

# EuPPollNet: A European database of plant-pollinator networks

## Abstract

**Motivation:** Pollinators play a crucial role in maintaining Earth’s terrestrial biodiversity and human food production by mediating sexual reproduction for most flowering plants. Indeed, the network of interactions formed by plants and pollinators constitutes the backbone of plant-pollinator community stability and functioning. However, rapid human-induced environmental changes are compromising the long-term persistence of plant-pollinator interaction networks. One of the major challenges for pollinator conservation is the lack of robust generalisable data capturing how plant-pollinator communities are structured across space and time. Here, we present the EuPPollNet (European Plant-Pollinator Networks) database, a fully open and reproducible European-level database containing harmonized taxonomic data on plant-pollinator interactions referenced in both space and time, along with other ecological variables of interest. This database offers an open workflow that allows researchers to track data-curation decisions and edit them according to their preferences. We present the taxonomic and sampling coverage of EuPPollNet, and summarize key structural properties in plant-pollinator networks. We hope EuPPollNet will stimulate future research that fills the taxonomic, ecological, and geographical data gaps on plant-pollinator interactions that we have identified. Further, the variation in the structure of the networks in EuPPollNet provides a strong basis for future studies aimed at quantifying drivers of plant-pollinator network change and guiding future conservation planning for plants and pollinators.

**Main Types of Variables Included:** EuPPollNet contains 1,162,913 interactions between plants and pollinators from 1,864 distinct networks (i.e., distinct sampling event in space or time), which belong to 54 different studies distributed across 23 European countries. In addition, information about sampling methodology, habitat type, bio-climatic region, and further taxonomic rank information for both plant and pollinator species are also provided (i.e., genus, family and order).

**Spatial location and grain:** The database contains 1,214 different sampling locations from 13 different natural and anthropogenic habitats that fall in 7 different bio-climatic regions. All records are geo-referenced and presented in the World Geodetic System 1984 (WGS84).

32 **Time period and grain:** Species interaction data was collected between 2004 and 2021. All  
33 records are time-referenced and most of the studies documented interactions within a single  
34 flowering season (68.52%).

35 **Major taxa and level of measurement:** The database contains interaction data at the  
36 species level for 94.39% of the records, including a total of 1,411 plant and 2,223 pollinator  
37 species. The database covers 5.56% of the European species of flowering plants, 34.38% of  
38 bees, 26.21% of butterflies, and 33.63% of syrphid species at the European level.

39 **Software format:** The database was built with the R programming language and is stored  
40 as “.rds” and “.csv” formats. The construction of the database is fully reproducible and can  
41 be accessed at the following link: <https://github.com/JoseBSL/EuPPollNet.git>.

## 42 **KEYWORDS**

43 Angiosperms, connectance, flowering plants, nestedness, plant-pollinator networks, pollinators, species  
44 interactions

# 1 | INTRODUCTION

Plant-pollinator interactions involve a great diversity of species, largely attributed to their co-evolutionary history (Ollerton, 2017), and are critically important for terrestrial biodiversity and economic productivity. The synergistic effects of climate change with other global change pressures are threatening worldwide biodiversity (Bellard et al., 2014; Sala et al., 2000), including plant and pollinator species as well as their interactions (Eichenberg et al., 2021; Goulson et al., 2015; Settele et al., 2016). Under this scenario, the increasing availability of biodiversity data plays a major role in our ecological understanding of species status, trends, and conservation (Heberling et al., 2021; Zattara & Aizen, 2021). However, our knowledge of plant and pollinator species and their network of interactions still exhibits major temporal, spatial and taxonomic biases (Archer et al., 2014; Marshall et al., 2024; Poisot et al., 2021; Troia & McManamay, 2016), limiting our ability to effectively protect their biodiversity.

The interactions between different plant and pollinator species within a community form complex networks. Macro-ecological analyses of the topology of these networks have revealed common properties, such as truncated power-law degree distributions (Jordano et al., 2003) or nestedness (Bascompte et al., 2003). Large-scale analyses across multiple studies can quantify patterns across geographic regions (Olesen & Jordano, 2002; Traveset et al., 2016) or environmental gradients (Ramos-Jiliberto et al., 2010; Rech et al., 2016; Saunders et al., 2023) that cannot be examined in a single study. Although macro-ecological approaches that use ecological interactions make significant contributions to knowledge (Windsor et al., 2023), such synthesis work must consider variation across studies in the spatio-temporal nature of the data (Burkle & Alarcón, 2011; García et al., 2024). For instance, plant-pollinator studies tend to differ in sampling effort and methodology which affect the structure of the resulting plant-pollinator networks (Gibson et al., 2011; Jordano, 2016; Schwarz et al., 2020). Most plant-pollinator networks have unobserved interactions (Chacoff et al., 2012; Olesen et al., 2011), and thus research that attempts to synthesize across published studies must have access to raw data on interactions in order to statistically account for sampling effort and completeness. This emphasizes the importance of providing data in its rawest possible form in datasets that will be utilized for synthesis and macro-ecological studies.

Europe is one of the continents with a larger amount of available biodiversity data (Proença et al., 2017), yet still exhibits major gaps (Bennett et al., 2018; Wetzal et al., 2018). While species checklists need to be treated carefully, especially at a macro-ecological scale (Grenié et al., 2023), the growing number of European plant and pollinator checklists (Reverté et al., 2023), along with occurrence data (Zattara & Aizen, 2021), is setting a foundation for the conservation of its flora and their pollinators. However, species richness is just one component of biodiversity and documenting the interaction between plants and pollinators is essential for understanding biodiversity change (Jordano, 2016). Numerous works have studied plant-pollinator interactions in the last decades, generating thousands of plant-pollinator interaction networks worldwide. Several initiatives have tried to integrate plant-pollinator interaction data into databases such as *Mangal* (Poisot et al., 2016) or *GloBI* (Poelen et al., 2014), resulting

85 in numerous large scale comparative analyses that have enhanced our understanding of the  
86 ecology of plants and pollinators (e.g., European wild bee data trends; [Marshall et al., 2024](#)).  
87 Despite all these resources, Europe lacks accessible harmonized plant-pollinator interaction  
88 data that allow researchers to evaluate plant-pollinator interactions at a European level. For  
89 example, only over a dozen of European plant-pollinator networks are included in *Mangal*, while  
90 *GloBI* focuses on pairwise interactions disconnected from the community context. Assembling  
91 and curating the existing information on EU plant-pollinator networks will guide research  
92 efforts, conservation planning and will set a foundation for future global change research.

93 Here, we present the European Plant-Pollinator Networks database (EuPPollNet), which con-  
94 tains harmonized information on plant-pollinator interactions at the European level. The  
95 pollinator taxonomic groups include the main orders of entomofauna that visit and polli-  
96 nate flowering plants in Europe. These comprise insect species from the orders Hymenoptera,  
97 Diptera, Lepidoptera, and Coleoptera, accounting for almost the totality of recorded interac-  
98 tions in EuPPollNet (99.86%). To understand the scope of the database, we examined the  
99 taxonomic and sampling coverage of the different plant and pollinator species at the European  
100 level with the help of the most up-to-date species checklists and rarefaction analyses. In addi-  
101 tion, for bees and plants, we evaluated if there is a phylogenetic signal in the presence-absence  
102 of interaction data.

103 EuPPollNet contains one of the largest sets of plant-pollinator networks collated to date,  
104 providing a unique opportunity to examine the prevalence of key structural metrics across  
105 networks. For example, despite the large theoretical literature on the meaning of a nested  
106 structure in plant-pollinator networks ([Bascompte & Jordano, 2007](#); [Guimaraes, 2020](#)), where  
107 specialists species interact only with subsets of generalists species, this pattern has only been  
108 empirically evaluated with a relatively small number of networks ([Bascompte et al., 2003](#);  
109 [Payrató-Borras et al., 2019](#); [Staniczenko et al., 2013](#)), and is still debated how structural  
110 metrics such as connectance and nestedness change across latitudes and bioclimatic regions  
111 ([Olesen & Jordano, 2002](#); [Song et al., 2017](#); [Trøjelsgaard & Olesen, 2013](#)).

