

Nitrogen deposition alters plant community structure and biomass by affecting the relationships between plants and soil microorganisms a desert steppe

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Abstract

Aims Nitrogen (N) deposition is an important component of global change and threatens terrestrial biodiversity. The response of plant–soil microbe relationships to N deposition has recently attracted considerable attention. Soil microorganisms have been proven to provide nutrients for specific plant growth, especially in nutrient-poor desert steppe ecosystems. However, the effects of N deposition on plant soil microbial community interactions in such ecosystems remain poorly understood.

Methods To investigate these effects, a six-year N-addition field experiment was conducted in a *Stipa breviflora* desert steppe in Inner Mongolia, Northwest China. Four N treatment levels (N0, N1, N2, and N3, corresponding to 0, 30, 50, and 100 kg N ha⁻¹ yr⁻¹, respectively) were applied to simulate atmospheric N deposition.

Results The results showed that (1) after six years of simulated N deposition, plant aboveground biomass did not increase, but plant community structure changed; (2) In desert steppes, N addition increased the biomass of *Neopallasia pectinata*, and the correlations between *N. pectinata* and microorganisms also increased. However, the biomass of the perennial grass *S. breviflora* decreased, and the correlation with soil microorganisms was weaker for *S. breviflora* than for *N. pectinata*; (3) N deposition indirectly affects plant biomass mainly by inhibiting (or promoting) the number of microorganisms negatively correlated with plant growth.

Conclusions These results suggest that N deposition alters plant community structures and biomass by affecting plant–soil microbe relationships in desert steppes. These findings help clarify atmospheric N deposition effects on the ecological health and function of desert steppes.

Introduction

Desert steppes are unique transitional ecotones located between steppe and desert regions in Eurasia (Chen et al., 2017; Wu et al., 2021). The desert steppe region of Inner Mongolia has a simple plant community structure, lacks water resources, and has poor soil nutrients. Therefore, it is considered a fragile ecosystem, especially under the background of global climate change (Angerer et al., 2008). In recent years, global climate change has led to an increasing atmospheric nitrogen (N) deposition trend in China (Liu et al., 2013), and the average amount of N deposited in China was estimated at 20.4 ± 2.6 kg N ha⁻¹ yr⁻¹ from 2011–2015 (Yu et al., 2019). N deposition has been considered the third-greatest threat to global terrestrial biodiversity (Payne et al., 2017). According to previous studies, atmospheric N deposition negatively affects the plant and soil microbial community diversity in terrestrial ecosystems (Bobbink et al., 2010; Zhang et al., 2018). Biodiversity is not only inherently precious but also bolsters the functioning abilities of ecosystems and provides reliable ecosystem services on Earth (Borer et al., 2014; Hautier et al., 2014; Yang et al., 2019). To maintain biodiversity, there is an urgent need to understand the responses of biodiversity to long-term N deposition in desert steppe ecosystems (Yang et al., 2019).

N deposition usually leads to an increase in plant productivity but a decrease in plant diversity. With some plant species becoming rare, N depositions can even result in species extinctions (Stevens et al., 2004; Hautier et al., 2009; Yu et al., 2019). N deposition affects plants through many factors, such as nutrient imbalances and interspecific competition (Payne et al., 2017). Additionally, shifts in plant communities do not occur in isolation, and plant composition changes can influence the soil bacterial and fungal communities through cascade effects (Erisman et al., 2013; Payne et al., 2017). However, soil microbial communities can also influence plant fitness in various ways, such as via the decomposition, nutrient cycling, and nutrient acquisition processes (Berg and Smalla, 2009; Schlatter et al., 2015). The interactions between plants and the associated soil microbial communities are so intertwined that they can be considered as a whole entity that is subjected to environmental changes and selection (Zilber-Rosenberg and Rosenberg, 2008; Panke-Buisse et al., 2015; Hortal et al., 2017). A previous study showed that plant productivity is positively correlated with the proportion of soil microorganisms (Fan et al., 2020). Key-stone microbial taxa are highly connected taxa that exert a considerable influence on microbiome structure and functioning, either individually or in a guild, irrespective of their spatial or temporal abundance (Banerjee et al., 2018). These microbial species often coexist in space and time and form clusters in microbial ecological networks; these clusters have been proven to provide nutrients for specific plant growth, especially in nutrient-poor desert steppe ecosystems (Delgado-Baquerizo et al., 2020).

N is an essential element for plant growth, and plants and microbes compete for N in soil. Increased plant-microbial competition for N can result in decreased soil N availabilities and microbial activities (Hu et al., 2001; Dunn et al., 2006; Shao et al., 2018). For instance, an N increase can depress the soil microbial activity by altering the metabolic capabilities of soil bacterial communities (Ramirez et al., 2012). Additionally, accumulated evidence suggests that N deposition can reduce the microbial biomass and change the microbial community compositions in diverse ecosystems (Treseder, 2008; Contosta et al., 2015). Increased N availabilities reduce the fungal biomass via changes in plant-specific exudates and alterations in nutrient competitions between plants and rhizosphere microbes (Bardgett et al., 1999; Zhang et al., 2018). Many ecological studies have highlighted the importance of plant–soil microorganism feedbacks and shifts in feedback effects associated with soil microbial community compositions, as these processes affect the coexistence and community compositions of plants (Bever, 2003; Reynolds et al., 2003; Lau and Lennon, 2011). Although the effects of plant–soil microorganism interactions on plant ecology have been widely studied, little research has addressed how belowground microbial communities influence plant biomass in nutrient-poor desert steppes (Kardol et al., 2007; Lau and Lennon, 2011; Hortal et al., 2017; van der Putten, 2017). Additionally, the ways in which microbial communities affect plant biomass are also unknown. In this study, we established a 6-year simulated N deposition experiment in the desert steppe region of Inner Mongolia, China. The changes that occurred in the composition and diversity of the plant and soil microbial communities in response to elevated N deposition were explored. We hypothesized that (i) increased N availability would significantly affect the plant community composition and biomass at all N input levels and (ii) changes in the plant community

composition would be comprehensively affected by the keystone soil microorganisms and N deposition amounts.

Materials And Methods

Field experiment setup

The field experiment was established at Siziwang Banner (41°46'43.6" N, 111°53'41.7" E, with an elevation of 1456 m), an arid region in Inner Mongolia, northern China. The average annual precipitation in this region is 280 mm, with cumulative precipitation falling during the growing season (May to October) constituting approximately 70% of the total precipitation throughout the whole year. The annual average temperature in the study region is 3.4°C. The soil at the study site has a sandy loam texture and is classified as a Haplic Calcisol based on the Food and Agricultural Organization (FAO) soil classification system of the United Nations. The plant community at the study site is dominated by *Stipa breviflora* Griseb., *Neopallasia pectinata* (Pall.) Poljak., *Artemisia scoparia* Waldst. et Kit., *Kochia prostrata* (L.) Schrad. and *Cleistogenes songorica* (Roshev.) Ohwi.

