

**UNIVERSITÀ DEGLI STUDI DI NAPOLI
FEDERICO II**



Scuola politecnica e delle Scienze di Base

DIPARTIMENTO DI BIOLOGIA

Corso di Laurea Magistrale in Scienze Naturali

TESI DI LAUREA IN

BOTANICA

**THE ECOLOGY AND DISTRIBUTION OF EUROPEAN
ORCHID MYCORRHIZAL FUNGI**

**ECOLOGIA E DISTRIBUZIONE DI FUNGHI
MICORRIZICI DELLE ORCHIDEE EUROPEI**

Candidato: Manuel Moscariello, matr. M05000188
(manuel.moscariello@libero.it)

Tesi di laurea magistrale, sperimentale, 2019-2020

Relatore: Prof. Karl Joseph Duffy,
Geobotanica del mediterraneo (BIO/03);
Dipartimento di Biologia; karljoseph.duffy@unina.it

Contents

Contents	2
1. Abstract	4
2. Riassunto	4
I. Introduction	6
3. Orchid-mycorrhizal fungi relationship	10
3.1. Distribution and ecology of orchid mycorrhizal fungi	12
II. Materials and methods	14
4. Phylogenetic analysis	16
5. Multivariate analysis	18
6. Hierarchical Modelling of Species Communities	20
III. Results	23
7. Phylogenetic analysis	24
8. PCA	24

CONTENTS

9. NMDS	25
10.Hierarchical modelling of species communities	26
IV.Discussion	32
V. Conclusions	37
VI.Appendices	39
11.Additional resources and information	40
12.Phylogenetic trees	40
Bibliography	43

1. Abstract

The importance of fungi in the ecosystems could not be overestimated. Not only they are key decomposer and provide food and digestive aid to many animals, most of the plants rely on fungi living in their roots for minerals, protection and other nutrients, in what we call a mycorrhizal symbiosis. Orchidaceae are particularly reliant on this symbiosis, as their seeds need the fungal symbiont to provide all the necessary nutrients in a symbiosis that is often obligate also when the plant reaches adulthood. Despite all of this, the ecological processes that influence the fungal distribution, the environmental and biotic factors, are still unclear.

Fungi are often invisible to human eye and the soil is a very complex system, thriving with a multitude of organisms. By sampling the fungi that live in the orchids root system, we can have a simpler, more understandable starting point to explore the ecological mechanisms that contribute to their distribution.

Multivariate analysis, phylogenetic analysis and Bayesian distribution modelling are useful tools that can help us shed some light on what the most relevant environmental variables are, if there is a correlation in the presence of organisms from different groups, what their niche is and how do those overlap.

2. Riassunto

L'importanza dei funghi negli ecosistemi non può essere sovrastimata. Non solo sono decompositori chiave, forniscono cibo e supporto digestivo a molti animali, la maggior parte delle piante dipende dai funghi che vivono nelle loro radici per minerali, protezione e altri nutrienti, in quella che chiamiamo una simbiosi micorrizica. Le Orchidaceae sono particolarmente dipendenti da questa simbiosi. I loro semi hanno bisogno dei funghi per ottenere tutti i nutrienti necessari in una simbiosi che spesso rimane obbligata anche quando la pianta raggiunge la maturità. Nonostante ciò, i processi ecologici che influenzano la distribuzione dei funghi, i fattori ambientali e biotici, sono ancora poco chiari.

I funghi sono solitamente invisibili all'occhio umano e il suolo è un sistema molto complesso, in cui vivono una moltitudine di organismi. Campionando i funghi che vivono nel sistema radicale delle orchidee abbiamo un punto di partenza più semplice per esplorare i meccanismi ecologici che contribuiscono alla loro distribuzione.

Analisi multivariate, analisi filogenetiche e modellizzazioni di distribuzione Bayesiane sono strumenti utili che possono aiutarci a capire quali siano le variabili ambientali più rilevanti, se ci sono correlazioni nella presenza di organismi di gruppi diversi, quale è la loro nicchia ecologica e in che modo queste si sovrappongono.

Part I.

Introduction

The kingdom Fungi is one of the most diverse groups of organisms on Earth. Fungi play an important role in the ecosystem and have a huge impact on biogeochemical cycles, plant and animal pathology, plant nutrition and soil properties. While historically fungi were taxonomically clustered with plants (Copeland, 1938, 1956), towards the middle of the twentieth century it became clear that it failed to properly deal with the differences between the two groups. In 1969 R. H. Whittaker divided the organisms into five kingdoms: Animalia, Plantae, Fungi, Protista and Monera (Whittaker, 1969). By the 1970s this division became widely accepted, and the Kingdom Fungi was recognized. However, due to a limited understanding of the taxonomy, evolution and phylogenesis of fungi, it was still a matter of ample debate. All the analysis were based on morphological differences, with all of its downsides.

The fossil record for fungi is limited and even though the known fossils cover almost all major fungal lineages (Lücking et al., 2009), it is rather incomplete relative to the evolutionary history of the various fungal lineages. The earliest compendium of fossil fungi is from the late 19th century (Meschinelli, 1898), and their symbiotic relationship with plants in fossils was suggested around that period (Renault, 1896), but the difficulty in the interpretation of morphological data made it impossible to actually understand what happened.

Earliest fossil with the morphological features of a fungus is dated to around 1 billion years ago, and was found in the Arctic Canada (Loron et al., 2019), and there is evidence of fungus-like organisms in fossils of around 800 Mya (Bonneville et al., 2020). Starting from the lower Devonian (around 400 Mya), fossil record is more abundant (Lücking et al., 2009).

It was not until the development of molecular phylogenetics techniques that some light could be properly shed on the evolutionary history of fungi (James et al., 2006a).

The molecular clock is one of the most widely used tools to investigate the timing of phylogenetic events. It is based on the hypothesis of the constancy of the rate of evolution with time and, when combined with the use of fossil records, allows the dating

of branching events on phylogenetic trees (Lepage et al., 2007; Weir and Schluter, 2008). From molecular clock analysis seems like fungi are sister group to animals, that is, the two lineages are close, diverging around 1.5 billion years ago (Wang et al., 1999). The two groups form one supergroup called Opisthokonta (Cavalier-Smith, 1987), from the Greek opísthios (rear, posterior) and kontós (“pole” i.e. “flagellum”), since the group is characterized by flagellate cells that propel themselves with a single, posterior flagellum, now lost in most fungi (Steenkamp et al., 2006) with the notable exception of the Chytridiomycota division (James et al., 2006b).

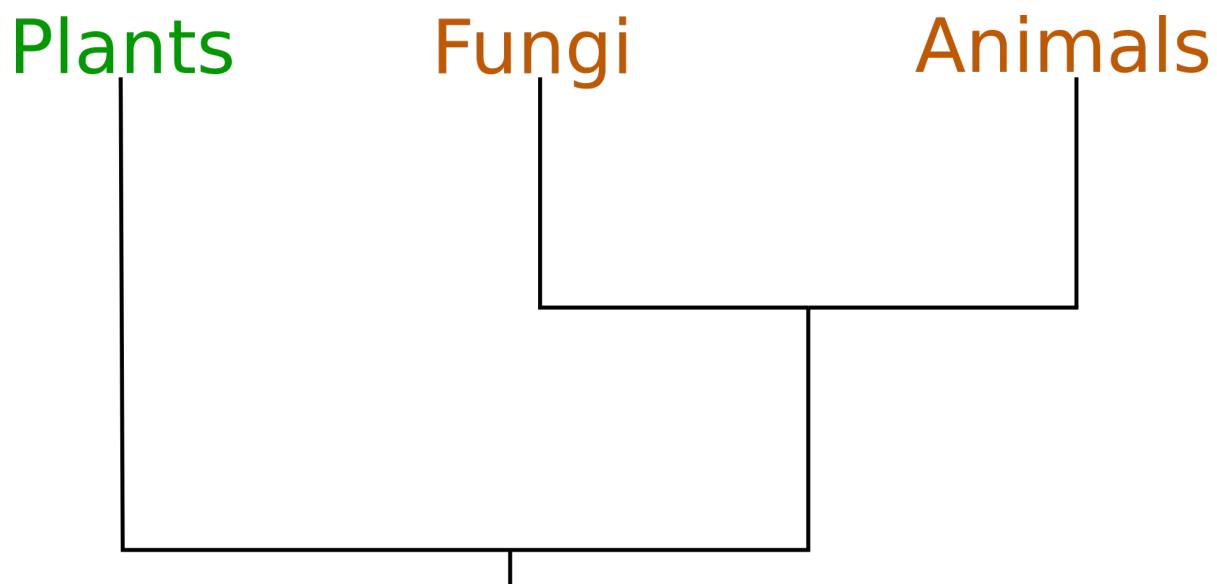


Figure 2.1.: Simplified phylogenetic tree showing the relationship between the three clades

The ancestors of fungi are believed to be simple aquatic forms with flagellated spores, similar to members of the extant phylum Chytridiomycota (chytrids), which are now considered one of the early-diverging clade in the kingdom (James et al., 2006a). The first terrestrial fungi colonized land probably before plants (Heckman et al., 2001), as saprobe (taking nutrition out of dead matter) and/or in symbiosis with organisms capable of photosynthesis. It is commonly accepted that in order to colonize the land, plants had to develop a symbiotic relationship with fungi (Selosse and Le Tacon, 1998; Heckman et al., 2001; Bonneville et al., 2020), but it is not entirely clear whether this

relationship was lichen-like (an algae or cyanobacteria living among filaments of a single or more fungi) (Spribille et al., 2016) or mycorrhizal-like, where the fungus colonizes the host plant's root tissues.

Lichens are the symbiotic relationship between a single or more fungi (*mycobiont*) and a cyanobacteria or algae (*photobiont*). Early plants that transitioned from aqueous environments were poorly equipped to deal with the challenges of a terrestrial life style: mainly, to decompose the mineral substrate to absorb nutrients, to protect itself against dehydration, UV radiations and temperature fluctuations (Selosse and Le Tacon, 1998; Blackwell, 2000). By forming relationships with fungi (i.e. a lichen), the photobiont is protected by the fungal stroma, and it can tolerate drought, cold, heat, intense light and barren rocky substrates. Indeed they also seem to be pioneers of harsh environments today.

Yet, while the relationship between plants and fungi evolved several times (Gargas et al., 1995), the only fungal group we know that are capable of forming such association (called *lichenization*) are Ascomycota and Basidiomycota. The origin of those clades can be dated to about 400 Mya in the Devonian period (Berbee and Taylor, 1993). Similarly there are fossils for lichens dating at the oldest in the Early Devonian (400 Mya) (Taylor et al., 1997; Honegger et al., 2013), while the first fossil land plants and fungi appeared 480 to 460 Mya, and molecular clock estimates suggests about 600–700 Mya (Berbee and Taylor, 1993; Heckman et al., 2001).

Therefore, lichens were likely not what opened the way to plants for land colonization.

The mycorrhizal association is a symbiotic association between plants and fungi happening in the rhizosphere, the plant's root system (Barman et al., 2016). In this interaction there is an exchange of resources between the mycorrhizal fungus and the plant, ideally the plant providing sugar to the fungus and the fungus providing minerals and nutrients to the plant. However, this is not always the case and upon closer analysis, there appears to be a continuum of plant responses to mycorrhizal colonization ranging from positive

to neutral to negative, and the same goes for the fungi (Johnson et al., 1997).

Fossils resembling mycorrhizal relationships date to the Ordovician (with an age of about 460 million years), and are Glomales-like Arbuscular Mycorrhizal Fungi (AMF hereafter), in a moment where the land flora was comprised mainly of bryophytes, pteridophytes and algae (Redecker et al., 2000). Plants can photosynthesize; these fungi can extract minerals from the substrate with great efficiency, protect the root system, extend the range from which water can be taken and protect the plants from pathogens.

Fossil records provides evidence that fungal organisms entered in such symbiosis before the appearance of true roots, and as long as there is a multicellular host AM fungi are fine (Wang and Qiu, 2006; Bonfante and Genre, 2008).

