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# Colombian coffee (*Coffea arabica* L.) plantations: a taxonomic and functional survey of soil fungi

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Fungi are essential players in the maintenance of global coffee productivity, but their taxonomic and functional diversity in tropical and subtropical soils of Latin America remains largely unexplored. To address this concern, soil fungi were surveyed in six farms in three traditional coffee-growing regions of Colombia (Cauca, Magdalena, and Risaralda). Five farms were organic and newly established (<1 to 15years) with low shade, and one farm was under long-term conventional management (>30years old) with higher shade cover. We used amplicon sequencing and functional prediction based on the FUNGuild annotation tool. Fungal community composition diverged among farms, with Mortierella (Mortierellomycota) and Saitozyma (Basidiomycota) among the most prevalent genera. Functional prediction revealed the predominance of saprotroph-symbiotroph and pathotroph fungi. The endophyte and litter decomposer Mortierella genus was dominant within the saprotrophs and symbiotrophs. The pathotroph community was characterized by insect pathogen species belonging to the Metarhizium (Ascomycota) genus. Indeed, M. anisopliae and M. marquandii were identified as indicator species in the conventional long-term shaded farm. This study revealed that coffee plantations studied sustain a diverse fungal community and nurture potentially beneficial species. Further studies are needed to elucidate how particular management practices can nourish beneficial fungi, suppress detrimental species, and promote more sustainable coffee production.

### KEYWORDS

coffee mycobiome, sustainable agriculture, shade, microbiome, amplicon sequencing

### **1** Introduction

Coffee (*Coffea arabica* L.—Rubiaceae) is the second most valuable commodity in the world after oil. It is a major crop in many countries in Latin America, Africa and Asia. Colombia is the third-largest global coffee producer after Brazil and Vietnam (de Oliveira Junqueira et al., 2019). Colombian coffee cultivation produces income that accounts for 15% of the agricultural GDP and employs 2.5 million people annually (Cano-Sánz et al., 2013). The success of coffee cultivation in Colombia is mainly due to rich volcanic-ash soil, abundant annual rainfall (200 mm per month on average), and high altitudes (1,800–2,000 m) where the Arabic coffee grows (Lara-Estrada and Vaast, 2005). However, such conditions overlap with areas of

enormously rich biodiversity (Komar, 2006). Consequently, coffee represents a promising crop in the described environment but entails an undeniable impact on local and global biodiversity (Jha et al., 2014).

Different cropping strategies for coffee cultivation have a particular impact on biodiversity (Moguel and Toledo, 1999). Agroforestry, also known as shade-grown management, supports coffee plantations in the understory of native and exotic trees. Diversified shade management has been the basis of traditional coffee plantations and offers a refuge for biodiversity, such as arthropods, mammals, amphibians and birds (De Beenhouwer et al., 2013; Perfecto et al., 2014), with tree leaf litter being an important source of carbon that modulates soil biota structure and functions (Rao et al., 2020). Coffee farm management is gradually shifting away from shade-grown management in favor of sun-intensive, higher-yield farms (DaMatta, 2004; Bravo-Monroy et al., 2016; Velmourougane and Bhat, 2017; Harvey et al., 2021). Compared to the available information about the impact of coffee cultivation on aboveground diversity, relatively little is known about belowground microbial diversity.

Among soil-borne microorganisms, soil fungi regulate key ecosystem processes, including plant productivity and carbon mineralization and sequestration. They are essential decomposers, mutualists, and pathogens (Webster and Weber, 2006). Certain pathogenic and mutualistic fungi have been extensively studied in coffee (Lovera et al., 2022; Lu et al., 2022b). For example, in the period from 2008 to 2011, until the appearance of resistant cultivars, Hemileia vastatrix caused a massive outbreak of coffee leaf rust in C. arabica plantations with significant economic losses (Cristancho et al., 2012; Talhinhas et al., 2017; Gichuru et al., 2021). On the other hand, the mutualistic association between coffee and arbuscular mycorrhizal fungi (AMF) has been well documented (Urgiles-Gómez et al., 2021; Lovera et al., 2022). Nevertheless, there is scarce information about overall soil fungal communities and their ecological functions, which are of utmost importance for sustainable crop management (Duong et al., 2020; Rao et al., 2020).

