



Haemosporidian taxonomic composition, network centrality and partner fidelity between resident and migratory avian hosts

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Abstract

Migration can modify interaction dynamics between parasites and their hosts with migrant hosts able to disperse parasites and impact local community transmission. Thus, studying the relationships among migratory hosts and their parasites is fundamental to elucidate how migration shapes host–parasite interactions. Avian haemosporidians are some of the most prevalent and diverse group of wildlife parasites and are also widely studied as models in ecological and evolutionary research. Here, we contrast partner fidelity, network centrality and parasite taxonomic composition among resident and non-resident avian hosts using presence/absence data on haemosporidians parasitic in South American birds as study model. We ran multilevel Bayesian models to assess the role of migration in determining partner fidelity (i.e., normalized degree) and centrality (i.e., weighted closeness) in host–parasite networks of avian hosts and their respective haemosporidian parasites. In addition, to evaluate parasite taxonomic composition, we performed permutational multivariate analyses of variance to quantify dissimilarity in haemosporidian lineages infecting different host migratory categories. We observed similar partner fidelity and parasite taxonomic composition among resident and migratory hosts. Conversely, we demonstrate that migratory hosts play a more central role in host–parasite networks than residents. However, when evaluating partially and fully migratory hosts separately, we observed that only partially migratory species presented higher network centrality when compared to resident birds. Therefore, migration does not lead to differences in both partner fidelity and parasite taxonomic composition. However, migratory behavior is positively associated with network centrality, indicating migratory hosts play more important roles in shaping host–parasite interactions and influence local transmission.

Keywords Haemosporidians · Migratory behavior · Antagonistic interactions · Partner fidelity · Network centrality

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Introduction

Migration, i.e., long distance and periodical roundtrip movement of animals between distinct habitats, can alter interaction dynamics among parasites and their hosts by serving as an escape mechanism from some pathogens but also increasing parasite prevalence and richness of certain other pathogens within migrant host species (Altizer et al. 2011; Satterfield et al. 2015; de Angeli Dutra et al. 2021a; Poulin and de Angeli Dutra 2021). Migratory behavior can also modify the availability of hosts for parasites across regions, since migrant individuals do not inhabit the same habitat year-round (Bauer and Hoyer 2014). At the same time, migrants can represent an opportunity for parasites to increase their distribution worldwide, as infected migrant individuals transport their pathogens through their routes and stopovers, therefore, providing new opportunities for host switching into new environments and resident species

(Altizer et al. 2011; de Angeli Dutra et al. 2021b; Poulin and de Angeli Dutra 2021). Indeed, the presence of migratory individuals can also affect local parasite transmission, altering parasite prevalence and richness within resident host communities (Bauer and Hoyer 2014; de Angeli Dutra et al. 2021b; Fecchio et al. 2021). However, despite the fact migration can modulate parasite–host interaction, only a few studies have addressed the implications of host migration for parasite ecology (Poulin and de Angeli Dutra 2021).

Intrinsic characteristics of host–parasite interactions could be altered by host migratory behavior, including traits, such as virulence (i.e., pathogenicity level) or partner fidelity, i.e., the species specificity in pairwise host–parasite associations. In this context, network analysis can be a powerful tool to explore the roles of particular species for both hosts and parasites (Runghen et al. 2021). Previous research suggests antagonistic interactions display lower partner fidelity than mutualistic ones (Fortuna et al. 2020) and hosts traits can drive network descriptors (Campião and Dáttilo 2020). In addition, infecting migratory individuals may pose a challenge to parasites due to the need to adapt to novel resources and conditions, which could lead to looser fidelity among parasites and their migrant hosts. For example, for malaria parasites infecting migratory birds to be transmitted into their hosts' new habitats, they must be able to infect and complete their cycle in new vector species under distinct environmental characteristics (Valkiūnas 2005). Hence, the exposure of parasites to abrupt environmental and vector changes may impact the ecological relationship between parasites and their migratory hosts, since host migrations represent repeated, predictable, and directional selective pressures (Møller and Szép 2011; Poulin and de Angeli Dutra 2021). Therefore, it is essential to study how host shifts between migratory and resident hosts occurring in sympatry and under different environmental conditions can alter parasite–host dynamics.