Whether as lichen or as mycorrhiza, the symbiosis between plants and fungi is one of the most important, most ancient relationship in the history of living beings and it surely played a crucial role in the successful colonization of the land by plants (Pirozynski and Malloch, 1975; Malloch et al., 1980; Harley and Harley, 1987; Trappe and Safir, 1987; Selosse and Le Tacon, 1998; Brundrett, 2002). The relationship is so beneficial (for one or both parts) that today is the norm, and is well established in c. 85% of extant plants (Cairney, 2000; Strullu-Derrien et al., 2018), with a high degree of complexity (van der Heijden et al., 2015) and mycorrhizal networks often constitute 20%–30% of total soil microbial biomass (Leake et al., 2011)

3. Orchid-mycorrhizal fungi relationship

Orchidaceae is a diverse and widespread family of flowering plants, containing over 28,000 species in about 736 genera (Christenhusz and Byng, 2016), second only to Asteraceae in terms of species numbers (Ramírez et al., 2007). They are cosmopolitan, with a distribution spanning all continents except Antarctica and including most major island groups (Givnish et al., 2016). By the end of 2017 the IUCN Global Red List included assessments for 948 orchid species, of which 56.5% are threatened (Fay, 2018). In Europe all wild orchids are protected, being included in their entirety on Appendices I and II of the Convention on International Trade in Endangered Species of Wild Fauna and Flora (CIT) as are many of the habitats they live in, and are listed on the Red List of many countries. Nonetheless, this protection has not staved off a general decline in the orchid flora of Europe (Jacquemyn et al., 2005; Kull and Hutchings, 2006). Major threats include habitat destruction and unsustainable (often illegal) harvesting, and because of their complex life histories orchids are thought to be particularly vulnerable to the effects of global environmental change (Kull et al., 2016; Gale et al., 2018).

Orchids exhibit a high diversity of habitat adaptations, morphologies and pollination strategies, but some characteristics are common to the whole family. One of the most important is the reliance on Orchid Mycorrhizal Fungi (OrM here after) for reproduction and survival. This is because orchids seeds are devoid of nutritional resources, and they completely rely on fungi for nutrition including water, minerals and carbon supply (Leake, 1994; RASMUSSEN and WHIGHAM, 1998; Merckx, 2013) in a nutritional strategy called “mycoheterotrophy”. After germination, seedlings often become autotrophic and subsequently revert to usual mycorrhizal functioning (Rasmussen, 1995; Cameron et al., 2008). Some species, especially from forest environments, remain mycoheterotrophic at adulthood though, developing partial photosynthetic capacity but

3. Orchid-mycorrhizal fungi relationship

still relying on fungi for carbon resources, a nutritional strategy called “mixotrophy” or “partial mycoheterotrophy” (Gebauer and Meyer, 2003; Julou et al., 2005; Selosse and Roy, 2009). Others never develop photosynthetic capacity and therefore rely completely on fungi for nutrition. This nutritional mode, which has evolved over 30 times independently in orchids, is called “obligate mycoheterotrophy” (Merckx, 2013).

While the relationship between orchids and OrM is known for over a century (Bernard, 1899; Rayner, 1927; Rasmussen, 2002; Selosse et al., 2011) and the mechanisms of this symbiosis are beginning to be properly understood, the knowledge from a taxonomical standpoint is still unclear. For many years orchids were thought to interact almost entirely with a specific clade of fungi, members of the Rhizoctonia complex. It was later discovered not only that orchids have way more interactions with different fungi also from the Ascomycetes phylum, but also that Rhizoctonia is a polyphyletic group, and was disassembled in different taxa, all members of the Agaricomycetes, most notably Sebacinales, Ceratobasidiaceae and Tulasnellaceae (Dearnaley et al., 2012). There is also evidence of fungi from the Ascomycota phylum, especially in the order Pezizales (Selosse et al., 2004; Ouanphanivanh, 2008; Waterman et al., 2011), but they are the exception: the most common and known families of OrM are in the Basidiomycota phylum, particularly Inocybaceae, Tulasnellaceae, Ceratobasidiaceae, Russulaceae, Sebacinaceae, Serendipitaceae and Thelephoraceae (Taylor et al., 2004; Roy et al., 2009; Duffy et al., 2019)

3.1. Distribution and ecology of orchid mycorrhizal fungi

Orchids depend on OrM for the germination of their seeds and in many cases for nutrient provision also in adulthood, we assume that OrM must co-occur with the orchid population. However, many OrM can also turn to a soil free-living saprotrophic ecological niche (Oberwinkler et al., 2017) and form mycorrhizal relationships with plants other

3. Orchid-mycorrhizal fungi relationship

than orchids (Selosse and Martos, 2014). Members of the Tulasnellaceae, Ceratobasidiaceae, and Sebacinales (Serendipitaceae and Sebacinaceae) are ubiquitous, with varying relative abundances (Jacquemyn et al., 2017).

Environmental factors that underlie the distribution of OrM taxa are poorly understood. Abiotic variables such as annual rainfall, temperature regimes and soil chemical properties should explain the distribution of many taxa. However, local biotic interaction, community composition and interactions may influence the OrM distribution, especially considering they are symbiotic organisms (Jacquemyn et al., 2017). Overall, there is a lack of evidence, and many parts of the world are undersampled (e.g. all the African continent and most of the tropical areas of the planet). Therefore, it is difficult to conclude that the occurrence of OrM taxa are structured by biotic variables based on a limited amount of data. A part of the problem is that the relationships between orchids and OrM are complex. They both vary in their degree of specialization, from a highly specialized to a more generalist (McCormick et al., 2004; Girlanda et al., 2011; van der Heijden et al., 2015), and OrM may be able to revert to saprophytic free-living lifestyles (Veldre et al., 2013).

In this thesis, I investigate the distribution and ecological factors underlying the occurrence OrM throughout Europe. I analyzed the OrM taxa associated with 16 different orchid species that occur in different regions throughout Europe. Specifically, I focus on two over-arching questions:

1. do similar OrM taxa occur in similar habitats and have similar environmental preferences?
2. Are similarities in OrM co-occurrence explained better by positive environmental correlations or are there residual taxa correlations that may suggest ecological processes beyond environmental filtering (e.g. competition and facilitation)?

Part II.

Materials and methods

Data regarding the distribution of OrM in Europe were entered into a database. The data included were composed of OrM fungi isolated from orchid roots, and were geo-referenced to the nearest known locality; also, each sample had to have a Genbank accession code in order to obtain the sequences and do the analysis. Only sequences from well-known OrM were considered, that is: Ceratobasidiaceae, Inocybaceae, Russulaceae, Sebacinaceae, Serendipitaceae, Thelephoraceae and Tulasnellaceae (Dearnaley et al., 2012). Orchid species sampled were *Cephalanthera damasonium* (Julou et al., 2005), *Cephalanthera longifolia* (Pecoraro et al., 2017), *Dactylorhiza baltica* (Shefferson et al., 2008), *Epipactis atrorubens* (Shefferson et al., 2008), *Himantoglossum adriaticum* (Pecoraro et al., 2013), *Limodium abortivum* (Girlanda et al., 2005), *Neottia cordata* (Těšitelová et al., 2015), *Neottia ovata* (Hans Jacquemyn et al., 2015; Těšitelová et al., 2015), *Ophrys bertolonii* (Pecoraro et al., 2015), *Orchis anthropophora* (Julou et al., 2005), *Orchis militaris* (Shefferson et al., 2008), *Orchis purpurea* (Lievens et al., 2010), *Orchis simia* (Schatz et al., 2010; Lievens et al., 2010), *Orchis tridentata* (Pecoraro et al., 2012), *Spiranthes spiralis* (Duffy et al., 2019).

For each population six variables were extracted by using the ESDAC database (Panagos et al., 2012) and the WorldClim database (Hijmans et al., 2005): Nitrogen, Potassium and Phosphorus soil content, soil pH, minimum temperature of the coldest quarter and maximum precipitation of the wettest month. These variables were selected because mycorrhizal fungi may be sensitive to nutrients in the soil: Nitrogen, Phosphorus and Potassium in high quantities (such as in eutrophicated soils because of agricultural fertilizers) have been seen to cause decline in the belowground mycorrhizal fungi species richness and cause dramatic changes in the community composition and structure (Lilleskov et al., 2002; Baar et al., 2002; Grant et al., 2011). Mycorrhizal fungi growth and community composition also seem to be influenced by the soil pH (Aarle et al., 2002; Carrino-Kyker et al., 2016), temperature and precipitation (Rillig et al., 2003). Those variables may serve as important proxy for other conditions. Biomes and vegetation are correlated with the environmental conditions, because they change local conditions (like soil pH). Also, human impact can often be seen by the amount of chemi-

cals in the soil, especially close to cultivated fields. Environmental values were extracted using GDAL's Sample Raster Values tool (Using QGIS v. 3.16 as a GUI) and appended to the dataset

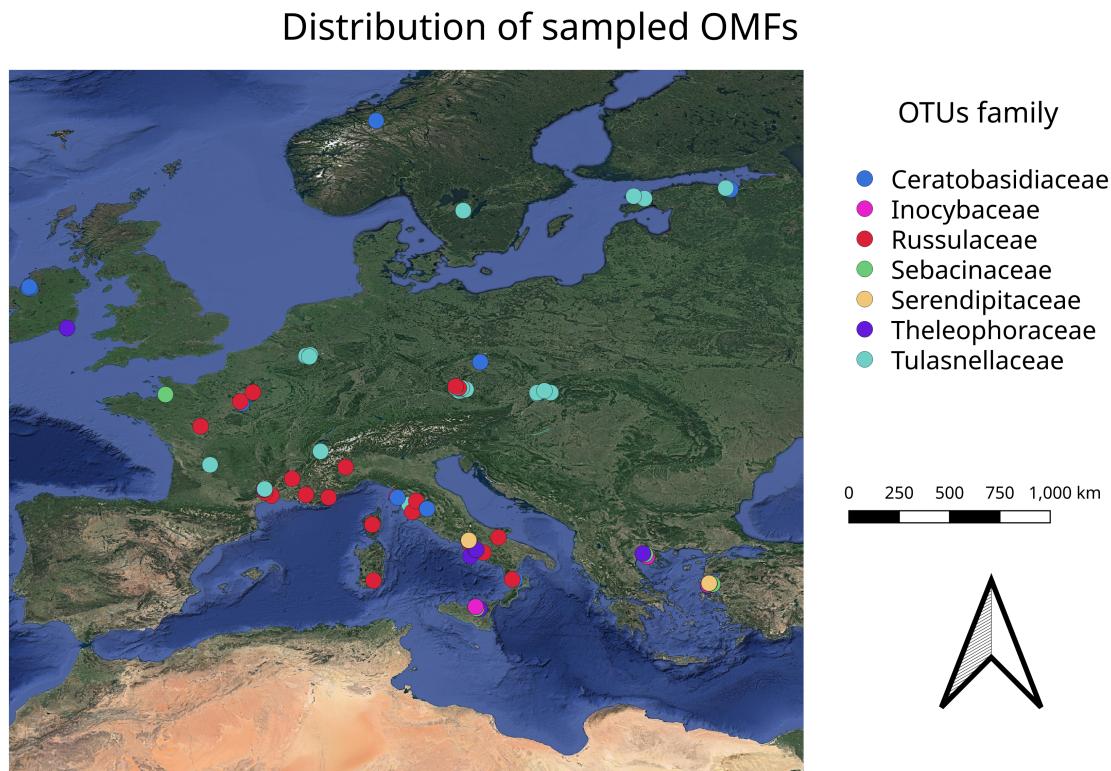


Figure 3.1.: Sampled points | Imagery ©2021 TerraMetrics, Map data ©2021 GeoBasis-DE/BKG (©2009), Google, Inst Geogr. Nacional

4. Phylogenetic analysis

In order to understand the distribution and ecology of the OrM we need a better insight of their phylogenesis. The hypothesis was for sequences of the same family to be clustered together, with some doubts regarding the Sebacinales as Serendipitaceae and Sebacinaceae are very closely related and have only been recently separated (Weiß et al., 2016). Phylogenetic analysis were performed on the sequences deposited by the papers included in the database. The primers used were mainly ITS1F, ITS4, ITS3 and ITS4OF, all targeting regions between the 18S rRNA subunit and the 28S rRNA subunit, including the Internal Transcribed Spacers (ITS hereafter) 1 and ITS 2. Those primers were usually universal for Basidiomycota or in some cases more specific for Tulasnelaceae (like ITS4tul) or other taxa. Sequence DQ520100 from *Tremiscus helvelloides* was used as outgroup.

