Conner S. Philson^{1,2,3*}, Clara Klassen^{1,*}, Kenta Uchida⁴, Daniel T. Blumstein^{1,5}

¹Rocky Mountain Biological Laboratory, Crested Butte, CO 81224, USA

² Natural Reserve System, University of California, Santa Barbara, 93106, USA

³ Centre for Research in Animal Behaviour, University of Exeter, Exeter EX4 4QG, United Kingdom

⁴ Graduate School of Agricultural and Life Sciences, University of Tokyo, Tokyo 113-0032, Japan

⁵ Department of Ecology and Evolutionary Biology, University of California, Los Angeles, CA 90095-1606, USA

*co-first author

Correspondence: C.S. Philson (c.s.philson@exeter.ac.uk) & D.T. Blumstein (marmots@ucla.edu)

Conner S. Philson, ORCID ID: 0000-0002-5973-347X

Kenta Uchida, ORCID ID: 0000-0001-7998-1363

Daniel T. Blumstein, ORCID ID: 0000-0001-5793-9244

© The Author(s) 2025. Published by Oxford University Press on behalf of the International Society for Behavioral Ecology

This is an Open Access article distributed under the terms of the Creative Commons Attribution License (https://creativecommons.org/licenses/by/4.0/), which permits unrestricted reuse, distribution, and reproduction in any medium, provided the original work is properly cited.

ABSTRACT

One of the most explored factors mediating antipredator behavior is group size, which generally predicts individuals in larger social groups allocate less time to antipredator vigilance while foraging. However, group size alone does not capture the full complexity of sociality. An individual's 'sense of security', or their perceived risk of predation, is also influenced by an individual's social connections. Further, group social structure – the pattern of all social interactions in a group – could explain additional variation in perceptions of security for the individuals that reside in the group. Using the time allocated to vigilance during foraging and flight initiation distance (FID) to quantify individuals' social security, we explored whether individual yellow-bellied marmots (Marmota flaviventer) in tightly connected social groups looked less while foraging and had shorter FIDs. Using linear mixed effect models, we found modest support for the Social Security Hypothesis; individuals in more socially reciprocal groups may spend less time looking for predators while foraging. No measure of group social structure explained variation in FID. Measures of the immediate environment (the number of individuals within 10 meters for vigilance and the distance from burrow and alert distance for FID) had effect sizes an order of magnitude greater than measures of social structure, suggesting an individual's immediate environment has more of an impact on their antipredator behavior than the structure of their social group.

Keywords: group social structure, social network analysis, vigilance, flight initiation distance, antipredator behavior, yellow-bellied marmot

INTRODUCTION

By aggregating with conspecifics, prey may decrease their risk of predation through a variety of mechanisms. Previous studies have focused on describing antipredator behavior using group size effects and have shown that as group size increases, per capita risk of predation decreases. This phenomenon is known as the 'Dilution Effect' (Cresswell 1994). The 'Many Eyes Hypothesis' predicts that with the help of more eyes, ears, and noses to detect predators, larger groups can detect potential predation risks more quickly (Lima 1995; Pulliam, 1973). While group size is one of many attributes that may influence risk assessment (Hill & Lee 1998), group size alone does not capture the diversity and complexity of social relationships and patterns within groups. When individuals aggregate, they may engage in preferential relationships with one another. Thus, individuals in groups may vary in their connectedness with others. Additionally, groups vary in their overall connectivity and pattern of connection (Hinde 1976). Using social network analysis, we can quantify the number, frequency, and directionality (the initiators and recipients of interactions) of individual's social relationships and their indirect social position within the group (e.g., who your direct social partners interact with) (Wey et al. 2008).

The Social Security Hypothesis predicts strong affiliative social relationships with conspecifics increase an individual's perceived security (Mady & Blumstein 2017). For example, more socially isolated yellow-bellied marmots (*Marmota flaviventer*) cannot rely on conspecifics for their safety and thus alarm call more often (Fuong et al. 2015) and with higher call entropy (Fuong and Blumstein 2019). Marmots with weaker social relationships also flee at greater distances when approached by human observers (Szulanski et al. 2023). Impala (*Aepyceros melampus*) that are more central in their social network allocate less time to vigilance and spent more time foraging compared to their less-connected conspecifics (van Deventer & Shrader 2021). Additionally, crested macaques (*Macaca nigra*) exhibit a stronger response to playbacks of conspecifics' alarm calls if they are produced by an individual with whom they share a strong social bond (Micheletta et al. 2012).

While individual sociality and social position may influence antipredator behaviors, the overall connectedness and structure of the social group may also influence the antipredator behaviors of each individual who resides in the group. Extending the Social Security Hypothesis to group social structure, residing in more connected and socially close groups may increase an individual's perceived security, reducing perceived risk of predation. Group social structure has known fitness consequences for individuals within groups, from fish (Solomon-Lane et al. 2015), to mammals (Philson et al. 2022; Philson & Blumstein 2023a; Philson & Blumstein 2023b) to insects (Costello et al. 2023). However, how group structure is associated individual perceptions of risk is still unknown. This is, in large part, because exploring emergent group social structure with individual-level risk perception requires many replicates of social groups and of marked individual's antipredator behavior behavior within those groups. Given the longitudinal and logistical demands, there are few study systems in the wild that meet these requirements. Because group social structure is pertinent to individual fitness, and group size has well established relationships with antipredator behavior, determining the roles of group social structure and social group size, relative to each other, is necessary to better understand individual antipredator behavior and social security in the wild.

