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Species diversification and phylogenetically constrained symbiont switching generated high modularity in the lichen genus *Peltigera*

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Abstract

- Ecological interactions range from purely specialized to extremely generalized in nature. Recent research has showed very high levels of specialization in the cyanolichens involving *Peltigera* (mycobionts) and their *Nostoc* photosynthetic partners (cyanobionts). Yet, little is known about the mechanisms contributing to the establishment and maintenance of such high specialization levels.
- 2. Here, we characterized interactions between *Peltigera* and *Nostoc* partners at a global scale, using more than one thousand thalli. We used tools from network theory, community phylogenetics and biogeographical history reconstruction to evaluate how these symbiotic interactions may have evolved.
- 3. After splitting the interaction matrix into modules of preferentially interacting partners, we evaluated how module membership might have evolved along the mycobionts' phylogeny. We also teased apart the contributions of geographical overlap vs phylogeny in driving interaction establishment between *Peltigera* and *Nostoc* taxa.
- 4. Module affiliation rarely evolves through the splitting of large ancestral modules. Instead, new modules appear to emerge independently, which is often associated with a fungal speciation event. We also found strong phylogenetic signal in these interactions, which suggests that partner switching is constrained by conserved traits. Therefore, it seems that a high rate of fungal diversification following a switch to a new cyanobiont can lead to the formation of large modules, with cyanobionts associating with multiple closely retated *Peltigera* species.

- 5. Finally, when restricting our analyses to *Peltigera* sister species, the latter differed more through partner acquisition/loss than replacement (i.e., switching). This pattern vanishes as we look at sister species that have diverged longer ago. This suggests that fungal speciation may be accompanied by a stepwise process of (1) novel partner acquisition and (2) loss of the ancestral partner. This could explain the maintenance of high specialization levels in this symbiotic system where the transmission of the cyanobiont to the next generation is assumed to be predominantly horizontal.
- 6. *Synthesis*. Overall, our study suggests that oscillation between generalization and ancestral partner loss may maintain high specialization within the lichen genus *Peltigera*, and that partner selection is not only driven by partners' geographical overlap, but also by their phylogenetically conserved traits.

KEYWORDS: biogeography, community phylogenetics, cyanolichens, ecological networks, macroevolution, modularity, specificity, symbiotic history reconstruction

1 | INTRODUCTION

Species neither live nor evolve in isolation. Rather, they enter complex webs, or networks, of interactions (Thompson 2006). The structure of these networks is expected to drive coevolution (Guimarães et al. 2017), populations' stability (May 1974, Pimm 1979, Melian & Bascompte 2002), species coexistence (Bastolla et al. 2009) and community productivity (Poisot et al. 2013). A major frontier in community ecology is thus to elucidate the drivers of the complex and repeatable patterns, or motifs, that we observe in ecological networks. These drivers can include phenotypic compatibility/complementarity (Junker et al. 2013, Eklöf et al.

2013, Maglianesi et al. 2014), phenological overlap (Olesen et al. 2008, Burkle et al. 2013), or spatial co-occurrence patterns (Bell et al. 2010, Chagnon et al. 2015). Network structure can also arise from the way new "immigrant" species connect to the others when they join a network (Maynard et al. 2018). For example, it has long been known that preferential attachment of immigrants to already well-connected species (i.e., generalists) will generate both a power-law degree distribution (Barabasi & Albert 1999, Krapivsky & Redner 2001) and a nested structure in bipartite networks (Medan et al. 2007). Such complexity in network assembly makes it a great challenge to identify the major ecological variables responsible for the establishment, or the avoidance of interactions in ecological networks.

One useful approach to deal with such complexity is to use phylogenies as a way of reducing dimensionality in network studies. In other words, we may not need to capture the myriads of traits (i.e., all the dimensions) responsible for the establishment of interactions between some species pairs but not others: phylogenies might capture sufficient information to make sense of ecological interaction patterns. Indeed, Rossberg et al. (2010) have shown that provided sufficient phylogenetic conservatism of traits, food-web (FW) structure can be synthesized into a single dimension using phylogenetic distance as a proxy for likelihood of establishing, or not, an interaction. In line with this theoretical finding, many empirical studies have found phylogenetic signal in FW structure (Bersier et al. 2008, Mouillot et al. 2008, Rezende et al. 2009, Eklöf et al. 2012), as well as in other types of ecological networks (Donatti et al. 2011, Jacquemyn et al. 2011, Chagnon et al. 2015). Likewise, community phylogenetics has been also widely used in ecology to tease apart deterministic (niche-based) vs stochastic (neutral) mechanisms driving community assembly (e.g., Kembel 2009, Swenson & Enquist 2009, Mayfield and Levine 2010) or to assess potential consequences of species coexistence on macroevolutionary trends (Gerhold et al. 2015). However, community phylogenetic approaches (either correlating phylogenetic distance with the propensity of

coexisting locally, or of sharing a given partner or prey) only map the imprint of phylogeny on current observed patterns, without informing about the evolution of such patterns.

Disentangling how evolutionary mechanisms shape interaction networks through time is a relatively new research avenue. For example, Nuismer et al. (2013) used a coevolution model to show that when interactions are mediated by phenotype matching, networks should evolve an anti-nested structure, characterized by small subsets of species interacting together if their phenotype is compatible; i.e., there could not be a super-generalist taxon, characteristic of a nested architecture. On the other hand, an interaction mediated by any form of threshold (e.g., a predator eating any prey with a smaller body size than its own body size) should evolve a nested architecture. For example, frugivorous birds have been found by Burns (2013) to eat roughly any fruit smaller than their beak in a New Zealand forest. Of course, this simplistic model omits all the other non-evolutionary constraints that may drive network structure (e.g., species encounter rates based on their spatio-temporal distributions), and also omits other potentially relevant evolutionary factors as well, such as cospeciation, heritability of symbionts through vertical transmission, etc. Host-microbiome studies have started to explore such questions tracking the evolution of symbiotic interaction patterns over broad phylogenetic scales (e.g., Sanders et al. 2014). Phylogenetic inference tools have recently been used by Groussin et al. (2017) to evaluate the relative importance of cospeciation and host switch in determining the evolution of mammalian gut microbiome composition. As in other types of networks, strong phylogenetic conservatism has been shown to drive partner acquisition (Ochman et al. 2010), leading to considerable debate regarding the relative importance of vertical vs horizontal transmission of symbionts (Refrégier et al. 2008, Moran 2015).