The long-term simulated N deposition experiments were established at the desert steppe site in December 2015. Four N-addition treatments were applied: i) the control treatment (N0, no N addition), ii) first N addition treatment (N1, 30 kg N ha⁻¹ yr⁻¹), iii) second N addition treatment (N2, 50 kg N ha⁻¹ yr⁻¹), and iv) third N addition treatment (N3, 100 kg N ha⁻¹ yr⁻¹). To mirror the natural seasonal N deposition pattern from May to September, NH₄NO₃ was mixed with purified water (10.0 L per plot; in the N0 treatment, plots received only purified water) and sprinkled evenly on each plot using a sprayer to simulate wet deposition. From October of the same year to April of the following year, NH₄NO₃ was mixed with soil (1.0 kg sand per plot; in the N0 treatment, plots received only soil) and broadcasted evenly by hand to simulate dry deposition. Nitrogen was applied once per month at the beginning of the month. The monthly nitrogen application rate was determined by the percentage of the average monthly precipitation in the last five years relative to total annual precipitation. These experiments were planned according to a randomized block design with 4 replicate blocks. Each plot measured 7 × 7 m, and the plots were separated by 1 m walkways.

Plant species composition and biomass

In August 2021, at the peak of the growing season, we randomly arranged three 0.5 × 0.5-m subplots in each plot, the edges of which were parallel to but at least 1 m away from the edges of the plot. We harvested all aboveground plant parts, sorted the plants into species, recorded the species richness and abundance (number of individuals), and dried the plants at 65°C for 48 h to measure the aboveground biomass of each species in each subplot.

Soil microbial communities

Soil samples were collected randomly by taking thirty soil cores (with 1-cm diameters and 10-cm depths); these cores were then mixed to yield one sample per plot. After roots and stones were removed and the soil was gently mixed, each sample was placed into a sterile plastic bag. The samples were immediately stored on dry ice and transported to the laboratory within 6 hours.

The microbial community genomic DNA was extracted from 0.5 g soil using an E.Z.N.A.® soil DNA Kit (Omega Bio-Tek, Norcross, GA, U.S.) according to the manufacturer's instructions. The DNA extract was then checked on a 1% agarose gel, and the DNA concentration and purity were determined with a NanoDrop 2000 UV-vis spectrophotometer (Thermo Scientific, Wilmington, USA). To determine the soil bacterial and fungal community composition and diversity, amplicon surveys of the 16S and ITS rRNA were implemented. The V3-V4 hypervariable regions of the 16S rRNA gene were amplified using the 338F (5'-ACTCCTACGGGAGGCAGCAG-3') and 806R (5'-GGACTACHVGGGTWTCTAAT-3') primer sets. The ITS1F (5'-CTTGGTCATTTAGAGGAAGTAA-3') and ITS2R (5'-GCTGCGTTCTTCATCGATGC-3') primers were used to amplify the ITS1 region of the fungal rRNA. PCR amplification of the 16S and ITS rRNA genes was performed through the following steps: an initial denaturation at 95°C for 3 min followed by 27 denaturing cycles at 95°C for 30 s each, annealing at 55°C for 30 s and extension at 72°C for 45 s, a single extension at 72°C for 10 min, and a terminal temperature of 4°C. The PCR mixtures contained 5 × 4 µL of *TransStart* FastPfu buffer, 2.5 mM dNTPs at 2 µL, 0.8 µL forward primer (5 µM), 0.8 µL reverse primer (5 µM), 0.4 µL *TransStart* FastPfu DNA Polymerase, 10 ng template DNA, and finally up to 20 µL ddH₂O. The PCR tests were performed in triplicate. The PCR product was extracted from a 2% agarose gel, purified using an AxyPrep DNA Gel Extraction Kit (Axygen Biosciences, Union City, CA, USA) according to the manufacturer's instructions and quantified using a Quantus™ Fluorometer (Promega, USA).

The purified amplicons were pooled in equimolar amounts and paired-end sequenced on an Illumina MiSeq PE300/NovaSeq PE250 platform (Illumina, San Diego, USA) according to the standard protocols established by Majorbio Bio-Pharm Technology Co. Ltd. (Shanghai, China). The raw reads were deposited into the National Center for Biotechnology Information (NCBI) Sequence Read Archive (SRA) database (accession number: SRP356315).

The raw 16S and ITS rRNA gene sequencing reads were demultiplexed, quality-filtered using fastp version 0.20.0 (Chen et al., 2018) and merged using FLASH version 1.2.7 (Magoc and Salzberg, 2011) with the following criteria: (i) the 300-bp reads were truncated at any site with an average quality score < 20 over a 50-bp sliding window, truncated reads shorter than 50 bp were discarded, and reads containing ambiguous characters were also discarded; (ii) only overlapping sequences longer than 10 bp were assembled according to their overlapped sequences, the maximum mismatch ratio of the overlapping region was set to 0.2, and reads that could not be assembled were discarded; (iii) the samples were distinguished according to the barcode and primers, and the sequence direction was adjusted through exact barcode matching and 2-nucleotide mismatches in the primer matching process.

Operational taxonomic units (OTUs) with 97% similarity cut-off values (Stackebrandt and Goebel, 1994; Edgar, 2013) were clustered using UPARSE version 7.1 (Edgar, 2013), and chimeric sequences were

identified and removed. The taxonomy of each OTU representative sequence was analysed using the RDP Classifier version 2.2 (Wang et al., 2007) against the 16S and ITS rRNA databases with a confidence threshold of 0.7.

Statistical analysis

Microsoft Excel 2019 and R were used for the statistical data analyses. All figures were illustrated using Origin 2021 software. The alpha diversity values of the plant and soil microbial communities were calculated based on Shannon's diversity (H') index according to the following formula: $H' = -\sum P_i \ln P_i$ (Shannon et al., 1950). The significant differences among N-addition levels were obtained separately for the above-ground plant biomass and the relative abundance of correlated microbes using a one-way analysis of variance (ANOVA) followed by Tukey's honestly significant difference test ($P < 0.05$). The beta diversity values of the plant and soil microbial communities were visualized with nonmetric multidimensional scaling (NMDS) plots based on the Bray–Curtis similarity matrix.

