

Integrating variation in bacterial-fungal co-occurrence network with soil carbon dynamics

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- 1 **Integrating variation in bacterial-fungal co-occurrence network with soil carbon**
- 2 **dynamics**

Abstract

 1. Bacteria and fungi are core microorganisms in diverse ecosystems, and their cross-kingdom interactions are considered key determinants of microbiome structure and ecosystem functioning. However, how bacterial-fungal interactions mediate soil organic carbon (SOC) dynamics remains largely unexplored in the context of artificial forest ecosystems.

 2. Here, we characterized soil bacterial and fungal communities in four successive planting of *Eucalyptus* and compared them to a neighboring evergreen broadleaf forest. Carbon (C) mineralization combined with five C-degrading enzymatic activities was investigated to determine the effects of successive planting of *Eucalyptus* on SOC dynamics.

 3. Our results indicated that successive planting of *Eucalyptus* significantly altered the diversity and structure of soil bacterial and fungal communities and increased the negative bacterial- fungal associations. The bacterial diversity significantly decreased in all *Eucalyptus* plantations compared to the evergreen forest, while the fungal diversity showed the opposite trend. The ratio of negative bacterial-fungal associations increased with successive planting 17 of *Eucalyptus* due to the decrease in SOC, ammonia nitrogen (NH₄⁺–N), nitrate nitrogen 18 (NO₃^{-−}N), and available phosphorus (AP). Structural equation modeling indicated that the potential cross-kingdom competition, based on the ratio of negative bacterial-fungal correlations, was significantly negatively associated with the diversity of total bacteria and keystone bacteria, thereby increasing C-degrading enzymatic activities and C mineralization. 4. *Synthesis and applications*: Our results highlight the regulatory role of the negative bacterial- fungal association in enhancing the correlation between bacterial diversity and C mineralization. This suggests that promoting short-term successive planting in the

1 INTRODUCTION

 The soil microbiome is a highly diverse ecosystem that is modulated by the dynamic interaction of taxa with and across domains of life (Mould & Hogan, 2021). Microbial interactions have recently received attention for their importance in mediating essential biochemical cycles in soils that directly affect plant performance and productivity (Luo et al., 2019; Fan et al., 2021). Bacteria and fungi have been described to be present in almost all ecosystems, and their spatial proximity can lead to either synergistic or antagonistic interactions (Deveau et al., 2018; Maynard et al., 2019). The bacterial-fungal associations can be modulated by antibiotic metabolism, signaling molecules, protein secretion, and/or organismal modulation of the local physicochemical environment (Velez et al., 2021; Ruan et al., 2022). Ecological bacterial-fungal associations are important for the fitness and colonization rates of interacting partners, ultimately maintaining microbial diversity in various environments (Ghoul & Mitri, 2016; Jiao et al., 2021b). However, the patterns of bacterial-fungal associations that occur naturally in soils remain largely unknown. *Eucalyptus* is widely planted in southern China, and most plantations have been established as monocultures with multi-generational successive planting to achieve high timber production (Xu et al., 2020). Long-term monoculture has caused numerous ecological problems, such as soil degradation and loss of soil microbial diversity and ecosystem stability (Xu et al., 2021). Previous studies have reported strong negative associations between the saprotrophic fungal and bacterial community in *Eucalyptus* plantations (Chen et al., 2021). The changes in community diversity and bacterial-fungal associations may largely depend on successive generations, as high generations of *Eucalyptus* plantations substantially reduce soil fertility by reducing the inputs of litter and root exudate (Ismaw et al., 2012; Veldkamp et al., 2020). Keystone taxa are considered

 key components of microbial communities that regulate diversity and community functions through high potential interactions (Trivedi et al., 2020). The presence of keystone species has profound effects on the nature and magnitude of bacterial-fungal associations (Herren & McMahon, 2018; Chen et al., 2019). Whether and to what extent successive planting of *Eucalyptus* regulate microbial diversity and bacterial-fungal associations is an unanswered question that has been overlooked in current management practices for years.

 Soil organic carbon (SOC) is defined as the core property of soil, and SOC formation and mineralization are central to climate regulation, food production, habitat conservation, and nutrient cycling (Lehmann & Kleber, 2015). Understanding and quantifying the response of SOC 63 to bacterial-fungal associations is essential for regulating SOC dynamics (Mille-Lindblom $\&$ Tranvik, 2003; Sokol et al., 2022). Bacterial-fungal cooperation is an important pathway for SOC mineralization, and functional complementarity between these two groups may influence soil carbon metabolic capacity (van der Heijden et al., 2016; Durán et al., 2018). However, bacteria and fungi are known to share simple plant-derived substances (e.g., amino acids and sugars), and antagonistic bacterial-fungal associations induced by substrate competition can enhance carbon consumption and decomposition (de Boer et al., 2005; Cecilia et al., 2006). Microbial species in highly competitive communities often grow with low carbon efficiency due to the high energy invested in competition, suggesting that the strongly antagonistic interactions can cause high C resource consumption (Becker et al., 2012; Maynard et al., 2017a). Keystone taxa have great explanatory power for community function, and changes in keystone taxa diversity considerably influence the strength and direction of SOC dynamics (Berry & Widder, 2014; Fan et al., 2021). Bacterial-fungal co-occurrence patterns have long been of interest to microbial ecologists, but

 little attention has been paid to their impact on the microbial diversity-function relationships that underlie SOC dynamics.