Avian haemosporidian parasites, i.e., malaria and malaria-like vector borne protozoan parasites, are some of the most prevalent, diverse and studied wildlife pathogens, being an excellent ecological model to study host–parasite relationships. These parasites use hematophagous Diptera as definitive hosts and vertebrates as intermediate hosts (Valkiūnas 2005). Within their vertebrate hosts avian haemosporidians infect and multiply in reticular cells for at least a few generations before reaching the blood stream, where they can multiply into new parasite forms or develop into gametocytes (i.e., the infective form for vectors) (Valkiūnas 2005). These parasites due to their high prevalence, diversity, cosmopolitan distribution and variable levels of specificity to their hosts (Valkiūnas 2005), which is particularly relevant for South America as it harbors the highest diversity of birds, vectors and haemosporidian parasites worldwide (Remsen et al. 2012; Santiago-Alarcon et al.

2012; Ellis et al. 2019). This region is also characterized by great vector abundance and considerable haemosporidian prevalence (Braga et al. 2011; Santiago-Alarcon et al. 2012). Furthermore, avian community composition seems to impact parasite composition as well, with avian community turnover driving both haemosporidian and ornithophilic mosquito turnover across the Amazon region (De La Torre et al. 2021). All those features together make South America an ideal region to investigate ecological and evolutionary dynamics of avian haemosporidian interaction.

Studying the role of host migratory behavior in shaping parasite taxonomic composition (i.e., the set of distinct parasite lineages infecting a given host species), host network centrality (i.e., the position a species occupies in the host–parasite interaction network) and partner fidelity (i.e., consistency in the interaction between certain parasites and their hosts) is fundamental to understand the impact of host migration on life-history traits for parasites. Here, we hypothesize that resident species show higher partner fidelity to their parasites due to the greater stability of environmental conditions and vector species they face. In addition, since migrants harbor higher taxonomic richness of haemosporidians (de Angeli Dutra et al. 2021a) and face more unstable environmental conditions and vector availability (what should increase their infection by generalist parasites), we also expect them to occupy more central positions in host–parasite networks. Moreover, since migrants are also exposed to more parasite lineages as they visit regions that harbor different parasite communities, our second hypothesis is that parasite taxonomic composition differs between resident and migratory avian hosts species. In this study, we computed and compared partner fidelity and network centrality levels between haemosporidians and their resident and partially and fully migratory avian hosts using Bayesian multilevel models. Furthermore, using permutational multivariate analyses of variance (PERMANOVA) we evaluated whether resident and migratory hosts harbor similar haemosporidian taxonomic assemblages.

Methods

Data set

All analyses were performed using a data set comprising 15,285 individual birds representing 974 avian species. Avian communities were sampled in 85 different localities across seven different South American biomes—Amazonia, Atlantic Rain Forest, Cerrado, Temperate Grassland, Caatinga, Pantanal and Andean Forest (Fig. 1). The birds were sampled from 2005 to 2018 with a subset of those samples having previously been used in published research (Lacorte et al. 2013; Ferreira et al. 2017; Fecchio et al. 2019a, 2020;