To quantify antipredator behavior and risk assessment, the time an animal allocates to vigilance versus eating during spurts of foraging and flight initiation distance (FID) are commonly used, as seen in some mammals (Beauchamp et al. 2021), birds (Tätte et al. 2019), and insects (Shackleton et al. 2018). Animals detect perceived threats by allocating time to vigilance while foraging (Tyrrell & Fernández-Juricic 2015). Individuals who spend more time looking during foraging bouts can be perceived as more fearful and less secure. FID measures the distance at which a prey flees from an approaching threat (Ydenberg & Dill 1986). Therefore, FID reflects the individual's risk assessment towards threats, such as an approaching predator. Many biological and environmental factors have been associated with FID, including body size (Weston et al. 2016), starting distance (Samia et al. 2013), vegetation conditions (Braimoh et al. 2018), the number of neighboring individuals (aggregation size) (Shuai et al. 2024), and individual social behavior (Szulanski et al. 2024). In summary, wildlife manages antipredator strategies via multiple behaviors to manage potential risks. Thus, further understanding what components of sociality, whether it be group size, individual social relationships, or group social structure, influence individual perceptions of risk is a pertinent question.

We asked how group social structure is associated with an individual's 'sense of security' in a wild population of yellow-bellied marmots at and around the Rocky Mountain Biological Laboratory (RMBL) in Colorado where the population has been studied annually since 1962. Yellow-bellied marmots at the RMBL are a good system to test how social structure is associated with antipredator behavior because of the 20-year dataset of individually marked animals with detailed social and antipredator behavioral data. Additionally, marmots have variation in their degree of antipredator behaviors (Armitage 2003) and group social structure (Blumstein 2013), and we know how their social structure relates to their individual fitness. Namely, group social structure has been related to dispersal (Schneidman et al. 2024), overwinter survival (Philson & Blumstein 2023a), mass gain rate (Philson et al. 2022), and reproductive success (Philson & Blumstein 2023b). Social network measures have been applied on an individual-level to study marmot social position and antipredator vigilance (Mady & Blumstein 2017; Szulanski et al. 2024). However, how group social structure relates to an individual's sense of security has not been explored in this system, or others. With adult marmot FID repeatability being 0.132 (Blumstein et al. 2023), there is variation in FID that may be explained by group social structure.

Given the support for both group size effects for individual perceptions of security and the Social Security Hypothesis showing more social and connected individuals perceive greater security (Mady & Blumstein 2017; Szulanski et al. 2024), we extended the Social Security Hypothesis to the group-level to predict that individuals residing in social groups that are more tightly connected will allocate less time to antipredator vigilance when foraging. Namely, we predicted that individuals in more socially dense, close, connected, and reciprocal groups will perceive greater security by spending less time looking while foraging and having shorter FIDs whereas individuals in groups centrally structured around one or few individuals will perceive less security. Due to group size effects, we also predicted that individuals in larger social groups will perceive greater security. By fitting social group size with measures of group social structure in the same model, we will develop a more comprehensive and representative view of how group-level traits, including both size and structure, relate to antipredator behavior relative to each other in the wild.

MATERIALS AND METHODS

Study Site and System

We studied yellow-bellied marmots in and around the Rocky Mountain Biological Laboratory (RMBL) in Gothic, Colorado, USA (38°77'N, 106°59'W; ca. 2900 m above sea level). Since 1962, the marmots have been under continuous study (Blumstein 2013; Armitage 2014), with detailed dyadic social interaction, FID, and vigilance data since 2003. Yellow-bellied marmots are a facultatively social mammal living in a matrilineal society which may include one or more adults, yearlings, and pups (Armitage 2014). Marmots are subject to aerial and terrestrial predation (Kelt & Van Vuren 2001) including, but not limited to, red-tailed hawks (*Buteo jamaicensis*), golden eagles (*Aguila chrysaetos*), coyotes (*Canis latrans*), red foxes (*Vulpes vulpes*), American badgers (*Taxidea taxus*), black bears (*Ursus americanus*), and mountain lions (*Puma concolor*).

Marmots at our study site hibernate for 7-8 months of the year from mid-September to mid-April (Armitage 2014). During their active season, we trapped the marmots in walk-in Tomahawk traps and applied a set of unique ear-tags and unique dorsal fur mark with a nontoxic Nyanzol-D dye (Albanil Dyestuff Corp., Jersey City, NJ, U.S.A) to distinguish individuals from afar. We use data from marmots studied annually at 8 colony sites spread 5 km apart along the bottom of the valley.

Quantifying Social Behavior

Trained observers recorded social interactions between individual marmots from distances of 20 to 150 meters using spotting scopes and binoculars. Behavioral data were collected at all 8 colony sites during the active season (mid-April to mid-September) during hours of peak marmot activity (0700 – 1100 hours and 1600-1900 hours) six days a week, weather permitting. Observers used all occurrence behavioral sampling to record all marmot social observations and interactions. Interactions were classified as affiliative (e.g., foraging together, grooming, and play behaviors) or agonistic (e.g., chasing, biting, or fighting behaviors) (full ethogram in: Blumstein et al. 2009). The initiator and recipient of the interactions were also recorded for the directionality of interactions. Affiliative social interactions comprised 88% of all observed interactions and 79% of interactions were between identified individuals (Philson & Blumstein 2023b).

Social Networks

We built social networks based on affiliative social interactions because the Social Security Hypothesis is based on affiliative, not agonistic, interactions. Networks included yearlings and adults and were constructed annually from 2003 to 2022. We filtered our data to include only social observations collected in April, May, and June because (1) vegetation was lowest at this time which allowed for accurate observations, (2) the most social interactions occurred during this time, and (3) yearlings had not yet dispersed (usually around late-June/early-July). We defined social groups based on shared space use within the 8 colony sites (Pfau et al. 2023; Szulanski et al. 2024; Schneidman et al. 2024; Philson et al. 2023). To do so, we calculated simpleratio pairwise association indices based on where individuals were trapped or seen within the same day using SOCPROG (Whitehead 2009). The resulting matrices were run through a community detection algorithm, MapEquation (Csardi & Nepusz 2006; Rosvall & Bergstrom 2008; Rosvall et al. 2009), to define social groups within colonies using the "igraph" package (Csardi & Nepusz 2006) in R (version 20.2.5; R Core Development Team 2024). Directed and weighted social networks were constructed from 42,369 affiliative social interactions between 752 unique individuals (with 549 being observed in multiple years) in 255 unique social groups-years across 20 years (2003-2022).

