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EDITED BY

Ari Mikko Hietala,
The Norwegian Institute
of Bioeconomy Research (NIBIO),
Norway

REVIEWED BY

Juan A. Martin,
Universidad Politécnica de Madrid,
Spain
Tessa Camenzind,
Freie Universität Berlin, Germany

*CORRESPONDENCE

Julio Javier Diez
✉ JulioJavier.Diez@uva.es
Sergio Diez-Hermano
✉ sergio.diez.hermano@uva.es

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Health condition and mycobiome diversity in Mediterranean tree species

Sergio Diez-Hermano^{1,2*}, Farooq Ahmad^{1,2},
Jonatan Niño-Sanchez^{1,2}, Alvaro Benito^{1,2}, Elena Hidalgo^{1,2},
Laura Morejón Escudero², Wilson Acosta Morel^{1,2} and
Julio Javier Diez^{1,2*}

¹Sustainable Forest Management Research Institute (iuFOR), University of Valladolid, Palencia, Spain, ²Department of Plant Production and Forest Resources Higher Technical School of Agricultural Engineering of Palencia (ETSIIAA), University of Valladolid, Palencia, Spain

Introduction: Mediterranean forests are currently facing a surge in abiotic stressors such as droughts and massive fires as a result of climate crisis and human pressure. Susceptibility to biotic stressors has also increased, including a variety of pests and pathogens capable of weakening and potentially killing forest flora. Biodiversity of microbiome protects forests against declines as it increases trees' resilience and adaptability.

Objectives: With the objective of analyzing the relationship between health status and fungal diversity, in the present work the mycobiota of declined and healthy specimens of keystone Mediterranean tree species is described and compared.

Methods: To this end, bark and wood from declining Spanish forests of *Castanea sativa* (chestnut), *Quercus ilex* (holm oak), *Quercus suber* (cork oak), and *Quercus pyrenaica* (pyrenean oak) were sampled and the Internal Transcribed Spacer (ITS1) genomic region was sequenced.

Results: Results showed a predominance of Ascomycota, Basidiomycota, and Mucoromycota in all samples. Alpha diversity at genus level was not affected by health status and was characterized by uneven, poorly distributed fungal communities dominated by a few genera. Differentially abundant (DA) genera between healthy and declined samples were found in chestnut (15), holm oak (6), and pyrenean oak (4) trees, but not in cork oak. Some genera known for their plant protection potential, such as *Trichoderma*, were found exclusively in healthy trees. Functional profiles revealed a predominance of phytopathogens and saprobes in all tree species, irrespective of their health status.

Discussion: This study emphasizes the importance of Mediterranean forests as biodiversity refuges and highlights the value of above-ground tissues as a valid approach to assess shifts in forests' microbiome diversity in response to biotic and abiotic stressors.

KEYWORDS

metabarcoding, biodiversity, forest pathology, *Quercus*, *Castanea*

1 Introduction

Forests are extremely valuable for the ecosystem services they provide. Forests act as biodiversity refuges and serve as important carbon sinks, but are experiencing severe degradation worldwide that threatens their very existence (Trumbore et al., 2015). Forest degradation is usually characterized by destruction of stand structure, dysregulation of functionality, and lowered productivity as a result of damaging human activities (Ghazoul et al., 2015; Vázquez-Grandón et al., 2018). As a result, forest resilience is heavily compromised. Forest decline can be listed as an important factor contributing to forest degradation, and encompasses reduction of growth rate and vigor of individual trees, loss of soil fertility, and ultimately, permanent death of trees (Zhu and Li, 2007).

Several factors contribute to forest decline, making it difficult to pinpoint specific causes. A variety of models of tree mortality have been conceptualized (Houston, 1981; Manion, 1991) and all of them share the idea that forest decline occurs when environmental stress factors interact with various biotic agents in forests at different stages of development. Declining trees often exhibit reduced water transport as a result of reduced radial growth, which creates an imbalance between the water-demanding foliage and the water-providing roots (Manion, 2003). This leads to alterations in carbon balance and systemic homeostasis and ends up increasing tree susceptibility to biotic attacks and other stressors (McDowell et al., 2008; Wang et al., 2012). This physiological disruption, alongside the continuous pressure exerted by human action and climate crisis, triggers a spiral of processes driven by interactions between abiotic and biotic stress factors that predispose, incite and contribute to stand-level decline (Manion, 1991; Amoroso et al., 2017).

Mediterranean forests rank among the terrestrial ecosystems most threatened by climate crisis and loss of biodiversity caused by changes in land use regime (Ochoa-Hueso et al., 2017; Newbold et al., 2020). Meteorological predictions for Iberian and Italian Peninsulas project severe decreases in precipitation, changes in rain patterns and rising temperatures in the following decades, which make the Mediterranean basin particularly prone to long drought periods and large-scale wildfires (Camia and Amatulli, 2009; Batllori et al., 2017; Turco et al., 2017). Post-fire soil is exposed to erosive agents and its recovery might be hindered if other extreme events, such as heavy rainfall, occur within the window of disturbance period (Morán-Ordóñez et al., 2020). Soil in Mediterranean forests is especially vulnerable to this kind of disturbances, as dry summers are followed by rain-intense autumns with 70–80% of the annual precipitation (Shakesby, 2011; Panagos et al., 2015).

Thus, edaphic instability and high frequency of climatic adversities impair the ability of Mediterranean trees to withstand other challenges such as insect pests and fungal diseases, which in turn contribute to the deterioration of tree health status. Inciting factors can also be of biotic origin, such as the *Cerambyx welensii* and *Coraebus undatus* beetles that create

tunnels in oak trees and other deciduous species and for which neither preventive nor curative methods exist (Torres-Vila et al., 2013; Tiberi et al., 2016). These stressors not only affect tree health directly but also influence the composition of forest microbiota (Bowd et al., 2022). Compositional changes in the microbiome have a big influence on the severity of diseases affecting the host plant (Wei et al., 2018). Before decline starts, trees with higher microbial diversity pose more resistance against external disturbances. *In vitro* experiments have shown that several microbial communities can decrease the invasion success of pathogens (Jones et al., 2021). Core microbiome assemblies capable of buffering plants from extreme environmental conditions have also been identified (Timm et al., 2018). The relationship between trees and their microbiome is so close that considering them as a holobiont - a 'functional entity formed by a macrobe and its long- and short-term associations with microbes and viruses' (Gordon et al., 2013) - has been proposed as a necessity to combat forest decline (Bettenfeld et al., 2020).