In this study, we looked at interaction patterns in cyanolichens involving *Peltigera* (Lecanoromycetes, Ascomycota), which are lichen-forming fungi, and Nostoc, their photosynthetic and nitrogen-fixing (Darnajoux et al. 2017) cyanobacterial symbionts. This symbiotic association has the particularity to show high levels of partner specificity and modularity, at least for the section *Polydactylon* (Chagnon et al. 2018). These lichen-forming fungi (also referred to as mycobionts) are typically highly specialized on one or very few cyanobacterial phylogroup partners (also referred to as cyanobionts) that commonly associate with multiple *Peltigera* species (asymmetric specificity). The evolution of specialization has fuelled a large body of literature in ecology and evolution (Fisher 1930, MacArthur 1955, Levins 1968, May 1974) and one question that might be asked when looking at current patterns of specialization is whether selection towards such patterns was directional or stabilizing: in other words, is there a directional evolution towards specialization (Jaenike 1990) or generalization (Waser et al. 1996) or a combination of both, i.e., specialization of Peltigera and generalization of Nostoc, which could be advantageous especially when symbionts are transmitted mostly horizontally (Chagnon et al. 2018, Lu et al. 2018, Lutzoni & Miadlikowska 2009, Magain et al. 2017a)? Alternatively, has the specialization level of a guild been stable for a long time due to selection against higher, or lower, levels of specialization (i.e., stabilizing selection)? In this regard, combining a network-based approach with phylogenetic inference tools might provide new insights. Here, we were interested in using the Peltigera-Nostoc symbiosis as a study system, to test the three following hypotheses:

- There is an evolutionary trend from generalist ancestral mycobionts towards derived specialists;
- 2- There is a strong phylogenetic conservatism in *Peltigera* species for *Nostoc* phylogroup selection;
- 3- Recent speciation events in the genus *Peltigera* are associated more with cyanobiont phylogroup acquisition/loss, rather than replacement/switching to different partners.

To test these hypotheses, we assembled a *Peltigera-Nostoc* interaction matrix at a global scale comprising more than one thousand lichen thalli. We combined a network-based approach, community phylogenetics and phylogenetic inference tools to make sense of current patterns of host-symbiont interactions and potential evolutionary mechanisms driving such patterns.

2 | MATERIALS AND METHODS

2.1 | Sample acquisition and interaction network inference

We assembled a dataset of *Peltigera-Nostoc* interaction pairs summing up all information from the literature for which we could confidently assess the identity of the *Peltigera* species and *Nostoc* phylogroups or haplotypes (O'Brien et al. 2005, 2013, Miadlikowska et al. 2014, 2018, Magain et al. 2017a, b, 2018, Chagnon et al. 2018, Lu et al. 2018, Pardo De la Hoz et al. 2018). The total dataset consisted of 1026 thalli, or interaction pairs, representing 155 *Peltigera* species and 95 *Nostoc* phylogroups or haplotypes (Tables S1, S2). For each thallus, DNA sequencing (see below) was used to identify the fungal and cyanobacterial partners. All data on thalli included in this study are available through the dryad data repository (Chagnon *et al.* 2019).

2.2 | Phylogeny of the genus *Peltigera*

To infer a phylogeny for the entire genus *Peltigera*, we gathered published data from all currently validated species (Miadlikowska et al. 2014, 2018, Magain et al. 2017a, b, 2018, Chagnon et al. 2018, Pardo De la Hoz et al. 2018) for seven loci (ITS, nrLSU, β -tubulin, *RPB1*, COR1b, COR3, COR16). We selected one representative per species with the highest number of sequenced loci, or two representatives per species when sets of available loci were mostly non-overlapping between two specimens of a species. We added six species to the outgroup (four thalli representing three *Solorina* species and three thalli representing three *Nephroma* species, Table S1). We generated an additional 159 sequences to fill gaps in the data matrix. These sequences were deposited in GenBank (MK517826-MK517886, MK519281-MK519372, MK520922-MK520926).

Because each locus was analyzed separately in previous studies to detect potential topological conflicts, with appropriate corrections made when needed (Miadlikowska et al. 2014, 2018, Magain et al. 2017a, b, 2018, Chagnon et al. 2018, Pardo De la Hoz et al. 2018), we concatenated these seven loci using in-house PERL scripts (Magain 2018). Our concatenated dataset consisted of 205 specimens and 10,064 characters. We delimited and excluded ambiguously-aligned sites manually using Mesquite v. 3.11 (Maddison and Maddison 2016), resulting in a dataset of 5736 characters. Our dataset was divided into 13 subsets (according to codon positions and non-coding regions for β -tubulin and *RPB1*, and locus delimitations for the remaining five loci). The optimal partitions were estimated using PartitionFinder v. 1.0.1 (Lanfear et al. 2012) by searching all models using the greedy algorithm and the BIC criterion.

The best tree (phylogram) was inferred using maximum likelihood (ML) as the optimization criterion (RAxML-HPC2 v.7.2.8; Stamatakis 2006, Stamatakis & al. 2008) as implemented on the CIPRES portal (Miller et al., 2010). Searches for optimal trees and bootstrap analyses were conducted with the rapid hill-climbing algorithm for 1000 replicates with the GTRGAMMA substitution model (Rodriguez et al. 1990).