Correlation network analysis. We performed a network analysis to assess the complexity of the soil microbial community and identify potential related taxa for each plant. To avoid spurious correlations, we selected the top 150 dominant bacterial genera and 150 dominant fungal genera; these genera accounted for the top 92.18% of the relative bacterial abundance and 97.77% of the relative fungal abundance. Spearman's rank correlation was used to assess the associations between plant and microbial taxa as well as the associations among *S. breviflora*, *N. pectinata* (the biomass of the two plants accounted for more than 60% of the total biomass), and soil microorganisms. Moreover, multiple comparison corrections were performed on the Spearman's rank correlation results using the false discovery rate correction method (Benjamini and Hochberg, 1995). All possible pairwise Spearman's rank correlations between the relevant genera were calculated with the VEGAN, IGRAPH, and HMISC packages. Correlation coefficients greater than 0.6 with corresponding P values below 0.05 were considered statistically robust and were included when generating the networks. The network structures were explored and visualized with Cytoscape 3.8.0.

Structural equation modelling (SEM). The SEM analyses were performed with the “piecewise SEM” package in R version 4.1.2. SEM was used to investigate the direct and indirect effects of N additions on the *S. breviflora* biomass, *N. pectinata* biomass, and related microbial taxa. The overall fit of the final piecewise SEM results was evaluated using Fisher's C and P values based on the piecewise SEM package (Lefcheck, 2016).

Results

Plant community composition, diversity and biomass

The N-addition treatments did not affect the aboveground plant biomass, while the plant community composition was significantly altered (Figs. 1A and B). With the increase in nitrogen deposition, the

relative abundance of *S. breviflora* gradually decreased, and this species was replaced by *N. pectinata*. However, the relative abundance of *A. scoparia* increased in the N1 treatment (30 kg N ha⁻¹ yr⁻¹). In the N2 (50 kg N ha⁻¹ yr⁻¹) and N3 (100 kg N ha⁻¹ yr⁻¹) treatments, the relative abundances of *N. pectinata* were highest. Figure 1B suggests that the other plant species were low in abundance under some conditions and absent under others, but in a manner suggesting that N addition influenced their relative abundance as well. The N additions did not significantly reduce the Shannon's index values of the plant communities (Fig. 1C). The N1 and N2 treatments tended to increase the plant diversity, whereas the N3 treatment did not significantly decrease the plant diversity. The NMDS plots revealed separations between the plant community samples collected from the different N-addition treatments (Fig. 1D). The treatments did affect the composition of the plant communities.

Soil microbial abundances at the phylum and genus levels

The dominant bacterial phyla (relative abundances > 5%) across all soil samples were *Actinobacteriota*, *Proteobacteria*, *Acidobacteriota*, and *Chloroflexi*, which together accounted for more than 83.46% of the total sequences (Fig. 2A). The dominant fungal phyla across all the soils were *Ascomycota*, *Basidiomycota*, and *Mortierellomycota*, which together accounted for more than 97.26% of the total sequences (Fig. 2B). The relative abundance of *Actinobacteriota* gradually increased as the amount of N added increased. In particular, the relative abundance of *Basidiomycota* was highest in the N1 treatment, followed by in the N2, N3, and N0 (0 kg N ha⁻¹ yr⁻¹) treatments.

The dominant bacterial genus (relative abundance > 5%) across all soils was *Rubrobacter*, which accounted for more than 13.42% of the total sequences (Fig. 2C). The dominant fungal genera across all soils were *Sarocladium*, *Knufia*, *Marasmius*, and *Gibberella*, which together accounted for more than 30.77% of the total sequences (Fig. 2D). The relative abundance of *Rubrobacter* was highest in the N2 treatment, followed by the N1, N0, and N3 treatments. However, the *Marasmius* abundance was highest in N1, followed by in N2, N0, and N3.

Soil microbial diversity and community structure

The N additions did not significantly reduce the Shannon's index values of the bacterial communities (Fig. 3A). The Shannon's index of bacteria was highest in the N3 treatment, followed by in the N2, N1, and N0 treatments. The NMDS plot revealed no clear separation among the bacterial community samples collected from different N-addition treatments (Fig. 3B). The N additions did not significantly reduce the Shannon index values of the fungal communities (Fig. 3C). For the fungal communities, the four N-addition treatments were not clearly separated in the NMDS plot (Fig. 3D).

Plant and soil microbe network

Soil microbial genera were found to be associated with plant species based on the Spearman correlation results (Fig. 4). Specifically, some members of the bacterial community showed significant positive relationships with *N. pectinata*, while an unclassified member of *Nitrosococcaceae* was negatively

correlated with *S. breviflora* (Table. S1). *A. scoparia* was positively and significantly correlated with *A. mongolicum*. *S. breviflora* was negatively and significantly correlated with *N. pectinata*. Strong correlations were found among *S. breviflora*, *N. pectinata*, and some microbial taxa.

The network complexity varied considerably between the two studied plants (Fig. 5). For example, compared to *N. pectinata*, the soil microbial communities originating from *S. breviflora* had lower complexity and fewer edges (13 edges). The network structure was most pronounced between *N. pectinata* and the microbial communities (23 edges), largely owing to the increased correlations between bacteria and fungi. The microorganisms that were positively correlated with *S. breviflora* were all members of *Proteobacteria*. The fungi that were negatively correlated with *N. pectinata* were all members of *Ascomycota*.

Effects of N addition on the correlations between plant and soil microbial communities

The experimentally elevated N deposition amounts significantly decreased the positive correlations between bacterial taxa and *S. breviflora* ($P < 0.05$, Fig. 6). The relative abundance of the bacterial taxa that were positively correlated with *S. breviflora* gradually decreased as the N addition amount increased. However, the relative abundances of the bacterial and fungal taxa that were negatively correlated with *S. breviflora* gradually decreased as more N was added. N addition significantly decreased the negative correlations between bacterial taxa and *N. pectinata* ($P < 0.05$, Fig. 6). The relative abundances of the bacterial taxa that were negatively correlated with *N. pectinata* gradually decreased as the N addition amount increased. The fungal taxa that were positively correlated with *N. pectinata*, in contrast to the bacterial taxa, significantly responded to N addition ($P < 0.05$, Fig. 6). In particular, the relative abundances of the microbial taxa that were positively correlated with *N. pectinata* were lowest in the N1 treatment, followed by those in the N2, N0, and N3 treatments.

As the SEM results illustrated, the N-induced changes in *S. breviflora* and *N. pectinata* biomasses in the studied plant communities were affected by different pathways (Fig. 7). The addition of N directly impacted the relative abundances of the microbial taxa correlated with *S. breviflora* and *N. pectinata*. Moreover, N addition had a nonsignificant direct effect on the biomasses of the two plant species ($P > 0.05$). The positively and negatively correlated microbes had a direct, nonsignificant effect on the biomasses of the two plant species ($P > 0.05$). Therefore, the effects of N addition on the biomasses of the two plant species reflected a combination of direct and indirect effects. However, N addition mainly affected the biomasses of both plant species by inhibiting the microbial taxa that were negatively correlated with the two plant species.