Within plants' microbiome, fungal diversity (mycobiota) is of particular interest in terrestrial ecosystems given that many survival, nutrition, and interaction strategies depend on them. Currently, the international LIFE MycoRestore consortium, focused on Mediterranean forests from Spain, Italy, and Portugal, seeks to utilize mycological biodiversity in order to increase soil and tree health, leading to a greater forest resilience to climate change, drought, forest fires, and pests. However, fungi can also be pathogens responsible for some of the most devastating diseases affecting trees, such as chestnut blight caused by *Cryphonectria parasitica* and ink disease caused by oomycetes of the *Phytophthora* genus. Metabarcoding studies have shown that the diversity and composition of fungal and oomycete soil communities are associated with the severity of symptoms in declining oak dehesas (Ruiz Gómez et al., 2019). In contrast, soil mycobiota of *Castanea sativa* trees affected by *Phytophthora cambivora* have been found to be particularly resilient to the pathogen (Venice et al., 2021). Direct examination of plant material is also of great importance. Root-associated fungi can be affected by pathogens, as shown by the limited diversity of symbiotic ectomycorrhizas found in *Quercus ilex* forests affected by *Phytophthora cinnamomi* (Corcobado et al., 2014). Moreover, analysis of internal tissues of trees allows the study of endophytic fungi, which commonly act as antagonists to pathogens and enhancers of plant immunity response (Busby et al., 2016b; Terhonen et al., 2019). Endophytes can increase tree tolerance to abiotic stressors as well, such as drought (Bae et al., 2009; Khan et al., 2016; Ferus et al., 2019), salinity (Rodríguez et al., 2008), and heat (Redman et al., 2002).

Therefore, the aim of the present work is to shed light on the relationship between diversity of plant mycobiota and health condition of Mediterranean forests, represented by four key species: holm oak, cork oak, and chestnut, that are of great economic importance in Iberian Peninsula ecosystems,

and pyrenean oak, which is endemic to Spain. To this end, wood and bark from healthy and declined specimens was sampled in locations where insect pests and fungal diseases are known to be prevalent. The mycobiota composition was assessed by means of metabarcoding using the ITS1 region of ribosomal DNA.

2 Materials and methods

2.1 Sampling sites and procedure

Bark and wood samples were extracted from healthy and declining trees of *Castanea sativa* (chestnut), *Quercus suber* (cork oak), *Quercus ilex* (holm oak), and *Quercus pyrenaica* (pyrenean oak) from Salamanca (Castile and Leon, Spain) forests (Table 1 and Figure 1). Each site sampled corresponded to a single tree species. Sampling was conducted for all four sites in June and July 2020.

For all sampling sites, declining patches were defined as areas with high percentage of declining trees (presence of canker wounds or stem bleeds, >70% of trees with severe dieback and foliage wilting). Tree diameter was measured at breast height using calipers. Tree height was measured using a Vertex hypsometer. Crown conditions (% mortality and defoliation) were evaluated according to ICP Forests Manual Part IV “Visual Assessment of Crown Condition and Damaging Agents” (Eichhorn et al., 2016). Each sampling site had been previously characterized by the occurrence of a putative biotic stressor (Table 1), although sampled trees were not specifically tested for their presence. All selected symptomatic trees were alive at the moment of sampling and had variable although comparable degree of decline. Dead or close-to-death trees were not sampled to ensure that detected fungi belonged to microbial communities present in physiologically active trees. Stands of healthy trees were primarily composed of asymptomatic trees free of dieback or crown transparency.

TABLE 1 Description of sampling sites.

Location	Characteristics	Sampled species	Putative biotic stressor [†]	Main criteria for decline
La Alamedilla, Spain	Elevation: 756 m Rainfall: 600–854 mm	<i>Quercus ilex</i>	<i>Phytophthora cinnamomi</i>	Dead trees and exudates
Linares de Riofrío, Spain	Elevation: 956 m Rainfall: 700–900 mm	<i>Castanea sativa</i>	<i>Cryphonectria parasitica</i>	Dead trees and cankers
Cubo de Don Sancho, Spain	Elevation: 736 m Rainfall: 500–700 mm	<i>Quercus pyrenaica</i>	<i>Cerambyx welensii</i>	Dead trees, dieback and exit holes
Valdelosa, Spain	Elevation: 842 m Rainfall: 500–700 mm	<i>Quercus suber</i>	<i>Coraebus undatus</i>	Dieback and crown transparency

[†]Only well-characterized harmful agents known to be present at sampling sites.

Three plots of healthy trees and three with high degree of decline were selected in each site. Material from five live trees (North orientation) was sampled and pooled per plot. After removing the external bark, one sample was taken per tree from the main trunk at the height of 50 cm over the collar to a depth of 2–3 cm. Only xylem and the internal bark layer (phloem) were considered in the analysis. Six xylem-phloem samples were obtained per tree species (two health conditions × three plots), this totalling 24 samples. Samples were stored at –20°C prior to processing.

2.2 Sample processing

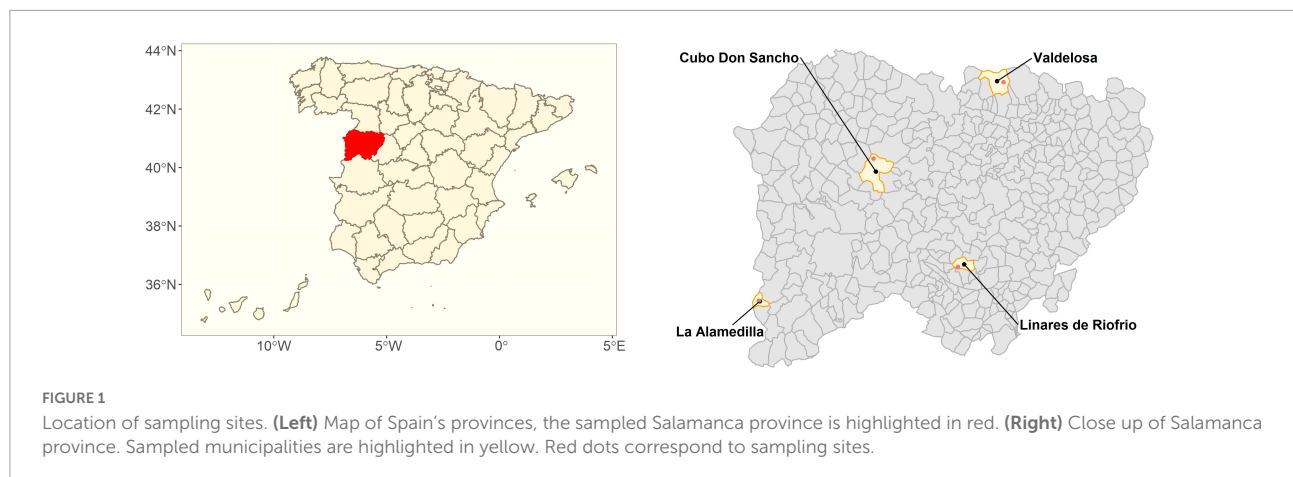
Samples were thawed and washed three times, first with 1 ml of 0.9% NaCl, then with 1 ml of 7% PVP and again with 1 ml of 0.9% NaCl. Following centrifugation for 5 min at 10000 rpm, the supernatant was discarded to remove polyphenols and impurities. Samples were then pulverized by milling during for 5 min at 30 Hz (RETSCH MM 400) with 2 mm tungsten steel beads. DNA was extracted from the wood powder using the EZNA Tissue DNA kit (Omega Bio-tek, Norcross, GA, USA), according to the manufacturer's instructions. The yield and purity of the DNA was measured by Qubit and then stored at –20°C until use.