Soil fungal responses are context-dependent, and local conditions determine the resultant assemblage and functions of fungal communities (Lekberg et al., 2021; Wang et al., 2021; Tedersoo et al., 2022). For example, fungal diversity showed high sensitivity to the legacy effects of land uses in the past (Turley et al., 2020; Correia et al., 2021) and along altitudinal gradients (Ogwu et al., 2019). In coffee plantations, earlier studies revealed that the soil fungal community is strongly influenced by agronomical management (i.e., conventional vs. organic) and the canopy composition in agroforestry systems on Nicaraguan farms (Jurburg et al., 2020), while altitude, the regional floristic domains and Coffea species were the main drivers of fungal diversity on Brazilian farms (Veloso et al., 2020, 2023). However, in situ surveys of soil fungi are missing in important and traditional coffee-growing regions of Colombia. Notably, unsustainable farm practices can favor pathogenic species (Jurburg et al., 2020; Rao et al., 2020), and impoverish the pool of mutualistic fungi from which plant roots can be colonized (Brinkmann et al., 2019; Prates Júnior et al., 2019; Lovera et al., 2022). In addition, valuable agents against pathogens and pests in coffee plantations, such as entomopathogenic and endophyte fungal species, are also sensitive to management practices (Vega et al., 2008; Duong et al., 2020; Bayman et al., 2021).

This study aimed to identify and describe the community composition and ecological functions of soil fungi in coffee farms in three traditional coffee-growing regions of Colombia. We conducted our study in six farms with divergent management practices (one conventional and five organic), which also varied in shade management, the plantation age and environmental properties. Certainly, we acknowledge that the multiplicity of conditions that characterize the farms across the studied regions can determine the existing fungal community (Lekberg et al., 2021; Wang et al., 2021; Tedersoo et al., 2022). For this reason, we focused on the identification of abundant genera, indicator species, and functional guilds. Despite the aforementioned sampling limitations, this investigation offers insight into the soil fungal taxonomy and ecological functions and provides an empirical baseline supporting the implementation of sustainable agricultural practices in Colombian coffee plantations.

### 2 Materials and methods

### 2.1 Description of the study area

The experimental sites were located in three Colombian coffeegrowing regions: Cauca (Cau), Risaralda (Ris), and Magdalena (Mag) (Figure 1). The Cauca and Risaralda regions were characterized by Andosols while Acrisols prevailed in the Magdalena region (IUSS Working Group WRB, 2022, adapted from IGAC, 2022). In Cauca, the farm was located in the town of El Tambo. The region is part of the southwestern Andean mountains of Colombia, characterized by diverse topography and favorable edaphic and climatic conditions for producing top-tier coffee (Rekik et al., 2018). In Risaralda, the surveyed farms were located in the town of Quinchia, in the central Andean mountains. Risaralda stands as the preeminent coffeeproducing region in Colombia, commonly denominated as the 'Eje Cafetero' or Coffee Central Axis. For over a century and a half, this expansive territory has played a pivotal role as the principal epicenter of coffee cultivation in Colombia. Risaralda's abundant rainfall and fertile soils contribute to the production of high-quality Arabica coffee beans (García et al., 2014; Velandia-Silva, 2017). In Magdalena, the farms were in the town of Minca, in the northern part of the country. It harbors diverse ecosystems, including coastal areas, mountains, and tropical forests that differentiate it from any other coffee-producing area in Colombia (García et al., 2014). In Magdalena, studied coffee farms were small (less than one hectare) with low-tech coffee management.

The six coffee farms surveyed differed in the use of agrochemicals [conventional (1) vs. organic (5)] and shade management [low (3) vs. higher shade cover (3)] (Table 1). *Cordia alliodora, Inga densiflora,* and *Eucalyptus grandis* were the most prevalent tree species in shaded coffee plantations. In the organic farms certified by the National Coffee Federation, nutrient are replenished through the application of homemade organic amendments produced on-site and the cultivation of beneficial legumes. Pesticides for pest and disease control are prohibited. In the surveyed conventional farm, synthetic chemicals are used for fertilization, as well as for pest and weed control.

### 2.2 Soil sampling

The samples were collected between July and August 2021. Before collection, the surface of each sampling area was manually cleaned to



TABLE 1 Description of study sites (i.e., farms) belonging to three traditional coffee regions of Colombia located in Cauca (Cau), Magdalena (Mag\_1; Mag\_2), and Risaralda (Ris\_1; Ris\_2; Ris\_3).

Farm	Region	Management	Age (years)	Shade (%)	Coffee variety	Altitude (masl)	MAP* (mm)	MAT⁺ (°C)	Latitude (°)	Longitude (°)
Cau	Cauca	Organic	<1	0	Castillo	1750	2,755	19.24	2.461	-76.803
Mag_1	Magdalena	Conventional	30	80	Colombia	1,570	2,800	21.60	11.077	-74.037
Mag_2		Organic	<1	20	Colombia	940	2,800	21.60	11.088	-74.077
Ris_1	Risaralda	Organic	10	0	Colombia	1,582	2,623	16.58	5.352	-75.728
Ris_2		Organic	5	0	Colombia	1,670	2,623	16.58	5.349	-75.725
Ris_3		Organic	5	70	Colombia	1,699	2,623	16.58	5.364	-75.727

\*MAP, mean annual precipitation; \*MAT, mean annual temperature.

remove organic material such as leaf litter, branches, stems of plants, inorganic debris, etc. In each farm, one transect of 500 plants was selected and five plants, each separated by 20 coffee shrubs, were sampled. A sample of 50-150 g of soil was collected using a sterile metal spatula at a depth of 0-20 cm and 30 cm from each coffee trunk. Samples were stored in sterile Ziploc-type plastic bags (4°C) and transported to the Laboratory of Molecular Interactions of Microorganisms in Agriculture (LIMMA), Universidad de Los Andes, for further processing.