- Sequences were aligned using the MUSCLE algorithm (Edgar, 2004) and manually trimmed to a visually satisfying overlapping;
- Ugene was used as main GUI, v. 37.0 (Okonechnikov et al., 2012);
- Maximum Parsimony analysis was performed using TNT, v. 1.1 (tnt), using the Tree Bisection and Reconnection algorithm and with ten replicas. 1000 trees were kept and a strict consensus tree was calculated. Bootstrap analysis was performed on the tree with 200 replications to test the validity of the tree. Bootstrap values are displayed as node labels in the appendix tree (Appendix 1);
- the Bayesian analysis (MCMC) was performed using MrBayes, v. 3.2.7a (Huelsenbeck and Ronquist, 2001), using the Hasegawa-Kishino-Yano with a gamma rate heterogeneity among sites (`lset nst=2 rates=gamma;`). One million trees were generated and sampled each thousand, with four chains running. A final consensus tree was then calculated (see appendix).

- Trees were then visually edited with FigTree v. 1.4.4.
- All parameters are available in the supplemental data, along with the files to reproduce the analysis.

5. Multivariate analysis

Before proceeding with the multivariate analysis, sequences have been clustered into Operative Taxonomic Units (OTU hereafter), by using cd-hit v. 4.8.1 (Li et al., 2001). This process yielded 210 OTUs, with the extremes of Serendipitaceae having two OTUs only, and Tulasnellaceae 52 OTUs. The database was then pivoted in a presence-absence matrix, and for further analysis it was splitted by family, so that each matrix only had all the OTUs for that single family, yielding seven different matrices. This was necessary to test what variability each family has; another matrix was obtained by grouping together all the observations from the same family, to test the variability between the different OrM families.

A final matrix was obtained by using the single families/OTUs as rows and removing the orchid species variable. This was done to understand the impact of the environmental variables only on each OTU, therefore trying to understand how different the realized niche (i.e. the variance in the environmental variables) is between the groups.

Principal Component Analysis (PCA hereafter) is an orthogonal linear transformation of the data that aims to maximize the variance of the scalar projection of all points of a dataset into a number of axis ordinated by explained variance. This yields a set of axis, which can be used for clustering, to reduce the number of dimensions and perform other analysis. PCA was performed on all matrices using the base R functions `princomp()`,

5. Multivariate analysis

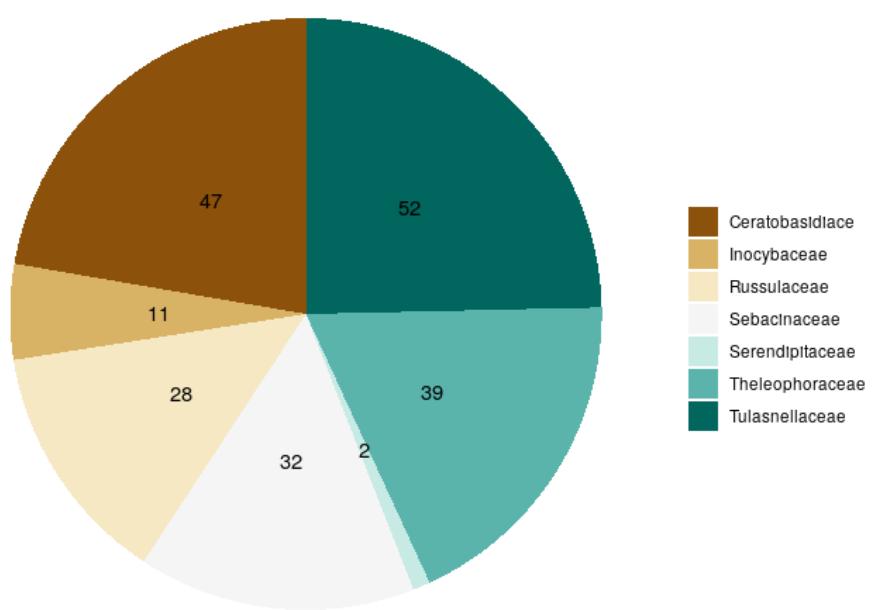


Figure 5.1.: Number of OTUs from each family

which takes into account the covariance matrix and applies an eigen method of spectral decomposition when possible. Only in the case of Russulaceae, when the number of observation was too limited, `prcomp()` was used, which does a single value decomposition on the centered and scaled data matrix.

As of clustering, Non-metric Multi Dimensional Scaling (NMDS) is another widely used method that allows to visualize the level of similarity of individuals in a dataset. In contrast with PCA, it's non-linear and it's based on a distance matrix, computed by different algorithms depending on the data. It works better with non-parametric data, such as the present one. NMDS was performed on all the matrices by using the R package `vegan` (Dixon, 2003), to understand both how do the OTUs from different families cluster together (if they do) and what environmental factors are most relevant; the Euclidean distance method was used.

In both the PCA and the NMDS we have taken into account how each OTUs presence was influenced by environmental factors, such as climate and soil conditions, and how do they cluster together. Species Distribution Models (SDM hereafter) is another conceptual framework we can use to disentangle the assembly processes that lead to the community as we can observe from the data we have, and to infer the relative importance of the environmental factors. SDMs are numerical tools that combine observations of species occurrence or abundance with environmental estimates. They are used to gain ecological and evolutionary insights and to predict distributions across landscapes, sometimes requiring extrapolation in space and time (Elith and Leathwick, 2009); those models can also inform us of how species-to-species associations depend on the environmental context, in a Joint Species Distribution Model which oftentimes outperforms simple SDMs especially with sparse data (Pollock et al., 2014; Tikhonov et al., 2017).

6. Hierarchical Modelling of Species Communities

There are several frameworks to infer patterns of species interactions from environmental data and species co-occurrence patterns (Pollock et al., 2014; Warton et al., 2015). In the present work, JSDM called Hierarchical Model of Species Community (HMSC) (Ovaskainen et al., 2017) was performed by using the `Hmsc` package in R, v. 3.0.9 (Tikhonov et al., 2020; `hmsc-r`, 2021); this method uses a Bayesian framework to find the best fitting model based on the data, and works very well with presence-absence data as well as with environmental data (Hefley and Hooten, 2016).

All JSDM approaches are based on multivariate probit regression for presence-absence datasets and allow partitioning of shared environmental responses among species from residual correlations among species. The Hierarchical Modelling of Species Communities (HMSC) framework is a joint species distribution model that allows a set of covariates to be modelled on multiple response variables (Ovaskainen et al., 2017). This framework is a hierarchical generalized linear mixed model and is structured by both fixed effects and random effects. This approach allowed us to jointly model the occurrences of mycorrhizal OTUs identified in each individual orchid species as a function of environmental covariates (Tikhonov et al., 2017). Hence, we can estimate to what extent co-occurrence or OrM is explained by environmental variables and taxon interactions for which statistically supported co-occurrence remains after accounting for environmental variables and other factors such as habitat and phylogenetic relatedness of taxa.

As the response variable (the matrix Y of HMSC; see (Ovaskainen et al., 2017)), we used the presence-absence of each of the OTUs. As this matrix is sensitive to outliers, to avoid spurious residual correlations due to the presence of rare OTUs, we reduced the original dataset and included 49 OTUs that occur in more than two different populations.

6. Hierarchical Modelling of Species Communities

As the data are presence-absence, we applied probit regression to the presence-absence model. We included as fixed effects (the matrix X of HMSC; see (Ovaskainen et al., 2017); where is the number of species-specific regression parameters to be estimated) soil chemical data extracted from the LUCAS database of the European Soil Data Centre (ESDAC) (Ballabio et al., 2019). HMSC involves a hierarchical structure examining how species responses to environmental covariates depend on phylogenetic relationships. As OrM OTUs were collected across different orchid species which may influence taxon composition, we included orchid species as a random effect in the model. We examined the explanatory and predictive powers of our data through species-specific AUC (area under the curve) (Pearce and Ferrier, 2000) and Tjur's R² (Tjur, 2009) values. Both of these are measures of discrimination, asking how well the occurrence probabilities discriminate sampling units as either occupied or empty. The units of AUC and Tjur R² are different; a model that behaves 'as well as by chance' will yield an AUC of 0.5, whereas for Tjur R² the same baseline is 0. To compute explanatory power, we made model predictions based on all data. We fitted the full HMSC model with the R-package Hmsc (Tikhonov et al., 2020) assuming the default prior distributions (see Chapter 8 of Ovaskainen and Abrego 2020). We fitted the model with 250,000 MCMC iterations comprised of 500 MCMC samples thinned by 500 samples, with the remaining samples thinned by 0.3*samples* thin used as burn-in. We examined MCMC convergence by examining the potential scale reduction factors (Gelman and Rubin, 1992) of the model parameters. We considered a co-occurrence between a pair of OrM OTUs well supported if the posterior probability of the association being positive or negative was at least 0.85. To evaluate environmental drivers of differences between taxa and residual co-occurrences, we estimated how much of the community variation was explained by population as a random effect, and the influence of the fixed effects outlined above using the variance partitioning approach of Ovaskainen et al. (2017). To understand how OMF OTUs respond to environmental variables as a function of their phylogeny, we applied the function 'plotBeta' to generate a heatmap of OTU niches according to each environmental variable separately, with at least a 0.85 posterior support.

Part III.

Results

7. Phylogenetic analysis

The Bayesian analysis yielded low probability branches. Nonetheless, it correctly identified OrM families, with the only notable exception of the Serendipitaceae and Sebacinaceae which were nested separately. Both Sebacinales and the Serendipitaceae were originally considered Sebacinaceae B (Weiss et al., 2004) and were only recently given a new name and properly defined (Weiβ et al., 2016). The Maximum parsimony analysis gave similar results, with bootstrap support as low as two.

8. PCA

The PCA analysis on the presence-absence matrix and the environmental variables combined showed how there is a substantial overlap of realized niche in the OTUs isolated from different orchids, without distinguishable clusters except for the Tulasnellaceae isolated from *Neottia cordata*. In all cases, the variance was well explained by the first two components (over 95% explained variance), with two variables bearing most of the loading: maximum precipitation of the wettest month and potassium content in the soil.

The PCA done using the condensed family matrix yielded the same results, with the

notable exception of the *Limodorum abortivum*, which showed high variance.

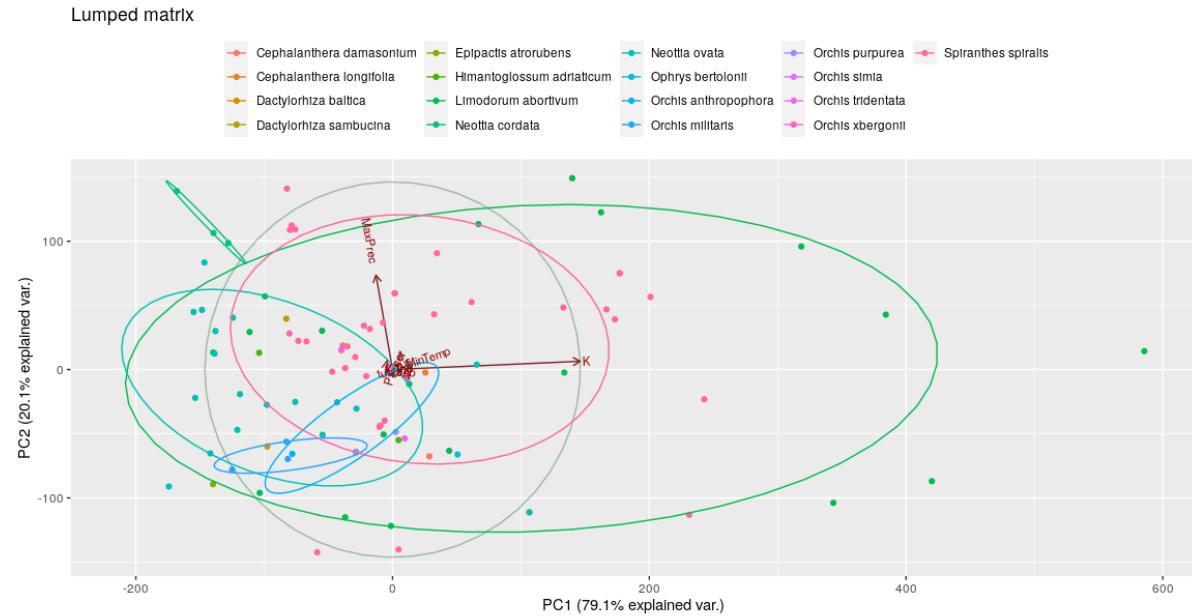


Figure 8.1.: PCA done on the condensed matrix of all seven OTUs families

9. NMDS

The NMDS analysis on the individual OrM families seems to show that there is no differentiation in the OTUs found in different orchid species. Again, Tulasnellaceae seem to

be the exception, with more distinct groups for different orchid hosts; while this could be a bias caused by the higher number of samples, Ceratobasidiaceae and Theleophoraceae did not show this pattern even though the sample amount were roughly similar. This could point to a higher specialization of the Tulasnellaceae group, confirming previous observations (Dearnaley, 2007). The NMDS comparing the families yielded only a partial overlapping clustering, which could indicate that different orchids may have different degrees of specialization and realized niche; *Limodorum abortivum* seemed to exhibit the highest diversity, together with *Spiranthes spiralis*.