2.3 Library preparation and sequencing

Samples were sent for molecular analysis to Biome Makers Inc., (West Sacramento, CA, USA). Region 1 of fungal Internal Transcribed Spacer 1 (ITS1) gene was amplified using WineSeq[®] custom primers according to Patent WO2017096385 (Becares and Fernandez, 2017). After quality control by gel electrophoresis, each library was pooled in equimolar amount and subsequently sequenced on an Illumina MiSeq instrument (Illumina, San Diego, CA, USA) using 2 × 301 paired-end reads. Sequencing data was analyzed through a QIIME-based custom and in-house bioinformatics pipeline (Caporaso et al., 2010; Becares and Fernandez, 2017). Illumina adapters and chimeras were removed (Edgar et al., 2011) and reads were quality-trimmed. ITS1 sequences were clustered into non-singleton operational taxonomic units (OTUs) at a 97% sequence similarity level. Taxonomy assignment and abundance estimation were performed comparing OTUs against UNITE database version 7.2 (Nilsson et al., 2019). Rarefaction curves were used to evaluate the relationship between sequencing depth and the number of OTUs.

2.4 Statistical analysis

Prior to the analysis, taking into consideration that only ITS1 marker was used, OTUs' raw reads were aggregated



at genus level to have better confidence, and to avoid misidentification of closely-related species (Yang et al., 2018).

Differences in height, diameter, crown mortality, and crown defoliation were assessed using Wilcoxon test (p -value < 0.05 for statistical significance). P -values were adjusted for multiple comparisons by means of Bonferroni correction. Differences between mycobiome communities were evaluated in terms of alpha and beta diversity. Alpha diversity was assessed using Hill diversity indexes according to the equation.

$$D = \left(\sum_{i=1}^S p_i(r_i)^l \right)^{1/l}$$

Where D is diversity, S is the number of taxa, p_i is the proportion of all individuals that belong to taxa i , r_i is the rarity of taxa i , defined as $1/p_i$, and l is the exponent that determines the rarity scale and corresponds to richness ($l = 1$) or equivalence-corrected versions of Shannon ($l = 0$) and Simpson indexes ($l = -1$) (Roswell et al., 2021). Differences between health conditions per tree species at $l = [-1, 0, 1]$ were contrasted using Wilcoxon's rank test.

Beta diversity was evaluated in terms of differential abundance taking into account that high-throughput sequencing counts should be considered compositional data (Gloor et al., 2017). Analyses followed anova-like differential expression analysis (ALDEx) technique, which has been shown to produce results very similar to the intersection of multiple independent tools (Soneson and Delorenzi, 2013; Wallen, 2021). Reads were transformed to centered log-ratio (clr) values and per-genus technical variation within each sample was estimated using 1,000 Monte-Carlo instances drawn from the Dirichlet distribution, which returns the posterior probability of observing the counts given the data collected (Fernandes et al., 2013). Effect size was then calculated as the median standardized difference of clr values between groups. A genus was deemed as differentially abundant if the estimated effect was bigger than 1 (absolute value) and the 95% confidence interval (95%CI) didn't include 0.

All fungal genera were included in the functional analysis. Each genus was assigned a functional guild according to the "primary lifestyle" column obtained from FungalTraits database V1.2 (Pölmle et al., 2020). Raw read numbers of each guild were summed per tree species and health condition and expressed as \log_2 (guild abundance/total abundance).

All analyses were performed in R environment 4.1.3 (R Core Team, 2022). Hill diversity analysis was performed using the package *MeanRarity* (Roswell and Dushoff, 2022). Compositional analysis was performed using the packages *ALDEx2* (Fernandes et al., 2014; Gloor et al., 2016), *CoDaSeq* (Gloor and Reid, 2016), and *zCompositions* (Palarea-Albaladejo and Martin-Fernandez, 2015). Plotting and data cleaning and formatting were performed using the packages *dplyr* (Wickham et al., 2022), *doParallel* (Microsoft Corporation and Weston, 2022), *ggplot2* (Wickham, 2016), *ggplotify* (Guangchuang, 2021), *ggpubr* (Kassambara, 2020), *ggVennDiagram* (Gao, 2021), *openxlsx* (Schauberger and Walker, 2021), and *tidyr* (Wickham and Girlich, 2022).