We estimated relative divergence times (chronogram) using BEAST v1.8.4 (Drummond et al. 2012) as implemented on the CIPRES portal, with linked clocks (with a lognormal relaxed clock model) and linked trees, and substitution models following the best scheme retrieved with the PartitionFinder analysis. We ran the program for 100 million generations, sampling every 10,000th generation, and discarded 25% of generations as burn-in.

2.3 | Phylogenetic distances among Peltigera species

For both the phylogram and the chronogram, we pruned our 199-OTU phylogenetic tree, to include only one representative per species, resulting in a 175-OTU tree (Fig S1), using the *drop.tip* function of the R (R core team 2018) package ape (Paradis et al. 2004). We then computed pairwise phylogenetic distances between all species using the function *cophenetic.phylo*.

2.4 | Similarity-based distances among cyanobionts

Because the phylogeny of *Nostoc* is incompletely resolved and poorly supported (Fig S2; see also Magain et al. 2017a), we computed pairwise similarity distances as a proxy for phylogenetic distances among *Nostoc* phylogroups and distinct haplotypes. We assembled a

dataset containing each of the 95 *Nostoc* groups (phylogroups and distinct haplotypes) represented in our interaction matrix, and computed pairwise distances corrected with the General Time Reversible (GTR) model, using PAUP v. 4.0a (Swofford 2001).

2.5 | Statistical analyses

2.5.1 | Hypothesis 1: Evolutionary trend from generalism to specialism

We tested this hypothesis only for *Peltigera*, because this analysis requires a well-resolved and well-supported phylogeny. For computational feasibility, we split our global *Peltigera* 1tip-per-species chronogram (Fig S1) into two monophyletic groups, one clade comprising sections *Chloropeltigera*, *Peltidea*, *Phlebia* and *Polydactylon* (POLY clade), and the other encompassing sections *Horizontales*, *Peltigera* and *Retifoveatae* (PELT clade; sections follow Miadlikowska and Lutzoni 2000). Prior to the analyses, we excluded *Peltigera* species for which we had no information about their interactions with *Nostoc* cyanobionts.

For each of these two clades, we ran ancestral area reconstructions using BioGeoBears v. 0.2.1 (Matzke 2013a, b) with models DEC and DEC+J. We considered the modules in which each *Peltigera* species belonged as the ancestral areas to infer. Unlike ancestral state reconstructions of traits, biogeographical models allow nodes to be reconstructed as several character states, corresponding to broader areas (or in our case, larger [or broader] ancestral modules than currently delimited modules). In the DEC model, dispersion (parameter D) corresponds to the addition of a new area (in our case a new module or phylogroup) along a phylogenetic branch, and extinction (parameter E) the loss of a module or phylogroup. At cladogenesis (C), areas of children species split into the ancestral area, or a subset of it. The difference between the two models is the J parameter for founder effects. In our scenario, this founder effect would represent a speciation event linked to a contemporaneous change of module (i.e., a switch to an ecologically drastically different set of *Nostoc* phylogroups), whereas in the DEC model, acquisition of new modules (equivalent to dispersal) only occurs along branches of the tree. At speciation events, distributions (modules or phylogroups) of species are the same, or a subset, of the ancestral one. For further computational feasibility, we allowed a maximum of three ancestral modules per node. For the POLY clade, we reconstructed 17 modules for 61 species. For the PELT clade, we reconstructed 17 modules for 87 species.

We ran the same analyses on the same two clades using *Nostoc* phylogroups, instead of modules. For computational feasibility, we allowed a maximum of five reconstructed phylogroups per node. We therefore only tested the 12 most widespread phylogroups for the POLY clade, and the 10 most widespread phylogroups for the PELT clade, and coded all other rare phylogroups as a 13th or 11th state, respectively.

It should be noted that criticisms against the DEC+J model were raised (e.g., Ree & Sanmartin 2018), but we considered that in our case, the J parameter was ideal to capture the effects of cladogenesis events linked with contemporaneous changes of modules or phylogroups. The two models cannot be directly compared by a statistical test, because they are not nested version of each other (Ree & Sanmartin 2018). Because the DEC+J model resulted in much higher likelihood values, we only discuss the DEC+J reconstructions below. However, reconstructed nodes with the DEC model were globally similar.

2.5.2 | Hypothesis 2: Phylogenetic conservatism of mycobionts in the selection of cyanobionts

We evaluated whether genetic distances between cyanobionts among thalli pairs could be explained by phylogenetic distances among Peltigera species in the same thalli. Under phylogenetically conserved interactions, we would expect that closely related *Peltigera* species would host phylogenetically related cyanobionts. However, at a global scale, we must take into account the fact that some mycobiont-cyanobiont pairs have much higher probabilities of encountering each other. If the spatial distribution across the globe is also phylogenetically constrained, this might be falsely interpreted as phylogenetic constraints on partner selection. To tease apart the two mechanisms, we generated null interaction matrices that randomized interaction patterns with the two following constraints: (1) forbidding interactions among pairs of mycobionts and cyanobionts that do not overlap in their spatial distribution in our dataset and (2) forcing the total number of interactions recorded (i.e., network connectance) to be the same as in the original dataset (see R code in file S1). Imposing such biological constraints on null models, as opposed to architectural constraints (such as fixing row and column marginal totals through swap-based approaches), is considered to be more ecologically relevant (Perez-Neto et al. 2001, Lessard et al. 2012). Using these null matrices, we then compared the amount of variance in cyanobiont genetic distances among thalli pairs that could be explained by mycobiont inter-species phylogenetic distances, to what was measured in the original dataset.