Removing orchid species from the NMDS analysis and only looking at how different OrM families clustered based on the environmental conditions showed an unexpected pattern. Russulaceae seemed to have a high variance, which points to a broader realized niche, compared to all other families; Tulasnellaceae, which is the most sampled and abundant OrM in the dataset, had less than half the variance and clustered in an area comparable to Sebacinaceae.

10. Hierarchical modelling of species communities

The calculated Joint species distribution modelling in HMSC had a high AUC (over 0.8), which means it is robust. The AUC (Area Under the Roc Curve) provides an aggregate measure of performance across all possible classification thresholds. One way of interpreting AUC is as the probability that the model ranks a random positive example more highly than a random negative example. The AUC ranges from 0 to 1. A model

10. Hierarchical modelling of species communities

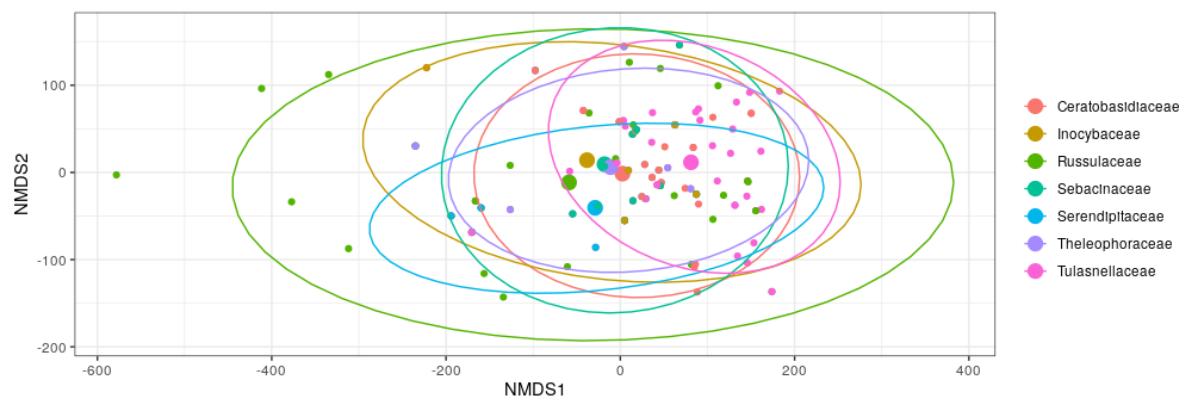


Figure 9.1.: NMDS of the OrMs families considering environmental variables only

10. Hierarchical modelling of species communities

whose predictions are 100% wrong has an AUC of 0.0; one whose predictions are 100% correct has an AUC of 1.0.

In the correlation between the families seemed like most families had a positive correlation, with two exceptions: Tulasnellaceae, who had no correlation (0) and Russulaceae, that had a negative correlation (-1). OTUs from the same families seemed, on the other hand, to have no correlation with the others, positive or negative. This stands true for all families but Ceratobasidiaceae, which had more complex correlations, both positive and negative. Whether this is phylogenetically related is to be understood.

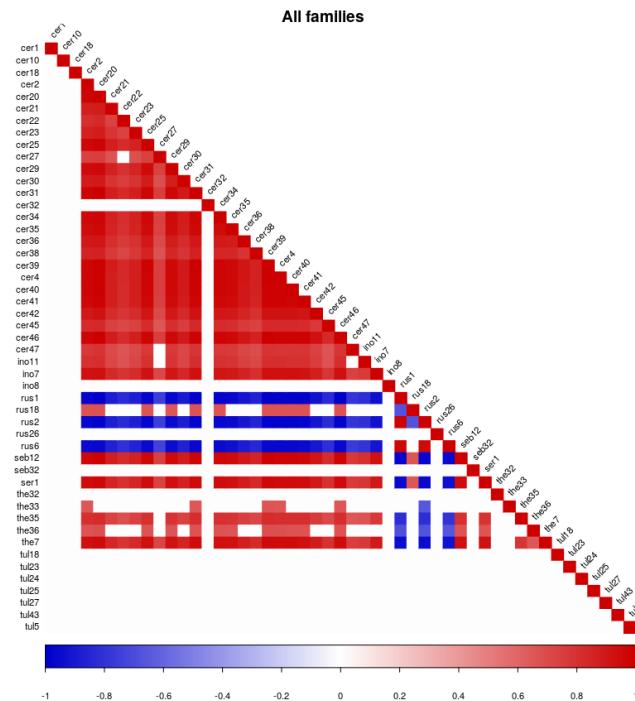


Figure 10.1.: Correlation plot between the OTUs

The second HMSC result is the correlation between the groups and the environmental variables. The difference between the families wasn't very pronounced, and the most relevant parameter seemed the Minimum Temperature, which was highly correlated with most families (only Tulasnellaceae had 0 correlation), confirming the importance of this environmental parameter in understanding the distribution of OrMs. Maximum precipitation was also invertedly correlated with most families, except for Russulaceae which

10. Hierarchical modelling of species communities

showed a positive correlation. Of all the soil parameters, pH seemed the most important with a general inverse correlation (the lower the pH, the higher the presence of the OrM). The differences between OTUS from the same families were less clear-cut, showing different correlations for different OTUs in the same family, giving an idea of the diversity that can happen also at low taxonomic levels. It's worthy of notice that Tulasnellaceae showed again the least amount of internal differences, with Ceratobasidiaceae being at the opposite side of the spectrum.

The last HMSC result is how the variance of the environmental variables is distributed in each OTU. The minimum temperature of the coldest quarter usually has the higher variance