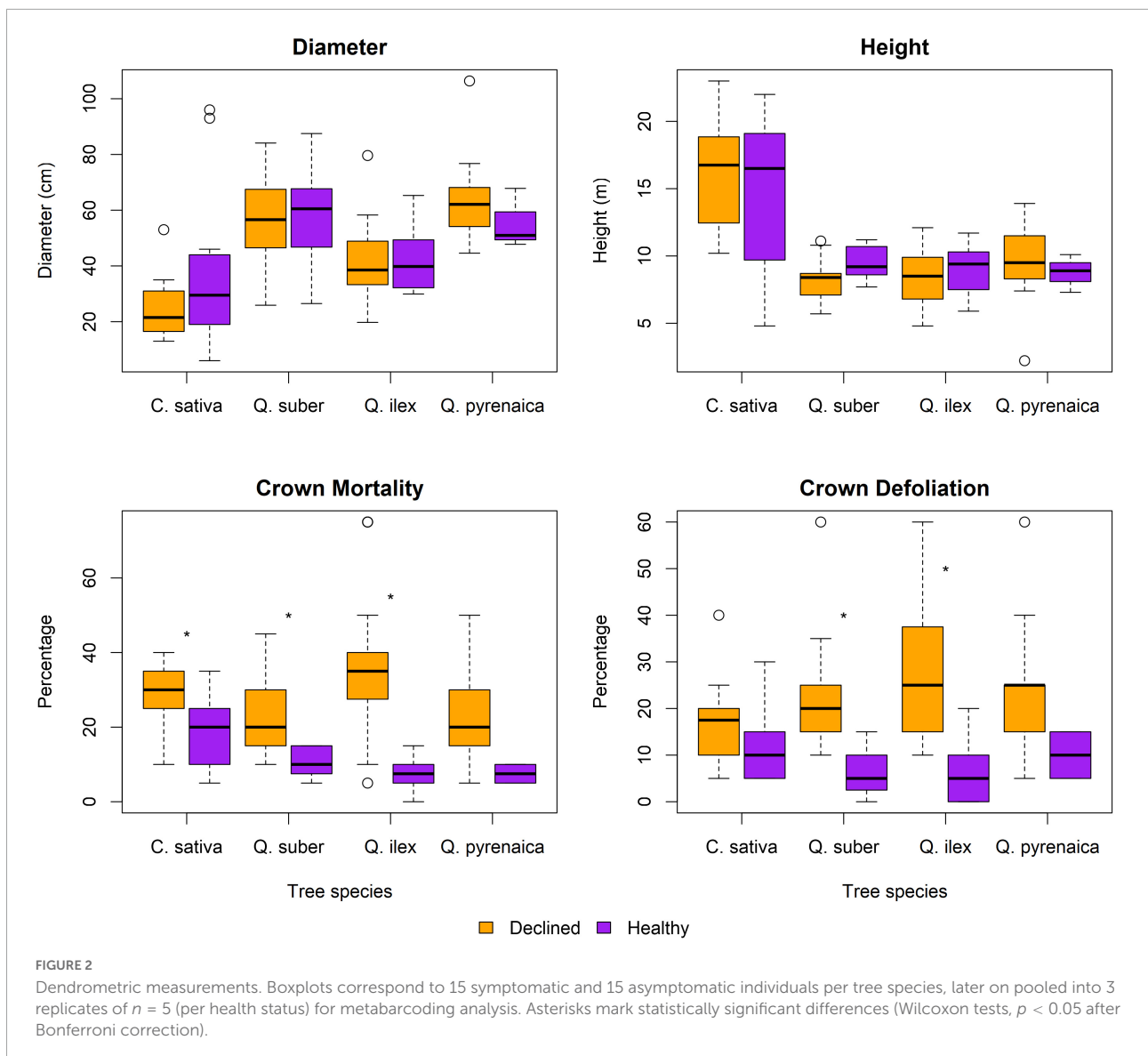
3 Results

3.1 Characterization of decline

No differences in height and diameter were observed between healthy and declined trees (Figure 2). Crown mortality and defoliation were higher in declined samples of cork oak and holm oak, while chestnut showed differences only in crown mortality. Pyrenean oaks showed comparable levels of crown mortality and defoliation regardless of health status.

3.2 Fungal community description

Sequencing after quality control yielded 38,421 (25,817–66,879) reads on average (median and P25–75) and a total



of 483 OTUs clustered at genus level (97% similarity) (**Supplementary Tables 1, 2**). In general, all samples had sufficient reads to capture most of the diversity, as shown by the plateauing rarefaction curves (**Supplementary Figure 1**). The most common phyla corresponded to Ascomycota (~74%), Basidiomycota (~19%), and Mucoromycota (~6%) (**Figure 3**). The same pattern was observed regardless of health condition and ecosystem (**Supplementary Figure 2**).

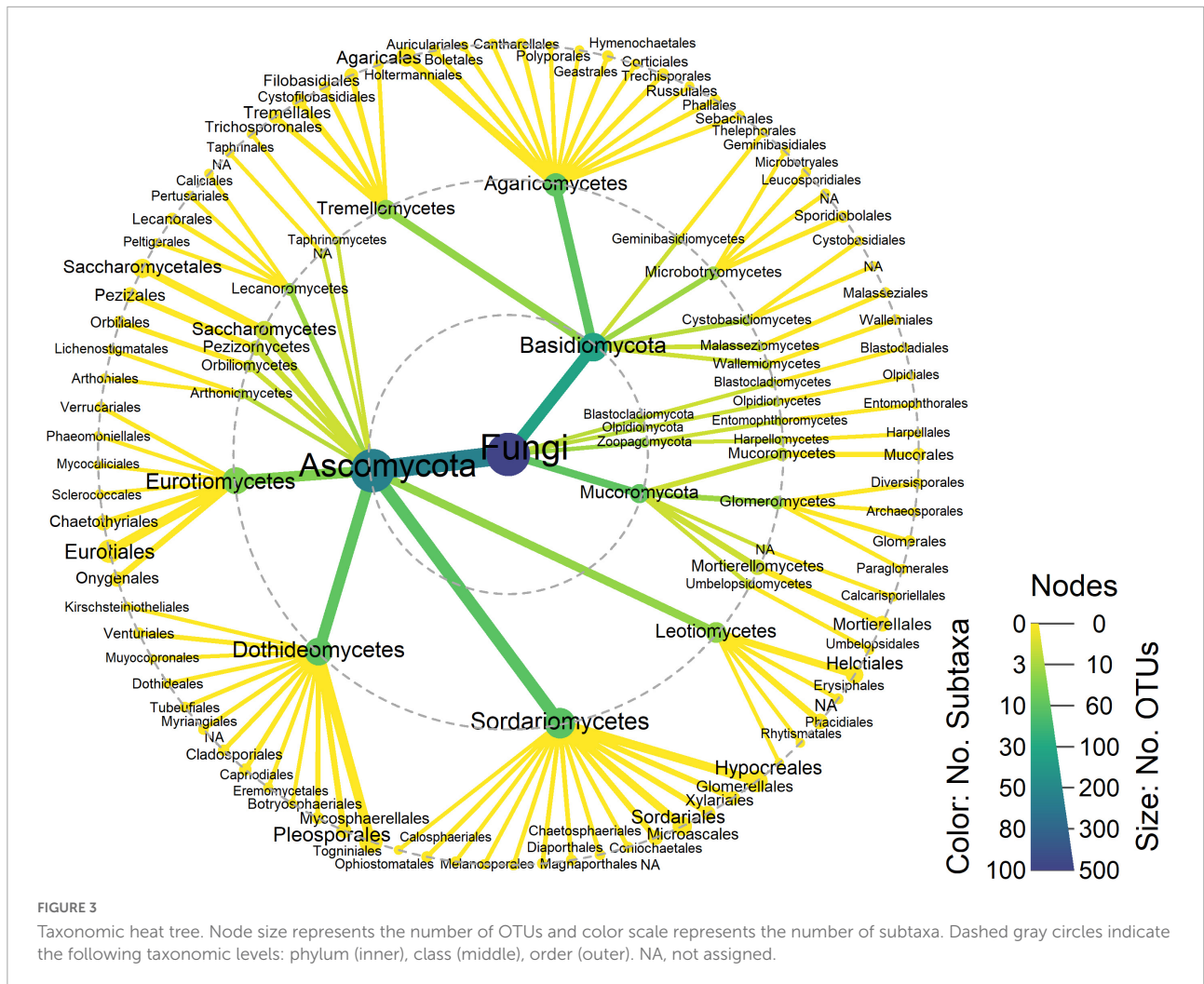
3.3 Global comparison by health condition

Presence/absence of fungal genera was assessed regardless of tree species as a first approach to find commonalities associated with health status. Some genera were exclusively present in

healthy ($n = 8$, ~21.1%) or diseased ($n = 4$, ~10.5%) samples, although most genera were common to both ($n = 26$, ~68.4%) (**Figure 4A**). Dimensionality reduction analysis showed no signs of clustering in terms of health condition or tree species (**Figure 4B**).