For each unique social group, we calculated seven group-level social network measures to quantify social structure (Table 1) using "igraph". Measures of social group connectivity included density, transitivity, cut points, and centrality. Measures of group homophily included reciprocity, inverse average path length, and degree assortativity. These seven measures were selected due to relevance across systems (Kasper & Voelkl 2009; Farine & Whitehead 2015; Sah et al. 2018), including in this marmot system (Philson et al. 2022; Philson & Blumstein 2023a; Philson & Blumstein 2023b; Schneidman et al. 2024). These group-level traits are also generally extensions of individual-level social network measures used in past social security studies (Fuong et al. 2015; Mady & Blumstein 2017; Blumstein et al. 2017; Szulanski et al. 2024), facilitating comparison between individual and group studies of social security.

Group Measure	Description	Reference	FID	Vigilance
Density	The proportion of all possible social relationships in a group that are observed	Burt (1992); Wasserman & Faust (1994); Grund (2012)	-	-
Average Path Length*	How many social links individuals are from all others in the group	Watts (1998); Broder et al. (2000)	-	-
Cut Points*	A measure of social connectedness that quantifies how easily a group can fracture into two or more groups	Wasserman & Faust (1994); Borgatti (2006)	-	Õ.
Transitivity	Quantifies group connectedness as the proportion of connected triads in the group	Wasserman & Faust (1994); Milo et al. (2002); Faust (2010)	G	-
Reciprocity	Measures the proportion of relationships within a group where both individuals initiate at least one interaction with each other	Wasserman & Faust (1994); Kankanhalli et al. (2005); Squartini et al. (2013)	-	-
Degree Assortativity	Tendency for social connections in a group to share similar a similar number of partners	Wasserman & Faust (1994); McPherson et al. (2001)	-	-
Centralization	Quantifies if interactions flow through few (high centralization) or many (low centralization) individuals in the group	Freeman (1979); Wasserman & Faust (1994); Kang (2007)	+	+

Table 1: Group-level social network measures, their descriptions, references, and predictions fortheir relationship with flight initiation distance (FID) and time allocated to vigilance. *The inverse ofaverage path length and cut points is presented for interpretability (so that as values increase, allmeasures can be interpreted as more connected).

Antipredator Vigilance

Trained observers conducted 2-minute focal observations on individual marmots during bouts of foraging. The ethogram focused on head position and activity; vigilance was defined as the head being up while the individual likely looks for predators; foraging was defined when the head was down while an individual walks or ingests food (full ethogram in Blumstein et al. 2009). In addition to quantifying foraging, we also collected key contextual information: the colony location, number of individuals within 10 m (foraging aggregation size, incline of the slope, substrate (stones, talus, dirt, low vegetation, or high vegetation), and the distance the marmot was to the nearest burrow while foraging (Chmura et al. 2016). All focal recordings were scored in JWatcher 1.0 (Blumstein & Daniel

2007) to quantify the mean time each individual allocated to vigilance versus foraging during the two-minute foraging bouts recorded across the active season.

Flight Initiation Distance and Tolerance of Approach

To quantify flight initiation distance (FID), a trained observer walked at a constant speed of 0.5 m/s directly towards a marmot that was not showing any alert behaviors at the time (Blumstein et al. 2004). We recorded the starting distance from the marmot to the observer, the alert distance from the marmot to the observer (when the marmot looked towards the observer but did not flee), and the flight initiation distance (when the marmot began to move away from the approaching observer) by dropping a flag for measurement after the animal fled and measuring with a measuring tape or laser-range finder (Yardagepro 400, Bushnell Performance Optics). Additionally, we also recorded the following environmental covariates to account for additional variation in FID (Stankowich & Blumstein 2005; Shuai et al. 2024): initial behavior, number of marmots within 10 m, slope of terrain and escape, substrate, trial number, and the marmot's distance from a burrow during the trial. We did not measure FID when it was windy or rainy.

Statistical Methods

To explore the relationship between group social structure and the time individuals allocated to vigilance, we fit a linear mixed effects model using the package "Ime4" (Bates et al. 2015). The following fixed effects were included in the model: number of individuals within 10 meters, sex (female or male), age class (yearling or adult), social group size (i.e., social network size) and the seven social network measures. Year, colony, and marmot ID were included as random effects. We log-transformed cut points, degree assortativity, and centralization to meet model assumptions. All continuous fixed effects were then standardized (mean-centered across all samples). This model had a variance inflation favor (VIF) of 8.83 for density. A correlation matrix for all numeric fixed effects indicated that density and inverse average path length were highly correlated (0.88). We then removed inverse average path length from our model because density was more clearly connected to the Social Security Hypothesis. The model without average path length did not have multicollinearity issues and met all other model assumptions (Table 2). This model for vigilance had 2,625 total observations consisting of 529 unique individuals across 133 unique social groups in 20 years. The vigilance measurements were recorded across the summer active season (mean \pm SD = 12 June \pm 23.3 days), with an average of 39.9 \pm 15.8 individuals recorded each year an average of 3.13 \pm 1.99 times each. Almost all (94.5%) of the vigilance recordings were conducted before 1 August. If an individual had multiple vigilance recordings per year, they still only had one social network value per social network measure for that year.