Discussion

Our experimental results showed that the sixth-year N deposition did not induce any significant increase in the aboveground plant biomass but did change the plant community structure. In contrast to our hypothesis, the plant aboveground biomass was not significantly affected by the simulated N deposition. Some results of previous studies have shown that the increase in aboveground net primary production

(ANPP) as N is added stabilizes after approximately $10.5 \sim 12.0 \text{ g N m}^{-2} \text{ yr}^{-1}$ is added in desert steppe regions (Bai et al., 2010; Tang et al., 2017). However, the amount of N added in our study did not exceed this threshold. Therefore, the nonsignificant biomass increases observed herein may have been due to water constraints (Su et al., 2013). This finding is in line with the theoretical predictions of the multiple resource colimitation theory (Harpole et al., 2011). The effects of N additions on plant communities largely depend on the water availability (Delgado-Baquerizo et al., 2013; Ma et al., 2020). Additionally, water is another limiting factor in desert steppe ecosystems. Thus, in this work, N addition enhanced the aboveground biomass of the annual *N. pectinata*. In contrast to the strong positive effects of N addition on the *N. pectinata* biomass, N detrimentally affected the aboveground biomass of the perennial grass *S. breviflora*. Previous studies have also reported that fast-growing annuals, which are usually abundant only in the early stages of grassland succession, can almost completely replace perennials in mature sites (Bai et al., 2010). The rapid growth of annuals is facilitated by their species-specific traits, including their abundant seed production, rapid growth, and tall stature. In contrast, the decline in the abundance of perennials could be attributable to their conservative resource-use strategies (Bai et al., 2010). Moreover, another ecological adaptive strategy, the r/K selection theory, might be reflected in the results; forbs (which grow faster as r-strategists) increased at the expense of decreased native perennial grasses (which grow slowly as K-strategists) (Gadgil and Solbrig, 1972; Ma et al., 2020). In addition to the mechanisms discussed above, some microbial mechanisms may mediate plant growth in desert steppes.

Soil microorganisms play essential roles in regulating multiple ecosystem services, including plant productivity and nutrient cycling, in natural terrestrial ecosystems (Fan et al., 2021). The experimental results obtained under all N addition treatments showed that N addition did not significantly decrease the soil microbial diversity. Our soil microbial diversity findings regarding its responses to N inputs were consistent with those reported in other desert steppe regions (McHugh et al., 2017; Huang et al., 2021), indicating that plants may mitigate the detrimental effects of N deposition on soil biodiversity (Shao et al., 2018). However, in this work, the soil microbial community structure was affected by the different N-addition amounts. The NMDS analysis revealed that the effect of all N-addition treatments on soil bacterial community structure was greater than that on the soil fungal community. Studies from arid and semiarid grasslands have shown that drought promotes the destabilizing properties of soil bacteria but not fungi and thus has a prolonged effect on bacterial communities and their cooccurrence networks via changes in the vegetation composition and the resultant reductions in soil moisture (de Vries et al., 2018; Fan et al., 2020; Wang et al., 2020).

Plants and soil microbes can have direct coevolutionary relationships, and their relationships constitute important systems (Keymer and Lankau, 2017). In this work, we used correlation networks to identify related taxa in the soil microbial community, and the relative abundances of these related taxa largely determined the plant community composition and biomass after almost six years of different N treatments. N deposition simplified the relationship network between *S. breviflora* and microorganisms and decreased the relative abundance of microorganisms that were positively correlated with the *S. breviflora* biomass. However, the relationships between *N. pectinata* and soil microbial taxa were more

abundant in the network, and the relative abundance of microorganisms that were positively correlated with the *N. pectinata* biomass increased. Similarly, a recent study indicated that the biodiversity of the keystone microbiome is essential for supporting plant production (Chen et al., 2020; Fan et al., 2021). This is because the performance of plants greatly depends on the ability of the soil microbiome to uptake nutrients and protect the plants against stresses (Bakker et al., 2018). To put it simply, there are a larger number of these keystone microorganisms in soils with higher nutrient availabilities and higher plant productivities. We further found that the microorganisms that were positively correlated with the *S. breviflora* biomass were all members of *Alpha-Proteobacteria*. *Alpha-Proteobacteria* have been considered copiotrophs in previous studies and might play important roles in enzyme activities (Chen et al., 2020; Zhang et al., 2022). Moreover, the related taxa *Skermanella* and *Microvirga* are members of *Alpha-Proteobacteria* and participated in *S. breviflora* growth via symbiotic N fixation pathways (Li et al., 2020; Zhang et al., 2022). Our study shows that N deposition reduces the *S. breviflora* biomass and the relative abundances of these microorganisms, thus leading to an increase in the *N. pectinata* biomass. The relative abundance of *Basidiomycota* was highest in the N1 treatment. This may have been related to the growth of *A. scoparia* plants treated under N1. We showed that N deposition significantly impacted the relative abundances of *Lecythophora*, *Oomyces*, *Mycocalicium*, and *Dinemasporium*, members of *Ascomycota* in the studied desert steppe. We further found that the microorganisms that were negatively correlated with the *N. pectinata* biomass were all members of *Ascomycota*. This was consistent with previous studies in which oligotrophic Ascomycetes were usually dominant under drought conditions with limited carbon or nutrient availabilities (Chen et al., 2017; Wang et al., 2020). Therefore, N deposition reduced the abundance of microorganisms negatively correlated with the growth of *N. pectinata* and increased the biomass of *N. pectinata*. While the addition of N did not directly affect the *S. breviflora* or *N. pectinata* biomasses, it did directly (and significantly) affect the soil microbial community, which then subsequently affected the *S. breviflora* and *N. pectinata* biomasses. The SEM results showed that N addition and the related microorganisms explained more than 60% of the variance in the *S. breviflora* and *N. pectinata* biomasses but did not directly affect the *S. breviflora* or *N. pectinata* biomasses. Therefore, N deposition indirectly affects plant biomasses in desert grasslands mainly through pathways related microorganisms. Among these pathways, the inhibition or promotion of negatively correlated microorganisms with the growth of plants represents the main factor. These findings support our hypothesis that changes in plant community composition are comprehensively affected by soil microorganisms and N deposition. These results contribute to a comprehensive understanding of the effects of atmospheric N deposition on biodiversity and the mechanism underlying plant-microbial interaction in desert steppes.