### 2.3 Soil properties

Soil sampling for physicochemical analyses were performed in one composite sample per farm at the Soil and Foliar Laboratory, Universidad Tecnológica de Pereira, Colombia. In Mag\_1 and Mag\_2 farmers carried out sampling. Unfortunately, due to circumstances beyond our control, we were unable to conduct physicochemical analyses of the Mag\_2 farm because the farmer did not provide the soil sample. In the remaining sites, pH was measured

with a potentiometer in water (1:1), organic matter (OM) with the Walkley-Black photometric method, and electrical conductivity (EC) in paste saturated with water using a conductivity meter. Iron (Fe), manganese (Mn), zinc (Zn), and copper (Cu) ions were determined by the atomic absorption technique (acetate+EDTA). Boron (B) was determined by extraction with monocalcium phosphate, azomethine H., and photometric detection; sulfur (S) was determined by the turbidimetric method after extraction with monocalcium phosphate. Phosphorus (P) was analyzed using the Bray II photometric method. Texture was determined by Bouyoucos, and exchangeable acidity was determined by the volumetric method under KCl extraction. The bases - potassium (K), calcium (Ca), magnesium, (Mg), and sodium (Na) - were analyzed by the ammonium acetate method, using atomic absorption. Finally, cation quantified by exchange capacity (CEC) was atomic absorption spectrophotometry.

### 2.4 DNA extraction

Molecular identification of soil fungi was conducted using five soil replicates per individual farm. DNA was extracted from 250 mg of fresh soil using DNeasy<sup>®</sup> PowerSoil<sup>®</sup> Pro-Kit (Qiagen), following the manufacturer' recommendations. DNA quality and quantity were checked by 1% agarose gel electrophoresis, and spectrophotometry was conducted using the NanoDrop<sup>TM</sup> 2000 (Thermo Fisher Scientific<sup>TM</sup>). The DNA samples were stored at - 80°C until further processing.

# 2.5 Library preparation and high throughput sequencing

Amplification was performed using fungal-specific primers ITS3\_ KyO2F (5'-GATGAAGAACGYAGYRAA-3') and ITS4R (5'-TCCTCCGCTTATTGATATGC-3') targeting the internal transcribed spacer (ITS2) region (Toju et al., 2012). Library preparation and high-throughput, pair-end sequencing were performed on the Illumina MiSeq PE250 platform of the Genomics Unit of the IABIMO (INTA, Hurlingham, Buenos Aires, Argentina).

### 2.6 Bioinformatics analysis

Bioinformatics processing of the reads was performed with QIIME 2 version 2022.2 (Bolyen et al., 2019). Illumina adapters and primers were trimmed with the cutadapt function of QIIME2 pipeline. Next, denoising processing was performed using DADA2 version 2022.8.0 (Callahan et al., 2016). Amplicons with more than 100 bp were retained and amplicon sequence variants (ASVs) were generated. The taxonomic assignment of each ASV was annotated using the q2-classify-sklearn module against UNITE 8.3 database (Nilsson et al., 2019). Functional guilds were assigned at the genus level using the annotation tool FUNGuild (Nguyen et al., 2016). Only 'highly probable' and 'probable' confidence rankings were considered for further analyses. Among the total number of ASVs, 75.2% were assigned to a specific functional group.

### 2.7 Statistical analysis

Sequencing efficacy was assessed with rarefaction analysis using the rarefy function from the R package VEGAN (Oksanen et al., 2015). For further analyses, the data matrix was standardized by rarefaction to the minimum read count per sample (12,174). This approach, which consists of randomly selecting reads in each sample until the minimum read count is reached, is optimal for reducing bias due to differences in sample size while retaining information (De Cárcer et al., 2011). Alpha diversity indexes were calculated using the diversity function from the R package VEGAN (Oksanen et al., 2015). Differences in alpha diversity indexes among farms were tested using Tukey post hoc analyses with Bonferroni correction after Kruskal-Wallis tests from the R package STATS (R Development Core Team, 2022). The effect of farms on soil fungal community composition was assessed by permutational multivariate analysis of variance (Anderson, 2001) using the adonis function with 9,999 permutations from the R package VEGAN (Oksanen et al., 2015). Variation in fungal taxonomic community composition was visualized by non-metric multidimensional scaling (three-dimensional NMDS, with 50 iterations) using the metaMDS function and Bray-Curtis distance from VEGAN package (Oksanen et al., 2015). We plotted ellipses representing communities belonging to the different farms with the ordiellipse function using the standard deviations of weighted averages (Oksanen et al., 2015). To identify fungal ASVs associated with a specific farm, we used indicator species analysis (Dufrêne and Legendre, 1997) as implemented by function indval from the R package LABDSV (Roberts, 2012). Only those ASVs with an indicator value of at least 0.25 were considered. To identify abundant genera, we detected those genera with ≥0.005 relative abundance per sample and present in at least 25% of sampling sites. Differences in the abundance of genera, phyla, and fungal trophic mode among farms were tested as described for alpha diversity indexes.