 Eucalyptus has valuable economic importance in maintaining the world's timber supply (Hunter, 2001). Most *Eucalyptus* plantations in southern China are short-rotation (4–6 years), and successive planting of *Eucalyptus* can cause soil degradation with nutrient losses of nitrogen, phosphorus, and potassium (Temesgen et al., 2016; Zhu et al., 2019). In the present study, we sought to assess the structure of soil bacterial and fungal communities and patterns of bacterial- fungal co-occurrence potentially associated with SOC dynamics in response to successive planting of *Eucalyptus*. Specifically, this study focused on testing three hypotheses: (*i*) the successive planting of *Eucalyptus* will significantly affect the diversity and taxa co-occurrence patterns of bacterial and fungal communities; (*ii*) the negative bacterial-fungal associations will decrease bacterial diversity in the successive planting of *Eucalyptus*, as well as the diversity of keystone taxa; and (*iii*) the diversity and negative co-occurrence pattern of bacterial and fungal communities will jointly improve SOC mineralization.

2 MATERIALS AND METHODS

Experimental site description

 The experimental site is located in the state-owned Daguishan Forest Farm in Hezhou City, Guangxi Zhuang Autonomous Region, China (111°20'5''E, 23°58'33''N). The mean annual temperature in this area is 19.3℃, with mean annual precipitation and evaporation of 2,056 mm and 1,200 mm, respectively. The soil type is classified as red soil (i.e., ferralsols). A total of 12 97 plots (20 m wide \times 30 m long) were established to collect soil samples in triplicate representing

 four generations of *Eucalyptus* plantation. In each treatment, the *Eucalyptus* trees were at the same stage of development (i.e., 4 years after planting). The treatments included the first generation (PrG) of *Eucalyptus* reforestation, the second generation (SeG) regenerating after the PrG was cut, the third generation (ThG) regenerating after the SeG, and the fourth generation (FoG) regenerating after the ThG. An evergreen broadleaf forest with three adjacent plots was selected as the control (CK), which was a precursor to the *Eucalyptus* plantation. All the plots 104 were located within a 5 km² area. The *Eucalyptus* species planted in these plots was a hybrid of *Eucalyptus urophylla S.T. Blake* × *Eucalyptus grandis Hill ex Maiden* (*Eucalyptus urograndis*).

Soil sampling, physiochemical analysis, and microbial biomass

 Fifteen soil cores were collected from each plot using the "S" line soil sampling strategy and then 109 mixed evenly as a composite sample. Soil samples were collected from 15 plots (5 treatments \times 3 replicates) at a depth of 0−20 cm in July 2020. Samples were collected in sterile plastic bags and immediately transported to the laboratory (<12 h). After sieving (< 4 mm), each sample was divided for determination of soil chemical properties, the bacterial and fungal communities, soil enzymatic activities and carbon mineralization.

114 Soil bulk density was determined using 43 cm³ standard cylinders and by calculating total porosity (Pt) and aeration porosity (Pa). Soil pH was determined using a glass electrode pH meter (Sartorius, Germany) with a soil:water ratio of 1:2.5. Soil organic carbon (SOC) and total nitrogen 117 (TN) were determined using the $K_2Cr_2O_7-H_2SO_4$ oxidation method and the semi-micro Kjeldahl 118 method, respectively. Soil ammonium nitrogen (NH⁴⁺–N) and nitrate nitrogen (NO₃⁻–N) concentrations were measured using a flow analyzer (Astoria-Pacific 2-channel flow analyzer).

et al. (2010). Briefly, a subset of air-dried soil samples (i.e., 20 g per sample) were adjusted and

(Edgar et al., 2011), and frame shifts using HMM-FRAME (Zhang et al., 2011). Community-

Statistical analyses

 One-way analysis of variance (ANOVA) was used to test for differences in soil properties, microbial biomass, fungal and bacterial diversity, enzymatic activity, and C mineralization rates using the Bonferroni's post hoc test in SPSS 20.0 (SPSS, Chicago, IL, USA). Metrics of bacterial and fungal alpha diversity (i.e., Shannon index and Chao1 richness) and principal coordinate analysis (PCoA) were calculated using the 'vegan' package in R (R 4.0.3, R Development Core Team). The multiple regression model (lm function in 'stats' package) and variance decomposition analysis (calc. relimp function in the 'relaimpo' package) were used to estimate the importance of soil physicochemical properties in explaining variation in fungal and bacterial diversity and differences in microbial biomass (Grömping, 2006). Permutational multivariate analysis of variance (PERMANOVA) based on Bray-Curtis dissimilarity was used to examine differences between treatments.

 We constructed bacterial-fungal co-occurrence networks using SparCC with the iNAP network analysis pipeline (Feng et al., 2022). Only OTUs with ≥12 occurrences (from a total of 15 samples) were retained for network analysis. The co-occurrence of OTUs was determined with

bacterial and fungal communities. The hydrolytic enzymes β-1,4-glucosidase, β-xylosidase, acid

3 RESULTS

Soil properties, enzymatic activities, and carbon mineralization

 treatment. No significant differences were found for bulk density, total porosity, and aeration porosity among the *Eucalyptus* planting treatments (**Table 1**). Carbon mineralization was significantly lower (*P* < 0.05) in PrG and SeG treatments than in CK, ThG, and FoG treatments (**Fig. 1b**). Compared with CK treatment, *Eucalyptus* planting significantly (*P* < 0.05) decreased the enzymatic activities of sucrase (33.3%~64.0%), β-1,4- glucosidase (BG, 15.7%~38.9%), β-xylosidase (BX, 52.2%~63.2%), acid phosphatase (ACP, 58.7%~71.7%), and β-N-acetylglucosaminidase (NAG, 51.0%~76.3%) (**Fig. 1c**). BG and ACP activities were significantly (*P* < 0.05) higher in SeG, ThG, and FoG treatments than in PrG treatment. Sucrase activity was significantly (*P* < 0.05) lower in PrG, ThG, and FoG treatments than in CK and SeG treatments. However, BX and NAG activities were not significantly (*P* > 0.05) different among the *Eucalyptus* planting treatments (**Fig. 1c**).