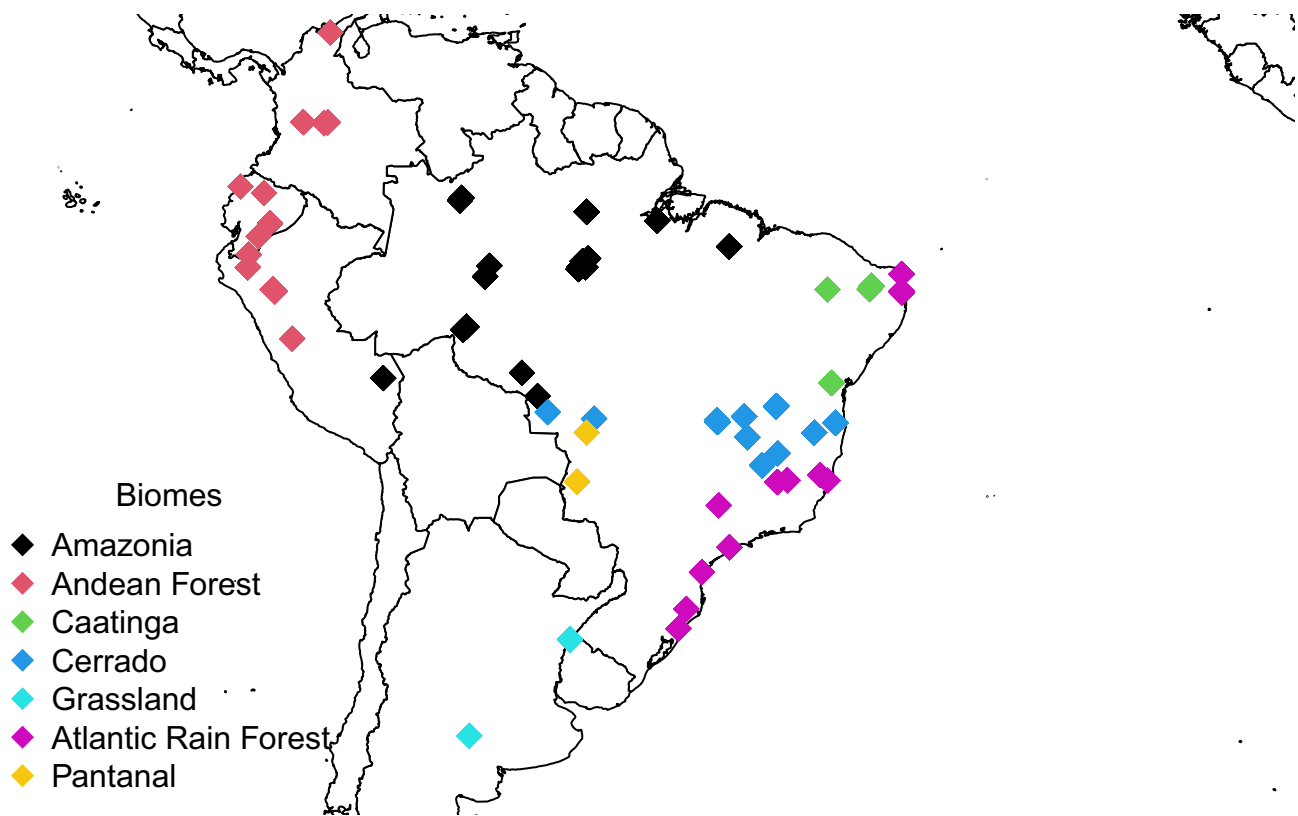


Fig. 1 Localities where haemosporidians were sampled from birds, comprising a total of 85 localities by combining our data set and the MalAvi database

Anjos et al. 2021) and the rest consisting of unpublished data. This large data set was combined with data available from MalAvi (<http://130.235.244.92/Malavi/>) and represents a total of 2758 sequenced parasites representing 752 distinct lineages, all belonging to one of three genera: *Plasmodium*, *Haemoproteus* and *Leucocytozoon*. Haemosporidian infection was estimated using PCR protocols described previously (Fallon et al., 2003; Hellgren et al., 2004; Bell et al., 2015). All lineages were identified by sequencing a DNA fragment obtained using PCR protocols described by Hellgren et al. (2004) that amplify a cytochrome b fragment of 478 base pairs. Hosts were classified into three migratory categories: (1) resident; (2) partial migrant (i.e., only a part of the bird population migrates) and (3) full migrant (i.e., the entire bird population migrates), according to the Brazilian Committee of Ornithology Records—CRBO 2014, Somenzari et al., 2018 and BirdLife International (<https://www.birdlife.org/>).

haemosporidian-host partner fidelity and network centrality analyses

All analyses were conducted in R version 4.0 (R Core Team 2020). For haemosporidian-bird partner fidelity and network