# **3** Results

### 3.1 Soil properties

Overall, soils had low nutrient content, considerably high levels of organic matter, and coarse textures with a predominance of sand among soil textural particles. Soils were characterized by moderate water retention (Supplementary Table S1), low cation exchange capacity (CEC), low P availability (except for Ris\_1) and poor base saturation. The cationic complex was dominated by acidic metallic components, namely Fe and Al (Table 1 and Supplementary Table S1).

# 3.2 Sequencing

A total of 5,034,648 ITS sequences/reads were obtained from 27 out of 30 samples submitted for sequencing. Three samples of Cau and one of Ris\_1 failed in the sequencing procedure. After cleaning and denoising processes, 316,524 reads were retained and 456 fungal ASVs were identified. All samples reached the asymptote when the number of reads was 12,174 (see Supplementary Figure S1). The raw reads were submitted to the European Nucleotide Archive and are available from BioProject PRJEB51624.

### 3.3 Alpha diversity

Alpha diversity indexes varied widely among farms with significant differences in observed richness and Shannon indexes (Table 2). The range of observed richness (ASVs) was around 30.6 (Mag\_2) and 107.2 (Mag\_1). Mag\_1 presented the highest value of Shannon index with an average of 2.97 whereas the range presented by the other farms ranged from 0.89 (Mag\_2) to 1.94 (Ris\_2). Farms did not exhibit differences in evenness of fungal species, according to the invSimpson index (Table 2).

### 3.4 Community composition

Composition differences in soil fungal communities were assessed across farms based on the Bray-Curtis distances between samples [PERMANOVA, df=5,  $R^2$ =0.6221, p<0.001]. This finding is further illustrated in the NMDS plot, where Mag\_1 and Mag\_2 formed separate and less dispersed groups onto the ordination plot (Figure 2).

Indicator species analysis revealed that 21 fungal ASVs were distinctive of a particular farm (Table 3). Thirteen out of the 21 indicator fungal ASVs were identified at the species level. Notably, Cau and Mag\_1 exhibited the highest number of indicator species, including pathotrophs, saprotrophs-symbiotrophs and pathotrophs-saprotrophs. Mag\_2 was characterized by the saprotroph-symbiotroph *Mortierella elongata* (Table 3). The saprotroph Ascobolaceae and the pathotroph-saprotroph *Septoriella* sp. were indicators of Ris\_1; while Ris\_2 did not show any indicator species and the pathotroph-saprotroph *Cordana bisbyi* was an indicator of Ris\_3 (Table 3).

Overall, 11 phyla were identified, and *Mortierellomycota*, *Basidiomycota*, and *Ascomycota* were the most abundant (Figure 3). The per sample abundance distribution and statistical comparisons among farms are presented in Supplementary Figure S2 and Supplementary Table S2, respectively. *Mortierellomycota* was dominant in Ris\_3 (88.4%) and Mag\_2 (88.2%) and less abundant in Mag\_1 (16.6%) (Supplementary Table S2). *Basidiomycota* was mainly found in Mag\_1 (43.8%) with a low abundance in Mag\_2 and Ris\_3 (both around 0.1%). *Ascomycota* was predominant in Mag\_1 (33.7%), and rare in Ris\_1 (0.7%) and Mag\_3 (0.2%) (Supplementary Table S2). *Chytridiomycota*, *Glomeromycota*, *Kickxellomycota*, and *Mucoromycota* were mainly found in Mag\_1, and *Rozellomycota* was detected in Cau (Supplementary Figure S2 and Supplementary Table S2).

TABLE 2 Observed richness, Shannon diversity and inverse of the Simpson indexes based on the taxonomic diversity of soil fungi.

Farm	Observed richness (S)	Shannon (H)	InvSimpson (1/D)
Cau	32.5 <sup>bc</sup>	1.75 <sup>b</sup>	2.76ª
Mag_1	107.2ª	2.97ª	7.52ª
Mag_2	30.6°	0.89 <sup>b</sup>	1.68ª
Ris_1	38.25 <sup>bc</sup>	1.05 <sup>b</sup>	2.60ª
Ris_2	81.2 <sup>b</sup>	1.94 <sup>b</sup>	6.29ª
Ris_3	56.4 <sup>bc</sup>	1.04 <sup>b</sup>	1.58ª

Different letters indicate significant differences within rows by Tukey *post hoc* analyses with Bonferroni correction after Kruskal–Wallis statistical tests.