112 Overall, EuPPollNet aims to cover a wide range of taxonomic groups and habitats, while also  
113 providing other variables of interest that define the ecological context and sampling methods  
114 of the study. In addition, EuPPollNet offers a transparent and accessible workflow of its  
115 data management and species harmonization that allows the database to be reused and to  
116 expand over time. This database provides a large number of community-level networks with  
117 curated and harmonized data, distinguishing it from other currently available resources that  
118 contain plant-pollinator interactions. We expect that EuPPollNet can be used to evaluate  
119 macro-ecological processes in plant-pollinator networks, guide conservation planning, and set  
120 a baseline for global change research.

## 2 | METHODS

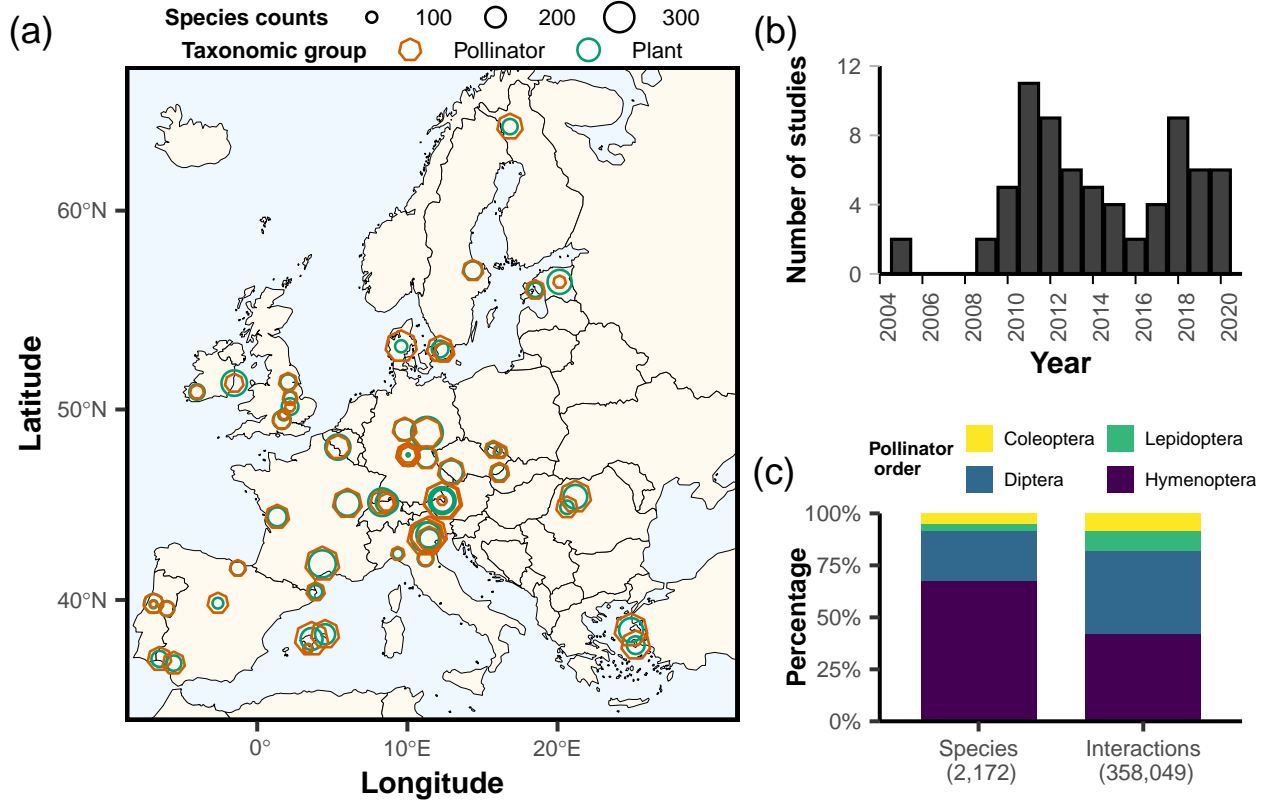
### Data acquisition

The EuPPollNet database includes published and unpublished studies compiled initially by a wide number of researchers and institutions within the European continent as defined by the European Environment Agency (Stanners & Bourdeau, 1995). As this database is the result of one of the work packages of the European project Safeguard (Safeguarding European wild pollinators; <https://doi.org/10.3030/101003476>), first, data was directly requested from members of the Safeguard project in May 2022. Second, the request was extended to data owners outside of the project, with data collection concluding in August 2024. These other data owners were identified by direct communication with colleagues suggested by Safeguard members and by directly searching for studies on Google Scholar of under-represented regions within the database. While Google Scholar lacks reproducibility (Gusenbauer & Haddaway, 2020), it still remains the most comprehensive search engine to date (Gusenbauer, 2019). This approach maximized the potential number of studies that could be incorporated in this database. The search strings used were ‘*plant-pollinator interactions*’ and ‘*plant-pollinator networks*’. To maintain high quality standards that will support robust future ecological research, we only included studies that met the following criteria: 1) studies containing time- and geo-referenced records of plant-pollinator interactions; and 2) studies that quantify interactions by documenting the contact between a floral visitor - referred to as a ‘pollinator’ throughout the manuscript, even though pollination efficiency is not evaluated - and the reproductive structure of a specific sampled plant (i.e., phyto-centric networks).

### Dataset description

The database contains 54 independent published and unpublished studies conducted during the time period 2004 - 2021 in 23 different countries (Figure 1a and Figure 1b; see Figure S1 for exact locations). The studies differ in sampling effort and methodology, and thus documenting sampling methods and sampling effort is an important feature of EuPPollNet. Most studies took place within a single flowering season (68.52%), sampled a given location for an average of 6.99 days, and exclusively sampled diurnal plant-pollinator interactions, with transects being the most common sampling method (64.81%). All the studies documented interactions with Hymenopterans (with 50.00% considering all Hymenopterans, 46.15% only wild bees and 3.85% only bumblebees), 92.31% documented interactions with Dipterans (with 46.15% considering all Dipterans, 46.15% only syrphids and 5.77% recorded syrphids plus bombylids or tachinid flies), 63.46% with Lepidopterans, and 32.69% with Coleopterans. The database includes a total of 1,162,913 distinct interactions. Most of the pollinator species belong to the orders Hymenoptera, Diptera, Lepidoptera and Coleoptera (89.11%), which account for nearly all interactions in this database (99.86%). Species that belong to other orders (10.89%) are not explored in this study as they account for a minor fraction of the total interactions (0.14%). Hymenoptera and Diptera contain the highest number of species,

with each comprising approximately 1,000 species in the database. However, the majority of plant-pollinator interactions are from Hymenoptera species (90.15%; **Figure 1c**). Notably, the western honey bee, *Apis mellifera*, represents 69.89% of the total interaction records from the database and an average of 30.74% of the total interactions per network.



**Figure 1.** (a) Locations of the studies in EuPollNet across the European continent, showing the total number of pollinator (i.e., orange heptagon) and plant (i.e., green circles) species per study. The sizes of these shapes are proportional to the respective species counts. For visualization purposes, we have selected only a single location per study. (b) Number of studies by year in EuPollNet. (c) Proportion of species and interactions across the four main pollinator orders in EuPollNet, excluding interactions from *Apis mellifera*. The total number of species and interactions is indicated in parentheses at the bottom.