For FID, we fitted a linear mixed effects model with alert distance, distance to burrow, number of individuals within 10 meters, social group size, our seven social network measures, sex, age class, and trial number (to account for habituation) as fixed effects. We included alert distance as a fixed effect because of the strong positive correlation between FID and alert distance (Blumstein 2010; Cooper and Blumstein 2014) and because "best practice" suggests that AD should be included as a

variable in FID models (Blumstein et al. 2015). We included year, colony, and marmot ID as random effects. To meet model assumptions, we log-transformed alert distance, distance to burrow, number of individuals within 10 meters, group size, reciprocity, cut points, centralization, degree assortativity, and average path length. All continuous fixed effects were then standardized. This model had high VIF for density (11.37) and thus we again removed average path length due to a high correlation with density (0.93). The model without average path length did not have multicollinearity issues and met all other model assumptions (Table 3). This model for FID had 850 total observations between 299 unique individuals across 91 unique social groups in 16 years (FID data were not collected in four years due to logistical constraints). The FID measurements were conducted across the summer active season (mean \pm SD = 29 June \pm 19.7 days), with an average of 25.6 \pm 11.4 individuals tested each year an average of 2.06 \pm 1.23 times each. Almost all (93.4%) of the FID estimates were conducted before 1 August. If an individual had multiple FID recordings per year, they still only had one social network value per social network measure for that year.

Using the "partR2" package (version 0.9.2; Stoffel et al. 2021) in R, we report marginal and conditional partial and semi-partial R^2 values for each of our models. We then estimated 95% confidence intervals using 100 parametric bootstrap iterations.

RESULTS

For vigilance, we found that reciprocity (B = -0.015; P = 0.027) had a negative statistically significant relationship (i.e., individuals in more socially reciprocal groups spent less time looking for predators). No other measures of group social structure were statistically significant (Table 2). In addition to reciprocity, we found that the number of individuals within 10 meters (B = -0.02; P < 0.001) and social group size (B = -0.017; P = 0.016) were negatively statistically significant with vigilance (i.e., individuals with more conspecifics nearby while foraging and in their social group spent less time looking around). This model explained 4.7% of the marginal variance and 22.9% of the conditional variance in vigilance. We found no statistically significant relationships between the measures of group social structure and FID (Table 3). We did find that alert distance (B = 0.648; P < 0.001), distance to burrow (B = 0.155; P < 0.001), and trial number (B = 0.03; P = 0.025) were positively statistically significant with FID. This model explained 58.6% of the marginal variance in FID and 72.4% of the conditional variance.

	Estimate	SE	t-Value	P-Value	Marginal Partial R ²	Conditional Partial R ²
Intercept	0.360	0.021	17.019	<0.001	0.047 (0.037 - 0.075)	0.229 (0.159 - 0.328)
Social Group Size	-0.017	0.007	-2.402	0.016	0.005 (0 - 0.034)	0.186 (0.11 - 0.29)
Density	0.018	0.012	1.576	0.115	0.002 (0 - 0.032)	0.183 (0.107 - 0.288)
Transitivity	-0.003	0.008	-0.358	0.720	0 (0 - 0.03)	0.181 (0.105 - 0.286)
Reciprocity	-0.015	0.007	-2.222	0.027	0.001 (0 - 0.031)	0.182 (0.106 - 0.287)
Degree Assortativity	-0.006	0.006	-1.020	0.308	0.002 (0 - 0.032)	0.183 (0.107 - 0.288)
Cut Points*	0.009	0.006	1.557	0.120	0.003 (0 - 0.033)	0.184 (0.109 - 0.289)
Centralization*	-0.007	0.006	-1.247	0.213	0.002 (0 - 0.032)	0.183 (0.107 - 0.288)
Age Class	-0.008	0.008	-1.081	0.280	0.001 (0 - 0.031)	0.182 (0.106 - 0.287)
Sex	-0.002	0.008	-0.253	0.801	0 (0 - 0.03)	0.181 (0.105 - 0.286)
Number w/in 10m	-0.020	0.003	-5.891	<0.001	0.013 (0.004 - 0.042)	0.194 (0.119 - 0.297)

Table 2: Vigilance results. Estimates, standard errors, t-values, p-values, and marginal andconditional part R² values for the fixed effects of the linear mixed models for vigilance. *Indicateslog-transformation was done to better meet model assumptions

	Estimate	SE	t-Value	P-Value	Marginal Partial R ²	Conditional Partial R ²
Intercent	3 1 2 6	0.109	28.690	<0.001	0.586	0.724
intercept	5.120				(0.52 - 0.651)	(0.676 - 0.767)
	0.648	0.026	24 722	<0.001	0.444	0.581
	0.010	0.020	21.,22	01001	(0.389 - 0.51)	(0.52 - 0.641)
Distance to Burrow	0 155	0.022	7.022	<0.001	0.024	0.162
	01200	01022	,1022		(0 - 0.124)	(0.046 - 0.27)
Number w/in 10m	0.026	0.020	1.309	0.191	0.001	0.139
					(0 - 0.102)	(0.02 - 0.249)
Social Group Size	0.030	0.053	0.561	0.575	0.001	0.138
					(0 - 0.102)	(0.019 - 0.249)
Density	0.011	0.086	0.127	0.899	0	0.138
Density	0.011	01000	0.127		(0 - 0.102)	(0.019 - 0.248)
Transitivity	0.068	0.048	1 423	0.155	0	0.136
					(0 - 0.1)	(0.017 - 0.247)
Reciprocity	-0.059	0.044	-1.340	0.182	0.004	0.142
					(0 - 0.105)	(0.023 - 0.252)
Degree Assortativity	-0.010	0.038	-0.269	0.788	0	0.136
					(0 - 0.1)	(0.017 - 0.247)
Cut Points*	0.055 0.034	0.034	1.610	0.108	0	0.136
		0.031			(0 - 0.1)	(0.016 - 0.246)
Centralization*	0.039	0.036	1.081	0.280	0	0.138
Centralization	0.000	0.000	1.001	0.200	(0 - 0.102)	(0.019 - 0.248)
Age Class	0.012	0.046	0.266	0.791	0	0.138
					(0 - 0.102)	(0.019 - 0.249)
Sex	-0.064 0.05	0.050	-1 267	0 207	0.002	0.14 (
JEA	0.004	0.000	1.207	0.207	(0 - 0.104)	0.021 - 0.25)
Trial Number	-0.030	0.014	-2,240	0.025	0	0.136
	-0.030 0.014	0.011	2.270	0.023	(0 - 0.1)	(0.017 - 0.247)

Table 3: FID results. Estimates, standard errors, t-values, p-values, and marginal and conditional partR² values for the fixed effects of the linear mixed models for FID. *Indicates log-transformation wasdone to better meet model assumptions

DISCUSSION

Overall, we found very modest support for the extended group-level Social Security Hypothesis for vigilance, but no support at the group-level in our findings for FID. At the individual-level in this system, previous studies found that affiliative social relationships are associated with both FID and vigilance (Mady & Blumstein 2017; Szulanski et al. 2024). By exploring both vigilance and FID together, which reflect different aspects of antipredator behavior, we highlight the importance of examining multiple different antipredator behaviors to better understand the relationships with sociality.