### 3.5 Abundant genera

Six genera were identified as predominant among the coffee farms (Figure 4). By far, *Mortierella (Mortierellomycota)* was the most abundant genus, reaching up to 88% abundance, followed by *Saitozyma (Basidiomycota)* with 30% abundance in Mag\_1 (p<0.001). *Metarhizium (Ascomycota)* accounted for 8% in Mag\_1 and showed significant differences from the other five farms (p<0.0003). *Apiotrichum* and *Fusarium* did not show significant differences among farms (Figure 4).

### 3.6 Functional prediction

Saprotroph-symbiotroph was the most abundant trophic mode in the survey, accounting for up to 99% of detected functions in Mag\_2, and 43% in Mag\_1 (Figure 5). The genus Mortierella was representative of this trophic mode, with M. alpine, M. elongata, M. exigua, and M. minutissima identified at the species level (Figure 6). Potential pathotrophs were significantly more abundant in Mag\_1 than in any other surveyed farms, with a 24% relative abundance (Figure 5). Among the genera belonging to Pathotroph, Metarhizium reached the highest abundance, particularly in Mag\_1, with M. anisopliae and *M. acridum* identified at the species level (Figure 6). The potentially plant pathogens Clonostachys, Galactomyces, Giberella, Ilyonectria, and Thanatephorus were identified in low abundance considering the total counts (Supplementary Table S3 and Figures 5, 6). Saprotrophs reached up to 50% relative abundance in Mag\_1 but varied highly within farms (Figure 5). Pseudocoleophoma and Talaromyces dominated the saprotrophic fungi in Cau, while species with low prevalence and abundance aggregated in the category "others" predominated on the remaining farms (Figure 6). The pathotrophsaprotroph-symbiotroph group exhibited a low relative abundance (i.e., <1% of total reads) compared to the previous groups (Figure 5). In this trophic mode, Trichoderma longipilis and Trichoderma sp. predominated in Cau and Mag\_1, respectively (Figure 6).



FIGURE 2

Non-metric multidimensional scaling (NMDS) ordination of fungal community composition based on Bray-Curtis distance (k = 2, stress 0.08). Ellipses indicate one SD around group centroids of each farm.

Pathotroph-saprotroph and pathotroph-symbiotroph fungi showed low abundance and were absent on the Cau farm (Figure 5).

# 4 Discussion

Agriculture generates artificial systems through multiple human activities, which greatly alter the resources and environment, and affects the biodiversity patterns of pre-existing biota (Sun et al., 2016; García-Delgado et al., 2019; Vukicevich et al., 2019). Here, we evaluated the composition of soil fungal communities in six coffee farms across three main coffee-growing regions in Colombia (Cauca, Risaralda, and Magdalena). These regions exhibited particular climatic and edaphic conditions, typical of soils intended for coffee production (Vaast et al., 2006). We found differences in community composition and ecological functions of soil fungi, which could be expected given the distinct geographical locations (Tedersoo et al., 2014; Nilsson et al., 2019), altitudinal gradients (Ogwu et al., 2019), topology (Veloso et al., 2020), floristic domains (Veloso et al., 2023), and inherent soil properties (Sun et al., 2016; Jurburg et al., 2020; Ning et al., 2021). However, to the best of our knowledge, the great predominance of the saprotroph-symbiotroph Mortierella and the genus Saitozyma is an unprecedented result that highlights the need for further investigation to disentangle the potential benefits as well as the consequences of this finding on the maintenance of sustainable coffee plantations (Duong et al., 2020).

We found that the conventional long-term shaded farm showed a diverse fungal community and high number of indicator species. *Ascomycota* and *Basidiomycota* exhibited the highest abundances (33.7 and 44%, respectively) in Mag\_1, the farm under conventional management, and were non-dominant on the remaining farms (2–22% and 1–8%, respectively). On the other hand, *Mortierellomycota* dominated fungal abundance, with up to 88% of the total number of reads in a single sample belonging to the organic farms. Such differences in phyla distribution are consistent with further taxonomical and functional indicators evaluated in this study (i.e., indicator species, abundant genera, and abundant trophic modes).

Ascomycota, Basidiomycota, and Mortierellomycota are considered ubiquitous in natural and anthropogenic soils (Yang et al., 2019; Chen et al., 2020; Wang et al., 2021). Ascomycota and Basidiomycota comprise a great variety of species displaying a wide range of lifestyles (Webster and Weber, 2006). In a previous report on soil fungi in orchards in Boyacá Department, Colombia, Landinez-Torres et al. (2019) found that ~60% of the abundance belonged to Ascomycota followed by ~20% Basidiomycota and ~15% Zygomycota (formerly the phylum that contained Mortierellomycota). This study observed a similar pattern of relative abundance across the seven sites assessed in their survey (Landinez-Torres et al., 2019). Guevara (2005) found that

TABLE 3 Indicator species analysis showing characteristic fungal species (indicator value >0.25) of studied coffee farms.