centrality analyses, we considered only localities with at least 10 distinct parasite lineages, which involved 249 distinct avian host species and 40 parasite lineages from five biomes—Amazonia, Andean Forest, Cerrado, Caatinga and Atlantic Rain Forest. We created incidence matrices between avian host species and parasite lineages for each biome. Using the “species level” function from the “bipartite” package (Dormann et al. 2008) in R, we computed normalized degree and weighted closeness and betweenness values for hosts infected by parasites in each biome. The first value represents the number of distinct realized interactions between hosts and parasites in each biome divided by the total number of distinct potential partners (i.e., parasites) in that same region. Normalized degree values can be employed as measures of partner fidelity, with hosts presenting higher values being less specific to their partners than hosts with lower values (Fortuna et al. 2020). On the other hand, weighted closeness and betweenness are measures of centrality in a network. Weighted closeness is calculated as the inverse minimum sum of the paths between a species (i.e., hosts) and all their partners (i.e., parasites) through the network, with hosts presenting higher closeness values being more central. In contrast, weighted betweenness represents the degree to which a species is positioned on the paths linking

other species, i.e., the degree to which a species connects other species in an ecological network. We then combined the values obtained for birds in all biomes into one single data set and ran a Bayesian model to compare partner fidelity and network centrality among migratory categories.

Later, to control and standardize our results for network size and for the uneven number of bird species in the different migratory categories, we calculated the Z-scores (i.e., the position of a raw value in terms of its distance from the mean of simulated values) for each of the metrics described above (normalized degree, weighted closeness and weighted betweenness) for each bird species in each biome. First, using the function “vaznull” from the “bipartite” package, we created 9999 random networks for each biome. Then, we estimated the three network metrics for each random network as described above for bird species in each biome and used the random values generated from the 9999 permutations to calculate the Z-score of each metric for each sample. These values were employed in the analyses below.

To run our Bayesian analyses, we employed the function “brm” from the “brms” package (Bürkner 2017). Here, we considered Z-scored normalized degree as the response variable for our first model, while for our second and third models we employed Z-scored weighted closeness and Z-scored weighted betweenness as our response variables. Avian host migratory category (resident; partial migrant and full migrant, reference level = resident) was included as our population-level effect in all models and biome as random effect in all models. Furthermore, we downloaded the full avian phylogeny file from the AllBirdsHackett1.tre website (<https://birdtree.org/>) and using the function “drop.tip” from the “ape” package, we selected only the species used for our analyses. Later, we created a matrix with phylogenetic distances between bird species with the function “inverseA” from the “MCMCglmm” package. This matrix was also added to all our models as random effect to account for host phylogenetic influence on partner fidelity and network centrality employing “gr” and “data2” arguments from the “brms” package. For all models, we ran the Bayesian models using 4 chains with 4000 total iterations per chain (2000 for warmup, 2000 for sampling) and employed skewed normal distribution for normalized degree and weighted betweenness and Gaussian distribution for weighted closeness to match the Z-scored values distributions. Priors were determined using the “get_prior” function again from the “brms” package and added manually to the models.

The model results were plotted using the “conditional_effects” function to visualize the predicted normalized degree and weighted closeness as a function of the host migratory status. Furthermore, we subsequently combined partial and full migrants into one single category and repeated our Bayesian analyses. Afterwards, we applied the “bip_ggnet” function from the “ggnet” package ([\[te.github.io/ggnet/\]\(http://te.github.io/ggnet/\)\) to plot a bipartite net representing the relationships among haemosporidian lineages and avian hosts from different migratory categories.](http://briat</p>
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Haemosporidian taxonomic composition analyses

For haemosporidian taxonomic composition analyses, we considered only localities with 10 or more individual birds sampled, at least three distinct parasite lineages per biome and at least two distinct host migratory categories, which included 2465 haemosporidian infections from 485 avian species (Supplementary Table S1). We created an incidence matrix between host migratory category and parasite lineages per biome. Later, applying the function “vegdist” (method Bray) from the “vegan” package in R (Dixon 2003), we calculated dissimilarity indices for parasite taxonomic composition among migratory host categories. We then compared dissimilarity in parasite taxonomic composition among migratory categories using an Analyses of Variance with permutation test (PERMANOVA) for homogeneity of multivariate dispersions. For this, we employed the “permutest” function also from the “vegan” package with 999 permutations. Again, we subsequently combined partial and full migrants into one migratory category and repeated the analyses above. A non-metric multidimensional scaling plot was used to visualize the dissimilarity in parasite taxonomic composition among avian host migratory categories.

