeding is associated 279 with slow life histories, harsh and unpredictable environments, as well as productive environments 280 (Arnold and Owens 1998; Jetz and Rubenstein 2011; Gonzalez et al. 2013; Downing et al. 2015). 281 However, associations among individuals before the onset of breeding are required for cooperative 282 breeding to occur. Drivers of group maintenance can be varied (e.g., Lin et al. 2019) and can differ 283 from those that make helping at the nest beneficial (Covas and Griesser 2007; Griesser et al. 2017). 284 This study provides cross-species support for the hypothesis that predation risk is associated with 285 group formation or family maintenance, a pattern which was previously shown within species. Thus,

predation might be an evolutionary driver of family living by increasing benefits of delayed dispersal, thereby favouring the evolution of cooperative breeding. We suggest that future studies combining predation risk alongside other known factors associated with family-living and cooperative breeding could improve our understanding of the relative importance of each driver for the evolution of these social behaviours.

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## 297 Data availability

The datasets and R scripts needed to reproduce the results and figures can be found on GitHub (https://github.com/lbiard/predation\_sociality\_birds) and will be uploaded to Zenodo upon acceptance.

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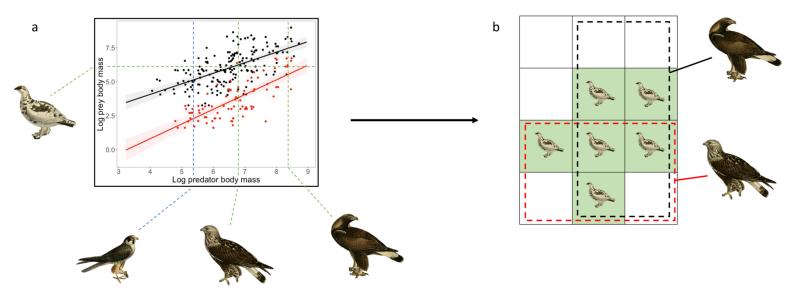
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314 Figure 1: Schematic representation explaining how average predator richness was computed for each 315 species (n=2984). (a) Predator-prey body mass allometry showing the lightest (red, n=84) and heaviest 316 prey (black, n=176) targeted by predator species depending on their mass, used to infer a range of 317 prey mass for each predator species (n=302). For instance, considering a given species (e.g., Lagopus 318 muta) and several predator species (e.g., Falco subbuteo, Buteo lagopus, Aquila chrysaetos), a 319 predator will be considered only if a given species fall within its predation mass range (F. subbuteo will 320 not be considered a potential predator of *L. muta*). (b) Geographical range overlap, to compute the 321 average richness of predators in each grid cell for each species of the dataset (in this hypothetical case, 322 L. muta has an average predator richness of 1.5). Bird illustration credits: Magnus & Wilhelm von Wright (1828). 323

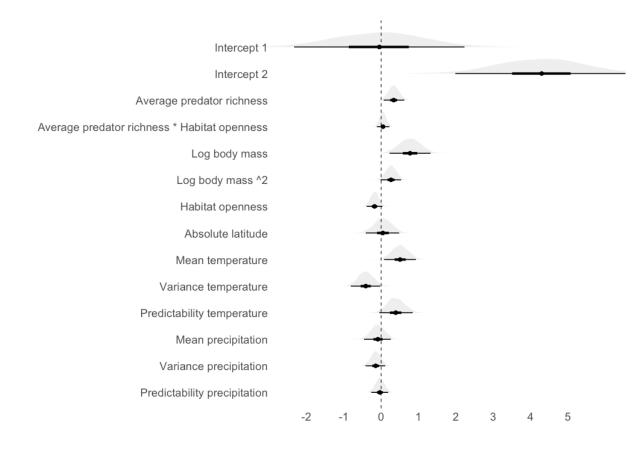
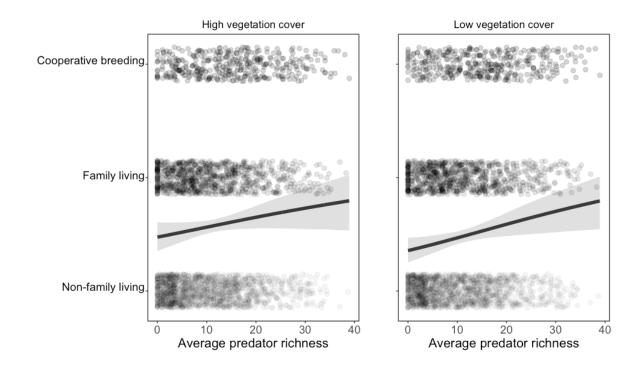




Figure 2: Estimated effects of standardized predictors on bird sociality. The figure displays the
 posterior distributions estimated by the ordinal model, alongside the mean, 50%, and 95% credible
 intervals. A summary of the posterior distributions can also be found in Table S2.