Cluster	Indicator species [phylum]+	Ind. value	Probability	Trophic mode	Guild*
Cau	Clonostachys candelabrum [A]	0.925	0.002	Pathotroph	РР
	Mortierella minutissima [M]	0.788	0.001	Saprotroph-Symbiotroph	E-LS-SS
	Mortierella sarnyensis [M]	0.862	0.003	Saprotroph-Symbiotroph	E-LS-SS
	Papiliotrema laurentii [B]	0.857	0.002	na	na
	Pseudocoleophoma sp. [A]	0.990	0.001	Saprotroph	US
	Scedosporium sp. [A]	0.858	0.007	Saprotroph	US
Mag_1	Circinella simplex [Mu]	0.731	0.008	Saprotroph	US
	Cladosporium sphaerospermum				
	[A]	0.800	0.007	na	na
	Clonostachys sp. [A]	0.863	0.001	Pathotroph	PP
	Ilyonectria sp. [A]	0.950	0.001	Pathotroph	РР
	Metarhizium anisopliae [A]	0.760	0.002	Pathotroph	AP
	Metarhizium marquandii [A]	0.674	0.005	Pathotroph	AP
	Penicillium sp. [A]	0.969	0.001	Saprotroph	DS-WS
	Phialocephala humícola [A]	0.959	0.001	Symbiotroph	Е
	Sagenomella diversispora [A]	0.800	0.007	Saprotroph	US
	Saitozyma podzolica [B]	0.787	0.001	na	na
	Setophoma sp. [A]	0.696	0.008	Pathotroph-Saprotroph	FP-PP-PS
Mag_2	Mortierella elongata [M]	0.610	0.001	Saprotroph-Symbiotroph	E-LS-SS
Ris_1	Ascobolaceae [A]	0.971	0.001	Saprotroph	DS-WS
	Septoriella sp. [A]	0.991	0.001	Pathotroph-Saprotroph	FP-PP-PS
Ris_3	Cordana bisbyi [A]	0.695	0.01	Pathotroph-Saprotroph	na

Trophic mode and functional guild were added based on FUNGuild database. \*Phylum: A, Ascomycota; B, Basidiomycota; M, Mortierellomycota; Mu, Mucoromycota. \*Guild defined according to FUNGuild database (Nguyen et al., 2016): AP, animal pathogen; E, endophyte; E-LS-SS, endophyte-litter saprotroph-soil saprotroph; DS-WS, dung saprotroph- wood saprotroph; FP-PP-PS, fungal parasite-plant pathogen-plant saprotroph; PP, plant pathogen; US, undefined saprotroph; na, not available information.

conversion of natural forest to coffee plantation greatly affected the abundance of *Basidiomycota*, particularly mycelial cord-forming fungi, due to changes in soil micro-environmental conditions.

*Mortierellomycota* is frequently represented in investigations of soil fungi. It has been identified among generalist fungi of cropping systems (Toju et al., 2018; Grzadziel and Gałazka, 2019; Wang et al., 2021), and among the most characteristic micro-fungal species in montane cloud forest (Velez et al., 2021). *Mortierellomycota* became highly dominant in soils after the addition of organic amendments (Li et al., 2018, 2021), and high soil P availability negatively affected



### FIGURE 3

Relative abundances of soil fungal phyla in coffee farms. "Other" indicates the relative abundance of minor phyla *Aphelidiomycota* and *Zoopagomycota*. "Unidentified" indicates the relative abundance of ASVs belonging to Fungi but not associated with further taxonomic groups. Asterisks (\*) indicate significant difference in phylum abundance according to Tukey post-hoc analyses with Bonferroni correction after Kruskal–Wallis statistical tests (Supplementary Table S2).

*Mortierellomycota* abundance (Detheridge et al., 2016; Orrù et al., 2021). Hence, considering that our study was conducted mostly in P-impoverished soils, we infer that such conditions might have created a favorable trophic niche for *Mortierellomycota* development (Sun et al., 2016; Li et al., 2021). Indeed, *Mortierella* was the predominant genus in five out of the six studied coffee farms, and it was identified as indicator species of organic farms. This result can be associated with the application of organic amendments on the organic farms (Li et al., 2018, 2021), which are not generally used on conventional farms as these rely on mineral fertilization (Perfecto et al., 2019).