Microbial biomass and diversity

 Microbial biomass measured as MBC, MBN and MBP significantly (*P* < 0.05) varied among the *Eucalyptus* planting treatments. The ThG and FoG treatments significantly (*P* < 0.05) decreased MBC by 40.8% and 49.0%, MBN by 93.1% and 95.1%, and MBP by 88.5% and 89.4% compared to CK and SeG treatments, respectively (**Fig. S1**). The Shannon index of bacterial communities significantly (*P* < 0.05) decreased with increasing years of *Eucalyptus* plantation. However, the Shannon index and Chao1 richness of fungal communities showed an opposite pattern (**Fig. 2a, b**). The Shannon index and Chao1 richness of bacterial communities were significantly ($P < 0.05$) higher in SeG treatment than in FoG treatment, while these indices for fungal communities were

significantly (*P* < 0.05) higher in ThG treatment than in SeG and PrG treatments.

Taxonomic composition of soil bacterial and fungal communities

 The soil bacterial communities were mainly composed of the phyla Proteobacteria (43.1%), Acidobacteria (33.2%), Actinobacteria (7.90%), Chloroflexi (7.20%), Verrucomicrobia (2.60%), and Firmicutes (2.19%) (**Fig. S2a**). At the genus level, the bacterial community was dominated by DA111 (13.8%), *Edaphobacter* (10.0%), *Variibacter* (5.82%), *Acidothermus* (4.98%), *Candidatus_Solibacter* (4.77%), *Bradyrhizobium* (3.44%), *Acidibacter* (3.90%), *Rhodanobacter* (2.30%), and *Bryobacter* (2.02%) (**Fig. S2c**). The fungal community consisted of the dominant phyla Ascomycota (63.1%), Basidiomycota (18.3%), and Zygomycota (17.1%), followed by the rare phyla Glomeromycota (0.55%) and Chytridiomycota (0.22%) (**Fig. S2b**). At the genus level, the fungal community was dominated by *Umbelopsis* (9.40%), *Penicillium* (4.79%), *Russula* (3.47%), *Tetracladium* (1.65%), *Issatchenkia* (0.98%), and *Scleroderma* (0.91%) (**Fig. S2d**). Principal coordinate analysis (PCoA) combined with permutational multivariate analysis of variance indicated that the composition of the bacterial community in PrG, SeG, and ThG treatments was significantly (*P* = 0.001) different from those in FoG and CK treatments (**Fig.**

Microbial co-occurrence networks

 The network analysis resulted in a network with 998 nodes and 6402 edges, a diameter of 5, an average degree of 6.415, an average path length of 3.796, a modularity of 0.543, and an average clustering coefficient of 0.169. The bacterial and fungal taxa contributed 57.9% and 42.1% of the nodes, respectively (**Fig. 3a-c**). Correlations between bacterial OTUs accounted for 41.7%, between fungal OTUs for 27.3%, and between bacterial and fungal OTUs for 31.0%. The bacterial-bacterial and fungal-fungal associations were mainly positive (40.0% and 22.4% of total edges), whereas the bacterial-fungal associations were primarily negative (24.9%) (Fig. 3d) (**Fig. 3d**). We found that there was a general trend to increase the number of negative bacterial-fungal correlations (26.6% and 25.4%, respectively) through the *Eucalyptus* planting generations (ThG and FoG treatments), as indicated by the ratios of negative edges to positive edges (**Fig. 3e**).

Negative bacterial-fungal associations correlated with carbon mineralization

 Random forest modeling showed that all predictors significantly contributed to carbon 312 mineralization (67.9%, $P < 0.05$) (Fig. S4). Soil pH, TN, and NH₄⁺-N were the stronger determinants of carbon mineralization (2.1%~6.9%, *P* < 0.05). To a lesser extent, carbon 314 mineralization was significantly $(P < 0.05)$ predicted by Shannon index of total bacteria (4.2%) and keystone bacteria (2.8%), fungal-bacterial correlations (3.2%), and soil enzymatic activities (BG, BX, and Sucrase) (4.4%~4.7%) (**Fig. S4**). Structural equation modeling provided further statistical evidence that keystone bacterial diversity was positively correlated with soil properties

4 DISCUSSION

Successive planting of *Eucalyptus* **affected the bacterial and fungal communities**

 We observed that successive planting of *Eucalyptus* significantly decreased the bacterial diversity, 330 but improved the fungal diversity due to changes in SOC, NH₄⁺–N, NO₃[−]–N, and AP (**Table 1**). Soil organic carbon is widely recognized as a key regulator influencing microbial diversity (Zhang et al., 2020). Continuous tree harvesting in *Eucalyptus* plantations significantly decreases SOC by reducing litter and root exudate inputs (Guillaume et al., 2015; Chen et al., 2021). *Eucalyptus* residues contain high amounts of recalcitrant organic biopolymers, and the accumulation of recalcitrant compounds in the soil after successive plantings may favor more fungal species and suppress bacterial growth (Mori et al., 2020). In general, soil fungi have a high ability to acquire resources, which allows them to be more adaptable to low SOC environments, and thus the decrease in SOC has less or even positive effects on fungal diversity (Yang et al., 2019). In contrast, bacteria may preferentially use labile organic compounds and grow with low C

Negative bacterial-fungal associations decreased bacterial diversity

 Our study showed that the negative bacterial-fungal associations increased with increasing generations of *Eucalyptus*, indicating the long-term *Eucalyptus* planting dominated the potential negative interactions between fungi and bacteria. The negative bacterial-fungal associations may be due to interference confrontation caused by antimicrobial compounds and to exploitative competition caused by responses to preferred energy sources for their metabolic demands (Banerjee et al., 2018; Hassani et al., 2018). We observed that six OTUs affliated with