## Data structure

The EuPPollNet database is available in both .csv and .rds formats and contains a total of 30 columns (**Table 1**), where each row represents a single interaction between a plant and a pollinator species. These columns include information about the study and network identifiers (columns 1 and 2), sampling method (3), habitat type as described by the author, and a unified habitat classification across studies (4 and 5), bioregion where the network is located (6), country, locality, and latitude-longitude coordinates (7 to 10), date of the interaction (11), number of interactions (12), taxonomic information about plants (13 to 20), taxonomic information about pollinators (21 to 28), and information about the availability of floral count data (29). The flower count data is provided in a separate file (.csv or .rds) and can be merged with the interaction data through the “Flower\_data\_merger” column (30). Note that although two-thirds of studies include information on floral abundance, the methods and units vary greatly across studies. To construct a plant-pollinator network matrix within a single flowering season at the site level, users should group interactions by plant and pollinator species, site, study, and year. Finally, metadata at the study level is provided in a separate file, including information about the authors, digital object identifier (if available), sampling time, and taxonomic coverage of the main pollinator groups for each study.

## 180 Taxonomic harmonization

181 All plant and pollinator species names were checked and harmonized in R using **rgbif** (Cham-  
182 berlin et al., 2022). The protocol for plants and pollinators is similar but slightly different  
183 given the availability of the different taxonomic resources. For transparency, we have included  
184 in the database the original species name, the new assigned name, and, if the name of the  
185 species is uncertain (e.g., species complex or species alike). In addition, taxonomic informa-  
186 tion at genus, family and order level was downloaded for each species.

187 For plants: (i) we initially verified the exact matches against the GBIF species checklist; (ii)  
188 we selected unmatched cases and fixed orthographic errors; (iii) we retrieved again taxonomic  
189 information for those unmatched cases, evaluated accuracy of fuzzy matching and manually  
190 fixed records that are still not found; (iv) finally, we used the World Flora Taxonomic Backbone  
191 (Govaerts et al., 2021; WFO, July 7, 2022) as the ultimate filter for taxonomic information as  
192 we used it to calculate the plant taxonomic coverage of our database.

193 For pollinators: (i) we first created a checklist of species names for the most representative  
194 pollinator groups at the European level by combining the most up to date published checklists  
195 of bees and syrphids (Reverté et al., 2023), and butterflies (Wiemers et al., 2018); (ii) we  
196 compared pollinator species names against the checklist and recovered some unmatched cases  
197 with restrictive fuzzy matching by using **stringdist** package (Van der Loo et al., 2014); (iii)  
198 we fixed unmatched records when necessary and retrieved the taxonomic information for all  
199 species from GBIF; (iv) we fixed the non-found cases in the GBIF checklist and made sure that  
200 all species names from bees, syrphids and butterflies were named according to their respective  
201 species checklists. Coleoptera species names were only checked against the GBIF checklist.

## 202 Taxonomic coverage

203 To assess the completeness of plant and pollinator species in the EuPPollNet database at the  
204 European level, we used the aforementioned checklists for plants and pollinators. Specifically  
205 for plants, we refined the checklist to include only plants occurring in Europe and excluded  
206 taxonomic groups not associated with biotic pollination. We did this by first excluding the  
207 families considered to have exclusively a wind pollination mode (see Culley et al., 2002), and  
208 then by filtering out the genera with wind or non-biotic pollination from families that ex-  
209 hibit both biotic and non-biotic pollination modes. Additionally, we manually included exotic  
210 species and added unresolved species names that were not present in the accepted names of  
211 the checklist at the current version of usage. For pollinators, we only evaluated the taxo-  
212 nomic coverage of groups with species checklists available in Europe (i.e., bees, syrphids and  
213 butterflies). While there is not a good understanding of pollinator diversity in other taxo-  
214 nomic groups (e.g., beetles), it was assumed that their coverage within the database is equal  
215 to the average coverage of bees, syrphids, and butterflies (mean coverage = 31.4; sd = 4.51).  
216 Therefore, the total number of of flower visiting species from other taxonomic groups (i.e.,  
217 non-bee, non syrphid and non-butterfly flower visitors) at European level was extrapolated by



**Table 1.** Column names and their descriptions within the EuPPollNet database.

Variable	Description
1. Study_id	Identifier of the study
2. Network_id	Identifier of a site sampled within a study
3. Sampling_method	Type of plant-pollinator sampling
4. Authors_habitat	Type of habitat as described by the authors
5. EuPPollNet_habitat	Type of habitat homogenized across studies
6. Bioregion	European biogeographical regions
7. Country	Country where the plant-pollinator interaction was observed
8. Locality	Locality where the plant-pollinator interaction was observed
9. Latitude	North-south position of the observed interaction in decimal degrees
10. Longitude	East-west position of the observed interaction in decimal degrees
11. Date	Year, month and day when the observation took place
12. Interaction	Number of interactions. By default is 1 as interactions are provided ungrouped
13. Plant_original_name	Plant species name given by the authors
14. Plant_accepted_name	Harmonized plant species name in the database
15. Plant_rank	Taxonomic rank of the observation
16. Plant_order	Order taxonomic rank of the observed plant species
17. Plant_family	Family taxonomic rank of the observed plant species
18. Plant_genus	Genus taxonomic rank of the observed plant species
19. Plant_unsure_id	Category to indicate if the plant species name is unsure (Yes) or not (No)
20. Plant_uncertainty_type	If the name is unsure, type of species uncertainty is provided
21. Pollinator_original_name	Pollinator species name given by the authors
22. Pollinator_accepted_name	Harmonized pollinator species name in the database
23. Pollinator_rank	Taxonomic rank of the observation
24. Pollinator_order	Order taxonomic rank of the observed pollinator species
25. Pollinator_family	Family taxonomic rank of the observed pollinator species
26. Pollinator_genus	Genus taxonomic rank of the observed pollinator species
27. Pollinator_unsure_id	Category to indicate if the pollinator species name is unsure (Yes) or not (No)
28. Pollinator_uncertainty_type	If the name is unsure, type of species uncertainty is provided
29. Flower_data	Floral data availability (Yes) or (No)
30. Flower_data_merger	Column to merge floral data with the interaction dataset

assuming that their coverage is equal to the mean coverage of bees, syrphids, and butterflies. Consequently, we provide an estimate for the total number of potential pollinators across the European continent.

Finally, to evaluate if the presence-absence of interaction records for bees and flowering plants follows a phylogenetic pattern within the database, we calculated its phylogenetic signal at genus and family level, respectively. The phylogenetic signal was calculated by using the *phylosig* function from the **phytools** package (Revell, 2012). We extracted the phylogenetic information for bees from a genus level phylogeny (Hedtke et al., 2013) and processed it using the packages **ape** (Paradis et al., 2019), **MCMCglmm** (Hadfield, 2010) and **phytools**. For plants, the phylogenetic tree was obtained from a species level plant phylogeny (Smith & Brown, 2018) with the help of the **rtree** package (Li, 2023).

## Sampling coverage

The completeness of the EuPPollNet database was evaluated by exploring the rarefied accumulation curves of plant and pollinator species and their interactions across the different networks. In addition, we computed the accumulation curve of pollinator species with an increasing number of plant species as an indicator for how many pollinator species are likely responsible for the pollination of flowering plants (e.g., Kleijn et al., 2015 for crops). The rarefied and extrapolated sampling curves were obtained using the **iNEXT** package (Hsieh & Chao, 2016). The different rarefied curves were complemented with 100 bootstrapped accumulation curves.