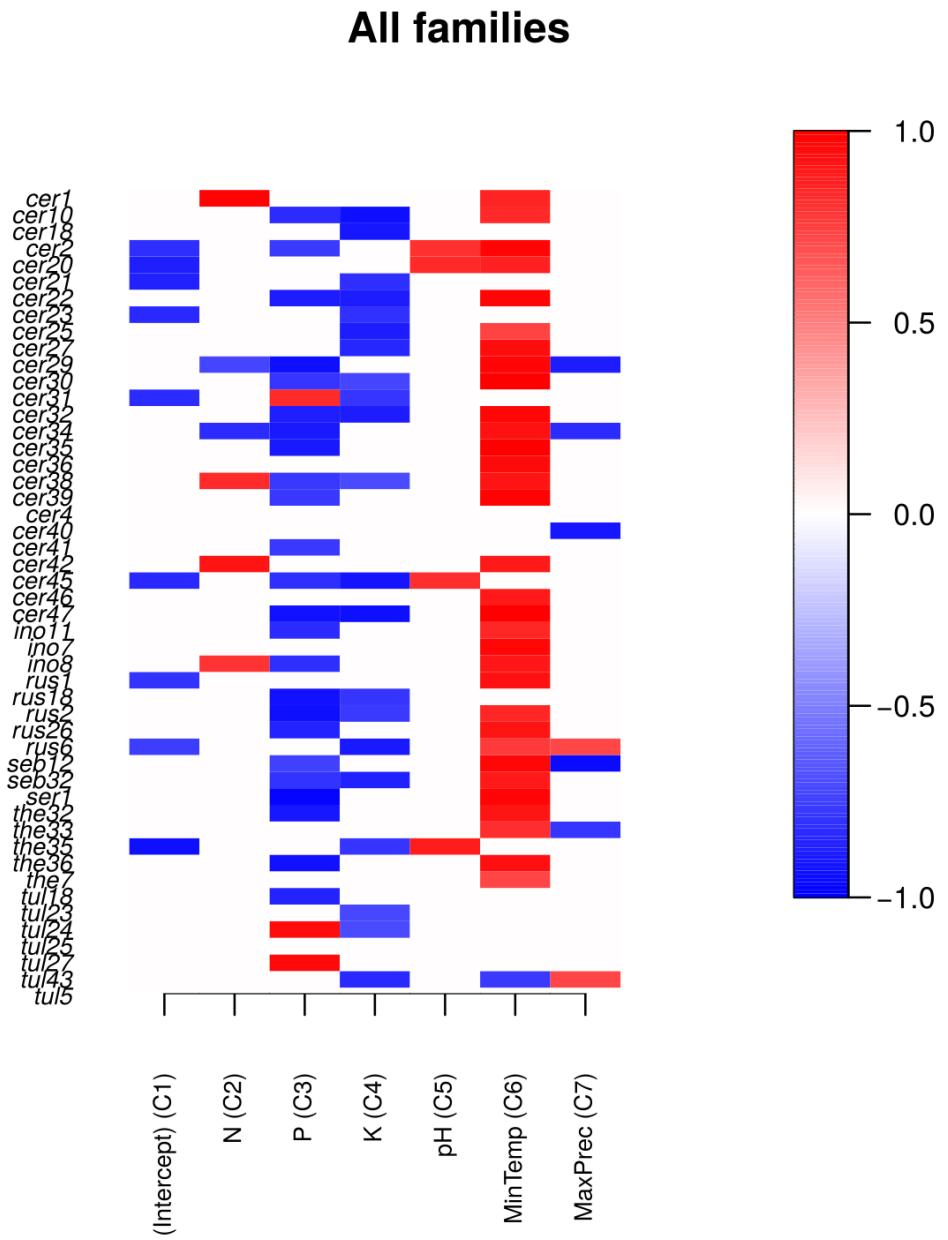


Figure 10.2.: Correlation between environmental variables and OTUs presence

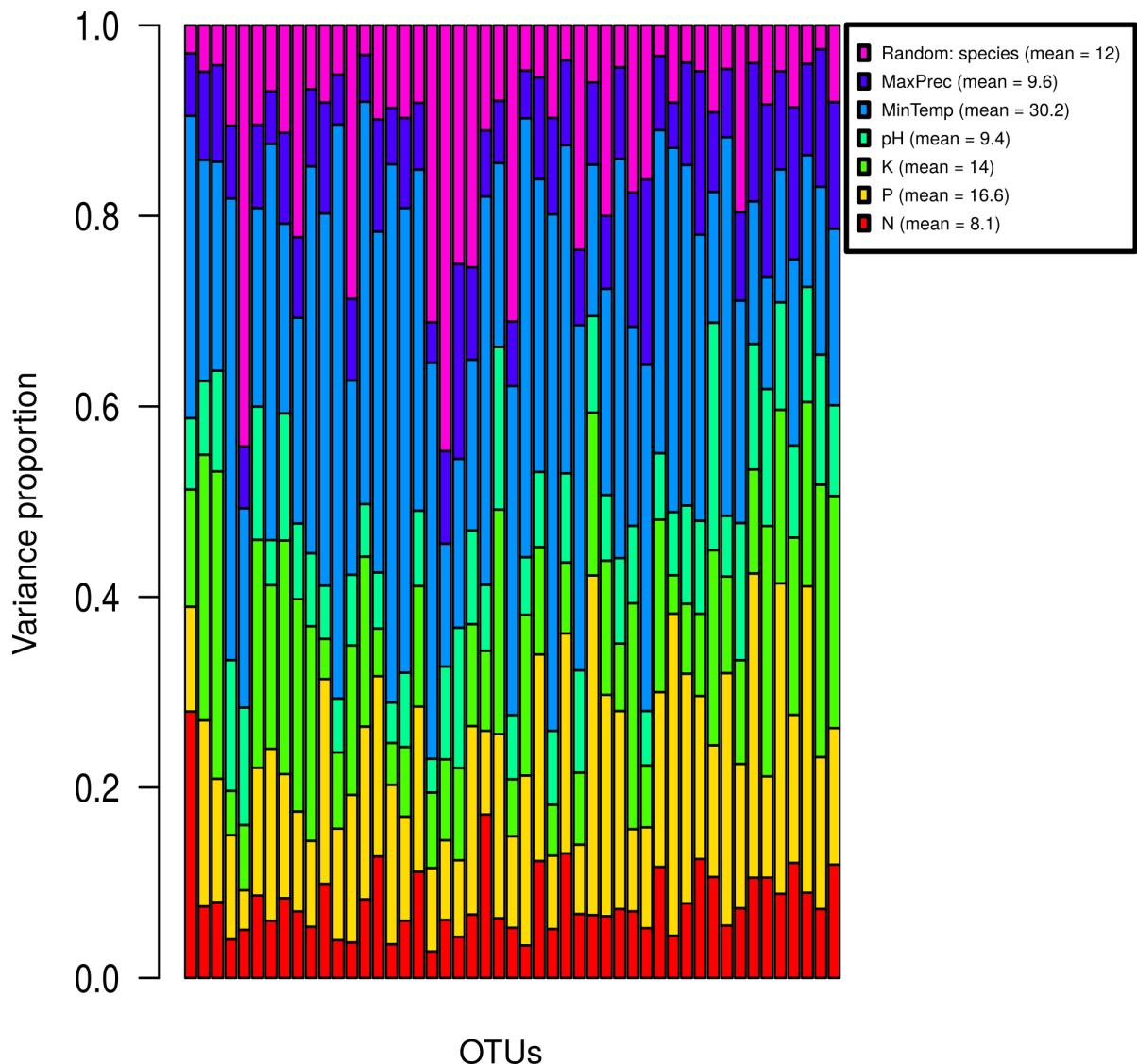


Figure 10.3.: Distribution of the environmental variables variance for each OTU

Part IV.

Discussion

This thesis investigated the distribution and ecological factors of OrM across Europe using a combination of multivariate and joint species distribution modelling techniques. We found that, overall, both PCA and NMDS clustered together the OrM identified from different orchid species. This would support the idea of the OrM generalist approach as being the most common, which is a still ongoing debate (Bailarote et al., 2012).

In the PCA variance was explained by two main variables, soil potassium and maximum precipitation of the wettest quarter, which means that those variables contribute the least to the definition of the niche and that the orchids were living in places highly differentiated in those parameters. This could also be the result of the very broad sampling, and more research should be done on a smaller scale, as the potassium levels can dramatically vary even in a very small plot, doubling in just a few meters (Bogunovic et al., 2014).

From the NMDS Russulaceae seemed to be more tolerant than other families to different environments, and despite the lower number of sampled individuals we witness a higher variance. This could mean that the Russulaceae are more generalist toward orchids, that they have a wider niche, that it's more ecologically flexible, it was sampled in a broader area or all of the above. Russulaceae are a very diverse family, but it is actually difficult to say that Russulaceae find a “niche” in the symbiosis with orchids, especially with Limodorum, as there doesn't seem to be any advantage for the fungus: this orchids seem to have an insufficient photosynthesis and to heavily rely on the OrM to provide not only minerals but also carbon-base chemicals; this also means that distribution of Limodorum may also be potentially constrained by the occurrence of its fungal symbionts (Girlanda et al., 2005).

Inocybaceae have a high variance too, despite having only eleven sampled points; this is in striking contrast with more sampled OrM families, such as Tulasnellaceae and Ceratobasidiaceae, which show the lowest amount of variance, explainable by a more specialist niche, for the families themselves or for the orchids that host them. Serendipitaceae have a very low number of samples (two), but show nonetheless a variance comparable

to the mean of all the families.

The HMSC analysis showed clearly that there are residual correlations between OrM taxa. To my knowledge, this shows for the first time that OrM have ecological interactions beyond what is explained by environmental variables. Members of Ceratobasidiaceae tend to have positive residual correlations among them, that is, when there is an OTU from the Ceratobasidiaceae family there are good chances of finding another one. In some other cases, there is a zero correlation, so they do not influence each other's presence. This is interesting as the most broadly sampled orchid included in this study, *Spiranthes spiralis*, is predominately associated with OTUs of Ceratobasidiaceae. It could be that the positive residual co-occurrence are the result of facilitation between taxa of Ceratobasidiaceae, which may in turn positively affect orchid occurrence at a particular site. Inocybaceae, Sebacinaceae and Theleophoraceae show similar results but less pronounced, either because residual correlation was not as strong (as in the Theleophoraceae) or because the positive correlation trend is not as common.

In contrast with the Ceratobasidiaceae trend, and in accordance with the multivariate analyses, the residual co-occurrence of members of Russulaceae were mostly negatively correlated with the other families. This means that where we find Russulaceae, we are unlikely going to find other OrM, of any family. This is probably the result of the main orchid species where Russulas were found in this dataset, *Limodorum abortivum*, which seems to show a specialization toward this family (Girlanda et al., 2005). A single OTU, identified as *rus18* in the present work, showed a general positive correlation also with other families.

Tulasnellaceae are very consistent and show no residuals correlation at all (zero) either between other OTUs of the same OrM family, or with OTUs of different families.

The correlation between OrM and environmental variables in the HMSC model showed some shared patterns. Most of the OrM were positive correlated with the minimum temperature of the coldest quarter, in all families except Tulasnellaceae, which had a zero correlation (except for a single OTU, *tul5*). Two other trends stand out: the

phosphorus and potassium soil content, which are generally negatively correlated with little exceptions. Nitrogen is often considered a major community changer in the soil fungal communities, (Lilleskov et al., 2002) both because of the nitrogen itself and because it's considered a proxy to infer human impact, especially for agricultural reason. The model, however, show little correlation between the OrM and the soil nitrogen content, which could be explained as evidence of the little impact of nitrogen on the communities or as evidence of communities already changed in their composition by the nutrients content by selection, so that the resulting OrM are not as impacted. The pH level was of little relevance, and so was the maximum precipitation, the reason for which should be subject of future studies, but it could be the effect of the limited sample size.

The last useful output of the HMSC model was the variance partitioning for each OTUs of all the environmental values. It shows how for some variables there is a relevant difference between the OTUs, especially for the random effect (which was associated with the host orchid). Soil nitrogen and the maximum precipitation variable seem to vary the least, which is in line with the correlation plot: they are not good predictors of the kind of OrM that we could find in a place. Potassium and phosphorus have a higher relative variance. This variables could therefore be considered the most useful in understanding the distribution of OrM, and may be a good starting point for further niche modelling.

The phylogenetic analysis didn't give significative results. This was likely due to the different methods used to obtain the sequences, as the different primers allowed to polymerize different DNA areas, with only a partial overlap; this, coupled with the different trimming of the sequences done by the authors can explain the poor quality matrix that was so obtained. This piece of data would be crucial in properly understanding and framing the ecological evidence.

So, do similar OrM taxa occur in similar habitats and have similar environmental preferences? Some taxa do, and in the same family we've seen shared correlations for

environmental variables from the HMSC, while the NMDS analysis shows a narrow ecological niche with shared correlation to environmental variables in some families, e.g. Tulasnellaceae, Ceratobasidiaceae, Theleophoraceae, and a broader niche in others, in particular Russulaceae and Inocybaceae. This seems to be irrespective of the sample size.

The correlation between the OTUs presence is quite robust, so there may be facilitation or competition processes happening between the OrM. Further studies are required to understand what the nature of these processes are, how much the OrM themselves are responsible for it and what is the importance of the orchid host in the process.

Part V.

Conclusions

In this thesis I compiled and analysed an extensive database of mycorrhizal fungi that associate with European orchids. These results show that fungi are generally associated with individual orchid species, but that members of each OrM family often occur in a broad range of ecological conditions. Competitive and facilitative interactions may be common within OrM, and this study provides a platform for future experimental work. The usage of probabilistic models in this thesis was a useful instrument to untangle the correlation between the OTUs and the environmental variables, and I have little doubt that in the future more work will be done using these tools.

These kind of studies are of crucial importance for the understanding and protection of species we may not even know yet. Improving the ecosystem is not something we can successfully do without knowing the key elements that allow them to function, and fungi surely are part of this category. These studies are heavily reliant on data, which must be accurate and abundant. Presently there is limited properly georeferenced studies that allow the pinpointing of genetic sequences to places, resulting in gappy databases and in a difficulty reproducing the analysis. Furthermore, gathering the data the way I've done is mostly a manual process, with huge cost in terms of time and resources. More transparent analysis with an accessible, standardize and rich metadata structure are of the uttermost importance for a significant progress of knowledge in the understanding of ecology and distribution of OrM (Powers and Hampton, 2019), and for scientific studies in general.

The understanding of OrM ecology will always be incomplete without a better knowledge of the phylogenetic relationship between the organisms. Patterns may emerge and we can analyse them, but we are flying blind when we try to infer those patterns to a broader context.

Part VI.

Appendices

11. Additional resources and information

All of the datasets, scripts and resources to reproduce the analysis are available at
<https://github.com/arteteco/FunModels>

Unless differently specified, the present work copyright is held by Manuel Moscariello and is released under the Creative Commons Attribution 4.0 International License. To view a copy of this license, visit <http://creativecommons.org/licenses/by/4.0/> or send a letter to Creative Commons, PO Box 1866, Mountain View, CA 94042, USA.