For vigilance, the negative association with reciprocity may suggest that individuals residing in more egalitarian groups (in which individuals initiate interactions with one another more equally) allocate less time towards vigilance behavior and thus may perceive less risk than individuals residing in less socially reciprocal groups. In other mammalian systems, reciprocal interactions between individuals within a group are positively associated with cooperative antipredator response behaviors (Smith 1986; Wheeler 2008; Taborsky & Riebli 2020). For example, crested macaques (*Macaca nigra*) exabit a stronger response to playbacks of conspecifics' alarm calls if they were produced by an individual with whom they share a strong social bond (Micheletta et al. 2012). Our modest finding that individuals in more socially reciprocal groups have higher perceived security may suggest that the value of social reciprocity for perceived safety scales from individuals to groups, and that this is possibly observed across taxa.

However, while reciprocity as a measure of group social structure had a statistically significant association with vigilance, it had a small effect size (B = -0.015; $R^2_m = 0.001$), suggesting group reciprocity may have limited influence in the grand scheme of all factors that may influence individual vigilance. For example, we found that social group size (B = -0.017; $R^2_m = 0.005$) and the number of individuals within 10 meters of the focal individual (B = -0.02; $R^2_m = 0.013$) had stronger statistically significant negative associations. Group size's association supports the 'Dilution Effect' (Cresswell 1994) while the number of conspecifics within 10 meters suggests that foraging aggregation size and the immediate social surroundings of an individual may have a greater impact on antipredator risk assessment behavior than the more emergent group social structure.

To this same end, while no measures of group social structure explained variance in FID, three contextual fixed effects did: alert distance, distance from burrow, and trial number. The closer the observer was when the animal looked at the observer and the further an animal was from their burrow, the sooner the animal fled (as seen in Blumstein et al. 2005). This again suggests that the immediate surroundings and the environmental context that an individual experiences may have a larger influence on perceived security than social group structure when being approached by a threat. The negative association between FID and trial number suggests that repeated FID trials on marmots may have a modest habituation effect, with individuals fleeing at shorter distances with more trials. This has been shown in past studies in this system: animals subject to repeated trials of FIDs and exposure to human disturbance will tolerate closer human approach (Uchida & Blumstein 2021). This habituation to humans may contribute to the lack of a relationship with group social

structure: individuals may rely on their immediate environmental context rather than social information given the known risk of humans from previous experiences.

Taken together, our results suggest that environmental and contextual factors have a stronger relationship with antipredator risk assessment and behavior than group social structure. How many individuals are nearby, how close the threat was when the animal alerts, and how many past FID trials have larger effect sizes (as measured by the semi-partial marginal part R²) and stronger relationships (as measured by the estimates) with antipredator escape behavior than any measure of group social structure (Table 2; Table 3).

Our results also suggest that FID and time allocated to vigilance measure two different components of antipredator behavior. The time an individual allocates to vigilance represents the response to the ambient risk in the environment during foraging (Lima & Bednekoff 1999; Armitage & Salsbury 2016), whereas the decision to flee reflects the response to more immediate threats, such as an approaching predator (Lima & Bednekoff 1999). Thus, our finding that group social structure relates to vigilance (the ambient risk) but not FID (the immediate risk) perhaps suggests that the structure of your group does not offer support or perceived security in a risky situation but does in a risky environment. This may align with the literature that suggests there are trade-offs and cost-benefit analyses underpinning risk-assessment behaviors in response to perceived predation risk (Lima & Dill 1990).

Contextualizing our results across taxa is impeded by the difficulty to generalize antipredator results across taxa. Prior studies have found that many environmental factors associated with FID are species-specific and context-dependent (Stankowich & Blumstein 2005). For example, aggregation size and repeated exposure to human disturbance (habituation) have been shown to have conflicting results with FID. Increased aggregation size may increase FID, supporting the 'Many Eyes Hypothesis' (Morelli et al. 2019), and decrease FID, supporting the 'Dilution Effect' (Braimoh et al. 2018; Ardila-Villamizar et al. 2022). Both habituation and sensitization can occur in repeated trials of FIDs (Uchida & Blumstein 2021). For example, animals in urban areas can decrease their responsiveness to humans due to repeated exposure to harmless humans (Uchida et al. 2019) while human disturbance from increased hunting activity has increased the FID in wild reindeer (Rangifer tarandus) (Reimers et al. 2009). Despite the difficulties in generalizing across taxa, social reciprocity is observed across a wide range of taxa (Van Doorn & Taborsky 2012) and thus may influence antipredator behavior more broadly, at least for ambient risk behaviors. The more immediate social environment (i.e., number of conspecifics within 10 meters) having a stronger relationship than the more passive and emergent group social structure may also be observed across taxa. However, both of these predictions require broader exploration across species and contexts.

In summary, we found that group social structure is only modestly associated with antipredator risk assessment and that group social structure is not associated with antipredator escape decisions when faced with an immediate and approaching threat. Overall, results suggest that environmental and contextual factors have a stronger relationship with antipredator risk assessment and behavior than group social structure. However, given group social structure is an important component of individual's social environments across taxa and contexts (Solomon-Lane et al. 2015; Philson et al. 2022; Costello et al. 2023; Philson & Blumstein 2023a; Philson & Blumstein 2023b), further exploration into how the structure of social groups may influence antipredator behavior is warranted.