Results

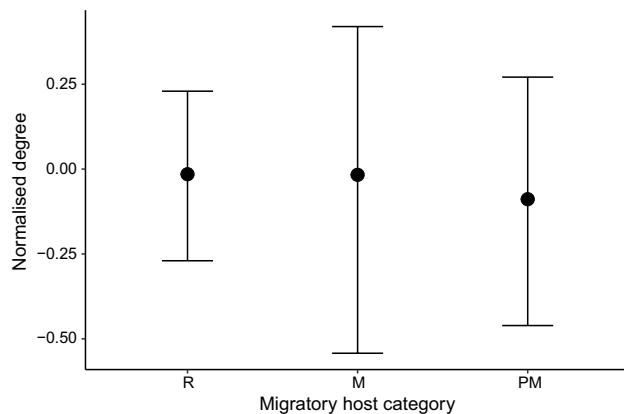
Among the 249 avian species included in the Bayesian analyses, 227 species were classified as resident, 16 as partial migrants and six as full migrants. In these analyses, we assessed 81 bird species from Amazonia, 89 from Andean Forest, 73 from Cerrado, 68 from Atlantic Rain Forest and 34 from Caatinga with many species present in more than one biome (Supplementary Table S2). Our first Bayesian model revealed avian hosts display similar normalized degree (i.e., partner fidelity) among host migratory categories (Table 1, credible intervals overlapping zero) with normalized degree values around 0.10 (Fig. 2). Likewise, no difference was observed for partner fidelity when comparing resident versus non-resident (i.e., partial and full migrant hosts combined, Table 2, credible intervals overlapping zero).

For our next Bayesian models evaluating weighted closeness (i.e., network centrality), we observed that only partially migratory hosts present higher values of network centrality compared to residents (Table 3, credible intervals do not overlap zero). On the other hand, when combining fully and partially migratory hosts into a single category, we observed that non-resident avian hosts present higher

Table 1 Parameter estimates, standard errors, and credible intervals for the Bayesian model testing the differences in partner fidelity to haemosporidian parasites among avian hosts from distinct migratory categories

	Estimate	Std. error	Cred. Inter (95%)	
Intercept	− 0.02	0.13	− 0.27	0.23
Full migratory host species	− 0.01	0.23	− 0.50	0.40
Partial migratory host species	− 0.08	0.14	− 0.36	0.21
Biomes	0.12	0.10	0.01	0.38
Avian host phylogeny	0.21	0.08	0.05	0.38

Residents only = reference category

**Fig. 2** Mean (\pm credible intervals) normalized degree of avian hosts in bird–haemosporidian interaction networks according to the migratory category in which they are classified. *R* resident, *M* full migrant, *PM* partial migrant**Table 2** Parameter estimates, standard errors, and credible intervals for the Bayesian model testing the differences in partner fidelity between resident and non-resident avian hosts

	Estimate	Std. error	Cred. Inter (95%)	
Intercept	− 0.02	0.12	− 0.27	0.23
Non-resident host species	− 0.05	0.12	− 0.30	0.18
Biomes	0.12	0.10	0.01	0.39
Avian host phylogeny	0.21	0.08	0.06	0.38

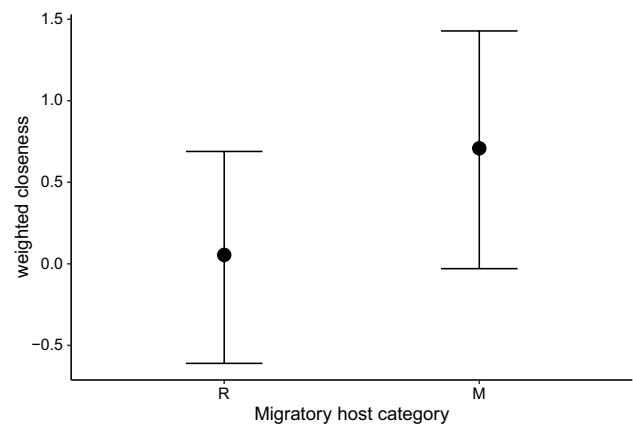
Residents only = reference category

network centrality than resident species (Fig. 3, Table 4, credible intervals do not overlap zero). Betweenness values were similar among host migratory categories in both models (Supplementary Tables S3, S4, credible intervals overlapping zero). Furthermore, only 57 hosts species had weighted betweenness values higher than zero, consisting of two full migratory, five partial migratory and 50 resident species. In all our Bayesian models phylogeny and biome