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331 Figure 3: Effect of average predator richness on the social system of bird species. The left panel shows 332 this association for habitats with high vegetation cover (habitat openness set to -1 SD) and the right 333 panel shows this association for habitats with low vegetation cover (habitat openness set to +1 SD). 334 The social system is represented as a graded scale. The regression lines and their associated 95% CI 335 are those predicted by the ordinal logistic regression model, accounting for phylogenetic relationship 336 between species. For display purposes only, the uncertainty associated with the intercepts was not 337 accounted for. Each circle represents a species (N=2984 species). Average predator richness was 338 transformed back to its original scale.

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# 527 Supplementary materials

## **Table S1:** Correlations among variables included in the model.

	Average predator richness	Habitat openess	Log body mass	Absolute latitude	Predictability precipitation	Predictability temperature	Mean precipitation	Mean temperature	Variance precipitation	Variance temperature
Average predator richness	1.000	-0.066	0.061	-0.201	-0.128	0.180	-0.026	0.253	0.091	-0.198
Habitat openess	-0.066	1.000	0.313	0.323	-0.187	-0.339	-0.460	-0.300	-0.347	0.310
Log body mass	0.061	0.313	1.000	0.182	-0.061	-0.156	-0.165	-0.146	-0.136	0.192
Absolute latitude	-0.201	0.323	0.182	1.000	-0.253	-0.900	-0.575	-0.878	-0.511	0.841
Predictability precipitation	-0.128	-0.187	-0.061	-0.253	1.000	0.358	0.550	0.025	0.224	-0.014
Predictability temperature	0.180	-0.339	-0.156	-0.900	0.358	1.000	0.657	0.793	0.558	-0.812
Mean precipitation	-0.026	-0.460	-0.165	-0.575	0.550	0.657	1.000	0.530	0.773	-0.477
Mean temperature	0.253	-0.300	-0.146	-0.878	0.025	0.793	0.530	1.000	0.547	-0.880
Variance precipitation	0.091	-0.347	-0.136	-0.511	0.224	0.558	0.773	0.547	1.000	-0.462
Variance temperature	-0.198	0.310	0.192	0.841	-0.014	-0.812	-0.477	-0.880	-0.462	1.000

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540	Table S2: Result of the ordinal logistic regression model exploring the effect of predation risk on
541	sociality in birds (N=2984 species), accounting for phylogenetic relationship between species using a
542	composite maximum clade credibility tree of the Prum et al. (2015) and Jetz et al. (2012) phylogenies.
543	Estimates and effect sizes are presented on the logit scale. All continuous variables were scaled.

Response variable	Explanatory variable	Mean estimate	95% Credible intervals
Social system	Intercept 1	-0.05	-2.33; 2.23
	Intercept 2	4.30	1.99; 6.61
	Average predator richness	0.34	0.07; 0.62
	Average predator richness * Habitat openness	0.05	-0.11; 0.23
	Log body mass	0.78	0.23; 1.32
	Log body mass ^ 2	0.27	-0.01; 0.54
	Habitat openness	-0.18	-0.39; 0.04
	Absolute latitude	0.05	-0.41; 0.48
	Mean temperature	0.51	0.08; 0.93
	Variance temperature	-0.41	-0.81; -0.02
	Predictability temperature	0.39	-0.05; 0.85
	Mean precipitation	-0.09	-0.46; 0.26
	Variance precipitation	-0.15	-0.42; 0.11
	Predictability precipitation	-0.03	-0.26; 0.19

Table S3: Result of the ordinal logistic regression model exploring the effect of predation risk from
bird-eating specialists only on sociality in birds (N=2984 species), accounting for phylogenetic
relationship between species using a composite maximum clade credibility tree of the Prum et al.
(2015) and Jetz et al. (2012) phylogenies. Estimates and effect sizes are presented on the logit scale.
All continuous variables were scaled.

Response variable	Explanatory variable	Mean estimate	95% Credible intervals
Social system	Intercept 1	-0.10	-2.44; 2.07
	Intercept 2	4.22	1.89; 6.42
	Average predator richness (bird-eating specialists)	0.29	0.05; 0.22
	Average predator richness * Habitat openness	0.04	-0.13; 0.20
	Log body mass	0.82	0.28; 1.38
	Log body mass ^ 2	0.22	-0.05; 0.49
	Habitat openness	-0.16	-0.37; 0.05
	Absolute latitude	0.04	-0.42; 0.50
	Mean temperature	0.52	0.10; 0.95
	Variance temperature	-0.40	-0.81; -0.02
	Predictability temperature	0.39	-0.06; 0.82
	Mean precipitation	-0.10	-0.46; 0.26
	Variance precipitation	-0.14	-0.42; 0.12
	Predictability precipitation	-0.02	-0.24; 0.19

554	Table S4: Result of the ordinal logistic regression model excluding Holarctic species exploring the
555	effect of predation risk on sociality in birds (N=2299 species), accounting for phylogenetic relationship
556	between species using a composite maximum clade credibility tree of the Prum et al. (2015) and Jetz
557	et al. (2012) phylogenies. Estimates and effect sizes are presented on the logit scale. All continuous
558	variables were scaled.