ACKNOWLEDGEMENTS

Data were collected with permission from Colorado Parks and Wildlife (TR917, renewed annually) and under the UCLA Institutional Animal Care and Use protocol 2001-191-01 (renewed annually). We thank Julien G.A. Martin for managing the database and the many previous marmoteers of the RMBL Marmot Project who collected these data. We also thank the Rocky Mountain Biological Laboratory and its staff for the logistical support that makes long-term research like this possible.

FUNDING

CSP was supported by the Rocky Mountain Biological Laboratory. CK was supported by the Rocky Mountain Biological Laboratory. KU was supported by Japan Society for the Promotion of Science Overseas Research Fellowship and the KAKENHI JP22KJ0721. DTB was supported by the National Geographic Society, the University of California Los Angeles (Faculty Senate and Division of Life Sciences), a RMBL research fellowship, and the U.S. National Science Foundation (NSF IDBR-0754247 and DEB-1119660 and 1557130 to D.T.B., as well as DBI 0242960, 07211346, 1226713, and 1755522 to RMBL).

DATA AVAILABILITY

Analyses reported in this article can be reproduced using the data and code provided in Philson et al. (2025).

CONFLICT OF INTEREST

The authors declare no conflicts of interest.

REFERENCES

- Ardila-Villamizar, M., Alarcón-Nieto, G., & Maldonado-Chaparro, A. A. (2022). Fear in urban landscapes: conspecific flock size drives escape decisions in tropical birds. Royal Society Open Science, 9(11), 221344. https://doi.org/10.1098/rsos.221344.
- Armitage, K. B. (2003). Behavioral responses of yellow-bellied marmots to birds and mammals.
 Oecologia Montana, 12(1-2), 15-20.
 https://om.vuvb.uniza.sk/index.php/OM/article/view/163.
- Armitage, K. B. (2014). Marmot biology: sociality, individual fitness, and population dynamics. Cambridge University Press. https://doi.org/10.1017/CBO9781107284272.
- Armitage, K. B., & Salsbury, C. M. (2016). Pattern and variation of the time budget of yellow-bellied marmots. Ethology Ecology & Evolution, 28(3), 329-365. https://doi.org/10.1080/03949370.2015.1059894.
- Bates, D. (2014). Fitting Linear Mixed-Effects Models Using Lme4. Journal of Statistical Software, 67, 1–48,. https://doi.org/10.18637/jss.v067.i01.
- Beauchamp, G., Li, Z., Yu, C., Bednekoff, P. A., & Blumstein, D. T. (2021). A meta-analysis of the group-size effect on vigilance in mammals. Behavioral Ecology, 32(5), 919-925. https://doi.org/10.1093/beheco/arab048.
- Blumstein, D. T. (2010). Flush early and avoid the rush: a general rule of antipredator behavior?. Behavioral Ecology, 21(3), 440-442.
- Blumstein, D. T. (2013). Yellow-bellied marmots: insights from an emergent view of sociality. Philosophical Transactions of the Royal Society B: Biological Sciences, 368(1618), 20120349. https://doi.org/10.1098/rstb.2012.0349.
- Blumstein, D. T., & Daniel, J. C. (2004). Yellow-bellied marmots discriminate between the alarm calls of individuals and are more responsive to calls from juveniles. Animal Behaviour, 68(6), 1257-1265.
- Blumstein, D. T., Ferando, E., & Stankowich, T. (2009). A test of the multipredator hypothesis:
 yellow-bellied marmots respond fearfully to the sight of novel and extinct predators. Animal
 Behaviour, 78(4), 873-878. https://doi.org/10.1016/j.anbehav.2009.07.010.
- Blumstein, D. T., Fernández-Juricic, E., Zollner, P. A., & Garity, S. C. (2005). Inter-specific variation in avian responses to human disturbance. Journal of applied ecology, 42(5), 943-953. https://doi.org/10.1111/j.1365-2664.2005.01071.x.
- Blumstein, D. T., Fuong, H., & Palmer, E. (2017). Social security: social relationship strength and connectedness influence how marmots respond to alarm calls. Behavioral Ecology and Sociobiology, 71, 1-9.

- Blumstein, D. T., Runyan, A., Seymour, M., Nicodemus, A., Ozgul, A., Ransler, F., ... & Daniel, J. C.
 (2004). Locomotor ability and wariness in yellow-bellied marmots. Ethology, 110(8), 615-634.
- Blumstein, D. T., Samia, D. S. M., Stankowich, T., Cooper, W. E. Jr. (2015). Best practice for the study of escape behaviour. In: Cooper WE Jr., Blumstein DT, editors. Escaping from predators: an integrative view of escape decisions. Cambridge: Cambridge University Press. p. 407–419.
- Blumstein, D. T., Sanchez, M., Philson, C. S., & Bliard, L. (2023). Is flight initiation distance associated with longer-term survival in yellow-bellied marmots, Marmota flaviventer?. Animal Behaviour, 202, 21-28.
- Braimoh, B., Iwajomo, S., Wilson, M., Chaskda, A., Ajang, A., & Cresswell, W. (2018). Managing human disturbance: factors influencing flight-initiation distance of birds in a West African nature reserve. Ostrich, 89(1), 59-69. https://doi.org/10.2989/00306525.2017.1388300
- Chmura, H. E., Wey, T. W., & Blumstein, D. T. (2016). Assessing the sensitivity of foraging and vigilance to internal state and environmental variables in yellow-bellied marmots (Marmota flaviventris). Behavioral ecology and sociobiology, 70, 1901-1910. https://doi.org/10.1007/s00265-016-2195-y.
- Cooper Jr, W. E., & Blumstein, D. T. (2014). Novel effects of monitoring predators on costs of fleeing and not fleeing explain flushing early in economic escape theory. Behavioral Ecology, 25(1), 44-52.
- Costello, R. A., Cook, P. A., Brodie III, E. D., & Formica, V. A. (2023). Multilevel selection on social network traits differs between sexes in experimental populations of forked fungus beetles. Evolution, 77(1), 289-303.
- Cresswell, W. (1994). Flocking is an effective anti-predation strategy in redshanks, Tringa totanus. Animal behaviour, 47(2), 433-442. https://doi.org/10.1006/anbe.1994.1057.
- Csardi, G., & Nepusz, T. (2006). The Igraph Software Package for Complex Network Research. InterJournal, Complex Systems, 1695, 1-9. http://igraph.org.
- Farine, D. R., & Whitehead, H. (2015). Constructing, conducting and interpreting animal social network analysis. Journal of animal ecology, 84(5), 1144-1163. https://doi.org/10.1111/1365-2656.12418.
- Fuong, H., Maldonado-Chaparro, A., & Blumstein, D. T. (2015). Are social attributes associated with alarm calling propensity?. Behavioral Ecology, 26(2), 587-592. https://doi.org/10.1093/beheco/aru235.
- Hill, R. A., & Lee, P. C. (1998). Predation risk as an influence on group size in cercopithecoid primates: implications for social structure. Journal of Zoology, 245(4), 447-456. https://doi.org/10.1111/j.1469-7998.1998.tb00119.x.