We also looked at phylogenetic conservatism in interactions by splitting our interaction matrix into modules, and looking at phylogenetic dispersion within vs. among modules. These modules correspond to subgroups of species that preferentially interact together. They were generated using a simulated annealing optimization algorithm (see the detailed code in File S1). In a nutshell, we started by allocating species to a random set of

modules, to calculate an initial modularity state. Following other major algorithms recently developed, we used Barber's modularity Q (Barber 2007, Dormann & Strauss 2014, Marquitti et al. 2014, Beckett 2016). Then, for each iteration, the algorithm swapped module affiliation for one row (here, mycobionts, i.e. Peltigera species) and one column (here, cyanobionts, i.e., Nostoc phylogroups and distinct haplotypes). If these swaps yielded a module comprising at least one mycobiont but no cyanobiont (or vice versa), module affiliation for the mycobionts (or cyanobionts) belonging to this module was swapped. The maximal number of modules was set to the minimum between the number of rows and the number of columns in the matrix. Here, we had 155 mycobionts and 95 cyanobionts, so the maximal number of modules was set to 95. After each iteration, modularity Q was recalculated and the swaps made in the iteration were accepted with a probability p. This probability depended on (1) their impact on modularity and (2) the time that had passed since the beginning of the algorithm. In the earlier phases of the algorithm, even swaps that decreased modularity Q by 0.1 had roughly a probability of 0.5 of being accepted, but as the algorithm progressed, it became increasingly stringent and accepted modularity-decreasing swaps with a probability approaching 0 (Fig S3). Swaps that increased modularity Q were always accepted (p = 1). While the main goal of modularity analyses in studies on ecological networks is typically to test the significance of the overall modularity Q metric, or to test for ecological drivers of such modules (e.g., species traits, Olesen et al. 2007; phylogeny, Chagnon et al. 2015; environmental filtering, Torrecillas et al. 2014), here we were interested in assigning a support value to each of our modules. In other words, we were interested in differentiating which modules constantly took part in the optimal solution during the algorithmic optimization, vs. other modules that were only infrequently part of the modules configuration. To do so, we ran our chain for 2×10^5 generations and saved the set of modules for every generation. We plotted the modularity Q against the number of generations

to assess the convergence of our chain (Fig S4). We converted our sets of modules to newick format using R (code in file S1). We sampled every 10^{th} set of modules to generate a set of 2 $\times 10^4$ sets of modules, from which we estimated the stability of each module throughout the algorithmic process (i.e., proportional frequency of each module) by building a Majority-Rule Consensus set of modules with PAUP v. 4.0a. We tested the effect of different values of burn-in by discarding sets of modules with Q < 0, Q < 0.7, Q < 0.71, Q < 0.72 and Q < 0.720.7225, and no burn-in, respectively. We did not use the term posterior probability because it is probably not adequate here, because our modularity algorithm is a simulated annealingbased optimization, not a Bayesian inference. Indeed, our function aims at maximizing modularity Q, but does not calculate the probability that a given set of modules generates the observed interaction matrix. Nevertheless, the frequency of a given module during the cooling of our simulated annealing chain may hold significant biological information. If a module contributes very strongly to the whole network modularity, it is unlikely that a random swap disassembling it will be accepted during the chain. Thus, this module will be included during most of the time steps in the chain. On the other hand, a "weak" module contributing little to network modularity might frequently be disassembled and reassembled during the chain cooling. Hence, the frequency of a given module during the algorithm may be used as a proxy for the strength, or support of this module.

To test for phylogenetic conservatism in ecological interactions, we calculated phylogenetic dispersion within vs outside modules, and compared it to expectations based on a random scenario. We used distance matrices described above, and implemented the analysis using the R package *picante* (Kembel et al. 2010). We used a mean nearest neighbour taxon distance (MNTD) approach, thus evaluating whether species within modules had a higher probability of having a closely related neighbour than expected by chance. For this calculation, we omitted modules comprising only one mycobiont and/or one cyanobiont.

2.5.3 | Hypothesis 3: Symbiont switching vs acquisition/loss during diversification

As for hypothesis 2, and for the same reason, we only conducted this analysis for *Peltigera*. We were interested to see if what typically accompanies a diversification event is either the acquisition of an additional symbiont or the loss of some of the multiple symbionts found with the ancestral *Peltigera* species throughout its distribution. This is in contrast to a complete switch, i.e., complete replacement of ancestral symbionts by new symbionts. Based on our previous observations of interaction patterns in section Polydactylon of the genus Peltigera, where we found high specialization levels by Peltigera species on Nostoc phylogroups that were more generalists than their Peltigera partners (Chagnon et al. 2018, Lu et al. 2018), we hypothesized that during fungal speciation, we would find either no change in Nostoc partner or Nostoc symbiont switching, rather than acquisitions or losses. We further hypothesized that shifts in *Nostoc* partners may be a stepwise process, whereby a fungus first acquires a new cyanobiont, to then lose their ancestral Nostoc partner. This mechanism could be favored by natural selection if there is a cost to maintain compatibility with many partners. For example, if it involves the maintenance of different signalling pathways involving genes for specific lectins (Singh & Walia 2014) or small secreted proteins (Plett et al. 2014). This implies that more recent speciation events should have a distinct signature from more ancient speciations. Recent divergences should show a stronger contribution of partner acquisition/loss, while older splits should rather reflect turnover, or switch in Nostoc partners, because no traces of the ancestral partner can be found in current populations.

To test this hypothesis, we used additive partitioning of β -diversity, frequently used in community ecology (Legendre 2014). This partitioning stems from the idea that differences in species composition between two sites (here, differences in Nostoc partners between two mycobiont species) can originate from (1) abundance difference or (2) species turnover (Williams 1996). Abundance difference is directly linked to the concept of nestedness in biogeography and ecological networks (Patterson & Atmar 1986, Bascompte et al. 2003), where species with fewer partners have their interactions nested within the interactions of species with more interactions. Methods have been developed to additively partition the dissimilarity between pairs of sites (or here, pairs of *Peltigera* species) into its abundance difference component (hereafter labelled D) and its species replacement component (hereafter R) (Podani et al. 2013, Baselga 2013). Both were tested with our data (following Legendre 2014), but yielded qualitatively similar results. Here, we will only report results using Podani's method and Ružička dissimilarity index (Ružička 1958) for pairwise mycobiont comparisons. We also note that our dataset is not suited to provide strict estimations of the relative importance of D vs R in Ružička mycobionts' pairwise dissimilarity, because our sampling design did not strictly control for sampling effort per mycobiont species, which results in some mycobionts being better sampled than others. This naturally induces some dissimilarity allocated to the D component, i.e., some mycobionts having more thalli (the equivalent of some sites having more individuals). For example, if two mycobionts shared the same unique Nostoc partner, but with one mycobiont being sampled from five thalli and the other from only two thalli, this would result in a non-null dissimilarity between them, which would be fully explained by the D component in this additive partitioning framework. Therefore, results must be interpreted with caution, taking into account that the D component of mycobiont dissimilarity is probably an inflated estimate for most pairwise comparisons. Nevertheless, the goal of the analysis is to compare the relative importance of D vs R