3.4 Biodiversity analysis

Effect of health conditions on the biodiversity of fungal communities was assessed separately per tree species. No significant differences were found in terms of alpha diversity (**Figure 5**). On average, healthy and diseased samples had comparable estimators for richness, Hill-Shannon and Hill-Simpson indexes. All samples had uneven, poorly distributed fungal communities and were dominated by a few genera



(usually 1 to 3, corresponding with Hill = -1). High variability was found particularly in the richness estimation, as shown by the widening of intervals as Hill's index approaches 1 (with the exception of holm oak samples).

Beta diversity was evaluated in terms of differences in fungal composition using log ratio-transformed values of raw reads. Differentially abundant (DA) genera between healthy and diseased samples were found in chestnut (15), holm oak (6), and pyrenean oak (4) trees, but not in cork oak (Figure 6). Identities of DA genera, alongside the corresponding effect estimator and 95%CI are shown in Figure 7. DA genera were more prominently found in samples from declined trees of chestnut and pyrenean oak, and in samples from healthy trees of holm oak.

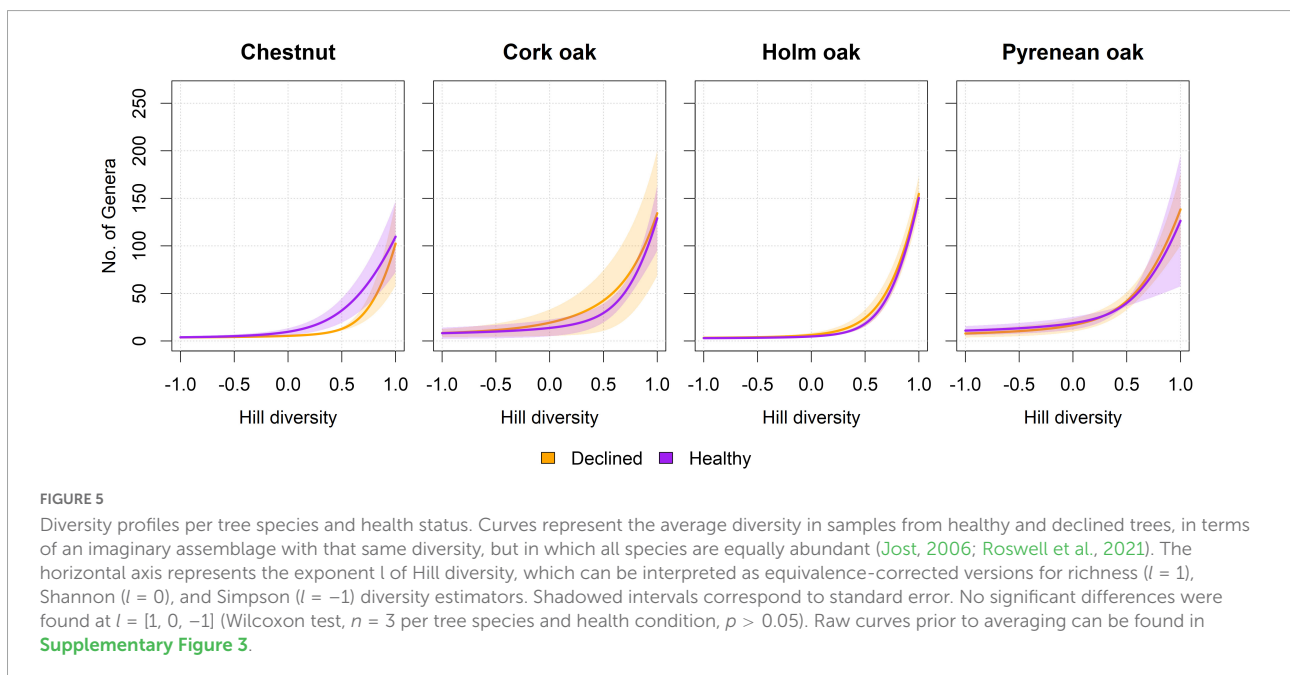
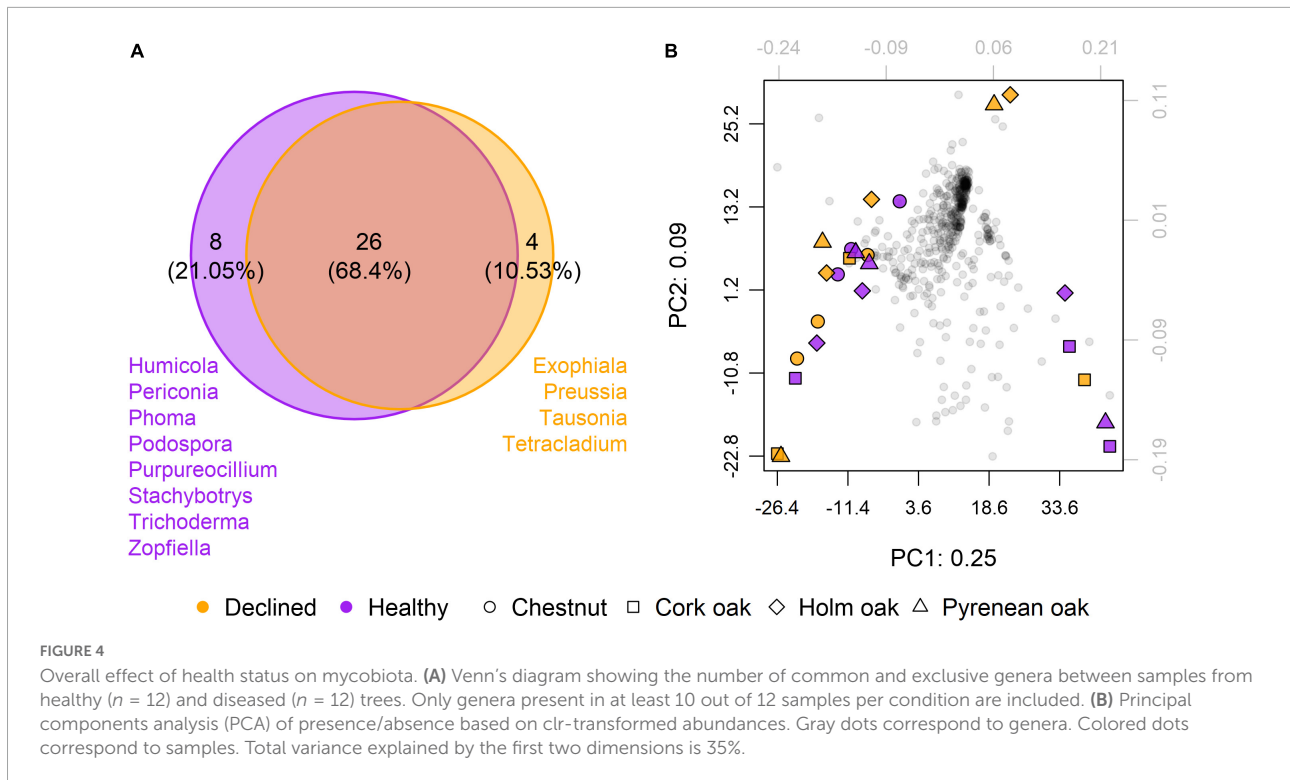
3.5 Functional profiles