## Habitat type and bioclimatic region

We describe the habitat type for each site using information from Corine Land Cover (CLC, version 2018) extracted using the **Terra** package (Hijmans et al., 2022), visual inspection of Google Earth imagery and the habitat classification from the authors. These different habitat categories (see definitions in supplementary text) allow a quick comparison and understanding of the habitat types from the database. Moreover, Europe is characterized by a great variety of environmental conditions that harbor different biota. Thus, to allow authors to explore the set of studies that share similar environmental conditions and species, we assigned a biogeographical region to each site. The biogeographical regions were downloaded from the European Environment Agency (version 2016) and were matched to the different sites using a spatial join from the **sf** package (Pebesma et al., 2018).

## Network analyses

To provide a general overview of the structure of plant-pollinator networks in EuPPollNet, we quantified connectance and nestedness for each network and examined how these network metrics change across different latitudes and bioclimatic regions in Europe. We selected these

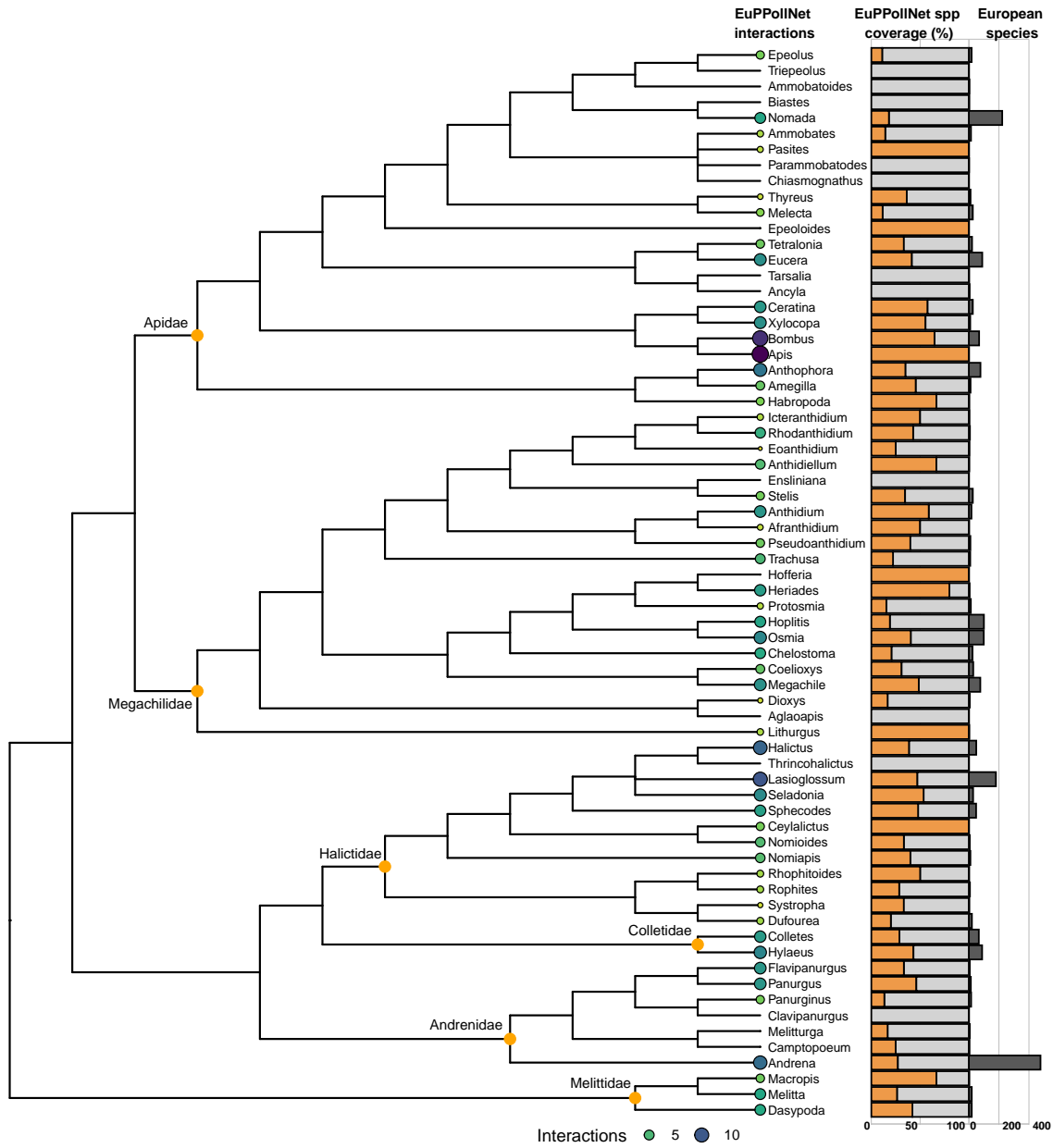
two network metrics as they are commonly evaluated in plant-pollinator network studies and capture structural properties with a straightforward interpretation. We implemented “standardised” versions of connectance and nestedness to account for the effect of sampling effort on network metrics. As connectance is negatively associated with network size (Jordano, 1987), we evaluated how network connectance was associated with the number of species (i.e., log of geometric mean of plants and pollinators) and extracted the residuals from this association (i.e., residual connectance) as a measurement of corrected connectance. The relationship between residual connectance and species richness was investigated using a beta regression. This approach was chosen because connectance displays a non-normal distribution with continuous values bounded between 0 and 1. The model was implemented using the `betareg` package (Cribari-Neto & Zeileis, 2010). We used NODFc to compare nestedness across networks, as it corrects by connectance and the number of species in comparison to other nestedness metrics that change with network size (Song et al., 2017). This metric was calculated using the **maxn-odf** package (Hoeppke & Simmons, 2021). Both residual connectance and NODFc were used as dependent variables to evaluate their association with latitude. In addition, to quantify how connectance and nestedness change with network size, we determined their association with the number of species per network using the Kendall rank correlation coefficient.

Finally, to compare if networks are more or less nested than expected by chance, we employed the traditional z-score approach with the widely used nestedness metric (NODF) from Almeida-Neto et al. (2008). The z-score approach only compares each unique network against their randomized versions, avoiding the influence of network size. As NODF is a metric computed from binary matrices, we calculated 100 null models for the binarized version of each network using the ‘curveball’ algorithm (Strona et al., 2014). This algorithm implements the configuration model (i.e. random rewiring of all links, without self-links or double links) and thus keeps the exact number of connections per species (i.e., realised degree). Since null model selection can significantly influence statistical results (Kaiser, 2015), we also implemented a null model that reorganizes the quantitative networks before binarising them. To that end, we used the ‘quasiswap\_count’ algorithm, which is a non-sequential algorithm for quantitative networks that maintains constant connectance and the number of connections per species. Each empirical network was randomized 100 times using each method. These null models were implemented with the **vegan** (Oksanen et al., 2013) package. Both connectance and nestedness (NODF) were estimated for each network using the function *networklevel* from **bipartite** (Dormann et al., 2008).