The fungal functional guild analysis revealed a strong association between predicted functions and taxonomic composition. The great predominance of *Mortierellomycota* is consistent with the prevalence of the saprotroph-symbiotroph trophic mode and the representative species detected in this study (i.e., *Mortierella alpina, M. elongata, M. exigua,* and *M. minutissima*). It is noteworthy that the genus *Mortierella* comprises several phosphate-solubilizing species (Osorio Vega et al., 2015; Ceci et al., 2018), as well as species able to assist roots and mycorrhizal fungi in P acquisition (Tamayo-Velez and Osorio, 2017). Our results highlight the potential role of *Mortierella* in carbon turnover and P acquisition on the surveyed farms, particularly in recently established coffee plantations suggesting this genus can be considered a beneficial component of the soil fungal community.

Potentially pathogenic fungi were abundant in the studied soils and included species of crucial agronomical importance. Animal, plant, and insect pathogens are the main functional guilds of pathotrophs (Nguyen et al., 2016). Plant pathogens were found in very low abundance across the surveyed farms, and only *Thanatephorus* (teleomorph of *Rhizoctonia solani*) was found to be a potential coffee disease (Priyatmojo et al., 2001). This pathogen is not a menace in productive plantations and has rarely been reported in coffee plantations (Duong et al., 2020; Lu et al., 2022b). *Apiotrichum* and *Fusarium* were among the dominant genera, and this finding was previously reported in coffee plantations and montane forest (Arias and Abarca, 2014; Velez et al., 2021). *Apiotrichum* and *Fusarium* have been described as devastating pests affecting coffee production in Africa, where they usually infect mature trees and affect



Proportion of reads (0 to 1) of the most abundant genus of soil fungi (A-F) ( $\geq 0.005$  of relative abundance per sample and present in at least 25% o sampling sites). Solid lines indicate medians; boxes and whiskers indicate quartiles and ranges, respectively. Different letters indicate statistical differences among farms by Tukey post-hoc analyses with Bonferroni correction after Kruskal Wallis statistical tests.



Proportion of reads (0 to 1) of the most abundant trophic modes (A-F) ( $\geq$  0.005 of relative abundance per sample and present in at least 25% of sampling sites). Only trophic modes with "probable" and "highly probable" confidence were considered. Solid lines indicate medians; boxes and whiskers indicate quartiles and ranges, respectively. Different letters indicate statistical differences among farms by Tukey post-hoc analyses with Bonferroni correction after Kruskal Wallis statistical tests.

coffee quality by the premature ripening of coffee beans (Rutherford and Phiri, 2006). Although farmers did not report damage caused by the fungal species in this study, they are a potential menace that deserves further consideration.

Conversely, insect pathogen species belonging to *Metarhizium*, in particular *M. anisopliae* and *M. acridum*, were characteristic of the conventional long-term shaded farm (Mag\_1) (Figures 4, 6). In addition to their well-documented entomopathogenic function, *Metarhizium* can also colonize plant root tissues as an endophyte, resulting in increased tolerance against pests and diseases (Behie and Bidochka, 2014; Altinok et al., 2019). In coffee plantations, *M. anisopliae* is used as a biopesticide to control nematodes (*Tylenchida*: Heteroderidae) and the coffee berry borer (*Coleoptera*: Cucurlionidae), which cause significant economic losses in coffee crops (Escobar-Ramírez et al., 2019; Cure et al., 2020; de Oliveira et al., 2021). It remains to be established whether the sequences identified in this study are vestiges of the commercial products applied on the farm in recent years or the native inhabitants of the soil microbiome.

Saprotrophs were among the abundant trophic modes with a high number of species with low prevalence (i.e., <25%) and low abundance per site (i.e., <10%) that were grouped as "other." Dominance of saprotroph was reported earlier in tropical forests and coffee plantations suggesting that saprotrophs are key players in nutrient cycling (Looby and Treseder, 2018; Velez et al., 2021). Among the surveyed farms, we found that Ascomycotan *Arachnotheca glomerata* (Onygenaceae) and Basidiomycotan *Geastrum* spp. (Geastraceae) were prevalent with low abundance. *A. glomerata* possesses cellulose degradation abilities (Cano et al., 1987), while *Geastrum* has been reported to be an ectomycorrhizal fungus (Hibbett et al., 2000). The Cauca farm exhibited a distinct abundance of *Pseudocoleophoma* sp. that accounted for >75% of reads within the saprotrophic group and was identified as an indicator species of this site. *Pseudocoleophoma* is a genus belonging to Dictyosporiaceae and was recently isolated from decayed wood of *Coffea arabica* plantations in China (Lu et al., 2022a). According to the authors, their finding represents the first report of coffee-associated fungi in Dictyosporiaceae, and our results support this novelty. Probably, *Pseudocoleophoma* is a common saprotroph soil fungus without any record in coffee plantations due to the limited surveys of fungi on coffee debris.