12. Phylogenetic trees

12. Phylogenetic trees

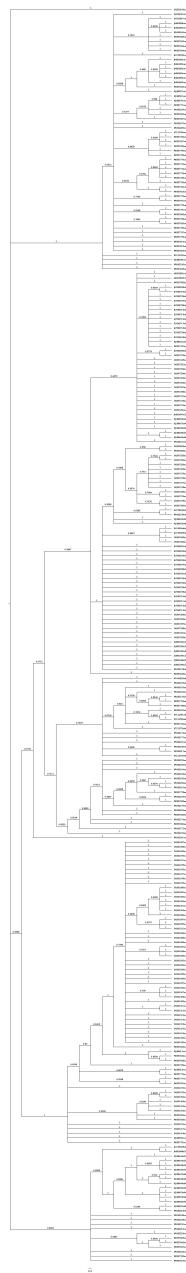


Figure 12.1.: Bayesian analysis tree

12. Phylogenetic trees

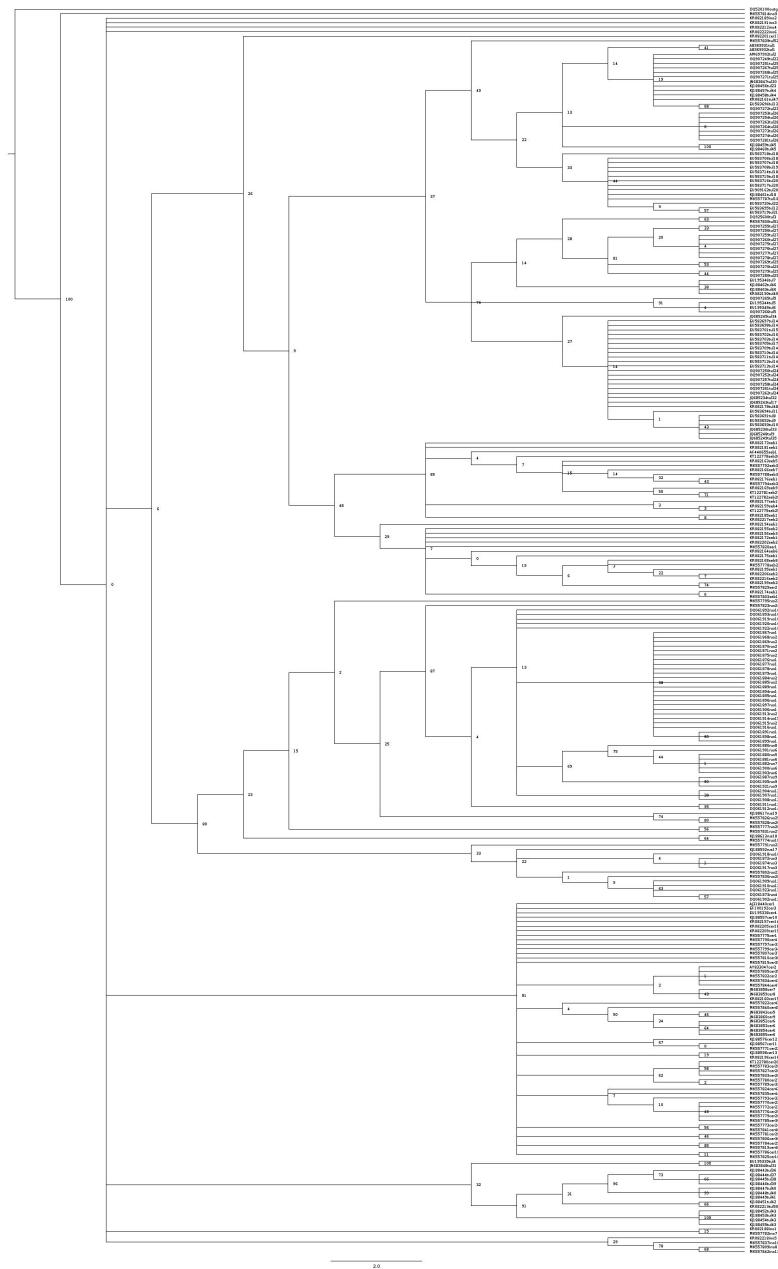


Figure 12.2.: Maximum Parsimony tree. Node labels are the bootstrap values

Bibliography

- Appendices — CITES. <https://cites.org/eng/app/appendices.php>.
- TNT, a free program for phylogenetic analysis - Goloboff - 2008 - Cladistics - Wiley Online Library. <https://onlinelibrary.wiley.com/doi/full/10.1111/j.1096-0031.2008.00217.x>.
- I. M. V. Aarle, P. A. Olsson, and B. Söderström. Arbuscular mycorrhizal fungi respond to the substrate pH of their extraradical mycelium by altered growth and root colonization. *New Phytologist*, 155(1):173–182, 2002. ISSN 1469-8137. doi: 10.1046/j.1469-8137.2002.00439.x.
- J. Baar, T. Bastiaans, M. van de Coevering, and J. Roelofs. Ectomycorrhizal root development in wet Alder carr forests in response to desiccation and eutrophication. *Mycorrhiza*, 12(3):147–151, 2002.
- B. C. Bailarote, B. Lievens, and H. Jacquemyn. Does mycorrhizal specificity affect orchid decline and rarity? *American Journal of Botany*, 99(10):1655–1665, 2012. ISSN 1537-2197. doi: 10.3732/ajb.1200117.
- C. Ballabio, E. Lugato, O. Fernández-Ugalde, A. Orgiazzi, A. Jones, P. Borrelli, L. Montanarella, and P. Panagos. Mapping LUCAS topsoil chemical properties at European scale using Gaussian process regression. *Geoderma*, 355:113912, Dec. 2019. ISSN 0016-7061. doi: 10.1016/j.geoderma.2019.113912.
- J. Barman, A. Samanta, B. Saha, and S. Datta. Mycorrhiza. *Resonance*, 21(12):1093–1104, Dec. 2016. ISSN 0973-712X. doi: 10.1007/s12045-016-0421-6.
- M. L. Berbee and J. W. Taylor. Dating the evolutionary radiations of the true fungi. <https://cdnsciencepub.com/doi/abs/10.1139/b93-131>, 1993.

BIBLIOGRAPHY

- N. Bernard. Sur la germination du *Neottia nidus-avis*. *Comptes Rendus Hebdomadaires Des Séances de l'Académie Des Sciences, Paris*, 128:1253–1255, 1899.
- M. Blackwell. Terrestrial Life—Fungal from the Start? *Science*, 289(5486):1884–1885, Sept. 2000. ISSN 0036-8075, 1095-9203. doi: 10.1126/science.289.5486.1884.
- I. Bogunovic, M. Mesic, Z. Zgorelec, A. Jurisic, and D. Bilandzija. Spatial variation of soil nutrients on sandy-loam soil. *Soil and Tillage Research*, 144:174–183, Dec. 2014. ISSN 0167-1987. doi: 10.1016/j.still.2014.07.020.
- P. Bonfante and A. Genre. Plants and arbuscular mycorrhizal fungi: An evolutionary-developmental perspective. *Trends in Plant Science*, 13(9):492–498, Sept. 2008. ISSN 1360-1385. doi: 10.1016/j.tplants.2008.07.001.
- S. Bonneville, F. Delpomdor, A. Préat, C. Chevalier, T. Araki, M. Kazemian, A. Steele, A. Schreiber, R. Wirth, and L. G. Benning. Molecular identification of fungi micro-fossils in a Neoproterozoic shale rock. *Science Advances*, 6(4):eaax7599, Jan. 2020. ISSN 2375-2548. doi: 10.1126/sciadv.aax7599.
- M. C. Brundrett. Coevolution of roots and mycorrhizas of land plants. *New Phytologist*, 154(2):275–304, 2002. ISSN 1469-8137. doi: 10.1046/j.1469-8137.2002.00397.x.
- J. W. G. Cairney. Evolution of mycorrhiza systems. *Naturwissenschaften*, 87(11):467–475, 2000.
- D. D. Cameron, I. Johnson, D. J. Read, and J. R. Leake. Giving and receiving: Measuring the carbon cost of mycorrhizas in the green orchid, *Goodyera repens*. *New Phytologist*, 180(1):176–184, 2008. ISSN 1469-8137. doi: 10.1111/j.1469-8137.2008.02533.x.
- S. R. Carrino-Kyker, L. A. Kluber, S. M. Petersen, K. P. Coyle, C. R. Hewins, J. L. DeForest, K. A. Smemo, and D. J. Burke. Mycorrhizal fungal communities respond to experimental elevation of soil pH and P availability in temperate hardwood forests. *FEMS Microbiology Ecology*, 92(fiw024), Mar. 2016. ISSN 0168-6496. doi: 10.1093/femsec/fiw024.

BIBLIOGRAPHY

- T. Cavalier-Smith. The origin of fungi and pseudofungi. In *Evolutionary Biology of the FUngi, British Mycological Society Symposium*, volume 12, pages 339–353. Cambridge Univ. Press, 1987.
- M. J. M. Christenhusz and J. W. Byng. The number of known plants species in the world and its annual increase. *Phytotaxa*, 261(3):201–217, May 2016. ISSN 1179-3163. doi: 10.11646/phytotaxa.261.3.1.
- H. F. Copeland. The Kingdoms of Organisms. *The Quarterly Review of Biology*, 13(4): 383–420, Dec. 1938. ISSN 0033-5770. doi: 10.1086/394568.
- H. F. Copeland. The classification of lower organisms. *The classification of lower organisms.*, 1956.
- J. D. W. Dearnaley. Further advances in orchid mycorrhizal research. *Mycorrhiza*, 17 (6):475–486, Sept. 2007. ISSN 1432-1890. doi: 10.1007/s00572-007-0138-1.
- J. D. W. Dearnaley, F. Martos, and M.-A. Selosse. 12 Orchid Mycorrhizas: Molecular Ecology, Physiology, Evolution and Conservation Aspects. In B. Hock, editor, *Fungal Associations*, pages 207–230. Springer Berlin Heidelberg, Berlin, Heidelberg, 2012. ISBN 978-3-642-30825-3 978-3-642-30826-0. doi: 10.1007/978-3-642-30826-0_12.
- P. Dixon. VEGAN, a package of R functions for community ecology. *Journal of Vegetation Science*, 14(6):927–930, 2003. ISSN 1654-1103. doi: 10.1111/j.1654-1103.2003.tb02228.x.
- K. J. Duffy, M. Waud, B. Schatz, T. Petanidou, and H. Jacquemyn. Latitudinal variation in mycorrhizal diversity associated with a European orchid. *Journal of Biogeography*, 46(5):968–980, 2019. ISSN 1365-2699. doi: 10.1111/jbi.13548.
- R. C. Edgar. MUSCLE: Multiple sequence alignment with high accuracy and high throughput. *Nucleic acids research*, 32(5):1792–1797, 2004.
- J. Elith and J. R. Leathwick. Species Distribution Models: Ecological Explanation and Prediction Across Space and Time. *Annual Review of Ecology, Evolution,*

BIBLIOGRAPHY

- and *Systematics*, 40(1):677–697, Feb. 2009. ISSN 1543-592X. doi: 10.1146/annurev.ecolsys.110308.120159.
- M. F. Fay. Orchid conservation: How can we meet the challenges in the twenty-first century? *Botanical Studies*, 59(1):16, June 2018. ISSN 1999-3110. doi: 10.1186/s40529-018-0232-z.
- S. W. Gale, G. A. Fischer, P. J. Cribb, and M. F. Fay. Orchid conservation: Bridging the gap between science and practice. *Botanical Journal of the Linnean Society*, 186(4):425–434, Mar. 2018. ISSN 0024-4074. doi: 10.1093/botlinnean/boy003.
- A. Gargas, P. T. DePriest, M. Grube, and A. Tehler. Multiple origins of lichen symbioses in fungi suggested by SSU rDNA phylogeny. *Science*, 268(5216):1492–1495, June 1995. ISSN 0036-8075, 1095-9203. doi: 10.1126/science.7770775.
- G. Gebauer and M. Meyer. 15N and 13C natural abundance of autotrophic and myco-heterotrophic orchids provides insight into nitrogen and carbon gain from fungal association. *New Phytologist*, 160(1):209–223, 2003. ISSN 1469-8137. doi: 10.1046/j.1469-8137.2003.00872.x.
- A. Gelman and D. B. Rubin. Inference from Iterative Simulation Using Multiple Sequences. *Statistical Science*, 7(4):457–472, Nov. 1992. ISSN 0883-4237, 2168-8745. doi: 10.1214/ss/1177011136.
- M. Girlanda, M. A. Selosse, D. Cafasso, F. Brilli, S. Delfine, R. Fabbian, S. Ghignone, P. Pinelli, R. Segreto, F. Loreto, S. Cozzolino, and S. Perotto. Inefficient photosynthesis in the Mediterranean orchid *Limodorum abortivum* is mirrored by specific association to ectomycorrhizal Russulaceae: MYCORRHIZAL SPECIFICITY IN LIMODORUM. *Molecular Ecology*, 15(2):491–504, Dec. 2005. ISSN 09621083. doi: 10.1111/j.1365-294X.2005.02770.x.
- M. Girlanda, R. Segreto, D. Cafasso, H. T. Liebel, M. Rodda, E. Ercole, S. Cozzolino, G. Gebauer, and S. Perotto. Photosynthetic Mediterranean meadow orchids feature

BIBLIOGRAPHY

- partial mycoheterotrophy and specific mycorrhizal associations. *American Journal of Botany*, 98(7):1148–1163, 2011. ISSN 1537-2197. doi: 10.3732/ajb.1000486.
- T. J. Givnish, D. Spalink, M. Ames, S. P. Lyon, S. J. Hunter, A. Zuluaga, A. Doucette, G. G. Caro, J. McDaniel, M. A. Clements, M. T. K. Arroyo, L. Endara, R. Kriebel, N. H. Williams, and K. M. Cameron. Orchid historical biogeography, diversification, Antarctica and the paradox of orchid dispersal. *Journal of Biogeography*, 43(10):1905–1916, 2016. ISSN 1365-2699. doi: 10.1111/jbi.12854.
- C. Grant, S. Bittman, M. Montreal, C. Plenchette, and C. Morel. Soil and fertilizer phosphorus: Effects on plant P supply and mycorrhizal development. *Canadian Journal of Plant Science*, Mar. 2011. doi: 10.4141/P03-182.
- Hans Jacquemyn, Michael Waud, Vincent S. F. T. Merckx, Bart Lievens, and Rein Brys. Mycorrhizal diversity, seed germination and long-term changes in population size across nine populations of the terrestrial orchid *Neottia ovata*. *Molecular Ecology*, 24(13):3269–3280, 2015. ISSN 1365-294X. doi: 10.1111/mec.13236.
- J. L. Harley and E. L. Harley. A Check-List of Mycorrhiza in the British Flora. *The New Phytologist*, 105(2):1–102, 1987. ISSN 0028-646X.
- D. S. Heckman, D. M. Geiser, B. R. Eidell, R. L. Stauffer, N. L. Kardos, and S. B. Hedges. Molecular Evidence for the Early Colonization of Land by Fungi and Plants. *Science*, 293(5532):1129–1133, Aug. 2001. ISSN 0036-8075, 1095-9203. doi: 10.1126/science.1061457.
- T. J. Hefley and M. B. Hooten. Hierarchical Species Distribution Models. *Current Landscape Ecology Reports*, 1(2):87–97, June 2016. ISSN 2364-494X. doi: 10.1007/s40823-016-0008-7.
- R. J. Hijmans, S. E. Cameron, J. L. Parra, P. G. Jones, and A. Jarvis. Very high resolution interpolated climate surfaces for global land areas. *International Journal of Climatology*, 25(15):1965–1978, 2005. ISSN 1097-0088. doi: 10.1002/joc.1276.
- hmsc-r. Hmsc-r/HMSC, Jan. 2021.