Response variable	Explanatory variable	Mean estimate	95% Credible intervals
Social system	Intercept 1	-0.34	-2.61; 1.97
	Intercept 2	4.09	1.83; 6.38
	Average predator richness	0.32	0.02; 0.65
	Average predator richness * Habitat openness	0.05	-0.13; 0.24
	Log body mass	0.42	-0.19; 1.02
	Log body mass ^ 2	0.28	-0.04; 0.61
	Habitat openness	-0.14	-0.38; 0.09
	Absolute latitude	0.10	-0.24; 0.45
	Mean temperature	0.30	0.05; 0.56
	Variance temperature	-0.36	-0.65; -0.08
	Predictability temperature	-0.12	-0.48; 0.23
	Mean precipitation	0.06	-0.33; 0.47
	Variance precipitation	-0.27	-0.56; 0.01
560	Predictability precipitation	-0.06	-0.33; 0.21

562	Table S5: Result of the ordinal logistic regression model excluding migratory species exploring the
563	effect of predation risk on sociality in birds (N=2503 species), accounting for phylogenetic relationship
564	between species using a composite maximum clade credibility tree of the Prum et al. (2015) and Jetz
565	et al. (2012) phylogenies. Estimates and effect sizes are presented on the logit scale. All continuous
566	variables were scaled.

Response variable	Explanatory variable	Mean estimate	95% Credible intervals
Social system	Intercept 1	-0.17	-2.55; 2.18
	Intercept 2	4.14	1.84; 6.53
	Average predator richness	0.34	0.08; 0.64
	Average predator richness * Habitat openness	0.11	-0.07; 0.29
	Log body mass	0.64	0.07; 1.25
	Log body mass ^ 2	0.24	-0.04; 0.51
	Habitat openness	-0.15	-0.37; 0.05
	Absolute latitude	0.15	-0.27; 0.56
	Mean temperature	0.39	0.05; 0.76
	Variance temperature	-0.41	-0.76; -0.08
	Predictability temperature	0.17	-0.24; 0.59
	Mean precipitation	0.05	-0.33; 0.44
	Variance precipitation	-0.25	-0.53; 0.02
	Predictability precipitation	-0.05	-0.29; 0.19

**Table S6:** Result of the ordinal logistic regression model exploring the effect of predation risk on

571 sociality in birds, accounting for phylogenetic relationship between species using Ericson backbone.

572 Estimates and effect sizes are presented on the logit scale. All continuous variables were scaled.

Response variable	Explanatory variable	Mean estimate	95% Credible intervals
Social system	Intercept 1	-0.54	-3.01; 1.91
	Intercept 2	3.75	1.36; 6.18
	Average predator richness	0.32	0.07; 0.57
	Average predator richness * Habitat openness	0.04	-0.13; 0.21
	Log body mass	0.71	0.17; 1.23
	Log body mass ^ 2	0.25	0.00; 0.52
	Habitat openness	-0.19	-0.40; 0.02
	Absolute latitude	0.13	-0.33; 0.57
	Mean temperature	0.59	0.18; 1.01
	Variance temperature	-0.37	-0.74; 0.01
	Predictability temperature	0.46	0.04; 0.89
	Mean precipitation	-0.10	-0.44; 0.24
	Variance precipitation	-0.16	-0.42; 0.09
	Predictability precipitation	-0.04	-0.26; 0.19

**Table S7:** Result of the ordinal logistic regression model exploring the effect of predation risk on

577 sociality in birds, accounting for phylogenetic relationship between species using Hackett backbone.

- 578 Estimates and effect sizes are presented on the logit scale. All continuous variables were scaled.

Response variable	Explanatory variable	Mean estimate	95% Credible intervals
Social system	Intercept 1	-0.42	-2.92; 2.03
	Intercept 2	3.85	1.39; 6.29
	Average predator richness	0.33	0.08; 0.62
	Average predator richness * Habitat openness	0.03	-0.14; 0.20
	Log body mass	0.74	0.20; 1.27
	Log body mass ^ 2	0.24	-0.02; 0.51
	Habitat openness	-0.19	-0.40; 0.02
	Absolute latitude	0.17	-0.27; 0.61
	Mean temperature	0.61	0.20; 1.03
	Variance temperature	-0.34	-0.75; 0.04
	Predictability temperature	0.49	0.06; 0.93
	Mean precipitation	-0.13	-0.48; 0.22
	Variance precipitation	-0.15	-0.41; 0.11
	Predictability precipitation	-0.02	-0.24; 0.20