Assignment of fungal genera to their primary lifestyle was performed per tree species and health status (Figure 8).

Although plant pathogens and saprotrophs were the most abundant guilds in all cases, there was no consistent relation with health status. Plant pathogens were more abundant in declined samples of holm oak and healthy samples of chestnut and pyrenean oak, whereas the difference was non-existent in cork oaks. Functional guilds with the biggest differences in abundance per tree species were nectar/tap saprotroph in chestnut, ectomycorrhizas in cork oak, animal parasite in holm oak and wood saprotroph in pyrenean oak. Some guilds couldn't be found in both healthy and declined trees, such as sooty molds (absent from healthy chestnuts, holm oaks and pyrenean oaks, and declined cork oaks), and animal endosymbionts (absent from declined chestnuts, holm oaks and pyrenean oaks, and healthy cork oaks).

4 Discussion

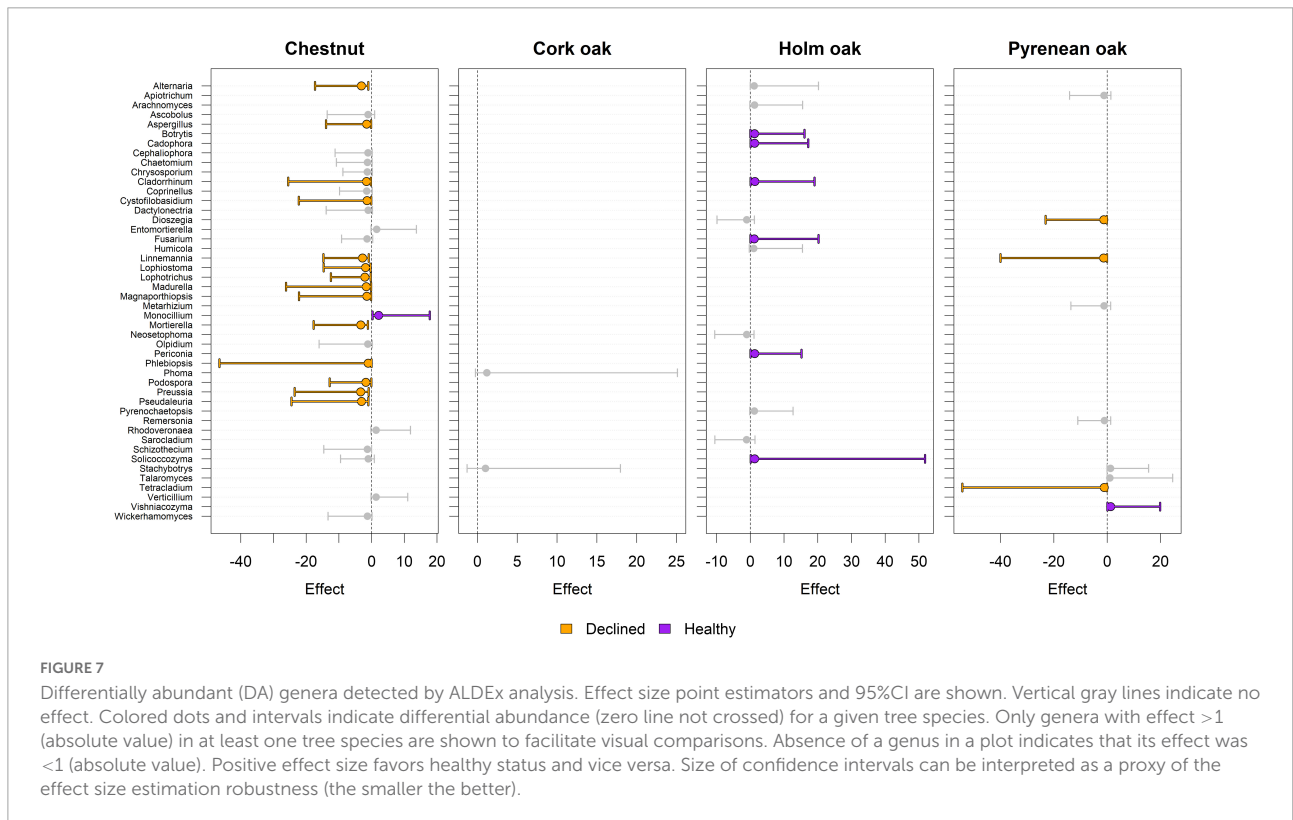
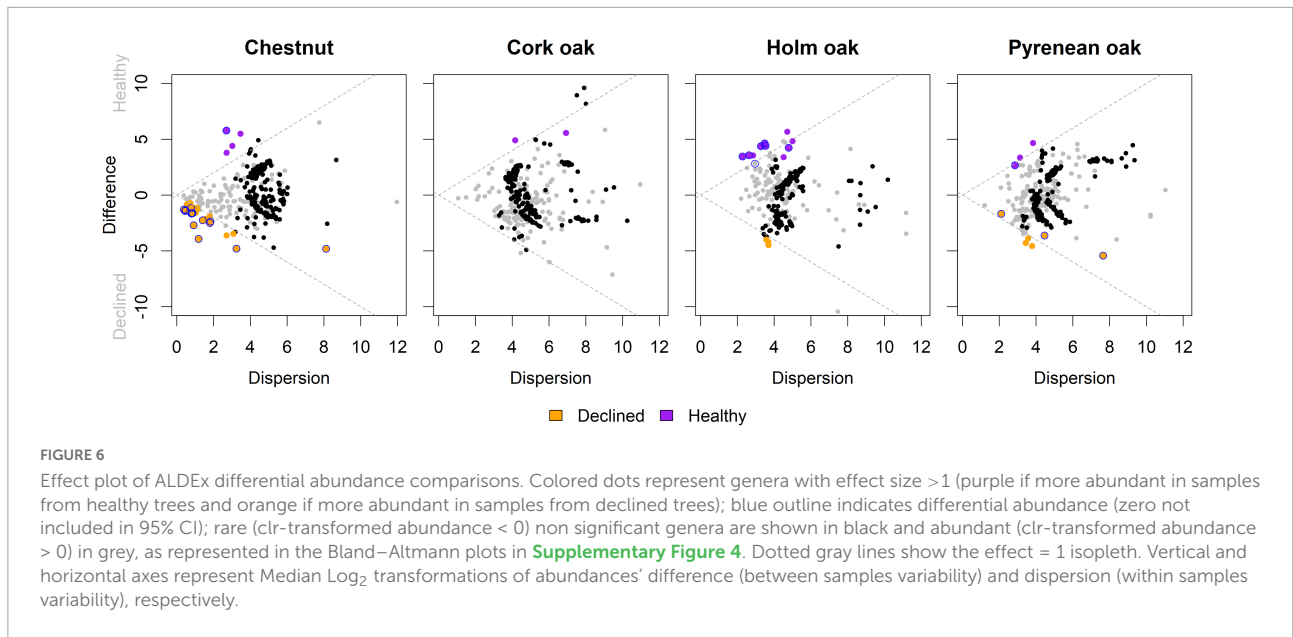
Human action and climate crisis contribute to forest dieback and increase the vulnerability of the surviving plants. That