 Aspergillaceae (Ascomycota) were classified as putative keystone taxa, and were mainly involved in fungal-bacterial associations. The putative keystone OTUs from Aspergillaceae may secrete antibiotics to maintain a high bonus from the "resource scramble" with bacteria. The strains of Aspergillaceae (e.g., *Penicillium* and *Aspergillus*) have the ability to produce antibiotics, which are an important part of microbial cross-kingdom warfare (Houbraken & Samson, 2011). Our results indicated that bacterial-fungal associations had strong negative correlations with bacterial diversity. The influences of negative associations on microbial diversity are affected by intrinsic differences in the antagonistic abilities of the association partners. Microbial secondary metabolites produced by the fungal community exert strong selective pressure on bacterial diversity through membrane disruption, inhibition of cell wall biosynthesis and primary metabolism, or disruption by quorum sensing signals (Getzke et al., 2019; Coller et al., 2019). The fungus *Penicillium* can inhibit the proliferation and dispersal dynamics of competing bacteria by producing antibiotics, thereby reducing bacterial diversity through antagonistic interactions (Bahram et al., 2018; Zhang et al., 2018). Given the asymmetries in bacterial-fungal competition, less adaptive bacterial taxa were more likely to be eliminated in the competitive interactions. Strong asymmetric competition can induce the elimination of weaker competitive genotypes and consequently reduce bacterial diversity (Guillemet et al., 2022). However, it should worth noting that the link between bacterial-fungal associations and bacterial diversity is bidirectional rather than unidirectional. Since potential bacterial-fungal competition can directly decrease bacterial diversity, it is indeed bacterial diversity that determines the direction and strength of bacterial- fungal interactions. We further showed that the keystone bacterial diversity increased with total bacterial diversity and negative bacterial-fungal correlations. Keystone taxa with different

 competitive strategies and trait expression can alter their morphology and metabolism, thereby persisting against direct displacement or overgrowth in the bacterial community (Maynard et al., 2017b). More importantly, keystone taxa are critical for maintaining soil microbial diversity and overall ecosystem plasticity (Herren & McMahon, 2018). These findings highlight the importance of keystone bacterial diversity within the microbial community in maintaining soil carbon function and enhancing SOC dynamics in the forest ecosystem.

Negative associations regulated the relationship between bacterial diversity and SOC dynamics

 Elucidating the relationships between microbial diversity and SOC dynamics in *Eucalyptus* plantations is crucial to elucidate the mechanism of the microbial community in regulating C mineralization in artificial forests. The high biodiversity induced by potential bacterial-fungal competition can improve ecosystem function in complex terrestrial ecosystems (Jiao et al., 2021b). However, we found that the positive relationship between diversity and function was not statistically supported when the negative bacterial-fungal associations were considered. In particular, the negative bacterial-fungal associations may favor the negative relationships of bacterial diversity with C-degrading enzymatic activities and C mineralization. Microbial diversity combined with negative associations in the network mediates microbial respiration and carbon use efficiency (Maynard et al., 2017a). The bacterial community exposed to the high negative association with fungi may have a significantly high metabolic affinity for sucrase, BG, and BX, which were involved in the degradation of carbohydrates, cellulose, and hemicellulose. This result indicated that the antagonistic bacterial-fungal associations decreased bacterial

 diversity and eventually improved the consumption of carbon resources and energy. We further observed that keystone bacterial diversity was negatively correlated with C-degrading enzymatic activities and C mineralization, supporting that the functional traits of keystone taxa are particularly important in determining the relationship between microbial diversity and SOC dynamics. These putative keystone taxa may have competitive traits and advantages to degrade recalcitrant C and more efficiently capture limiting resources. Keystone taxa are often essential for community functioning because they are responsible for carbon metabolic activities and C mineralization (Lynch & Neufeld, 2015; Chen et al., 2019). However, we find that it is difficult to provide empirical evidence for theoretical predictions about how keystone taxa orchestrate microbial diversity to mediate ecosystem processes. Therefore, further research is needed to manipulate specific keystone taxa to explore their ecological importance for the structure and functioning of entire microbial communities.

 Our study indicates that the decrease in bacterial diversity caused by negative bacterial- fungal associations regulates SOC dynamics under successive planting of *Eucalyptus*, which is usually overlooked in current management practices. Consistent with previous studies performed in different regions (Xu et al., 2021; Dai et al., 2023), SOC degradation was observed after two generations of successive planting of *Eucalyptus*. We found that the influences of *Eucalyptus* planting on total bacterial and keystone bacterial diversity and bacterial-fungal associations relied heavily on the generation of plantation. To prevent excessive SOC degradation in *Eucalyptus* plantations, it is preferable to avoid multi-generational planting (particularly planting more than two generations), and to prolong the rotation in *Eucalyptus* plantations that may undergo logging in the short term. To advance the explanatory and predictive understanding of SOC dynamics in

5 CONCLUSIONS

 Our study advances previous knowledge on microbial diversity and the potential for cross- kingdom competition to mediate SOC storage in forest ecosystems. We provided empirical evidence that successive planting of *Eucalyptus* increased negative bacterial-fungal associations and improved C-degrading enzymatic activities and C mineralization by decreasing total bacterial and keystone bacterial diversity. By linking SOC mineralization to negative bacterial-fungal co- occurrence, our study provides a framework for uncovering mechanistic insights into the patterns and biochemical consequences of important bacterial-fungal associations in soil systems (**Fig. 6**). These results can be extended to determine how changes in cross-kingdom associations modulate SOC cycling dynamics in a variety of ecosystems.