Conclusion

This study provides solid evidence that plant and microbial diversity has not decreased significantly after almost 6 years of N deposition. It is noteworthy that the plant diversity did not decrease, but the plant community structure was altered. N deposition indirectly affects plant biomass mainly by inhibiting (or promoting) the number of microorganisms negatively correlated with plant growth. These results suggest

that N deposition alters plant community structures and biomass by affecting plant–soil microbe relationships in desert steppes. These findings highlighted the importance of soil microbial in maintaining plant biodiversity and production, suggesting the possibility of improving plant biodiversity and production by mediating soil microbial in desert steppe ecosystems.

Declarations

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The authors declare that they have no conflicts of interest. All authors contributed to the study conception and design. Material preparation, data collection and analysis were performed by He Ye, Mei Hong, Xuehui XU, Zhiwei Liang, Na Jiang, Nare Tu and Zhendan Wu. The first draft of the manuscript was written by He Ye and all authors commented on previous versions of the manuscript. All authors read and approved the final manuscript.

The datasets generated during and analysed during the current study are available from the corresponding author on reasonable request.

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Figures

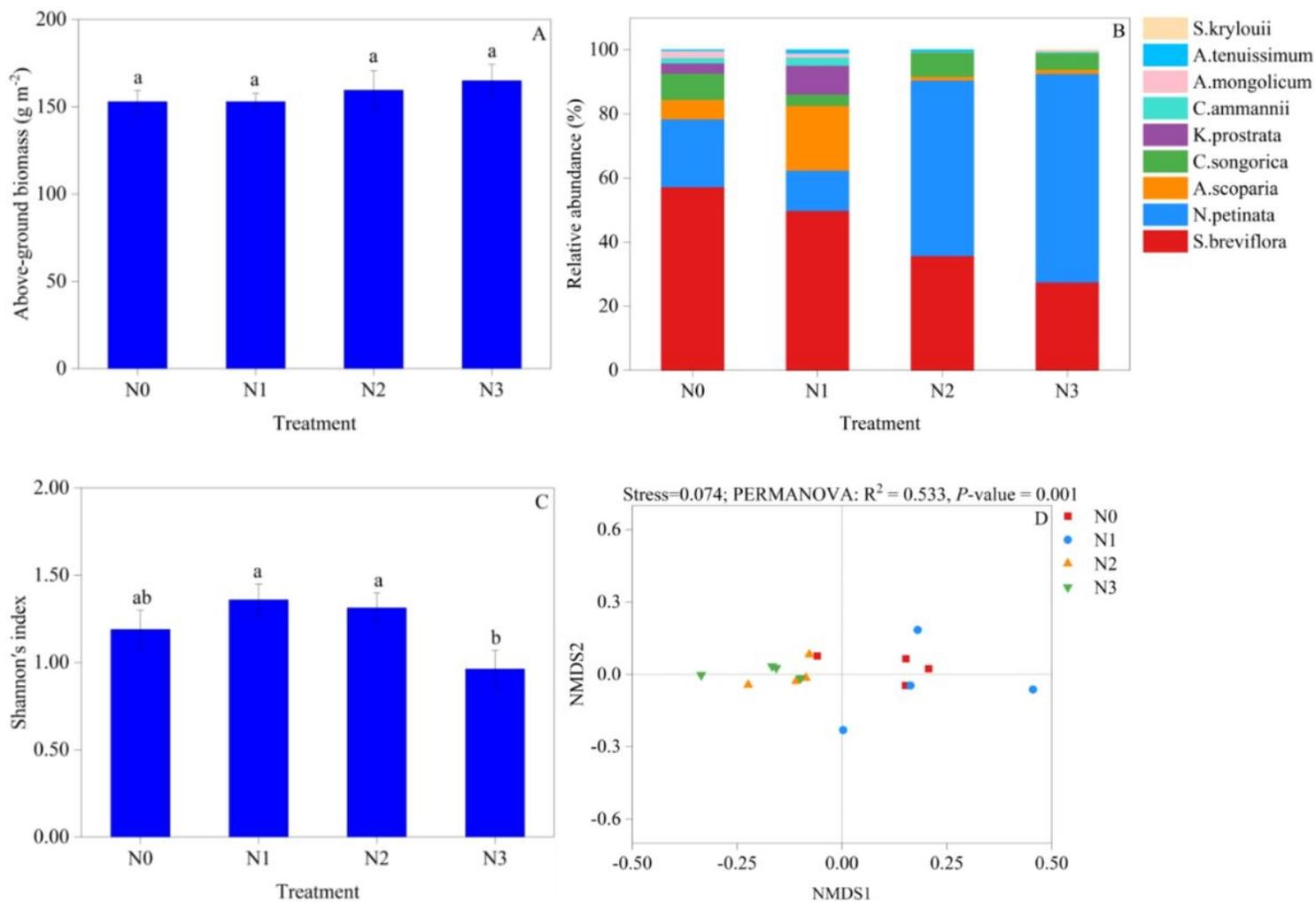


Figure 1

Changes in the aboveground biomass (A), plant community composition (B), alpha diversity (Shannon's index (C)) and beta diversity (NMDS (D)) of plants. Different lowercase letters indicate significant differences among the treatments ($P < 0.05$). Data are shown as the mean \pm SE.