BIBLIOGRAPHY

- R. Honegger, D. Edwards, and L. Axe. The earliest records of internally stratified cyanobacterial and algal lichens from the Lower Devonian of the Welsh Borderland. *New Phytologist*, 197(1):264–275, 2013. ISSN 1469-8137. doi: 10.1111/nph.12009.
- J. P. Huelsenbeck and F. Ronquist. MRBAYES: Bayesian inference of phylogenetic trees. *Bioinformatics*, 17(8):754–755, 2001.
- H. Jacquemyn, R. Brys, M. Hermy, and J. H. Willems. Does nectar reward affect rarity and extinction probabilities of orchid species? An assessment using historical records from Belgium and the Netherlands. *Biological Conservation*, 121(2):257–263, Jan. 2005. ISSN 0006-3207. doi: 10.1016/j.biocon.2004.05.002.
- H. Jacquemyn, K. J. Duffy, and M.-A. Selosse. Biogeography of Orchid Mycorrhizas. In L. Tedersoo, editor, *Biogeography of Mycorrhizal Symbiosis*, Ecological Studies, pages 159–177. Springer International Publishing, Cham, 2017. ISBN 978-3-319-56363-3. doi: 10.1007/978-3-319-56363-3-8.
- T. Y. James, F. Kauff, C. L. Schoch, P. B. Matheny, V. Hofstetter, C. J. Cox, G. Celio, C. Gueidan, E. Fraker, J. Miadlikowska, H. T. Lumbsch, A. Rauhut, V. Reeb, A. E. Arnold, A. Amtoft, J. E. Stajich, K. Hosaka, G.-H. Sung, D. Johnson, B. O'Rourke, M. Crockett, M. Binder, J. M. Curtis, J. C. Slot, Z. Wang, A. W. Wilson, A. Schüßler, J. E. Longcore, K. O'Donnell, S. Mozley-Standridge, D. Porter, P. M. Letcher, M. J. Powell, J. W. Taylor, M. M. White, G. W. Griffith, D. R. Davies, R. A. Humber, J. B. Morton, J. Sugiyama, A. Y. Rossman, J. D. Rogers, D. H. Pfister, D. Hewitt, K. Hansen, S. Hambleton, R. A. Shoemaker, J. Kohlmeyer, B. Volkmann-Kohlmeyer, R. A. Spotts, M. Serdani, P. W. Crous, K. W. Hughes, K. Matsuura, E. Langer, G. Langer, W. A. Untereiner, R. Lücking, B. Büdel, D. M. Geiser, A. Aptroot, P. Diederich, I. Schmitt, M. Schultz, R. Yahr, D. S. Hibbett, F. Lutzoni, D. J. McLaughlin, J. W. Spatafora, and R. Vilgalys. Reconstructing the early evolution of Fungi using a six-gene phylogeny. *Nature*, 443(7113):818–822, Oct. 2006a. ISSN 1476-4687. doi: 10.1038/nature05110.
- T. Y. James, P. M. Letcher, J. E. Longcore, S. E. Mozley-Standridge, D. Porter, M. J.

BIBLIOGRAPHY

- Powell, G. W. Griffith, and R. Vilgalys. A molecular phylogeny of the flagellated fungi (Chytridiomycota) and description of a new phylum (Blastocladiomycota). *Mycologia*, 98(6):860–871, Nov. 2006b. ISSN 0027-5514. doi: 10.1080/15572536.2006.11832616.
- N. C. Johnson, J.-H. Graham, and F. A. Smith. Functioning of mycorrhizal associations along the mutualism–parasitism continuum*. *New Phytologist*, 135(4):575–585, 1997. ISSN 1469-8137. doi: 10.1046/j.1469-8137.1997.00729.x.
- T. Julou, B. Burghardt, G. Gebauer, D. Berveiller, C. Damesin, and M.-A. Selosse. Mixotrophy in orchids: Insights from a comparative study of green individuals and nonphotosynthetic individuals of *Cephalanthera damasonium*. *New Phytologist*, 166 (2):639–653, 2005. ISSN 1469-8137. doi: 10.1111/j.1469-8137.2005.01364.x.
- T. Kull and M. J. Hutchings. A comparative analysis of decline in the distribution ranges of orchid species in Estonia and the United Kingdom. *Biological Conservation*, 129 (1):31–39, Apr. 2006. ISSN 0006-3207. doi: 10.1016/j.biocon.2005.09.046.
- T. Kull, U. Selgis, M. V. Peciña, M. Metsare, A. Ilves, K. Tali, K. Sepp, K. Kull, and R. P. Shefferson. Factors influencing IUCN threat levels to orchids across Europe on the basis of national red lists. *Ecology and Evolution*, 6(17):6245–6265, 2016. ISSN 2045-7758. doi: 10.1002/ece3.2363.
- J. Leake, D. Johnson, D. Donnelly, G. Muckle, L. Boddy, and D. Read. Networks of power and influence: The role of mycorrhizal mycelium in controlling plant communities and agroecosystem functioning. *Canadian Journal of Botany*, Feb. 2011. doi: 10.1139/b04-060.
- J. R. Leake. The biology of myco-heterotrophic ('saprophytic') plants. *New Phytologist*, 127(2):171–216, 1994. ISSN 1469-8137. doi: 10.1111/j.1469-8137.1994.tb04272.x.
- T. Lepage, D. Bryant, H. Philippe, and N. Lartillot. A General Comparison of Relaxed Molecular Clock Models. *Molecular Biology and Evolution*, 24(12):2669–2680, Dec. 2007. ISSN 0737-4038. doi: 10.1093/molbev/msm193.
- W. Li, L. Jaroszewski, and A. Godzik. Clustering of highly homologous sequences to

BIBLIOGRAPHY

- reduce the size of large protein databases. *Bioinformatics (Oxford, England)*, 17(3): 282–283, Mar. 2001. ISSN 1367-4803. doi: 10.1093/bioinformatics/17.3.282.
- B. Lievens, S. van Kerckhove, A. Justé, B. P. Cammue, O. Honnay, and H. Jacquemyn. From extensive clone libraries to comprehensive DNA arrays for the efficient and simultaneous detection and identification of orchid mycorrhizal fungi. *Journal of Microbiological Methods*, 80(1):76–85, Jan. 2010. ISSN 01677012. doi: 10.1016/j.mimet.2009.11.004.
- E. A. Lilleskov, T. J. Fahey, T. R. Horton, and G. M. Lovett. Belowground Ectomycorrhizal Fungal Community Change Over a Nitrogen Deposition Gradient in Alaska. *Ecology*, 83(1):104–115, 2002. ISSN 1939-9170. doi: 10.1890/0012-9658(2002)083[0104:BEFCCO]2.0.CO;2.
- C. C. Loron, C. François, R. H. Rainbird, E. C. Turner, S. Borensztajn, and E. J. Javaux. Early fungi from the Proterozoic era in Arctic Canada. *Nature*, 570(7760):232–235, June 2019. ISSN 1476-4687. doi: 10.1038/s41586-019-1217-0.
- R. Lücking, S. Huhndorf, D. H. Pfister, E. R. Plata, and H. T. Lumbsch. Fungi evolved right on track. *Mycologia*, 101(6):810–822, Nov. 2009. ISSN 0027-5514. doi: 10.3852/09-016.
- D. W. Malloch, K. A. Pirozynski, and P. H. Raven. Ecological and evolutionary significance of mycorrhizal symbioses in vascular plants (A Review). *Proceedings of the National Academy of Sciences*, 77(4):2113–2118, Apr. 1980. ISSN 0027-8424, 1091-6490. doi: 10.1073/pnas.77.4.2113.
- M. K. McCormick, D. F. Whigham, and J. O'Neill. Mycorrhizal diversity in photosynthetic terrestrial orchids. *New Phytologist*, 163(2):425–438, 2004. ISSN 1469-8137. doi: 10.1111/j.1469-8137.2004.01114.x.
- V. S. Merckx. Mycoheterotrophy: An introduction. In *Mycoheterotrophy*, pages 1–17. Springer, 2013.

BIBLIOGRAPHY

- L. Meschinelli. *Fungorum Fossilium Omnium: Hucusque Cognitorum Iconographia.* Sumptibus auctoris, typis Aloysii Fabris, 1898.
- F. Oberwinkler, D. Cruz, and J. P. Suárez. Biogeography and Ecology of Tulasnelaceae. In L. Tedersoo, editor, *Biogeography of Mycorrhizal Symbiosis*, Ecological Studies, pages 237–271. Springer International Publishing, Cham, 2017. ISBN 978-3-319-56363-3. doi: 10.1007/978-3-319-56363-3_12.
- K. Okonechnikov, O. Golosova, M. Fursov, and the UGENE team. Unipro UGENE: A unified bioinformatics toolkit. *Bioinformatics*, 28(8):1166–1167, Apr. 2012. ISSN 1367-4803. doi: 10.1093/bioinformatics/bts091.
- N. Ouanphanivanh. Could orchids indicate truffle habitats? : Mycorrhizal association between orchids and truffles. *Acta Biologica Szegediensis*, 52(1):229–232, Jan. 2008. ISSN 1588-4082.
- O. Ovaskainen, G. Tikhonov, A. Norberg, F. G. Blanchet, L. Duan, D. Dunson, T. Roslin, and N. Abrego. How to make more out of community data? A conceptual framework and its implementation as models and software. *Ecology Letters*, 20(5):561–576, 2017. ISSN 1461-0248. doi: 10.1111/ele.12757.
- P. Panagos, M. Van Liedekerke, A. Jones, and L. Montanarella. European Soil Data Centre: Response to European policy support and public data requirements. *Land Use Policy*, 29(2):329–338, Apr. 2012. ISSN 0264-8377. doi: 10.1016/j.landusepol.2011.07.003.
- J. Pearce and S. Ferrier. Evaluating the predictive performance of habitat models developed using logistic regression. *Ecological Modelling*, 133(3):225–245, Sept. 2000. ISSN 0304-3800. doi: 10.1016/S0304-3800(00)00322-7.
- L. Pecoraro, M. Girlanda, T. Kull, C. Perini, and S. Perotto. Analysis of fungal diversity in Orchis tridentata Scopoli. *Central European Journal of Biology*, 7(5):850–857, Oct. 2012. ISSN 1644-3632. doi: 10.2478/s11535-012-0071-y.
- L. Pecoraro, M. Girlanda, T. Kull, C. Perini, and S. Perotto. Fungi from the roots of