way forests are led into a spiral of decline in which trees are weakened and become susceptible to other abiotic and biotic stressors, which ultimately places the health and existence of the whole ecosystem at risk. Mycobiota of trees affected by recent wildfires show increases in genetic diversity and shifts in community structure and taxonomic composition (Huang et al., 2016). Imbalances in microbiome diversity have been related to

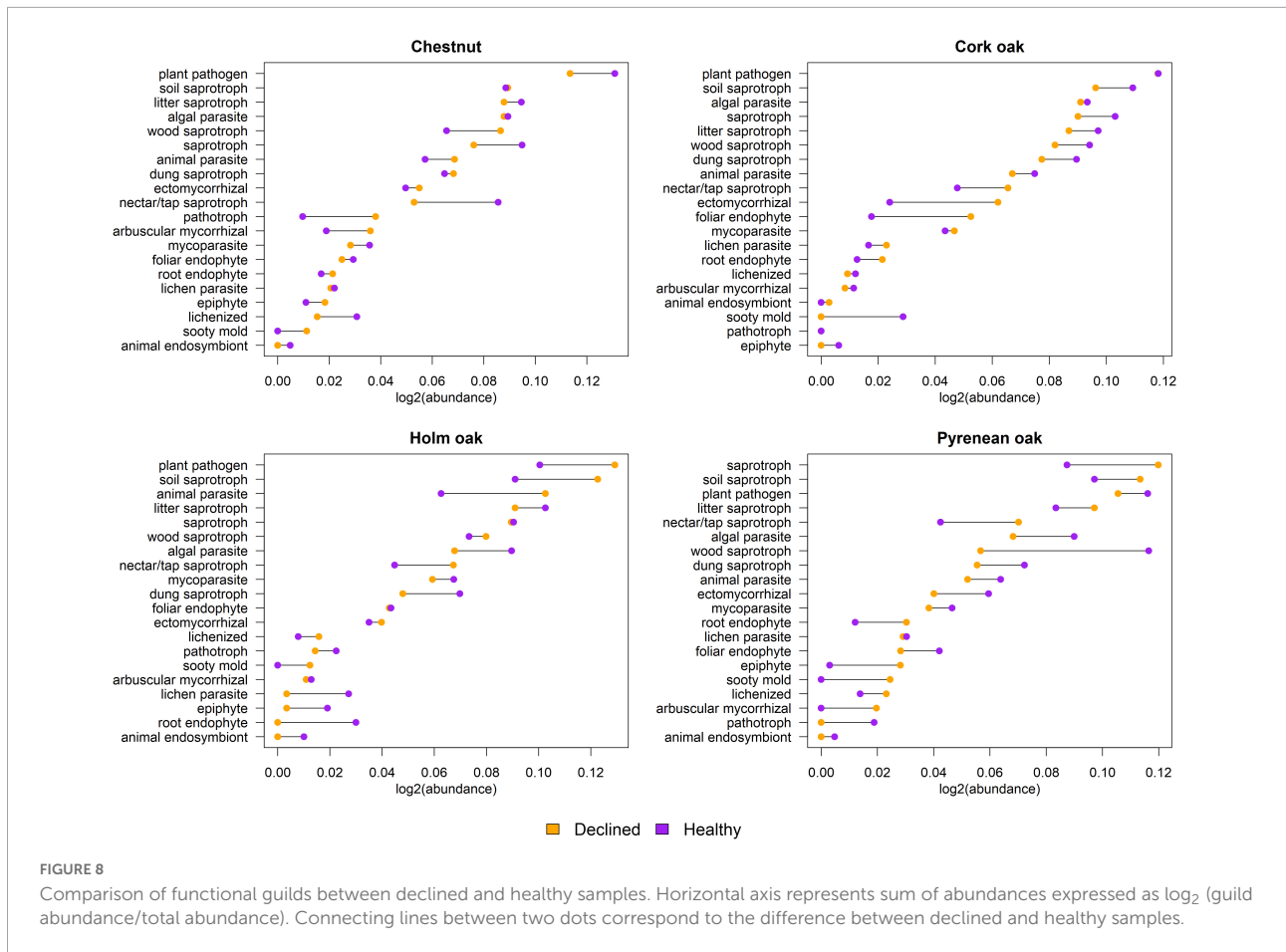
severity of decline, as essential functions of the holobiont might not be guaranteed, reducing its fitness (Moricca et al., 2012; Bettenfeld et al., 2020; Lyu et al., 2021). Therefore, biodiversity acts as a buffer that makes forests more resilient, minimizing the damages caused by disturbances.