between sister *Peltigera* species (i.e., species sharing a most recent common ancestor), as opposed to all other pairwise mycobiont comparisons. We have no logical reason to expect the bias explained above to be over- or under-represented among sister species as opposed to any other pairwise mycobiont comparisons.

Finally, because we inferred a chronogram for the genus *Peltigera*, where branch lengths represent relative time, we were able to evaluate, for sister species, if the relative contribution of D vs R varies as a function of evolutionary time using Pearson's correlation. Our expectation was that fungal speciation events would not necessarily imply a partner switch right away, but over time this divergence between sister species would eventually lead to a partner switch/turnover (i.e., the R component). In other words, we expected the R component to be positively associated with time since divergence when comparing sister species, and vice versa for the D component. Figure S5 explains graphically how such a stepwise partner switch may drive an initially high D component right after speciation and a larger R component later after the loss of one ancestral partner.

3 | Results

Our interaction network between *Peltigera* mycobionts and *Nostoc* cyanobionts comprised 1026 thalli, yielding 324 binary interactions (Fig 1). Although this dataset is a major effort in uncovering interactions at a global scale, our rarefaction analyses suggest that up to 594 interactions could have been uncovered in this dataset with a "complete" sampling. This is based on rarefaction analyses with Hill numbers (order q = 0) following Chao et al. (2014) (Fig S6). Given the lack of saturation in interactions we wanted to make sure that the network structure uncovered through our analyses was robust to sampling effort. We thus calculated two widely used network metrics (i.e., modularity and nestedness), over a gradient of

sampling effort ranging between ~50 to our full 1026 thalli dataset. Confirming what we had found in prior analyses on the section *Polydactylon* of the genus *Peltigera* (Chagnon et al. 2018), we found that modularity and nestedness did vary with sampling effort, but with trends that increasingly diverged from random expectations as sampling effort increased (Fig S7). In other words, further sampling would have only strengthened our conclusions about network structure. Thus, overall, we are confident that our global dataset is well suited to provide a robust test to our three main hypotheses.

3.1 | Hypothesis 1: Evolutionary trend from generalism to specialism and eco-evolutionary drivers of modules

We found no evidence for a directional evolution from generalism to specialism. Instead, when inferring module affiliations through time, the DEC+J model greatly improved the likelihood score compared to the DEC model (POLY clade, DEC model, LnL = -175.05 vs. DEC+J model, LnL = -127.74; PELT clade, DEC model lnL = -317.58 vs. DEC+J model LnL = -216.10; Table S3). Interestingly, the J parameter explains all changes (POLY clade, d = 0, e = 0, J = 0.0277; PELT clade d = 0, e = 0, J = 0.0541), which means that under this model all changes to a *Nostoc* in a different module are associated with founder effects linked to speciation events.

Likewise, when inferring ancestral phylogroup affiliations using the same *Peltigera* clades (Table S3), the likelihoods generated with the DEC+J model are still better than with DEC, but the differences are not as large as for modules (lnL of -256.84 vs -247.08 for the POLY clade, -383.25 vs -361.39 for the PELT clade; Table S3). Moreover, for the DEC+J model, the *d* parameter (dispersion; in this case, the acquisition of a new phylogroup) is larger than the *j* parameter for clades POLY and PELT (Table S3). Collectively, these

reconstruction results suggest that the evolution of *Peltigera* did not proceed from large ancestral modules to smaller modules. Instead, modules were replaced by other modules (corresponding to a drastic change of *Nostoc* symbionts), and these switches were linked to speciation events. However, changes in phylogroup associations, especially acquisitions, without immediate replacement, are frequent within modules. Eight modules consist of only one *Peltigera* species and one *Nostoc* phylogroup (Fig 1). These modules include 1-to-1 strict reciprocal specialists, or rare *Peltigera* species sampled once. Strict specialists display no obvious phylogenetic or geographic trend except

1). These modules include 1-to-1 strict reciprocal specialists, or rare *Peltigera* species sampled once. Strict specialists display no obvious phylogenetic or geographic trend except that they are endemic to a specific region: for example, *P. neopolydactyla* 5 is endemic to Oregon and British Columbia, *P.* sp. 11, is endemic to Papua New Guinea, *P. patagonica* is endemic to Southern Chile/Argentina, and *P. vainioi*, is endemic to the Andes (Fig 1).

Biogeographical factors are also shaping the detected modules. For example, the ancestor of section *Polydactylon* was part of module K, which is mostly boreal (Magain et al. 2017a) (Figs 1, 2a). Sympatric species of temperate and boreal zones of Asia and Pacific Northwest seem to be associated with an amphi-berengian module P (i.e., *P. neopolydactyla* 2a, *P. pacifica*, *P. neopolydactyla* 6, *P. neopolydactyla* 7 from section *Polydactylon*, and *P. degenii* 1, *P. degenii* 2, *P. degenii* 3a from section *Peltigera*. In the *P. dolichorhiza* group, the colonization of the Neotropics is linked to a switch to module L. The only species of that group to escape the Neotropics and disperse to boreo-temperate regions of Southern Chile and Argentina, *P. truculenta*, further switched to module J. The independent colonization of the Neotropics by *Peltigera* sp. 6 also resulted in a switch from module K to L (Fig 2a). In the polydactyloid clade, the colonization of tropical Asia is linked to a switch to module H, followed by a switch to module C for the *P. polydactylon/udeghe/*sp. 10 clade when returning

to boreo-temperate regions of the northern hemisphere. Interestingly, dispersion events to the Neotropics were not associated to switches to the same modules in sections *Polydactylon* vs. *Peltigera*, the two most species-rich sections of the genus *Peltigera*. In section *Polydactylon*, two independent switches to module L were observed, whereas in section *Peltigera*, two switches to module F occurred (*P. laciniata* group, and *P. rufescens* 2) (Fig 2).