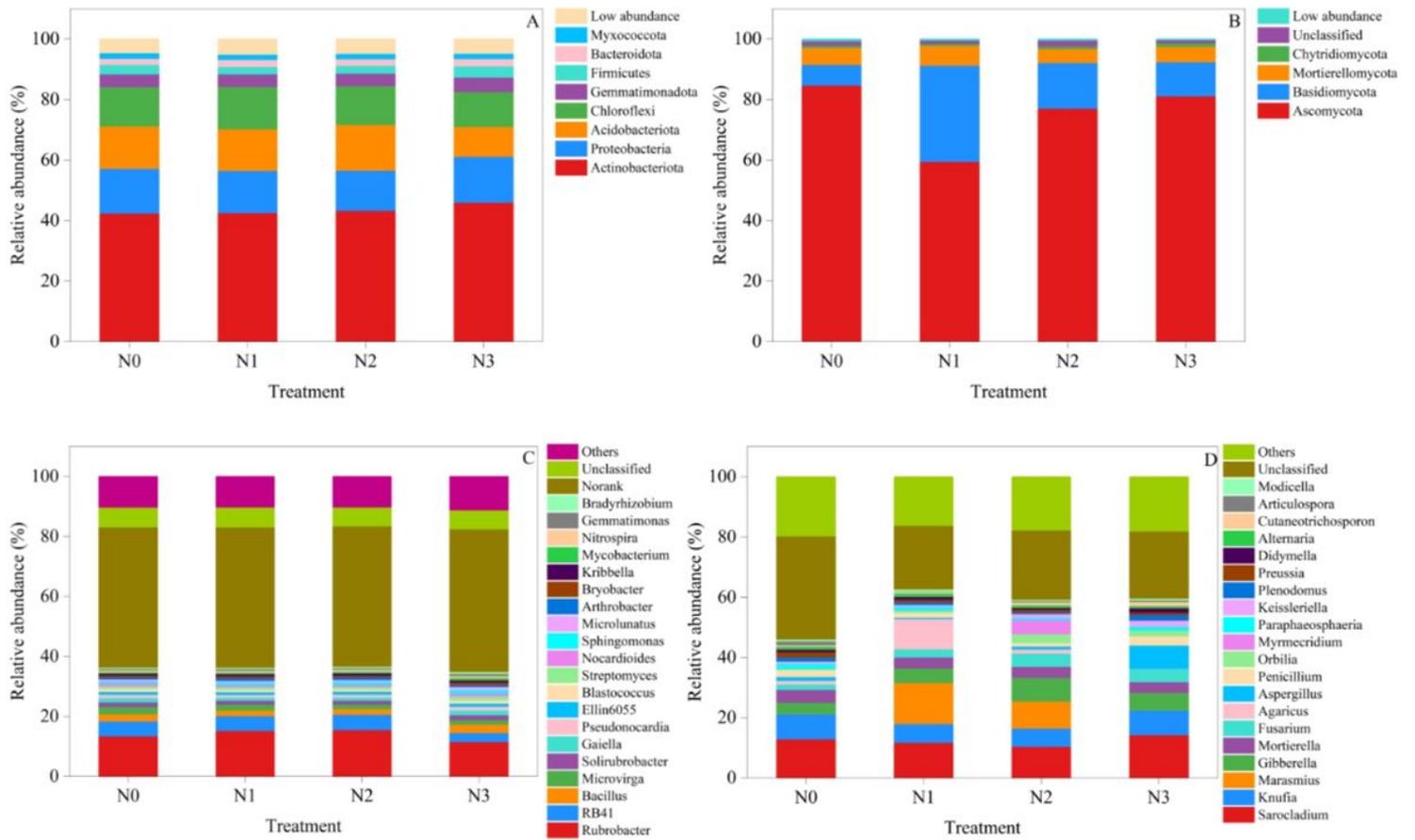


Figure 2

Relative abundance of soil bacterial (A) and fungal (B) communities at the phylum level, and soil bacterial (C) and fungal (D) communities at the genus level

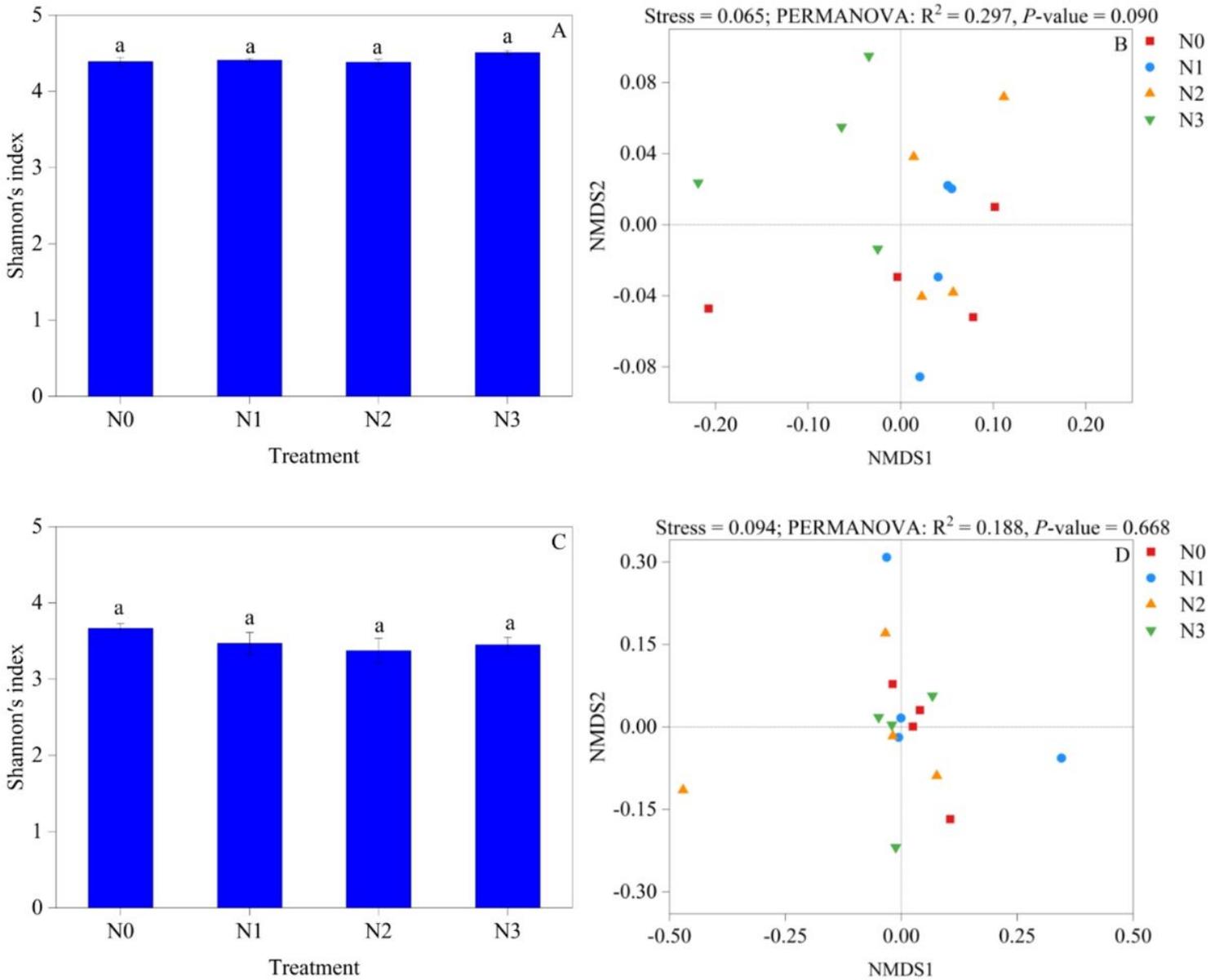


Figure 3

Alpha diversity (Shannon's index (A)) and beta diversity (NMDS (B)) of the bacterial communities. Alpha diversity (Shannon's index (C)) and beta diversity (NMDS (D)) of the fungal communities. Dissimilarities between communities were calculated by Bray–Curtis distance based on the relative abundances of the genera. Different lowercase letters indicate significant differences among the treatments ($P < 0.05$). Data are shown as the mean \pm SE.