We found a low abundance of Pathotroph-Saprotroph-Symbiotroph, Pathotroph-Saprotroph, and Pathotroph-Symbiotroph. Among these groups, we would like to highlight *Trichoderma*, which soared up to 2.5% of relative abundance in Mag\_1 and was among the abundant genera. *Trichoderma's* antimicrobial action has been used as a biocontrol agent against diverse phytopathogens in agroecosystems (Láng, 1936; Zamanizadeh et al., 2011). Mulaw et al. (2010) and Hoyos-Carvajal and Bissett (2011) isolated *Trichoderma* species inhabiting the rhizosphere of coffee plants. Arias and Abarca (2014) found *Trichoderma* as one of the most abundant and frequent genera among the saprotrophic fungi in coffee plantations. These authors suggest that its potential to produce large quantity of spores that are able to colonize a wide variety of substrates coupled with the ability to produce mycotoxins might constitute a competitive advantage of *Trichoderma* over other soil organisms in coffee plantations.

Among the fungi without a functional annotation, *Papiliotrema laurentii* (*Basidiomycota*), *Cladosporium sphaerospermum*, and *Saitozyma podzolica* were detected as indicators species. *P. laurentii* is an oleaginous yeast frequently found in soil, characterized by its ability to produce enzymes that degrade a wide diversity of carbon sources (de Almeida et al., 2022). In addition, *P. laurentii* can enhance mycorrhizal colonization of roots (Sampedro et al., 2004). *Cladosporium sphaerospermum* is usually found in soil air and has



Saprotroph. Symbiotroph (**D**), Pathotroph. Saprotroph (**E**), and Pathotroph. Symbiotroph (**F**) trophic modes. "Taxon" represents the highest taxonomic level revealed by the functional prediction database FUNGuild. Note that the trophic mode was assigned based on fungal genus (Nguyen et al., 2016). "Other" is comprised by taxon with abundances lower than 0.5% of total counts of the group and a prevalence higher than 0.25.

been reported to be a plant growth-promoting fungus (Hamayun et al., 2009). Dietzel et al. (2019) reported that *C. sphaerospermum* is a pathogenic fungus highly found in dust. Hamdouche et al. (2016) identified *C. sphaerospermum* among post-harvest fungi in *Coffea arabica* beans. Despite the ecological and agronomical role of *P. laurentii* and *C. sphaerospermum* in this survey, both were detected in limited abundance (i.e., <1%). In contrast, *Saitozyma (Basidiomycota)* was the second most dominant genus in our study (i.e., up to 50%). It has been recently cited as a common member of soils associated with *Coffea arabica* plantations in Brazil (Veloso et al., 2023). Although the FUNGuild database did not assign any ecological function to this genus, Veloso et al. (2023) propose that *Saitozyma* can be used as a starter culture in coffee fermentation to improve the

sensory perception of the coffee beverage due to its ability to degrade particular lignocellulosic compounds. In addition, according to Starmer and Lachance (2011), *Saitozyma* species are key soil yeasts that can act as saprotrophs, mutualists and parasites. Yurkov et al. (2012) and Yurkov (2018) proposed this species as a potential indicator of acidic, well-drained, soils. Future investigations are necessary to disentangle the ecological role of *Saitozyma* in tropical and subtropical soils under anthropogenic use as well as the potential implications in further coffee beverage processing.

Admittedly, evident design constraints affected the generalizability of the findings of this study. One of the main limitations of this research was the restricted sampling design, associated with the absence of comparable farms in the sampled regions and scarce funding. We are aware that our results might not be representative of heterogeneous regional agroecosystems. Studying farms with comparable land practices is pivotal to disentangling agronomicalbased causal effects, and here we attempted to explore the broadest area in order to include more sites from unexplored regions. Given the persistent lack of data on coffee soil microbiomes, our study makes a valuable contribution not only to local coffee farmers but also to global datasets of biodiversity from these poorly studied soils.

# 5 Concluding remarks

This exploratory survey sheds light on the composition of soil fungi in a poorly studied area with the goal of providing important information for ensuring a sustainable food production. Different fungal communities prevailed across the sampled regions. The saprotroph *Mortierella* was broadly frequent and dominant. *Saitozyma* was prevalent in the long-term agroforestry farm, and even though we could not assign an ecological function, this yeast may hold a valuable potential to improve the beverage quality of coffee. The identification of beneficial fungi such as *Metarhizium* and *Trichoderma*, widely used as biological control agents in Colombia's coffee production, is an indication of the health of coffee soils in the country. In addition, no major pathogens of coffee roots, such as *Rosellinia*, were identified in any of the samples.

### Data availability statement

The datasets presented in this study can be found in online repositories. The names of the repository/repositories and accession number(s) can be found in the article/Supplementary material.

# Author contributions

VO-H: Investigation, Methodology, Writing – original draft, Writing – review & editing. VF: Conceptualization, Formal analysis, Funding acquisition, Investigation, Methodology, Supervision,

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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/fsufs.2024.1345383/ full#supplementary-material

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