However, a majority of metabarcoding studies focus on commercial crops and soil composition, making the studies on



tree health in forest ecosystems very scarce. Even fewer studies have dealt with above-ground microbiota and its composition in tissues from declined and healthy trees. For example, it has been shown that foliar fungi can decrease disease severity in *Populus trichocarpa* and make the host more resistant against the rust disease (Busby et al., 2016a). In addition, to the best of our knowledge, only a handful of studies have attempted to

characterize the microbiota of ecosystems as sensitive to climate change as Mediterranean forests are (Lasa et al., 2019; Maghnia et al., 2019; Ruiz Gómez et al., 2019; Venice et al., 2021; Gómez-Aparicio et al., 2022). These studies, however, only focused on a single tree species or pathosystem, i.e., *Quercus suber* (Maghnia et al., 2019; Gómez-Aparicio et al., 2022), *Quercus pyrenaica* (Lasa et al., 2019), *Quercus ilex* (Ruiz Gómez et al., 2019), and



Castanea sativa (Venice et al., 2021), and none of them dealt with above-ground tissues. Thus, the present work supplements prior studies by describing mycobiota in above-ground tissues of declined and healthy trees, belonging to key species in Mediterranean ecosystems in Spain.

In our study no significant differences between the alpha diversity of declined and healthy trees were found. Contrary to this result, more diverse fungal communities have been found in needles and sapwood of declining *Picea abies* and *Pinus sylvestris* trees, respectively, as compared to tissues from healthy specimens (Giordano et al., 2009; Millberg et al., 2015). Opposite effect was found in ficus trees where a brown root rot fungus decreased their microbial diversity (Liu et al., 2022). Water stress can also reduce diversity of endophytic mycobiota in cork oak (Linaldeddu et al., 2011). Nonetheless, in some cases the correlation between alpha diversity and plant health status has been found to be weak or non-existent as well (Lebreton et al., 2019; Solís-García et al., 2021; Romeralo et al., 2022).

Some genera were only found in either declined or healthy samples and could be identified as indicator genera. The number of indicator genera was slightly higher in healthy trees than in declined trees, as found in other studies (Hossain et al., 2021). On the one hand, regarding genera exclusive

to healthy samples, *Phoma* and *Periconia* are known to have a plant-pathogenic lifestyle. Other genera are considered to be primarily saprotrophic, such as *Stachybotrys*, *Humicola*, *Zopfiella*, and *Podospora*. Parasitic genera such as *Trichoderma* (mycoparasite) and *Purpureocillium* (animal parasite) were also only found in healthy samples and have been linked to improved in plant health and resilience (Gong et al., 2017; Dutta et al., 2022). On the other hand, genera exclusive to declined samples were saprotrophs (*Tetracladium*, *Preussia*, *Tausonia*) or animal parasites (*Exophiala*), although none of them have been described as detrimental to plant health so far.

Within the genera present in both declined and healthy plants, many were differentially abundant, with few genera having significant differences. The chestnut ecosystem had the highest amount of differentially abundant genera. The healthy chestnuts had 4 differentially abundant genera; one of them, *Monocillium*, was significantly different compared to declined chestnuts and is known for having a saprotrophic lifestyle, with some species being nematode parasites (Ashrafi et al., 2017). Some genera that were more abundant in declined chestnuts also have a saprotrophic lifestyle (*Cystofilobasidium*, *Cladorrhinum*, *Lophiostoma*, *Lophotrichus*), and a few are well known as plant pathogens. For example, *Alternaria* and *Aspergillus* have several

species that are either obligate or facultative pathogens. In cork oak, no significant differences were found between declined and healthy plants, neither in the alpha diversity nor in the differential abundance. In other host species, fewer genera were differentially abundant according to health condition.

Functional profiles revealed a predominance of genera with pathogenic and saprobic primary lifestyles in all tree species. This is in line with previous studies that showed high percentage of endophytes with pathogenic potential in twigs from declining *Quercus* species (Ragazzi et al., 2003). It has been long hypothesized that weak pathogens that have an endophytic state as part of their life cycle might play a role in the rapid decline of stressed oak trees (Petrini and Fisher, 1990; Kehr and Wulf, 1993; Ragazzi et al., 1995). Environmental adversities such as drought can induce switches in the lifestyle of an endophyte from neutral to pathogenic (Gonthier et al., 2006; Moricca and Ragazzi, 2008; Porras-Alfaro and Bayman, 2011). Type and abundance of functional guilds are also coincidental with recent studies performed on soil mycobiota of declining dehesas (Ruiz Gómez et al., 2019). This may be indicative of an increased trafficking of soil-borne fungi to above-ground tissues, taking into account that stressed trees show higher colonization frequencies in comparison to healthy trees (Ragazzi et al., 2003). However, differences in abundance of functional guilds according to health status were not uniform among tree species. It should also be noted that fungi might have different lifestyles when inhabiting tree wood than when observed in soil, which would add to the variability caused by host species and by the different abiotic stressors affecting each sampling site more severely.

There are some limitations to the present work that should be taken into consideration when interpreting the results. First, the study was performed after extracting total DNA and hence it is not possible to check if the microbial communities detected were living or dead. Pathogens are not likely to affect non-active or dead communities present in the ecosystems, and therefore, an RNA sequencing study (for example, studying rRNA instead of rRNA genes) could help to understand how pathogens affect active communities. Second, lack of samples from other latitudes and environmental conditions make it difficult to consider the potential environmental and demographic effects on mycobiomes. It remains to be explored how a combination of biotic and abiotic stress could affect the mycobiome composition. Moreover, although the ITS regions of ribosomal DNA are considered useful DNA barcodes for fungi, in some genera, such as *Fusarium*, these regions are very conserved across species, complicating OTU identification at species level. We tried to avoid this problem by using data up to the genus level to have better confidence. In turn, this hinders inferences about the functional roles of fungi based on their primary lifestyle because different species within a genus can have very different roles. Nonetheless, the same species can change its role depending on the host, making

in silico predictions of functional guilds noisy at any taxonomic resolution level. Moreover, databases still offer partial collections of functional traits, rendering functional analysis incomplete at best. Finally, comparison between different ecosystems should be taken with caution, given the limited sample size.

As a conclusion, in this work we show the resilience of above-ground fungal mycobiota in four tree species located in declining Mediterranean forests. Our study indicates that beta diversity but not alpha diversity of fungal communities was significantly affected by health status of the host trees. Some indicator genera that were only present in either diseased or healthy plants were also identified. These genera could be valuable for assessing the plant's health status and could be used as predictors of the onset of declines.

Data availability statement

Data and scripts used in this study are available in the following GitHub repository: https://github.com/serbiodh/2022_FrontiersForests. Raw sequencing data are available at NCBI SRA under BioProject PRJNA885270.

Author contributions

AB and LE collected the data. SD-H and FA analyzed the data. SD-H, FA, JN-S, EH, WM, and JD designed the sampling and wrote the manuscript. All authors contributed to the article and approved the submitted version.

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Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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Supplementary material

The Supplementary Material for this article can be found online at: <https://www.frontiersin.org/articles/10.3389/ffgc.2022.1056980/full#supplementary-material>

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