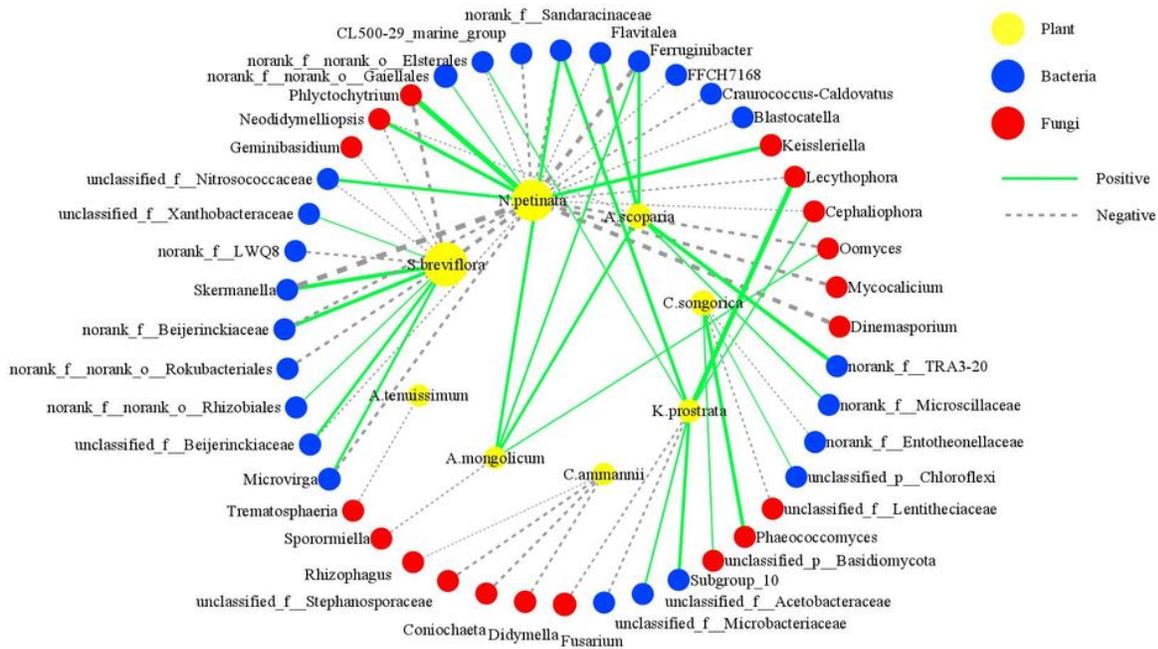


Figure 4

Correlation network visualization of the interaction strengths. Spearman's rank correlations of the relative abundances of all species between the two groups were calculated. Line colour and width are proportional to the interaction strength, as indicated in the legend in the figure. The size of the circles is proportional to the number of species/taxa in that group.

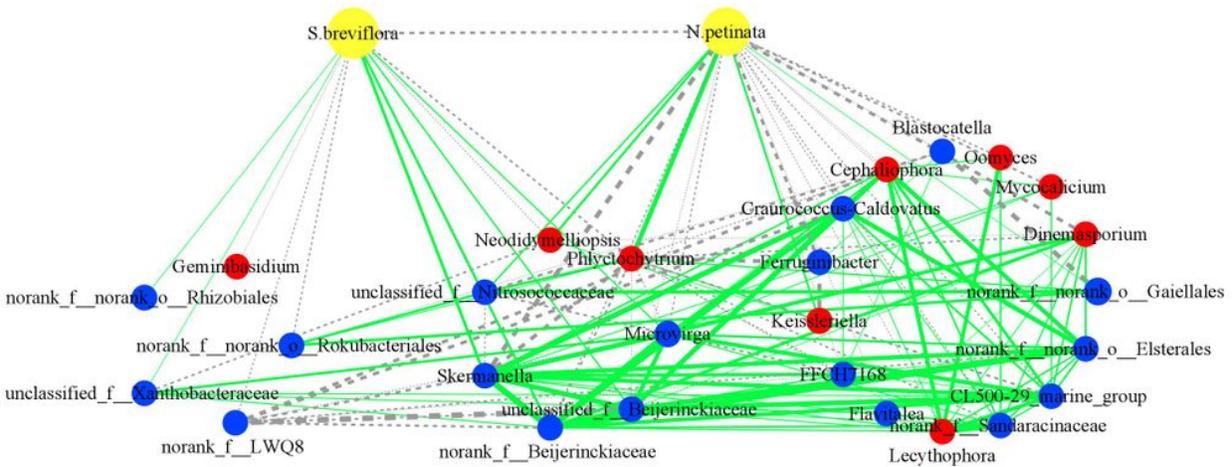


Figure 5

Effects of N addition on *S.breviflora*, *N.pectinata* and soil microbial networks. The proportion of correlations with a coefficient >0.6 was divided by the total number of possible interactions to obtain the interaction strength between two groups of species. Line colour and width are proportional to the interaction strength, as indicated in the legend in the figure. The size of the circles is proportional to the number of species/taxa in that group.