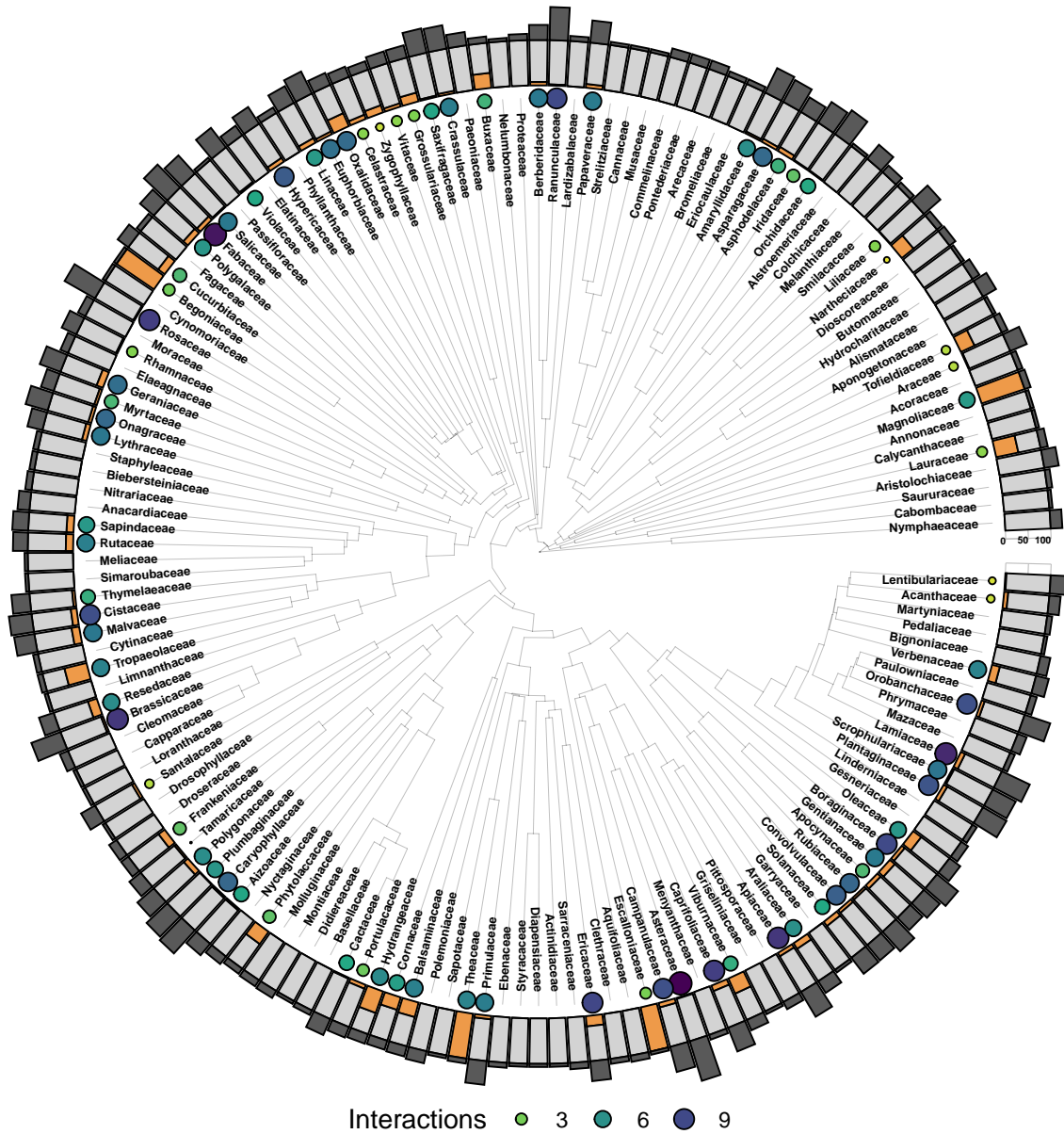
## 3 | RESULTS

### Taxonomic coverage

Europe hosts approximately over 5,000 species of pollinators, including 2,138 bee species, 913 syrphid species, 496 butterflies species, and about 1,700 species from other taxonomic groups, as estimated based on EuPPollNet average taxonomic coverage. Additionally, there are around 25,000 species of plants that benefit from animal pollination when excluding non-biotic pollinated species. EuPPollNet contains a total of 2,223 pollinators and 1,411 plant species. The coverage of the main pollinator groups occurring in Europe is 34.38% for bees, 33.63% for syrphids and 26.21% for butterflies (see **Figure S2** for coverage at the family level for bees and butterflies, and at the subfamily level for syrphids). Bees (i.e., Anthophila) constitute 89.65% of the interactions in EuPPollNet, and 77.95% of the interactions when excluding honey bees. Within the database, 83.82% of bee genera have at least one species with interaction records, and the average coverage of species at the bee genus level is 36.99% (**Figure 2**). The presence or absence of interaction records for bees does not follow a phylogenetic pattern ( $\lambda = 0.07$ ;  $P = 0.65$ ). The database coverage of all flowering plant species occurring in Europe is 5.56% (**Figure 3**), with an average coverage of 9.04% at the plant family level. Approximately, half of the plant families have at least one species with interaction records (52.56%), and the presence or absence of interaction data for the different plant species also does not follow a statistically relevant phylogenetic pattern ( $\lambda = 0.26$ ;  $P = 0.07$ ).



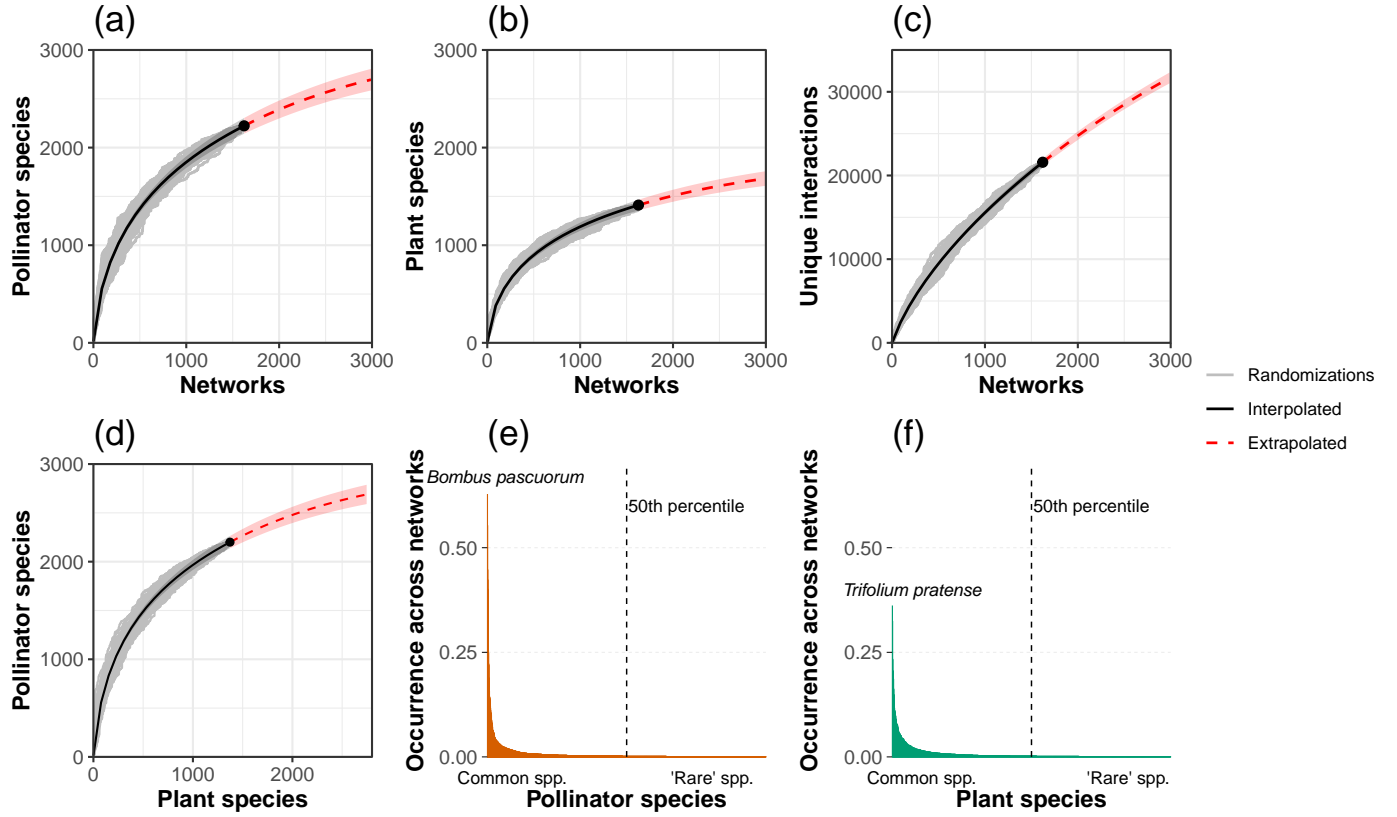
**Figure 2.** Phylogenetic and taxonomic coverage of bee genera at European level. The number of interactions recorded per genus in the database is illustrated using circles, with their sizes proportional to the number of interactions on a logarithmic scale, complemented by a gradient of colors ranging from yellow to dark purple. Additionally, the coverage of species recorded in EuPPollNet for each genus is depicted using two types of bars: orange bars representing the percentage of species included in the database and light grey bars indicating the percentage of species not included in the database, out of the total number of bee species in Europe. Dark grey bars represent the total number of species per genus at European level.