Table 3 Parameter estimates, standard errors, and credible intervals for the Bayesian model testing the differences in weighted closeness centrality to haemosporidian parasites among avian hosts from distinct migratory categories

	Estimate	Std. error	Cred. Inter (95%)	
Intercept	0.08	0.33	− 0.59	0.78
Full migratory host species	0.09	0.66	− 1.20	1.38
Partial migratory host species	0.73	0.23	0.29	1.18
Biomes	0.58	0.34	0.19	1.53
Avian host phylogeny	0.29	0.18	0.02	0.69

Residents only = reference category

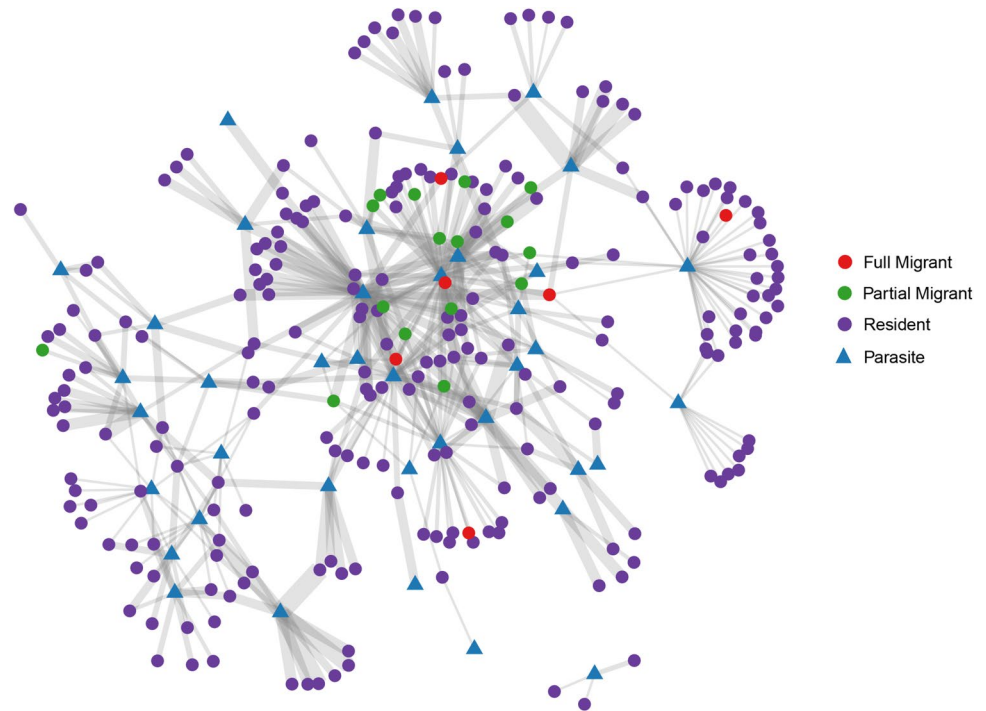
**Fig. 3** Mean (\pm credible intervals) weighted closeness of avian hosts in bird–haemosporidian interaction networks according to the migratory category in which they are classified. *R* resident, *M* full migrant and partial migrant**Table 4** Parameter estimates, standard errors, and credible intervals for the Bayesian model testing the differences in weighted closeness of avian hosts from distinct migratory categories

	Estimate	Std. error	Cred. Inter (95%)	
Intercept	0.05	0.32	− 0.61	0.69
Non-resident host species	0.66	0.22	0.23	1.08
Biomes	0.57	0.32	0.19	1.43
Avian host phylogeny	0.30	0.18	0.02	0.69

Residents only = reference category

had significant effects on partner fidelity (Tables 1, 2, 3 and 4, Supplementary Tables S3, S4, credible intervals do not overlap zero). Similarly, our network plot demonstrates most hosts and parasites are found within one main component (i.e., subgroup of interactors within a network in which there is a path possible between all vertices) and that non-resident hosts are more centrally distributed in our parasite–host network system (Fig. 4). Moreover, we can also observe that

Fig. 4 Network representing avian–haemosporidian interactions. Distinct colors represent avian hosts from distinct migratory categories or parasites. Circles represent avian hosts, while triangles represent haemosporidian parasites. Edge width varies according to the number of interactions between hosts and parasites



most parasites infect multiple hosts, while avian hosts seem mainly infected by one or a few distinct haemosporidian lineages.