REFERENCES

Bader, G. D., & Hogue, C. W. (2003). An automated method for finding molecular complexes in

- large protein interaction networks. BMC Bioinformatics, 4(1), 2. https://doi:10.1186/1471- 2105-4-2
- Bahram, M., Hildebrand, F., Forslund, S. K., Anderson, J. L., Soudzilovskaia, N. A., Bodegom,
- P. M., [Bengtsson-Palme, J](https://www.webofscience.com/wos/alldb/general-summary?queryJson=%5B%7B%22rowBoolean%22:null,%22rowField%22:%22AU%22,%22rowText%22:%22Bengtsson-Palme,%20Johan%22%7D%5D&eventMode=oneClickSearch)., [Anslan, S](https://www.webofscience.com/wos/alldb/general-summary?queryJson=%5B%7B%22rowBoolean%22:null,%22rowField%22:%22AU%22,%22rowText%22:%22Anslan,%20Sten%22%7D%5D&eventMode=oneClickSearch)., [Coelho, L. P.](https://www.webofscience.com/wos/alldb/general-summary?queryJson=%5B%7B%22rowBoolean%22:null,%22rowField%22:%22AU%22,%22rowText%22:%22Coelho,%20Luis%20Pedro%22%7D%5D&eventMode=oneClickSearch), Harend, H., Huerta-Cepas, J., [Medema,](https://www.webofscience.com/wos/alldb/general-summary?queryJson=%5B%7B%22rowBoolean%22:null,%22rowField%22:%22AU%22,%22rowText%22:%22Medema,%20Marnix%20H.%22%7D%5D&eventMode=oneClickSearch)
- [M. H.](https://www.webofscience.com/wos/alldb/general-summary?queryJson=%5B%7B%22rowBoolean%22:null,%22rowField%22:%22AU%22,%22rowText%22:%22Medema,%20Marnix%20H.%22%7D%5D&eventMode=oneClickSearch), Maltz, M. R., Mundra, S., Olsson, P. A., Pent, M., Polme, S., Sunagawa, S., Ryberg,

Dai Q, Wang T, Wei P, & Fu Y. (2023). Effects of successive planting of eucalyptus plantations

Evolution, 21, 3548−3560. https://doi.org/10.1038/s41559-022-01841-9.

- Hassani, M. A., Durán, P., & Hacquard, S. (2018). Microbial interactions within the plant
- holobiont. Microbiome, 6(1), 58. https://doi:10.1186/s40168-018-0445-0
- He, Y., Caporaso, J. G., Jiang, X.-T., Sheng, H.-F., Huse, S. M., Rideout, J. R., Edgar, R. C.,
- Kopylova, E., Walters, W. A., Knight, R., & Zhou, H. W. (2015). Stability of operational
- taxonomic units: an important but neglected property for analyzing microbial diversity.

Microbiome, 3(1), 20. https://doi:10.1186/s40168-015-0081-x

- Herren, C. M., & McMahon, K. D. (2018). Keystone taxa predict compositional change in
- microbial communities. Environmental Microbiology, 20(6), 2207–2217. https://doi:10.1111/1462-2920.14257
- Houbraken, J., & Samson, R. A. (2011). Phylogeny of Penicillium and the segregation of
- Trichocomaceae into three families. Studies in Mycology, 70, 1–51. https://doi:10.3114/sim.2011.70.01
- Hunter, I. (2001). Above ground biomass and nutrient uptake of three tree species (Eucalyptus
- camaldulensis, Eucalyptus grandis and Dalbergia sissoo) as affected by irrigation and
- fertiliser, at 3 years of age, in southern India. Forest Ecology and Management, 144(1-3),
- 189–200. https://doi:10.1016/s0378-1127(00)00373-x
- Ismaw S.M., Gandaseca S., & Ahmed O.H. (2012) Effects of deforestation on soil major macro-
- nutrient and other selected chemical properties of secondary tropical peat swamp forest. Int.
- J. Phys. Sci. 7, 2225–2228. https://doi.org/10.5897/IJPS11.596
- Jenkinson, D. S., & Powlson, D. S. (1976). The effects of biocidal treatments on metabolism in
- soil-V. Soil Biology and Biochemistry, 8(3), 209–213. https://doi:10.1016/0038-

- 60–68. https://doi:10.1038/nature16069
- Luo, G., Sun, B., Li, L., Li, M., Liu, M., Zhu, Y., Guo, S., Ling, N., & Shen, Q. (2019).

- Maynard, D. S., Bradford, M. A., Lindner, D. L., van Diepen, L. T. A., Frey, S. D., Glaeser, J. A.,
- & Crowther, T. W. (2017b). Diversity begets diversity in competition for space. Nature
- Ecology & Evolution, 1(6), 0156. https://doi:10.1038/s41559-017-0156

- Ribeiro, H. M., Fangueiro, D., Alves, F., Vasconcelos, E., Coutinho, J., Bol, R., & Cabral, F.
- (2010). Carbon-mineralization kinetics in an organically managed Cambic Arenosol
- amended with organic fertilizers. Journal of Plant Nutrition and Soil Science, 173(1), 39–
- 45. https://doi:10.1002/jpln.200900015
- Ruan, C. J., Ramoneda, J., Gogia, G., Wang, G., & Johnson, D. (2022). Fungal hyphae regulate
- bacterial diversity and plasmid-mediated functional novelty during range expansion. Current
- Biology, 4131646. https://doi10.1016/j.cub.2022.11.009
- Sokol, N. W., Slessarev, E., Marschmann, G. L., Nicolas, A., Blazewicz, S. J., Brodie, E. L.,
- Firestone, M. K., Foley, M. M., Hestrin, R., Hungate, B. A., Koch, B. J., Stone, B. W.,
- Sullivan, M. B., Zablocki, O., Trubl, G., McFarlane, K., Stuart, R., Nuccio, E., & Weber, P.
- (2022). Life and death in the soil microbiome: how ecological processes influence biogeochemistry. Nature Reviews Microbiology, 20, 415−430. https://doi.org/10.1038/s41579-022-00695-z
- Sparks, D. L., Page, A. L., Helmke, P. A., Loeppert, R. H., Soltanpour, P. N., Tabatabai, M. A.,
- Johnston, C. T., & Sumner, M. E. (1996). Methods of Soil Analysis. SSSA Book Series.
- <https://doi:10.2136/sssabookser5.3>
- Temesgen, D., Gonzálo, J., & Turri ó n, M. B. (2016). Effects of short-rotation *Eucalyptus*
- plantations on soil quality attributes in highly acidic soils of the central highlands of Ethiopia.
- Soil Use and Management, 32(2), 210–219. https://doi:10.1111/sum.12257
- Trivedi, P., Leach, J. E., Tringe, S. G., Sa, T., & Singh, B. K. (2020). Plant–microbiome
- interactions: from community assembly to plant health. Nature Reviews Microbiology,
- 18(11), 607–621. https://doi:10.1038/s41579-020-0412-1