**Figure 3.** Phylogenetic and taxonomic coverage of the plant families at European level. The number of interactions recorded per family in the database is illustrated using circles, with their sizes proportional to the number of interactions on a logarithmic scale, complemented by a gradient of colors ranging from yellow to dark purple. Additionally, the coverage of species recorded in EuPPollNet for each family is depicted using two types of bars: orange bars representing the percentage of species included in the database and light grey bars indicating the percentage of species not included in the database out of the total number of bee species per family in Europe. Dark grey bars represent the total number of species per family at European level.

## Sampling coverage

The estimated sampling coverage of plant and pollinator species within EuPPollNet across the different networks is approximately 97% for both taxonomic groups. This suggests that the rarefied accumulation curves of both plant and pollinator species exhibit already a “quasi-asymptotic” growth of species richness by considering the current number of networks (**Figure 4a-4b**). The predicted observed species richness by doubling the sampling effort on the already sampled habitat types within the database will only increase pollinator richness by 23.79% and plant richness by 21.53%. However, the sampling coverage of interactions is 74.35%, and by doubling the sampling effort, the predicted number of unique interactions recorded will have approximately a twofold increase (53.68%; **Figure 4c**). When we consider the accumulated pollinator richness across sampled plant species, this curve also shows a “quasi-asymptotic” growth with a sampling coverage value of 96.54%. The predicted recorded pollinator species by doubling the number of plants sampled is expected to increase by 22.22% (**Figure 4d**). We find that a small portion of plant species and pollinator species are shared across a broad range of networks and that most plant (85.68%) and pollinator (87.72%) species are exclusively found in less than 1% of networks (**Figures 4e-4f**). The most common plant (*Trifolium pratense*) and pollinator (*Bombus pascuorum* when excluding *Apis mellifera*) species are found in 36.07% and 62.70% of networks, respectively.

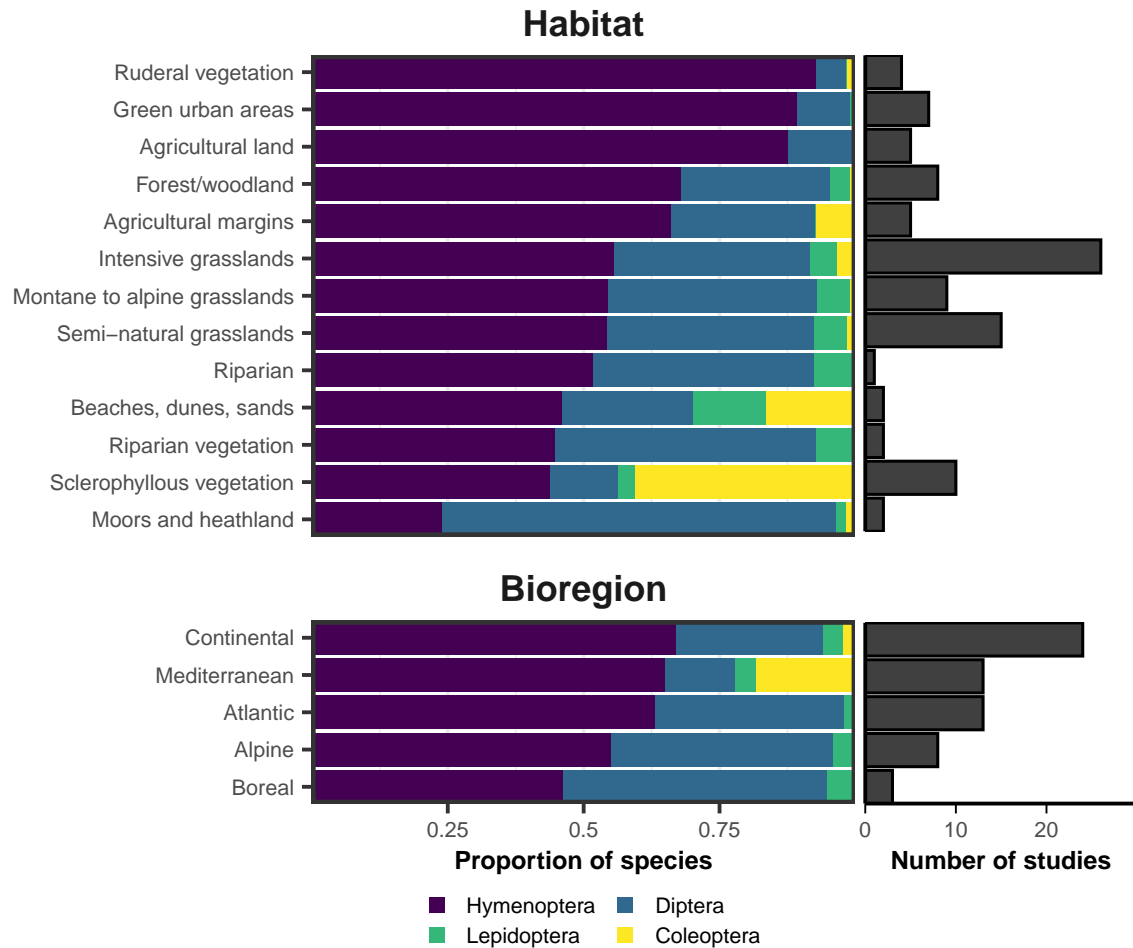


**Figure 4.** Graphs (a-b-c) indicate the accumulation curves for pollinators, plants, and the number of unique pairwise interactions across networks. Grey solid lines represent 100 randomized accumulation curves, the black solid lines represent the interpolated curve (i.e., the mean across curves), and the red dashed lines illustrate the extrapolated curve for approximately 3000 networks. The solid black points indicate the number of species and interactions contained in the database. Graph (d) shows the accumulation curve of pollinator species across an increasing number of plant species. This last graph uses the same color and shape structure as the ones in the top panel. Graphs (e-f) indicate the percentage of occurrence (i.e., incidence) of plant and pollinator species across networks. Species on the left (i.e., common) are found in many networks, while species on the right (i.e., rare) are found in few or only a single network. Note that *Apis mellifera* is the most common pollinator but was excluded from this visualization.