Out of the 2465 haemosporidian infections included in our taxonomic composition analyses, most infections ($N=1544$) represent *Plasmodium* parasites, followed by *Haemoproteus* parasites with 909, with 590 classified in the subgenus *Parahaemoproteus* and 319 in the subgenus *Haemoproteus*. Only 12 infections of *Leucocytozoon* were included in these analyses. In addition, most parasites were recovered from Amazonia ($N=638$), followed by Cerrado ($N=613$) and Atlantic Rain Forest ($N=482$). We observed no difference in parasite taxonomic composition among distinct migratory avian host categories when considering both resident versus partial and full migratory hosts separately (Fig. 5, F value = 0.783, P value = 0.46, PCoA1: residents = -0.038 , partial migrants = 0.05, full migrants = -0.014 , PCoA2: residents = 0.07, partial migrants = 0.039, full migrants = -0.122) or combined (Table 6, F value = 0.0745, P value = 0.79, P value = 0.46, PCoA1: residents = -0.015 , non-residents = 0.015, PCoA2: residents = -0.025 , non-residents = 0.025).

Discussion

Avian hosts can disperse haemosporidians across their flyways and are also able to modify local patterns of infections (de Angeli Dutra et al. 2021b), thus, migrants can play major roles into host–parasite networks. In this

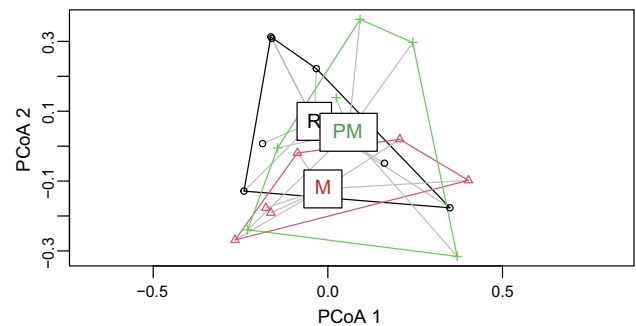


Fig. 5 Non-metric multidimensional scaling plot illustrating the dissimilarity in parasite taxonomic composition among avian host migratory categories. R resident, M full migrant, PM partial migrant

study, we observed that non-resident species display greater closeness centrality in host–parasites networks, which indicates they play a disproportionate role in overall network connectance (i.e., the proportion of realized interactions in a network out of the all possible interactions). However, we found no difference between resident and non-resident hosts in betweenness centrality and that most species are not network connectors (betweenness centrality = 0). This result suggests that, despite the fact migrants drive overall network connectance, these hosts do not necessarily act as key connectors between species within the network. In addition, we also observed that resident and non-resident hosts show similar partner fidelity and parasite taxonomic composition, demonstrating that similar parasites infect resident and non-resident hosts and

that there is no difference in pairwise parasite specificity among migratory and non-migratory species. Nonetheless, it is important to note our results are based on a limited number of migratory bird species.

By connecting more species within the network, migratory hosts can act as keystone species (i.e., species with disproportionate importance in keeping the structure and ecological services and functions within a community; sensu Paine 1969), since they interact with more distinct parasite lineages and are more closely associated with further hosts. Therefore, the presence of migrants in a community could impact local parasite–host dynamics. Indeed, previous research has associated the presence of migratory birds with variation in tick prevalence and haemosporidian prevalence and richness within the local community in South America (de Angeli Dutra et al. 2021b; Fecchio et al. 2021). In contrast, despite the fact that only partially migratory hosts presented higher closeness centrality when evaluated separately, de Angeli Dutra et al. (2021a) observed that only fully migratory birds harbor higher prevalence and richness of haemosporidian parasites. Nevertheless, no difference was observed here with respect to betweenness centrality, suggesting resident and non-resident hosts play similar roles in connecting parasites and other hosts. Thus, since migrants show higher closeness centrality and are involved in disproportionately more interactions within the network, they are influential in shaping parasite transmission within the community.