456, 117683. https://doi.org/10.1016/j.foreco.2021.119877

- Xu, Y., Ren, S., Liang, Y., Du, A., Li, C., Wang, Z., Zhu, W., & Wu, L. (2021). Soil nutrient
- supply and tree species drive changes in soil microbial communities during the
- transformation of a multi-generation *Eucalyptus* plantation. Applied Soil Ecology, 166,

103991. https://doi:10.1016/j.apsoil.2021.103991

- Yang, Y., Chen, H., Gao, H., & An, S. (2019). Response and driving factors of soil microbial
- diversity related to global nitrogen addition. Land Degradation & Development, 31, 190−204.
- https://doi:10.1002/ldr.3439
- Zhang, Y., & Sun, Y. (2011). HMM-FRAME: accurate protein domain classification for
- metagenomic sequences containing frameshift errors. BMC Bioinformatics, 12(1), 198.
- https://doi:10.1186/1471-2105-12-198
- Zhang, X., Liu, S., Wang, J., Huang, Y., Freedman, Z., Fu, S., Liu, K., Wang, H., Li, X., Yao,

Figure captions

 FIGURE 1 Soil organic carbon content (a), carbon mineralization (b) and enzymatic activities (c). Bars with different lowercase letters indicate significant differences (*P* < 0.05). PrG, first generation of *Eucalyptus*; SeG, secondary generation of *Eucalyptus*, ThG, third generation of *Eucalyptus*; FoG, fourth generation of *Eucalyptus*; CK, evergreen broadleaf forest as control. **FIGURE 2** Changes in soil bacterial (a) and fungal (b) diversity with successive planting of *Eucalyptus*, and the contribution of soil properties to bacterial and fungal diversity and microbial biomass based on correlation and best multiple regression model (c). Circle size represents variable importance (proportion of variability explained by multiple regression modeling and variance decomposition analysis). Colors represent Spearman's correlations. BD, bulk density;

 FIGURE 3 The bacterial-fungal co-occurrence network across all samples. (a) The nodes and edges of the network are colored by the modules. (b) The nodes and edges of the network are colored by the bacterial and fungal phyla. The proportion of nodes and edges the bacterial-fungal network (c). A connection stand for a significant (*P* < 0.05) correlation between two OTUs. The size of each node is proportional to the number of connections, and the thickness of each connection between two nodes is proportional to the weight of the correlation. BF_N, bacterial- fungal negative associations; BF_P, bacterial-fungal positive associations; FF_N, fungal-fungal negative associations; FF_P, fungal-fungal positive associations; BB_N, bacterial-bacterial negative associations; BB_P, bacterial-bacterial positive associations. NPP, The proportion of negative edges to positive edges; BBA, bacterial-bacterial associations; FFA, fungal-fungal associations; BFA, bacterial-fungal associations. PrG, first generation of *Eucalyptus*; SeG, secondary generation of *Eucalyptus*, ThG, third generation of *Eucalyptus*; FoG, fourth generation of *Eucalyptus*; CK, evergreen broadleaf forest as control.

FIGURE 4 Z_i - P_i plot showed the distribution of keystone taxa (a) based on their topological roles.

712 The threshold values of Z_i and P_i for categorizing OTUs were 2.5 and 0.62 respectively. (b) The

 diversity of bacterial and fungal keystone taxa indicated by Shannon index and Chao1 richness. 714 Nodes in the network can be classified into network hubs $(Z_i > 0.25, P_i > 0.62)$, module hubs $(Z_i > 0.25, P_i > 0.62)$ $> 0.25, P_i \le 0.62$;), connectors ($Z_i \le 0.25, P_i > 0.62$), and peripherals ($Z_i \le 0.25, P_i \le 0.62$). Z_i , the 716 within-module connectivity; P_i , the among-module connectivity. Lowercase letters indicate the significant difference among treatments at *P* < 0.05. PrG, first generation of *Eucalyptus*; SeG, secondary generation of *Eucalyptus*, ThG, third generation of *Eucalyptus*; FoG, fourth generation of *Eucalyptus*; CK, evergreen broadleaf forest as control.

 FIGURE 5 The impacts of soil properties, and bacterial and fungal community on carbon mineralization using the structural equation modeling (a) and its standard total effects on soil enzymatic activity (b) and carbon mineralization (c). Soil properties are represented by soil pH, 723 total nitrogen, and NH₄⁺–N. The bacterial diversities are represented by Shannon index, and the bacterial-fungal associations are represented by the proportion of negative bacterial-fungal associations. Enzymatic activities represented by the activity of β-1,4-glucosidase (BG), β- xylosidase (BX), and sucrase. Blue lines indicate positive relationships, while red lines indicate negative relationships. The width of arrows indicates the strength of significant standardized path 728 coefficients ($P < 0.05$). Paths with non-significant coefficients are presented as gray line. *** *P* ≤ 0.001 ; ** $P \leq 0.01$; * $P \leq 0.05$.

 FIGURE 6 Conceptual figure of bacterial-fungal associations impacts on SOC decomposition in successive planting of *Eucalyptus*. Successive planting of *Eucalyptus* decreased soil fertility and induced the high degree of bacterial-fungal negative associations. The potential bacterial-fungal competition led to the decline in the diversity of total and keystone bacteria, thereby improving carbon (C) mineralization and C-degrading enzymatic activities. PrG, first generation of

- 735 *Eucalyptus*; SeG, secondary generation of *Eucalyptus*, ThG, third generation of *Eucalyptus*; FoG,
- 736 fourth generation of *Eucalyptus*; CK, evergreen broadleaf forest as control.