## Habitat type and bioclimatic region

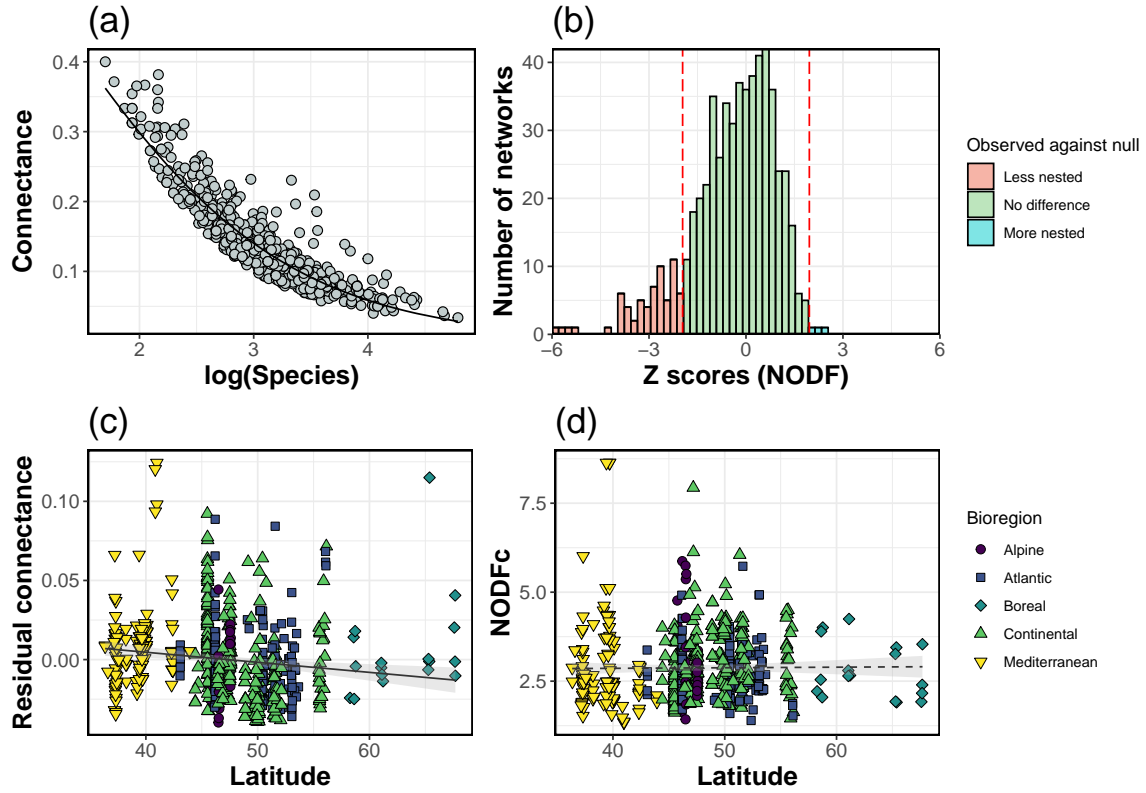
The proportion of species from the major pollinator orders within the database differed across habitats and bioclimatic regions (**Figure 5**). Hymenoptera was the main taxonomic order in the majority of habitats, exceeded only by Diptera for the habitat categories of riparian vegetation and moors and heathland. Overall, the proportion of flower visitors from Lepidoptera and Coleoptera were low across all habitats but Coleopteran flower visitors were notably more abundant in sclerophyllous vegetation and beaches, dunes and sands habitat categories. Similar patterns were observed when exploring the pollinator proportions by bioclimatic region. Hymenopterans were abundant across all bioclimatic regions and Dipterans were particularly abundant in the Boreal, Alpine and Atlantic regions. Lepidopterans had low proportions across all bioclimatic regions and Coleopterans were only relevant in the Mediterranean region at European level. Notably, the number of studies (**Figure 5**) and sampling sites (**Figure S3**) also differed across habitats and bioclimatic regions. The habitats sampled by a higher number of studies in the database were intensive grasslands (26), semi-natural grasslands (15) and sclerophyllous vegetation (10). However, the habitats that contain a higher number of sampling sites were intensive grasslands (601), agricultural margins (432) and agricultural land (141). The bioclimatic regions with a higher number of studies were Continental (24), Atlantic (13) and Mediterranean (13); and those that contain a higher number of sampling sites were Continental (490), Atlantic (459) and Boreal (439).



**Figure 5.** Proportion of species from the major pollinator orders by habitat types and bioclimatic regions in the EuPPollNet database. The orders, from left to right, include Hymenoptera, Diptera, Lepidoptera and Coleoptera. The horizontal barplot on the right indicates the number of studies that were conducted on each habitat type or bioclimatic region. Note that a single study can contribute to more than one habitat or bioclimatic region. Areas with a greater number of studies are more likely to depict accurate proportions of the different pollinator orders in those systems. The Pannonian and Steppic bioregions were excluded from this visualization because they contain only few networks from a single sampling day and site.

## Network properties

Connectance values ranged between 0.03 to 0.4 ( $\bar{x} = 0.14$ ) and followed a negative exponential relationship with the number of species per network (Kendall  $\tau = -0.75$ ,  $P < 0.01$ ; **Figure 6a**). Nestedness values (NODFc) ranged between 1.34 to 8.63 ( $\bar{x} = 2.87$ ), and, as expected, were not independent of the mean number of species (Kendall  $\tau = -0.05$ ,  $P = 0.08$ ; **Figure S4**). Although latitude has a statistically significant impact on residual connectance, it explains only a small portion of the observed variability in residual connectance and nestedness across networks. (connectance:  $R^2 = 0.02$ ,  $P < 0.01$ , **Figure 6c**; NODFc:  $R^2 \sim 0$ ,  $P = 0.83$ , **Figure 6d**). Overall, networks towards higher latitudes showed lower residual connectance but similar nestedness compared to networks located at lower latitudes. Note that residual connectance and normalised nestedness showed a moderate significant negative correlation (Kendall  $\tau = -0.43$ ,  $P < 0.01$ ). Empirical networks did not show statistically different nestedness (NODF) to the simulated ones (**Figure 6b** and **Figure S5**). The ‘curveball’ method for binary networks resulted in 12.02% of networks statistically less nested than null expectations, 85.71% showing no difference, and 1.57% being more nested. The ‘quasiswap\_count’ algorithm for quantitative networks resulted in 11.4% of networks being less nested, 88.07% showing no difference and 0.53% being more nested. Note that in both cases, NODF is calculated on binarised matrices.



**Figure 6.** Graph (a) shows the association between network connectance and the geometric mean of plant and pollinator species per network on a log-scale with the respective fitted line from a Beta regression. Graph (b) shows the distribution of z-scores when comparing the nestedness from the empirical networks with their randomised counterparts (100 null models for each network with the curveball algorithm). The vertical red dashed lines represent the z critical value for a two tailed test with  $\alpha = 0.05$ . Z-scores to the left of the first vertical red dashed line indicate that networks are less nested than expected by chance (red), those between the two dashed lines indicate no statistical difference from random expectations (green), and those to the right indicate that networks are more nested than expected by chance (blue). Graphs (c-d) show the fitted regression of residual connectance and nestedness across the latitudinal range of the studies from the database. The solid fitted line indicates a significant association, while the dashed lines indicate a non-significant association. The bioclimatic region of each network is indicated with points of different shapes and colours.

### 3 | DISCUSSION

EuPPollNet offers the largest set of plant-pollinator studies and networks compiled to date at European level. The database contains 1,411 plant and 2,223 pollinator species with over a million interaction records. While the overall sampling coverage of species and interactions is relatively high across the sampled sites, the taxonomic coverage of plants and the main pollinator groups at the European level is still relatively low (i.e., 5.6% for flowering plants and 34.4% for bee species). This likely reflects that most plant and pollinator species are rare and geographically restricted. For example, given that most of the plant-pollinator networks from the database are sampled on intensive grasslands, and habitat heterogeneity is a crucial factor in understanding pollinator diversity at European level (Hass et al., 2018; Kleijn et al., 2015; Martínez-Núñez et al., 2022), adding studies on other habitat types is likely to result in a rapid increase of the coverage of plant and pollinator species and their interactions. Indeed, plant and pollinator species were rarely shared across multiple sites, indicating that there are few “common” species and many “rare” ones at the metaweb or continental level. This high number of “rare” species results in an upward slope of the species or interaction accumulation curves (Thompson & Withers, 2003). In other words, minimal sampling efforts are capturing a substantial number of species and interactions, but achieving a comprehensive inventory will require numerous sampling events within and across habitats, particularly for plant-pollinator interactions.