We also demonstrated that migration does not impact partner fidelity for haemosporidian parasites and their avian hosts. Hence, it is possible the predictability of migration patterns allows parasites to co-adapt to these hosts as successfully as they do for resident species. Furthermore, the trade-off between adapting to multiple environments and vectors may be compensated by the opportunities to colonize new habitats and host species provided by host migration. Concomitantly, haemosporidian parasites tend to infect wide subsets of phylogenetically related avian hosts (Pinheiro et al. 2016; Huang et al. 2018). Thus, parasite host specificity patterns may remain similar within subsets of hosts which include resident and non-resident species, leading to similar parasite fidelity and taxonomic composition among distinct migratory categories. Indeed, we observed a host phylogenetic effect in all our Bayesian models, indicating that host phylogeny may be associated with multiple factors shaping host–parasite networks. Furthermore, similarity in environmental conditions also seems to affect network structure for parasites and their hosts as biome category (included as a random factor) also influenced partner fidelity and centrality in all our models. Likewise, previous research suggests that climate variation is an important driver of haemosporidian parasite specificity in South America (Fecchio et al. 2019b). Therefore, host phylogeny and environment

may be better predictors of parasite fidelity and taxonomic compositions than host migratory behavior.

Antagonistic interactions are generally characterized by lower partner fidelity patterns and, therefore, more malleability than mutualistic interactions (Fortuna et al. 2020). Therefore, parasites may be associated with looser evolutionary pressures for specialization favoring colonization of new habitats and spillover events. Indeed, a recent spillover of *Plasmodium juxtanucleare* from domestic and exotic hosts (chickens) to wild passerine birds has been reported in Brazil (Ferreira-Junior et al. 2018), demonstrating haemosporidian parasites can adapt to new hosts when placed in alien habitats. Moreover, Krasnov et al. (2012) argued that parasites can infect unrelated hosts when phylogenetically close hosts are exploited by too many pathogens. These findings suggest that parasites are malleable enough to exploit unfamiliar hosts in response to adverse resource conditions. This plasticity could lead to looser interaction patterns in avian–haemosporidian networks and similar dynamics for resident and non-resident birds. Nevertheless, host–parasite networks tend to be compartmentalized into modules (Bascompte 2010; Krasnov et al. 2012), which may reflect an ongoing arms race between parasites and their hosts (Bascompte 2010) and consequential convergence of traits among distinct parasites (Krasnov et al. 2012).

In summary, we show migratory hosts may be keystone species within host–parasite networks and their presence could putatively shape bird–haemosporidian interactions by, for example, impacting local prevalence and richness of parasites (de Angeli Dutra et al. 2021b). In addition, most birds are not important connectors in this network, with resident and non-resident hosts playing similar parts in connecting hosts and parasites. However, it is important to note that, despite the fact most avian hosts are not network connectors (i.e., weighted betweenness equals zero for most species), most species belong to a single network component (i.e., subgroup of interactors within a network in which there is a path possible between all vertices). Moreover, no difference in partner fidelity or parasite taxonomic composition was detected in this study between migrant and non-migrant birds, indicating parasite specificity may be associated with other traits of avian and vector hosts. Furthermore, biome and phylogeny seem to play important roles in determining network characteristics of hosts in avian–haemosporidian networks, an effect already demonstrated in systems involving trophically transmitted parasites (Poulin et al. 2013). We conclude that migrants may play fundamental roles in shaping host–parasite interactions, and encourage further research into other potential implications of host migration for disease dynamics.

Supplementary Information The online version contains supplementary material available at <https://doi.org/10.1007/s00442-021-05031-5>.

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Authors' contribution statement Daniela Dutra and Robert Poulin conceived the idea and designed the study. Daniela Dutra performed the data analyses. Daniela Dutra, Érika Braga and Alan Fecchio collected the data. Daniela Dutra wrote the manuscript with input from all other authors. All authors contributed critically to the drafts and gave final approval for publication.

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Availability of data and materials A part of the data that support the findings of this study is openly available at <https://onlinelibrary.wiley.com/doi/10.1111/mec.15094> and <http://130.235.244.92/Malavi/> (Bensch et al. 2009). The other portion of the data that support our findings can be shared by Prof. Érika Martins Braga under reasonable request.

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