Table T Don properties across successive planning of <i>Elicarypius</i>					
	CK	PrG	SeG	ThG	FoG
$BD (g cm-3)$	0.96 ± 0.04 ab	1.02 ± 0.06 ab	$0.90 \pm 0.02b$	0.98 ± 0.08 ab	$1.08 \pm 0.07a$
Pt $(\%)$	$50.37 \pm 2.22a$	50.00 \pm 0.89a	53.61 \pm 2.79a	$49.51 \pm 2.36a$	$51.50 \pm 2.32a$
Pa $(\%)$	$20.76 \pm 4.33a$	$21.82 \pm 3.44a$	$20.91 \pm 4.23a$	$19.26 \pm 3.97a$	$18.76 \pm 2.46a$
pH	$4.47 \pm 0.02a$	$4.37 \pm 0.02b$	$4.29 \pm 0.02c$	$4.40\pm0.01b$	4.24 ± 0.01 d
CEC (cmol kg ⁻¹)	$15.92 \pm 0.81c$	19.80 ± 1.46 ab	$21.77 \pm 1.21a$	17.34 ± 1.81 bc	17.55 ± 0.77 bc
TN (g kg ⁻¹)	$2.58 \pm 0.07a$	$1.71 \pm 0.16c$	2.25 ± 0.11	1.99 ± 0.09 bc	$1.85 \pm 0.09c$
$TP(g kg^{-1})$	$0.52 \pm 0.03a$	0.39 ± 0.04 bc	0.46 ± 0.01	0.39 ± 0.03 bc	$0.36 \pm 0.04c$
$TK (g kg-1)$	$28.23 \pm 0.47a$	21.83 ± 1.47	$28.50 \pm 1.78a$	$23.23 \pm 0.64b$	$14.58 \pm 0.55c$
NH_4^+ -N (mg kg ⁻¹)	$26.44 \pm 1.22a$	$10.44 \pm 0.77c$	15.69 ± 0.37 b	$10.03 \pm 0.20c$	7.74 ± 0.80 d
NO_3 -N (mg kg ⁻¹)	$1.98 \pm 0.52a$	1.46 ± 0.34 ab	1.27 ± 0.29 ab	0.88 ± 0.30	$1.03 \pm 0.18b$
AP (mg kg ⁻¹)	$5.96 \pm 0.97a$	2.92 ± 0.26	$5.20 \pm 0.60a$	$2.12 \pm 0.13b$	$1.97 \pm 0.13b$
AK (mg kg ⁻¹)	$97.83 \pm 7.37a$	$60.67 \pm 7.18b$	71.83±7.09b	$70.17\pm4.51b$	$66.00\pm6.76b$

Table 1 Soil propertieis across successive planting of *Eucalyptus*

Numbers within rows followed by same lowercase letters indicate no differences among treatments, while different lowercase letters indicate differences among treatments (p ≤ 0.05); BD:bulk density; Pt: total porosity; Pa: aeration porosity; CEC: cation exchange capacity; TN: total nitrogen; TP: total phosphorus; TK: total potassium; NH₄⁺-N: ammonium nitrogen; NO₃-N: nitrate nitrogen; AP: available phosphorus; AK: available potassium.

FIGURE 1 Soil organic carbon content (a), carbon mineralization (b) and enzymatic activities (c). Bars with different lowercase letters indicate significant differences (P < 0.05). PrG, first generation of Eucalyptus; SeG, secondary generation of Eucalyptus, ThG, third generation of Eucalyptus; FoG, fourth generation of Eucalyptus; CK, evergreen broadleaf forest as control.

1017x893mm (118 x 118 DPI)

FIGURE 2 Changes in soil bacterial (a) and fungal (b) diversity with successive planting of Eucalyptus, and the contribution of soil properties to bacterial and fungal diversity and microbial biomass based on correlation and best multiple regression model (c). Circle size represents variable importance (proportion of variability explained by multiple regression modeling and variance decomposition analysis). Colors represent Spearman's correlations. BD, bulk density; Pt, total porosity; Pa, aeration porosity; CEC, cation exchange capacity; TN, total nitrogen; TP, total phosphorus; TK, total potassium; NH4+−N, ammonium nitrogen; NO3−−N, nitrate nitrogen; AP, available phosphorus; AK, available potassium; MBC: microbial biomass carbon; MBN: microbial biomass nitrogen; MBP: microbial biomass phosphorus. PrG, first generation of Eucalyptus; SeG, secondary generation of Eucalyptus, ThG, third generation of Eucalyptus; FoG, fourth generation of Eucalyptus; CK, evergreen broadleaf forest as control. ** P < 0.01; * P < 0.05.

1066x790mm (118 x 118 DPI)

FIGURE 3 The bacterial-fungal co-occurrence network across all samples. (a) The nodes and edges of the network are colored by the modules. (b) The nodes and edges of the network are colored by the bacterial and fungal phyla. The proportion of nodes and edges the bacterial-fungal network (c). A connection stand for a significant (P < 0.05) correlation between two OTUs. The size of each node is proportional to the number of connections, and the thickness of each connection between two nodes is proportional to the weight of the correlation. BF_N, bacterial-fungal negative associations; BF_P, bacterial-fungal positive associations; FF_N, fungal-fungal negative associations; FF_P, fungal-fungal positive associations; BB_N, bacterial-bacterial negative associations; BB_P, bacterial-bacterial positive associations. NPP, The proportion of negative edges to positive edges; BBA, bacterial-bacterial associations; FFA, fungal-fungal associations; BFA, bacterial-fungal associations. PrG, first generation of Eucalyptus; SeG, secondary generation of Eucalyptus, ThG, third generation of Eucalyptus; FoG, fourth generation of Eucalyptus; CK, evergreen broadleaf forest as control.