Bees are responsible for the majority of the sampled interactions at the metaweb level. As not all surveys included all pollinator groups, this result may partly be influenced by the taxonomic groups sampled across studies. However, the relevance of bees and other pollinator orders for network topology changed across habitats and bioclimatic regions in accordance to the literature. For instance, plant-pollinator communities in the Mediterranean were dominated by bees, while communities in Alpine or Boreal regions were fly species rich or fly-dominated. These patterns are consistent with our current understanding of bee diversity, which peaks in dry or temperate areas (Leclercq et al., 2023; Orr et al., 2021); and with the fact that colder environments (i.e., altitude and latitude wise) harbor a larger fraction of fly pollinators compared to other taxa (Elberling & Olesen, 1999; Lefebvre et al., 2018). In addition, beetles were only commonly documented as floral visitors in the Mediterranean region. This study cannot determine whether pollination ecologists traditionally document flower-beetle interactions only in the Mediterranean, or if there are fewer flower visitations by beetles outside this region. Nevertheless, the high proportion of beetles as floral visitors provides further support for their potential role as pollinators in the Mediterranean (Herrera, 2019; León-Osper & Narbona, 2022). The number of butterfly species and interactions were relatively low compared to the other taxa. While Europe contains fewer butterfly species than other regions of the world (Ollerton, 2017), their relevance as pollinators is likely underestimated within this database. This is because a large fraction of studies (~40%) did not sample butterflies, and conventional sampling methods for monitoring other insect pollinators (e.g., bees or flies) may be inadequate for sampling plant-butterfly interactions (Isaac et al., 2011). Honey bees were present in 87% of networks and conducted on average a third of the total interactions per network.

The proportion of honey bees in networks across Europe is higher than in natural communities (i.e., large unmanaged assemblages of plant species) across the world (~13%; [Hung et al., 2018](#)). This potentially reflects the dominance of intensive grassland habitats in EuPPollNet and their widespread distribution across European landscapes ([Isselstein et al., 2005](#)), the highly generalised nature of honey bees, their native status and above all, the widespread practice of beekeeping in Europe ([Herrera, 2020](#); [Magrath et al., 2017](#); [Steffan-Dewenter & Tschardt, 2000](#)).

Although Europe contains a much larger number of flowering plants than pollinator species (~5 to 1 ratio according to our extrapolation from checklists), the observed number of pollinator species in the database was almost double that of the plants. This could be explained by the fact that all networks are phytocentric, resulting in sampling bias towards pollinator species ([Jordano, 2016](#); [Vizentin-Bugoni et al., 2018](#)). While animal-centered sampling is likely to increase the plant-pollinator species ratio (e.g., [Encinas-Viso et al., 2023](#)), the spatial scale and environmental context of the sampled communities will also influence their observed diversity, especially given the ability to move of pollinators and the sessile nature of plants. In addition, we found that the accumulation curve of pollinators per plant species does not saturate, which indicates low redundancy of pollinators and that many are regionally “rare”. Rare pollinators can be functionally important for plant species at the landscape level ([Simpson et al., 2022](#); [Winfree et al., 2018](#)), highlighting the need to conduct further sampling events to identify these rare species across different regions and to effectively understand and protect plant-pollinator biodiversity.

Consistent with [Olesen & Jordano \(2002\)](#), we found that residual connectance (i.e., the deviation from the expected connectance for a given network size) was lower at higher latitudes, while normalised nestedness increased towards higher latitudes. Networks at lower latitudes in Europe are exposed to higher temperatures, which can result in higher visitation rates ([Arroyo et al., 1985](#); [Classen et al., 2015](#); [Herrera, 2019](#)), and the overall level of pollinator generalization is known to be higher at lower latitudes ([Schleuning et al., 2012](#)). These factors should increase the number of possible connections that can be established between plants and pollinators for a given network size, resulting in more connected networks at lower latitudes in Europe. However, our results cannot be extrapolated to lower latitudes outside Europe, as tropical systems might behave differently. Finally, a result that can be surprising is that most empirical networks (~85%) showed a non-nested structure. This result contrasts with earlier work suggesting that plant-pollinator networks are typically nested ([Bascompte et al., 2003](#)) and it aligns with recent evidence showing that nestedness is not a common feature in plant-pollinator networks when evaluated against restrictive null models that conserve the observed species degree ([Payrató-Borrás et al., 2019](#); Figure S6). Note that while species degree distributions are sufficient to explain the emergence of nestedness, this does not preclude nestedness from being a useful metric for comparison across networks. For example, plant-pollinator networks are more nested than plant-herbivore networks precisely because these two network types differ in their composition of generalist and specialist species ([Thébault & Fontaine, 2010](#)).

Although this database covers a wide range of habitats across 23 countries, it contains temporal and geographical biases that can impact our understanding of plant-pollinator communities (Hughes et al., 2021). For instance, none of the studies in this database sampled nocturnal pollinators, which can impact our view of network structure (García et al., 2024), and most studies were conducted during a single flowering season, limiting our ability to evaluate temporal trends of plant-pollinator communities in the face of environmental changes (Alarcón et al., 2008; Chacoff et al., 2018). In addition, most plant-pollinator networks are sampled from central Europe, while Eastern Europe and the Mediterranean region are underrepresented. This is consistent with previous studies which also report lack of plant-pollinator data for those regions (Bennett et al., 2018; Marshall et al., 2024), highlighting that this database shows existing patterns in data availability despite the absence of a systematic search for studies. The lack of data for Eastern Europe, which contains vast landscapes with semi-natural grasslands experiencing rapid land use change (Sutcliffe et al., 2015), and for the Mediterranean region, which is severely impacted by climate change (Duchenne et al., 2020; Jaworski et al., 2022; Pareja-Bonilla et al., 2023), is particularly concerning. These areas are well known for their rich pollinator diversity (Miličić et al., 2018; Reverté et al., 2023), and their under-representation is likely contributing to the low taxonomic coverage of this database at the European level. Although some of the most well studied countries in Europe (e.g., Belgium, The Netherlands) have already experienced land use change and biodiversity loss at the end of the 20th century (Carvalho et al., 2013), plant-pollinator communities in Europe and across the globe still face current and future threats from climate change (Bartomeus et al., 2011; Duchenne et al., 2020), land use change (Batáry et al., 2015; Reidsma et al., 2006), and the introduction of alien species (Vanbergen et al., 2018; Vilà et al., 2009). Therefore, continuous monitoring programs are needed in order to evaluate spatio-temporal changes of species and their interactions across different European habitats and regions. This will allow local and large scale analyses of the status and trends of plant-pollinator communities, effectively informing management and conservation actions.

In conclusion, the EuPPollNet database enables researchers to explore spatial, taxonomic and structural properties of plant-pollinator networks within Europe. In contrast to previous databases, EuPPollNet provides interaction data along with sampling information that could help researchers to better control for sampling effort and completeness and to select the most suitable networks for their research questions. Here, we have shown how connectance and nestedness change across their latitudinal range, and that plant-pollinator networks are as nested as expected given plant and pollinator generalist levels. These analyses aim to highlight the variability present across Europe in the structure of plant-pollinator networks and illustrate the opportunities available to develop and test questions about spatio-temporal network change using EuPPollNet. The reproducible workflow allows researchers to adapt and reuse this database, enabling the continuous addition of new networks to better evaluate the status and trends of plant-pollinator communities. Finally, we hope this database becomes an iterative resource that keeps growing and improving over time to better understand and conserve European biodiversity.

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## 770 DATA AVAILABILITY

771 All data and code to produce of this database and manuscript are available at Zenodo (LINK)  
772 and Github (<https://github.com/JoseBSL/EuPPollNet.git>).