In the tri-membered (one mycobiont with both a green algal and a cyanobacterial photobiont, the latter restricted to small localized structures called cephalodia) and generalist sections *Chloropeltigera* and *Phlebia*, all species associate with phylogroup VI (part of module A) but some species are part of other modules (e.g., D) because they associate more frequently with other *Nostoc* phylogroups (Fig 2a). Interestingly, in section *Peltidea* (the only section to include both bi-membered and tri-membered *Peltigera* species), the ancestor associated with module E, but some tri-membered species (*P. britannica* and *P. aphthosa* 1) seem to have transitioned back to module A, including phylogroup VI (Fig 2a).

3.2 | Hypothesis 2: Phylogenetic conservatism of mycobionts in the selection of cyanobionts We found various lines of evidence for phylogenetic conservatism in partner selection between *Peltigera* and *Nostoc*. The network is strongly modular (Fig 1), which indicates a strong pattern of preferential interactions among mycobionts and cyanobionts. More closely related *Peltigera* species were much more likely to host (1) the same cyanobionts (pseudo- $F_{155,1026} = 9.07$, $R^2 = 0.62$, P < 0.001) or at least (2) cyanobionts with low genetic distances (pseudo- $F_{155,1026} = 18.01$, $R^2 = 0.76$, P < 0.001). Without controlling for geographic overlap in mycobionts' and cyanobionts' distributions, the mycobionts phylogenetic distances explained ~ 76% of the variation in cyanobionts' variation across thalli. This amount of explained variation was never met in our null matrices taking into account geographic

distribution (hence the P < 0.001 value). In these null matrices, mycobionts phylogenetic distances explained roughly 50-60% of the variation in cyanobionts variation among thalli (Fig S8). This 50-60% value suggests that mycobionts' geographic distributions are phylogenetically conserved, i.e., closely related mycobionts tend to be present in similar geographic areas, and thus share closely related cyanobionts. Nevertheless, a 16-26% of variation (i.e., 76% minus 50-60%) in observed data cannot be explained by a null model taking geographic distributions into account. We also note from Figure 1 that no apparent trend can be seen with regard to modules' distribution across the globe. In other words, the great majority of modules do not appear to be constrained to a single biogeographical region.

We also found that mycobionts sharing the same module often tended to be more closely related than expected by chance alone (Fig 3. Indeed, out of 22 modules (which comprised more than one mycobiont), 12 were shown to host more closely related mycobionts than expected by chance. The non-significant results of this phylogenetic clustering analysis within modules mostly came from very small modules comprising only two species. This might be regarded as a statistical artefact, because such small module size inflates the variance in the null scenarios for phylogenetic clustering (see wide error bars on Fig 3 for small modules). Figure 2 shows in more details the phylogenetic conservatism in module affiliation, with some modules being found in only specific sections of the genus *Peltigera* (e.g., module B is only found in section *Peltigera*, or modules L and K are only in section *Polydactylon*). For the cyanobionts, the phylogenetic clustering trend was much weaker, with only three modules showing a significant signal of phylogenetic clustering (Fig S9), again restricted to larger modules.

3.3 | Hypothesis 3: Symbiont switching vs acquisition/loss during species diversification

Our β -diversity partitioning analyses revealed that recent speciation events are more associated with partner abundance/richness differences (i.e., the *D* component in our decomposition) than with partner replacement/switching (*R*). Indeed, for sister species, the cyanobiont partners of one mycobiont were often a nested subset of the cyanobiont partners of its sister species. In other words, cases of partner replacement (i.e., cyanobiont *A* being more frequent with mycobiont *X* and cyanobiont *B* more frequent with mycobiont *Y*, and vice versa) were less frequent among sister species (Fig 4a). Interestingly, sister species pairs that diverged more recently were less likely to show evidence of partner switching/replacement (*R* component) than the ones that had diverged longer ago (and of course, vice versa for the *D* component, as *R* and *D* come from an additive partitioning of total dissimilarity) (Fig 4b, c). As a cautionary note, we highlight, that the higher *D* component of sister species, and particularly those that diverged recently, can be explained either by variation in the number of thalli sampled for the two mycobionts compared, or a "real" biological signal of partner acquisition/loss (and not just a sampling artefact).

4 | Discussion

Globally, interaction patterns between *Peltigera* and *Nostoc* are highly specialized. However, many studies on ecological networks have showed how specialization can be overestimated because of incomplete sampling effort (e.g., Chacoff et al. 2012), leading to the discovery of what Brooks and McLennan (2002) coined "faux specialists". Here, our recorded connectance (i.e., proportion of all possible pairwise interactions that are actually realized/observed) was 0.022, or 2.2%. A rarefaction analysis following Chao et al. (2014) showed that even with a "complete" sampling of the system (3500 thalli would be needed for

detecting 90% of all interactions and 4500 thalli would be needed to reach 95%), connectance would only have reached ~5%. This remains considerably lower than other study systems. Fortuna et al. (2010) did a meta-analysis on datasets with connectance of 0.09-0.19 for pollination networks, 0.15-0.28 for host-parasite networks and 0.29-0.49 for seed dispersion networks (values representing 25^{th} and 75^{th} quantiles, after reanalyzing their published data). Thus, our study seems to reveal true patterns of specialization, and not sampling artefacts.