- Hinde, R. A. (1976). Interactions, relationships and social structure. Man, 1-17. https://doi.org/10.2307/2800384.
- Kasper, C., & Voelkl, B. (2009). A social network analysis of primate groups. Primates, 50(4), 343-356. https://doi.org/10.1007/s10329-009-0153-2.
- Kelt, D. A., & Van Vuren, D. H. (2001). The ecology and macroecology of mammalian home range area. The American Naturalist, 157(6), 637-645. https://doi.org/10.1086/320621.
- Lima, S. L. (1995). Back to the basics of anti-predatory vigilance: the group-size effect. Animal Behaviour, 49(1), 11-20. https://doi.org/10.1016/0003-3472(95)80149-9.
- Lima, S. L., & Bednekoff, P. A. (1999). Temporal variation in danger drives antipredator behavior: the predation risk allocation hypothesis. The American Naturalist, 153(6), 649-659. https://doi.org/10.1086/303202.
- Lima, S. L., & Dill, L. M. (1990). Behavioral decisions made under the risk of predation: a review and prospectus. Canadian journal of zoology, 68(4), 619-640.
- Mady, R. P., & Blumstein, D. T. (2017). Social security: are socially connected individuals less vigilant? Animal Behavior. 134, 79–85. https://doi.org/10.1016/j.anbehav.2017.10.010.
- McPherson, M., Smith-Lovin, L., & Cook, J. M. (2001). Birds of a feather: Homophily in social networks. Annual Review of Sociology, 27(1), 415-444. https://doi.org/10.1146/annurev.soc.27.1.415
- Micheletta, J., Waller, B. M., Panggur, M. R., Neumann, C., Duboscq, J., Agil, M., & Engelhardt, A.
 (2012). Social bonds affect anti-predator behaviour in a tolerant species of macaque, Macaca nigra. Proceedings of the Royal Society B: Biological Sciences, 279(1744), 4042-4050. https://doi.org/10.1098/rspb.2012.1470.
- Morelli, F., Benedetti, Y., Díaz, M., Grim, T., Ibáñez-Álamo, J. D., Jokimäki, J., ... & Møller, A. P. (2019). Contagious fear: Escape behavior increases with flock size in European gregarious birds. Ecology and Evolution, 9(10), 6096-6104. https://doi.org/10.1002/ece3.5193.
- Pfau, M., Degregori, S., Johnson, G., Tennenbaum, S. R., Barber, P. H., Philson, C. S., & Blumstein, D. T. (2023). The social microbiome: gut microbiome diversity and abundance are negatively associated with sociality in a wild mammal. Royal Society Open Science, 10(10), 231305.
- Philson, C. S., & Blumstein, D. T. (2023a). Emergent social structure is typically not associated with survival in a facultatively social mammal. Biology letters, 19(3), 20220511. https://doi.org/10.1098/rsbl.2022.0511.
- Philson, C. S., & Blumstein, D. T. (2023b). Group social structure has limited impact on reproductive success in a wild mammal. Behavioral Ecology, 34(1), 89-98. https://doi.org/10.1093/beheco/arac102.