BIBLIOGRAPHY

- the terrestrial photosynthetic orchid *Himantoglossum adriaticum*. *Plant Ecology and Evolution*, 146(2):145–152, July 2013. doi: 10.5091/plecevo.2013.782.
- L. Pecoraro, M. Girlanda, Z.-J. Liu, L. Huang, and S. Perotto. Molecular analysis of fungi associated with the Mediterranean orchid *Ophrys bertolonii* Mor. *Annals of Microbiology*, 65(4):2001–2007, Dec. 2015. ISSN 1869-2044. doi: 10.1007/s13213-015-1038-9.
- L. Pecoraro, L. Huang, T. Caruso, S. Perotto, M. Girlanda, L. Cai, and Z.-J. Liu. Fungal diversity and specificity in *Cephalanthera damasonium* and *C. longifolia* (Orchidaceae) mycorrhizas. *Journal of Systematics and Evolution*, 55(2):158–169, 2017. ISSN 1759-6831. doi: 10.1111/jse.12238.
- K. A. Pirozynski and D. W. Malloch. The origin of land plants: A matter of mycotrophism. *Biosystems*, 6(3):153–164, Mar. 1975. ISSN 0303-2647. doi: 10.1016/0303-2647(75)90023-4.
- L. J. Pollock, R. Tingley, W. K. Morris, N. Golding, R. B. O'Hara, K. M. Parris, P. A. Vesk, and M. A. McCarthy. Understanding co-occurrence by modelling species simultaneously with a Joint Species Distribution Model (JSDM). *Methods in Ecology and Evolution*, 5(5):397–406, 2014. ISSN 2041-210X. doi: 10.1111/2041-210X.12180.
- S. M. Powers and S. E. Hampton. Open science, reproducibility, and transparency in ecology. *Ecological Applications*, 29(1):e01822, 2019. ISSN 1939-5582. doi: 10.1002/eap.1822.
- S. R. Ramírez, B. Gravendeel, R. B. Singer, C. R. Marshall, and N. E. Pierce. Dating the origin of the Orchidaceae from a fossil orchid with its pollinator. *Nature*, 448 (7157):1042–1045, Aug. 2007. ISSN 1476-4687. doi: 10.1038/nature06039.
- H. N. Rasmussen. *Terrestrial Orchids: From Seed to Mycotrophic Plant*. Cambridge University Press, Aug. 1995. ISBN 978-0-521-45165-9.
- H. N. Rasmussen. Recent developments in the study of orchid mycorrhiza. *Plant and Soil*, 244(1/2):149–163, 2002. ISSN 0032-079X.

BIBLIOGRAPHY

- H. N. RASMUSSEN and D. F. WHIGHAM. The underground phase: A special challenge in studies of terrestrial orchid populations. *Botanical Journal of the Linnean Society*, 126(1-2):49–64, Jan. 1998. ISSN 0024-4074. doi: 10.1111/j.1095-8339.1998.tb02515.x.
- M. C. Rayner. Mycorrhiza. An account of non-pathogenic infection by fungi in vascular plants and Bryophytes. *Mycorrhiza. An account of non-pathogenic infection by fungi in vascular plants and Bryophytes.*, (No. 15), 1927.
- D. Redecker, R. Kodner, and L. E. Graham. Glomalean Fungi from the Ordovician. *Science*, 289(5486):1920–1921, Sept. 2000. ISSN 0036-8075, 1095-9203. doi: 10.1126/science.289.5486.1920.
- B. Renault. *Bassin Houiller et Permien d'Autun et d'Épinac: Flore Fossile, 2. Partie. Fascicule 4*, volume 4. Imprimerie nationale, 1896.
- M. C. Rillig, K. K. Treseder, and M. F. Allen. Global Change and Mycorrhizal Fungi. In M. G. A. van der Heijden and I. R. Sanders, editors, *Mycorrhizal Ecology*, Ecological Studies, pages 135–160. Springer, Berlin, Heidelberg, 2003. ISBN 978-3-540-38364-2. doi: 10.1007/978-3-540-38364-2_6.
- M. Roy, T. Yagame, M. Yamato, K. Iwase, C. Heinz, A. Faccio, P. Bonfante, and M.-A. Selosse. Ectomycorrhizal Inocybe species associate with the mycoheterotrophic orchid Epipogium aphyllum but not its asexual propagules. *Annals of Botany*, 104 (3):595–610, Aug. 2009. ISSN 0305-7364. doi: 10.1093/aob/mcn269.
- B. Schatz, A. Geoffroy, B. Dainat, J.-M. Bessière, B. Buatois, M. Hossaert-McKey, and M.-A. Selosse. A case study of modified interactions with symbionts in a hybrid mediterranean orchid. *American Journal of Botany*, 97(8):1278–1288, 2010. ISSN 1537-2197. doi: 10.3732/ajb.0900303.
- M.-A. Selosse and F. Le Tacon. The land flora: A phototroph-fungus partnership? *Trends in Ecology & Evolution*, 13(1):15–20, Jan. 1998. ISSN 0169-5347. doi: 10.1016/S0169-5347(97)01230-5.
- M.-A. Selosse and F. Martos. Do chlorophyllous orchids heterotrophically use mycor-

BIBLIOGRAPHY

- rhizal fungal carbon? *Trends in Plant Science*, 19(11):683–685, Nov. 2014. ISSN 1360-1385. doi: 10.1016/j.tplants.2014.09.005.
- M.-A. Selosse and M. Roy. Green plants that feed on fungi: Facts and questions about mixotrophy. *Trends in Plant Science*, 14(2):64–70, Feb. 2009. ISSN 1360-1385. doi: 10.1016/j.tplants.2008.11.004.
- M.-A. Selosse, A. Faccio, G. Scappaticci, and P. Bonfante. Chlorophyllous and Achlorophyllous Specimens of *Epipactis microphylla* (Neottieae, Orchidaceae) Are Associated with Ectomycorrhizal Septomycetes, including Truffles. *Microbial Ecology*, 47(4), Apr. 2004. ISSN 0095-3628, 1432-184X. doi: 10.1007/s00248-003-2034-3.
- M.-A. Selosse, B. Boullard, and D. Richardson. Noël Bernard (1874–1911): Orchids to symbiosis in a dozen years, one century ago. *Symbiosis*, 54(2):61–68, June 2011. ISSN 1878-7665. doi: 10.1007/s13199-011-0131-5.
- R. P. Shefferson, T. Kull, and K. Tali. Mycorrhizal interactions of orchids colonizing Estonian mine tailings hills. *American Journal of Botany*, 95(2):156–164, 2008. ISSN 1537-2197. doi: 10.3732/ajb.95.2.156.
- T. Spribille, V. Tuovinen, P. Resl, D. Vanderpool, H. Wolinski, M. C. Aime, K. Schneider, E. Stabentheiner, M. Toome-Heller, G. Thor, H. Mayrhofer, H. Johannesson, and J. P. McCutcheon. Basidiomycete yeasts in the cortex of ascomycete macrolichens. *Science (New York, N.Y.)*, 353(6298):488–492, July 2016. ISSN 0036-8075. doi: 10.1126/science.aaf8287.
- E. T. Steenkamp, J. Wright, and S. L. Baldauf. The Protistan Origins of Animals and Fungi. *Molecular Biology and Evolution*, 23(1):93–106, Jan. 2006. ISSN 0737-4038. doi: 10.1093/molbev/msj011.
- C. Strullu-Derrien, M.-A. Selosse, P. Kenrick, and F. M. Martin. The origin and evolution of mycorrhizal symbioses: From palaeomycology to phylogenomics. *New Phytologist*, 220(4):1012–1030, 2018. ISSN 1469-8137. doi: 10.1111/nph.15076.
- D. L. Taylor, T. D. Bruns, and S. A. Hodges. Evidence for mycorrhizal races in a cheating

BIBLIOGRAPHY

- orchid. *Proceedings of the Royal Society of London. Series B: Biological Sciences*, 271 (1534):35–43, Jan. 2004. doi: 10.1098/rspb.2003.2557.
- T. N. Taylor, H. Hass, and H. Kerp. A cyanolichen from the Lower Devonian Rhynie chert. *American Journal of Botany*, 84(7):992–1004, 1997. ISSN 1537-2197. doi: 10.2307/2446290.
- T. Těšitelová, M. Kotilínek, J. Jersáková, F.-X. Joly, J. Košnar, I. Tatarenko, and M.-A. Selosse. Two widespread green Neottia species (Orchidaceae) show mycorrhizal preference for Sebacinales in various habitats and ontogenetic stages. *Molecular Ecology*, 24(5):1122–1134, 2015. ISSN 1365-294X. doi: 10.1111/mec.13088.
- G. Tikhonov, N. Abrego, D. Dunson, and O. Ovaskainen. Using joint species distribution models for evaluating how species-to-species associations depend on the environmental context. *Methods in Ecology and Evolution*, 8(4):443–452, 2017. ISSN 2041-210X. doi: 10.1111/2041-210X.12723.
- G. Tikhonov, Ø. H. Opdal, N. Abrego, A. Lehikoinen, M. M. J. de Jonge, J. Oksanen, and O. Ovaskainen. Joint species distribution modelling with the r-package Hmsc. *Methods in Ecology and Evolution*, 11(3):442–447, 2020. ISSN 2041-210X. doi: 10.1111/2041-210X.13345.
- T. Tjur. Coefficients of Determination in Logistic Regression Models—A New Proposal: The Coefficient of Discrimination. *The American Statistician*, 63(4):366–372, Nov. 2009. ISSN 0003-1305. doi: 10.1198/tast.2009.08210.
- J. M. Trappe and G. R. Safir. Ecophysiology of VA mycorrhizal plants. 1987.
- M. G. A. van der Heijden, F. M. Martin, M.-A. Selosse, and I. R. Sanders. Mycorrhizal ecology and evolution: The past, the present, and the future. *New Phytologist*, 205 (4):1406–1423, 2015. ISSN 1469-8137. doi: 10.1111/nph.13288.
- V. Veldre, K. Abarenkov, M. Bahram, F. Martos, M.-A. Selosse, H. Tamm, U. Kõljalg, and L. Tedersoo. Evolution of nutritional modes of Ceratobasidiaceae (Cantharellales,

BIBLIOGRAPHY

- Basidiomycota) as revealed from publicly available ITS sequences. *Fungal Ecology*, 6(4):256–268, Aug. 2013. ISSN 1754-5048. doi: 10.1016/j.funeco.2013.03.004.
- B. Wang and Y.-L. Qiu. Phylogenetic distribution and evolution of mycorrhizas in land plants. *Mycorrhiza*, 16(5):299–363, July 2006. ISSN 1432-1890. doi: 10.1007/s00572-005-0033-6.
- D. Y. Wang, S. Kumar, and S. B. Hedges. Divergence time estimates for the early history of animal phyla and the origin of plants, animals and fungi. *Proceedings of the Royal Society B: Biological Sciences*, 266(1415):163–171, Jan. 1999. ISSN 0962-8452.
- D. I. Warton, F. G. Blanchet, R. B. O’Hara, O. Ovaskainen, S. Taskinen, S. C. Walker, and F. K. C. Hui. So Many Variables: Joint Modeling in Community Ecology. *Trends in Ecology & Evolution*, 30(12):766–779, Dec. 2015. ISSN 0169-5347. doi: 10.1016/j.tree.2015.09.007.
- R. J. Waterman, M. I. Bidartondo, J. Stofberg, J. K. Combs, G. Gebauer, V. Savolainen, T. G. Barraclough, and A. Pauw. The Effects of Above- and Belowground Mutualisms on Orchid Speciation and Coexistence. *The American Naturalist*, 177(2):E54–E68, Feb. 2011. ISSN 0003-0147. doi: 10.1086/657955.
- J. T. Weir and D. Schlüter. Calibrating the avian molecular clock. *Molecular Ecology*, 17(10):2321–2328, 2008. ISSN 1365-294X. doi: 10.1111/j.1365-294X.2008.03742.x.
- M. Weiss, M.-A. Selosse, K.-H. Rexer, A. Urban, and F. Oberwinkler. Sebacinales: A hitherto overlooked cosm of heterobasidiomycetes with a broad mycorrhizal potential*
*Part 221 of the series Studies in Heterobasidiomycetes from the Botanical Institute, University of Tübingen, Tübingen. *Mycological Research*, 108(9):1003–1010, Sept. 2004. ISSN 0953-7562. doi: 10.1017/S0953756204000772.
- M. Weiβ, F. Waller, A. Zuccaro, and M.-A. Selosse. Sebacinales – one thousand and one interactions with land plants. *New Phytologist*, 211(1):20–40, 2016. ISSN 1469-8137. doi: 10.1111/nph.13977.

BIBLIOGRAPHY

R. H. Whittaker. New concepts of kingdoms of organisms. *Science*, 163(3863):150–160, 1969.