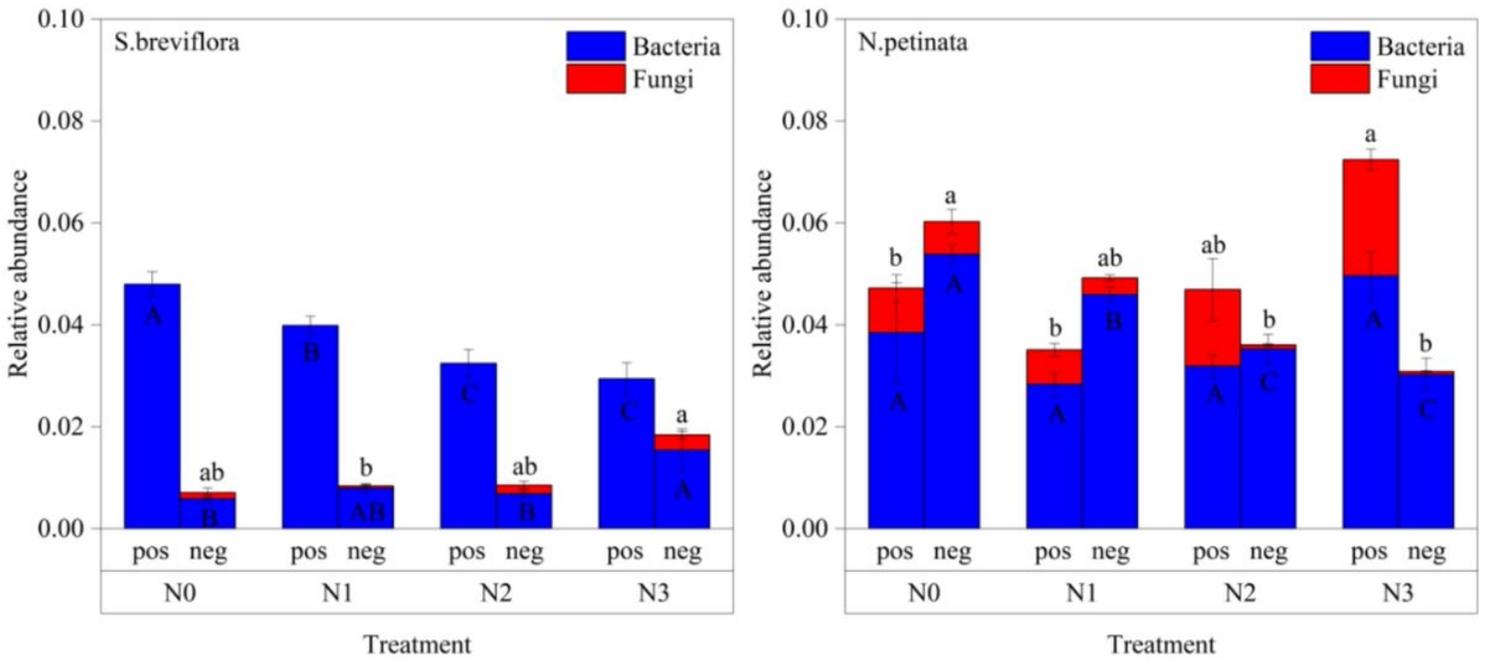


Figure 6

Relative abundance of correlated microbes at the genus level. Within each graph, different uppercase and lowercase letters indicate a significant ($P < 0.05$) difference under different treatments according to Duncan's test. Vertical bars represent standard errors. pos: positive correlation; neg: negative correlation.

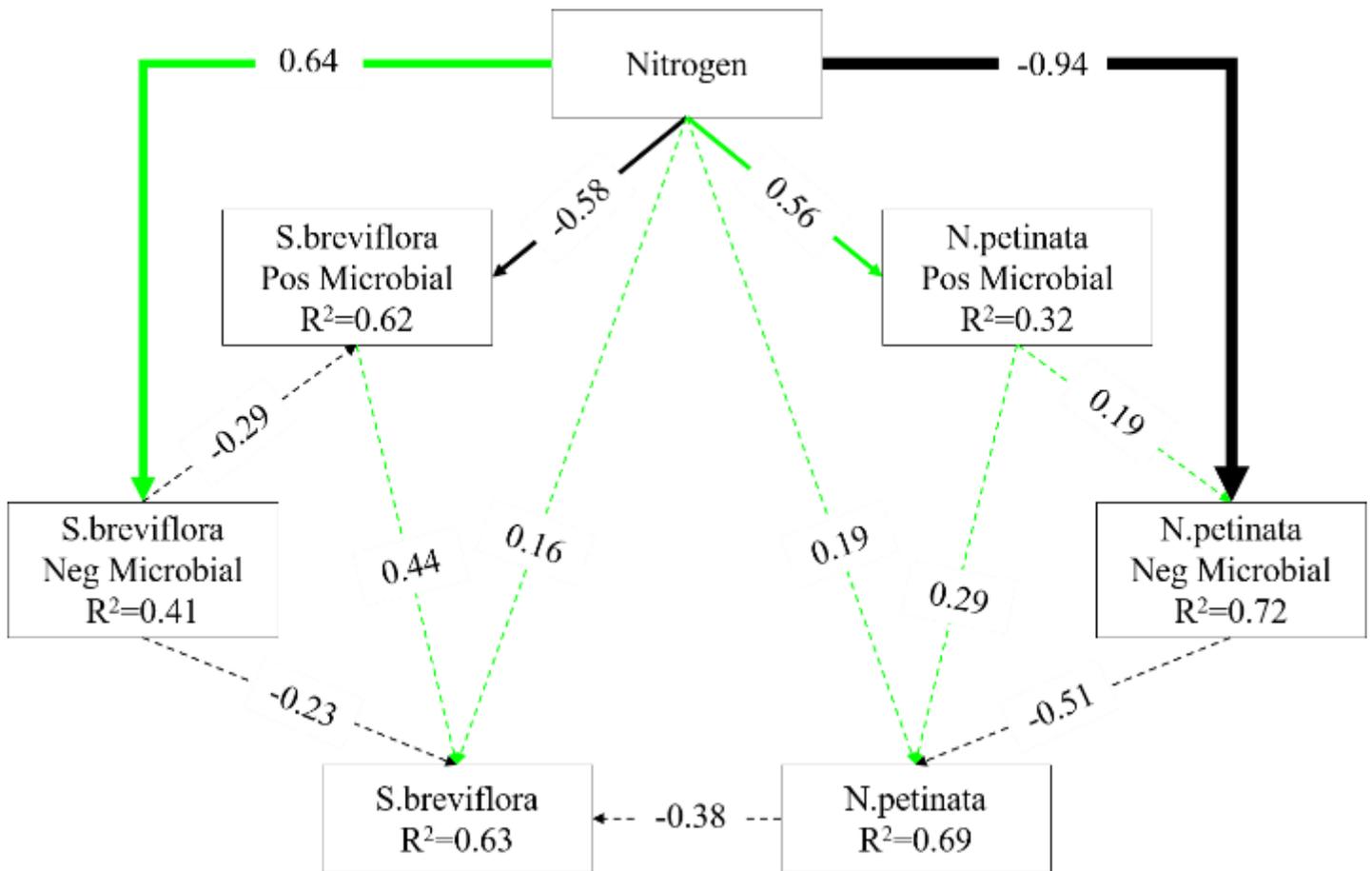


Figure 7

Structural equation modelling analysis of the N addition effects (via direct and indirect effects of plants and microbes) on positively correlated microbes, negatively correlated microbes, and plants. The results of model fitting: Fisher's $C = 15.848$, $P = 0.198$, 12 degrees of freedom. The green and black arrows indicate significant positive and negative effects, respectively ($P < 0.05$). Dotted lines are not significant ($P > 0.05$). Values associated with arrows represent standardized path coefficients. Arrow width is proportional to the strength of the path coefficients. R^2 values associated with response variables indicate the proportion of variation explained by relationships with other variables.

Supplementary Files

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