The evolution and maintenance of specialization has fuelled a large number of publications outside the study of mutualism. Indeed, other systems consistently leaning towards high specialization are host-parasites systems (e.g., Agosta et al. 2010). In parasitology, the "Stockholm paradigm" has been coined to explain the evolutionary maintenance of specialization, despite the occurrence of host shifts in the system. Two major components of this paradigm are (1) ecological fitting and (2) the oscillation hypothesis. In the context of interaction networks, ecological fitting (Janzen 1985, Agosta & Klemens 2008) refers to the notion of partner switching without the prerequisite for *de novo* adaptation to this new partner. This is closely related to the concept of exaptation, whereby a specialist could have a realized fitness on a different partner outside of its current partner range. The oscillation hypothesis refers to alternative cycles of novel partner acquisition and loss of ancestral partner as an explanation for partner switching in interaction networks (Janz & Nylin 2008). Interestingly, this hypothesis developed by parasitologists is in striking agreement with our SDR analyses on lichen symbionts (Fig 4). Indeed, the very fact that the D component and the R component are respectively larger and smaller for recently diverged species suggests that partner switching in the *Peltigera-Nostoc* system seems to follow such an oscillatory dynamics of partner acquisition-loss (Fig S5).

In line with this Stockholm paradigm, our results suggest that specialization is not an evolutionary dead-end in *Peltigera-Nostoc* cyanolichens. Specialists do seem to maintain the ability to expand partner range and perform partner switching. This is also corroborated by the fact that our reconstruction analysis of modules along the mycobionts' phylogeny was best represented by a model incorporating founder effects. In other words, our biogeographical reconstruction analysis did not support a model with ancestral lineages bearing all modules and progressively losing some during diversification (i.e., no directional trend from generalism to specialism). This model also evidenced coincidences between new module emergences and fungal speciation events. This could be explained by what has been termed the "taxon pulse hypothesis" (Erwin et al. 1979). This hypothesis states that some conditions (e.g., rapid environmental change, sudden range expansion) can promote speciation through cycles of expansion and isolation. In the context of the evolution of interaction networks, it could be envisaged that such conditions could promote both speciation and partner switch. Indeed, rapid environmental change can prime partner switching if a new partner becomes more favourable in this new environment. On the other hand, range expansion can promote novel contacts between pairs of partners not used to encounter each other in their ancestral distribution. Several cases of partner switching have been associated with periods of climate change and/or range expansion (reviewed in Agosta et al. 2010). This is totally plausible in our study system where some specific conditions/events seem to have primed the emergence of new modules and the diversification of *Peltigera*. For example, a *Peltigera* lineage within section *Polydactylon* colonized South America, which led to a switch to new cyanobiont phylogroups, selection towards generalism, a burst of speciation in this lineage, and the formation of a new module (module L, Figs 1 and 2a; see also Magain et al. 2017a). In fact, fungal speciation and partner switching may not be independent from each other. For example, Braga et al. (2018a)

recently found that new partners can create heterogeneity in geographic mosaics: a partner switch may thus further prime fungal diversification in a geographic mosaic of coevolution (Thompson 2005).

We observed a strong phylogenetic conservatism in interactions between Peltigera species and Nostoc symbionts. This may not seem surprising given the very intimate nature of the lichen interaction (sensu Guimarães et al. 2007) resulting from more than 400 million years of evolution (Honneger et al. 2012, Lutzoni et al. 2018). In this context, it could be expected that compatible interactions are mediated by a large number of conserved traits, and thus reducing evolutionary lability. Such conservatism was also found in other "intimate" systems such as orchid mycorrhizae (Shefferson et al. 2010). However, this needs not to be the rule: arbuscular mycorrhizal fungi, also "intimate" symbionts in their host plants, and a symbiosis that probably originated before lichens (Lutzoni et al. 2018), have been found to be less similar among closely related hosts (meta-analysis by Veresoglou & Rillig 2014, Reinhart & Anacker 2014). Here, interestingly, our phylogenetic partner conservatism remained significant even after controlling for the geographical overlap of cyanobionts and their Peltigera partners (Fig S8). This is in line with Braga et al. (2015) showing that phylogeny was a stronger driver of host-parasites networks than geography. However, it is likely that our coarse geographic resolution hides finer scale partitioning of the environment. If *Peltigera* species are not distributed randomly within our geographic regions, in a way that is linked to phylogeny, habitat partitioning may still be the underlying cause for part of the phylogenetically conserved partner selection observed in our system (Jüriado et al. 2019). For example, Lu et al. (2018) observed that along a latitudinal gradient crossing the entire boreal belt, some Peltigera species were restricted to specific portions of the gradient, well correlated to climatic variables such as total precipitation and mean temperature during the warmest quarter of the year. This study demonstrated that appropriate Nostoc phylogroup

availability was not limiting for the *Peltigera* species sampled along this intra-biome latitudinal gradient. Future work should test for phylogenetic bioclimatic niche conservatism in *Peltigera* to verify whether environmental filtering could be a driver of phylogenetically constrained *Nostoc* partner selection observed in our study.

Overall, our study shows how the combination of phylogenetics, ancestral biogeographical inferences, network-based and β -diversity analytical tools can yield novel insights into the evolution of symbiotic interactions. However, major unknowns remain to be solved to better understand why there seems to be such a strong pressure in these cyanolichens to remain highly specialized. Indeed, in many other mutualistic symbioses, some species evolve a more generalist strategy, and this gradient in generalism is at the core of the typically nested interaction patterns in these communities (e.g., Almeida-Neto et al. 2008, Podani & Schmera 2011). It is possible that the very slow growth rate and life history of lichens, as opposed to other organisms, may constrain opportunism in that it would be very costly to engage in an intimate interaction with a sub-optimal partner. Conversely, fast growing plant roots can establish interactions with various compatible rhizobial or mycorrhizal partners to then screen for preferred partners through either sanctions toward uncooperative symbionts (Kiers et al. 2003) or preferential reward toward beneficial partners (Bever et al. 2009). A major frontier for this field of research remains the estimation of the reliability in partner availability across spatial scales for mycobionts: how can very widely spread species across large biomes (e.g., *Peltigera occidentalis*) remain so selective in their partnership with Nostoc cyanobacteria? One necessary condition is to not be limited by partner availability across its home range (Douglas 1998). We still have to determine how Nostoc partner availability varies across space in the environment, and how other potential hosts (e.g., bryophytes, vascular plants) contribute to this regional partner pool.