- Philson, C. S., Klassen, C., Uchida, K., CS, & Blumstein DT (2025). Data for: Social Security: Individuals in Socially Reciprocal Groups Perceive Security. Behavioral Ecology https://doi.org/10.17605/OSF.IO/RZUVA.
- Philson, C. S., Todorov, S. M., & Blumstein, D. T. (2022). Marmot mass gain rates relate to their group's social structure. Behavioral Ecology, 33(1), 115-125. https://doi.org/10.1093/beheco/arab114.
- Pulliam, H. R. (1973). On the advantages of flocking. Journal of Theoretical Biology, 38(2), 419–22. https://doi.org/10.1016/0022-5193(73)90184-7.
- Reimers, E., Loe, L. E., Eftestøl, S., Colman, J. E., & Dahle, B. (2009). Effects of hunting on response behaviors of wild reindeer. The Journal of Wildlife Management, 73(6), 844-851.
- Rosvall, M., & Bergstrom, C. T. (2008). Maps of random walks on complex networks reveal community structure. Proceedings of the national academy of sciences, 105(4), 1118-1123. https://doi.org/10.1073/pnas.0706851105.
- Rosvall, M., Axelsson, D., & Bergstrom, C. T. (2009). The map equation. The European Physical Journal Special Topics, 178(1), 13-23. https://doi.org/10.1140/epjst/e2010-01179-1.
- Sah, P., Mann, J., & Bansal, S. (2018). Disease implications of animal social network structure: a synthesis across social systems. Journal of Animal Ecology, 87(3), 546-558. https://doi.org/10.1111/1365-2656.12786.
- Samia, D. S., Nomura, F., & Blumstein, D. T. (2013). Do animals generally flush early and avoid the rush? A meta-analysis. Biology letters, 9(2), 20130016. https://doi.org/10.1098/rsbl.2013.0016.
- Schneidman, S. A., Philson, C. S., & Blumstein, D. T. (2024). Extending the social cohesion hypothesis: is group social structure associated with dispersal in yellow-bellied marmots (Marmota flaviventer)?. Current Zoology, zoae002. https://doi.org/10.1093/cz/zoae002.
- Shackleton, K., Alves, D. A., & Ratnieks, F. L. (2018). Organization enhances collective vigilance in the hovering guards of Tetragonisca angustula bees. Behavioral Ecology, 29(5), 1105-1112. https://doi.org/10.1093/beheco/ary086.
- Shuai, L. Y., Morelli, F., Mikula, P., Benedetti, Y., Weston, M. A., Ncube, E., ... & Cao, Y. Y. (2024). A meta-analysis of the relationship between flock size and flight initiation distance in birds.
 Animal Behaviour, 210, 1-9. https://doi.org/10.1016/j.anbehav.2024.01.013.
- Smith, R. J. F. (1986). Evolution of alarm signals: role of benefits of retaining group members or territorial neighbors. The American Naturalist, 128(4), 604-610. https://www.jstor.org/stable/2461341.
- Solomon-Lane, T. K., Pradhan, D. S., Willis, M. C., & Grober, M. S. (2015). Agonistic reciprocity is associated with reduced male reproductive success within haremic social networks.
 Proceedings of the Royal Society B: Biological Sciences, 282(1811), 20150914.
 https://doi.org/10.1098/rspb.2015.0914.

- Stankowich, T., & Blumstein, D. T. (2005). Fear in animals: a meta-analysis and review of risk assessment. Proceedings of the Royal Society B: Biological Sciences, 272(1581), 2627-2634. https://doi.org/10.1098/rspb.2005.3251.
- Stoffel, M. A., Nakagawa, S., & Schielzeth, H. (2021). partR2: Partitioning R2 in generalized linear mixed models. PeerJ, 9, e11414.
- Szulanski, T., Philson, C. S., Uchida, K., & Blumstein, D. T. (2024). Social security: Does social position influence flight initiation distance?. Behavioral Ecology, 35(1), arad104. https://doi.org/10.1093/beheco/arad104
- Taborsky, M., & Riebli, T. (2020). Coaction vs. Reciprocal cooperation among unrelated individuals in social cichlids. Frontiers in Ecology and Evolution, 7, 515. https://doi.org/10.3389/fevo.2019.00515.
- Tätte, K., Ibáñez-Álamo, J. D., Markó, G., Mänd, R., & Møller, A. P. (2019). Antipredator function of vigilance re-examined: vigilant birds delay escape. Animal behaviour, 156, 97-110. https://doi.org/10.1016/j.anbehav.2019.08.010.
- Tyrrell, L. P., & Fernández-Juricic, E. (2015). Sensory systems and escape behavior. In Escaping from predators: An integrative view of escape decisions (Vol 1, pp. 322-341). Cambridge University Press. https://doi.org/10.1017/CBO9781107447189.013.
- Uchida, K., & Blumstein, D. T. (2021). Habituation or sensitization? Long-term responses of yellowbellied marmots to human disturbance. Behavioral Ecology, 32(4), 668-678. https://doi.org/10.1093/beheco/arab016.
- Uchida, K., Suzuki, K. K., Shimamoto, T., Yanagawa, H., & Koizumi, I. (2019). Decreased vigilance or habituation to humans? Mechanisms on increased boldness in urban animals. Behavioral Ecology, 30(6), 1583-1590. https://doi.org/10.1093/beheco/arz117
- Van Deventer, A., & Shrader, A. M. (2021). Predation risk and herd position influence the proportional use of antipredator and social vigilance by impala. Animal Behaviour, 172, 9-16. https://doi.org/10.1016/j.anbehav.2020.11.019.
- Van Doorn, G. S., & Taborsky, M. (2012). The evolution of generalized reciprocity on social interaction networks. Evolution, 66(3), 651-664. https://doi.org/10.1111/j.1558-5646.2011.01479.x
- Watts, D. P. (1998). A preliminary study of selective visual attention in female mountain gorillas (Gorilla gorilla beringei). Primates, 39, 71-78. https://doi.org/10.1007/BF02557744.
- Weston, M. A., McLeod, E. M., Blumstein, D. T., & Guay, P. J. (2012). A review of flight-initiation distances and their application to managing disturbance to Australian birds. Emu-Austral Ornithology, 112(4), 269-286. https://doi.org/10.1071/MU12026.
- Wey, T., Blumstein, D. T., Shen, W., & Jordán, F. (2008). Social network analysis of animal behaviour: a promising tool for the study of sociality. Animal behaviour, 75(2), 333-344. https://doi.org/10.1016/j.anbehav.2007.06.020

- Wheeler, B. C. (2008). Selfish or altruistic? An analysis of alarm call function in wild capuchin monkeys, Cebus apella nigritus. Animal Behaviour, 76(5), 1465-1475. https://doi.org/10.1016/j.anbehav.2008.06.023.
- Whitehead, H. (2009). SOCPROG programs: analysing animal social structures. Behavioral Ecology and Sociobiology, 63, 765-778. https://doi.org/10.1007/s00265-008-0697-y.
- Ydenberg, R. C., & Dill, L. M. (1986). The economics of fleeing from predators. In Advances in the Study of Behavior (Vol. 16, pp. 229-249). Academic Press. https://doi.org/10.1016/S0065-3454(08)60192-8.