539x559mm (118 x 118 DPI)

FIGURE 4 Zi-Pi plot showed the distribution of keystone taxa (a) based on their topological roles. The threshold values of Zi and Pi for categorizing OTUs were 2.5 and 0.62 respectively. (b) The diversity of bacterial and fungal keystone taxa indicated by Shannon index and Chao1 richness. Nodes in the network can be classified into network hubs (Zi > 0.25, Pi > 0.62;), module hubs (Zi > 0.25, Pi \leq 0.62;), connectors $(Zi \le 0.25, Pi > 0.62)$, and peripherals $(Zi \le 0.25, Pi \le 0.62)$. Zi, the within-module connectivity; Pi, the among-module connectivity. Lowercase letters indicate the significant difference among treatments at P < 0.05. PrG, first generation of Eucalyptus; SeG, secondary generation of Eucalyptus, ThG, third generation of Eucalyptus; FoG, fourth generation of Eucalyptus; CK, evergreen broadleaf forest as control.

972x536mm (118 x 118 DPI)

FIGURE 5 The impacts of soil properties, and bacterial and fungal community on carbon mineralization using the structural equation modeling (a) and its standard total effects on soil enzymatic activity (b) and carbon mineralization (c). Soil properties are represented by soil pH, total nitrogen, and NH4+−N. The bacterial diversities are represented by Shannon index, and the bacterial-fungal associations are represented by the proportion of negative edges to positive edges between bacteria and fungi. Enzymatic activities represented by the activity of β -1,4-glucosidase (BG), β -xylosidase (BX), and sucrase. Blue lines indicate positive relationships, while red lines indicate negative relationships. The width of arrows indicates the strength of significant standardized path coefficients ($P < 0.05$). Paths with non-significant coefficients are presented as gray line. *** $P < 0.001$; ** $P < 0.01$; * $\overline{P} < 0.05$.

988x1222mm (118 x 118 DPI)

FIGURE 6 Conceptual figure of bacterial-fungal associations impacts on SOC decomposition in successive planting of Eucalyptus. Successive planting of Eucalyptus decreased soil fertility and induced the high degree of bacterial-fungal negative associations. The potential bacterial-fungal competition led to the decline in the diversity of total and keystone bacteria, thereby improving carbon (C) mineralization and C-degrading enzymatic activities. PrG, first generation of Eucalyptus; SeG, secondary generation of Eucalyptus, ThG, third generation of Eucalyptus; FoG, fourth generation of Eucalyptus; CK, evergreen broadleaf forest as control.

956x821mm (118 x 118 DPI)

Supplementary Materials for

Integrating variation in bacterial-fungal co-occurrence network with soil carbon dynamics

This file includes:

Figures S1 to S4

FIGURE S1 Microbial biomass determined by microbial biomass carbon (MBC), microbial biomass nitrogen (MBN) and microbial biomass phosphorus (MBP) in four generations of *Eucalyptus* plantations and evergreen broadleaf forest. Lowercase letters indicate the significant difference among treatments at *P* < 0.05. PrG, first generation of *Eucalyptus*; SeG, secondary generation of *Eucalyptus*, ThG, third generation of *Eucalyptus*; FoG, fourth generation of *Eucalyptus*; CK, evergreen broadleaf forest as control.

FIGURE S2. Relative abundance of dominant phyla/genera in the bacterial (a, c) and fungal communities (b, d) in four generations of *Eucalyptus* plantations and evergreen broadleaf forest. PrG, first generation of *Eucalyptus*; SeG, secondary generation of *Eucalyptus*, ThG, third generation of *Eucalyptus*; FoG, fourth generation of *Eucalyptus*; CK, evergreen broadleaf forest as control.

FIGURE S3 Principal coordinate analysis based on the Bray-Curtis distances showing the effects of the *Eucalyptus* plantation on bacterial (a) and fungal (b) communities. The endpoint of the arrow points the central of the treatments. Different colors represent different bacterial and fungal phyla, respectively, and the size of pie represents the average abundance of each phylum. (c) The effects of soil chemical properties on the structure of bacterial and fungal community. PrG, first generation of *Eucalyptus*; SeG, secondary generation of *Eucalyptus*, ThG, third generation of *Eucalyptus*; FoG, fourth generation of *Eucalyptus*; CK, evergreen broadleaf forest as control.

FIGURE S4 Random forest modeling indicates the relative importance of predictors for soil organic carbon (SOC) content (a) and cumulative C mineralization (b). Soil properties include cation exchange capacity (CEC), total nitrogen (TN), total phosphorus (TP), total potassium (TK), ammonium nitrogen (NH₄⁺–N), nitrate nitrogen (NO₃⁻–N), available phosphorus (AP), available potassium (AK), bulk density (BD), total porosity (Pt), aeration porosity (Pa). Biomass is represented by microbial biomass carbon (MBC), microbial biomass nitrogen (MBN), and microbial biomass phosphorus (MBP). The bacterial and fungal diversity is represented by bacterial and fungal Shannon index (BacS and FunS) and Chao1 richness (BacC and FunC), respectively. The diversity of keystone bacteria and fungi is indicated by Shannon index (BacKTs and FunKTs) and Chao1 richness (BacKTc and FunKTc), respectively. The structure of the bacterial and fungal community (BCS and FCS) is indicated by the first principal coordinate (PCoA1). The bacterial-fungal co-occurrence network is indicated by the proportion of negative to positive bacterial-bacterial (BBA), fungal-fungal (FFA), and fungalbacterial (FBA) associations, respectively. Soil enzymatic activities include β-1,4-glucosidase (BG), β-xylosidase (BX), acid phosphatase (ACP), sucrase (Sur), and β-Nacetylglucosaminidase (NAG).