It is important to note that the largest modules in this study, modules A-C, include the most broadly distributed *Nostoc* phylogroups (VI, XXX, V and XXXIX), all of which are the most generalist *Nostoc* phylogroups in this symbiotic system. Therefore, it is possible that *Nostoc* phylogroups that are the most broadly distributed geographically, enable the interaction with the largest number of *Peltigera* species. A large fraction of these fungal species resulted from multiple speciation events subsequent to the establishment of a mutualistic interaction with a broadly distributed *Nostoc*, and continuous association with the same *Nostoc* (phylogenetic conservatism) through time. This not only provides a potential explanation for the maintenance of specialization by the mycobiont, but also the asymmetry of specificity in lichens, which is resulting from a gradual increase in generalism by broadly distributed *Nostoc* partners that are hosting an increasingly large number of *Peltigera* species sharing a most recent common ancestor. This is in agreement with the results from Lu et al. (2018), where *Peltigera* species have narrower latitudinal ranges than their broadly distributed generalist *Nostoc* partners.

Finally, another emergent finding from our study is how evolutionary trends in our mutualistic interaction networks were found to be closely aligned with theories put forth in parasitology, i.e., antagonistic networks. This suggests that some overarching laws may govern the evolution of specialized interaction networks in general, notwithstanding the nature of the interaction itself. This paves the way for more exciting work to develop broader hypotheses on the evolution of symbioses in general. The combination of network-based tools with macroevolutionary models appears to be a particularly promising avenue of research (e.g., Braga et al. 2018b).

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Data accessibility

Data available from the Dryad Digital Repository: https://doi.org/10.5061/dryad.b537cs5 (Chagnon *et al.* 2019).

Authors' contributions

PLC, NM, JM and FL conceived the study. PLC and NM conducted statistical analyses. PLC wrote a first draft of the manuscript. All authors participated in revising the manuscript.

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Figure 2. Close-ups of the seven-locus chronogram of the genus *Peltigera*: a) POLY clade, i.e., sections Chloropeltigera, Peltidea, Phlebia and Polydactylon, and b) PELT clade, i.e., sections Horizontales, Peltigera and Retifoveatae. Branch lengths are proportional to relative time, and each terminal tip represents a species indicated on the far right, or putative species resulting from recent studies (Magain et al. 2017a, b, 2018; Pardo De La Hoz et al. 2018; Miadlikowska et al. 2018). The colored capital letters immediately to the right of the terminal branch tips represent the network modules of each species, based on results of the modularity analyses (Figure 1). Further on the right, the Nostoc phylogroup partners of each Peltigera species are shown. Each *Nostoc* phylogroup that belongs to the same module as its *Peltigera* species partner share the same color inside a rounded box. *Nostoc* phylogroups belonging to different modules are shown in black outside of the rounded boxes. Inferences of ancestral modules on internal nodes were generated using BioGeoBears with the DEC+J model. Background colors represent the current and inferred ancestral modules each Peltigera species belongs to. Rare modules have no background colors. Strict 1:1 specialist associations forming distinct modules are represented in a circle with SS. Modules represented with a question mark are presumably incorrectly reconstructed by the modularity analyses (species in modules with none of their partners) and the module of their cyanobiont was used for the color-coding. Branches and nodes with very low probabilities for all states, or with several states reconstructed, have no background color.

> Figure 3. Phylogenetic clustering (for mycobionts) in our delineated modules. On the x-axis, the 22 modules comprising more than 1 mycobiont are ordered from the smallest to the largest. Module size is shown by the shade of blue (see corresponding color scale on the right), i.e., the number of *Peltigera* species per module. The bars represent observed value of mean nearest taxon distance (MNTD) for each module, while the circles show the null expectations from a null model shuffling the tree tips. These results are shown with their

Figure 1. The interaction matrix and modules uncovered through our global sampling. In the main matrix, shades of grey are proportional to the number of thalli (as shown on the scale) into which a given cyanobiont (columns) was found in association with a corresponding mycobiont (rows). The boxes delineate the modules found through simulated annealing. We used alternating white and grey backgrounds to facilitate visual allocation of given cyanobionts and mycobionts to a given module. On the top and right panels, we show the geographical distribution of the cyanobionts and mycobionts, respectively, in each of the 11 biogeographical regions sampled in or study (AFR = Africa, ASI = Asia, AUS = Australasia, BOR = Boreal biome, EUR = Europe, NAM = North America, NEA = Argentina and Chile, NEO = Neotropics, PNW = Pacific Northwest, PNG = Papua New Guinea): a filled cell means that at least one thallus of this cyanobiont/mycobiont has been sampled from the corresponding region in our study. Module ID are shown on the right part of the figure, with the module frequency/support value shown in parenthesis. The module ID and colors correspond to those shown in Figure 2.

standard deviations (1000 null scenarios per module). Black circles indicate significant clustering, while grey circles indicate non-significant trends.

Figure 4. β -diversity decomposition analyses for sister species. In a), we show that variation in cyanobionts between sister species can be better explained by richness/abundance differences (i.e., *D* as a fraction of total pairwise dissimilarity, (1-*S*)), as compared with all other pairwise mycobiont comparisons. In b and c), we show that sister species that have diverged longer ago tend toward higher partner replacement (*R*) component and lower richness/abundance differences (*D*) component. In these latter plots, each point represents a pairwise comparison between two sister species.



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