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1	Organic manure rather than phosphorus fertilization primarily determined
2	asymbiotic nitrogen fixation rate and the stability of diazotrophic community in
3	an upland red soil
4	Wei Shi <sup>a,d</sup> , Hui-Yu Zhao <sup>b</sup> , Yin Chen <sup>c</sup> , Jin-Song Wang <sup>b</sup> , Bing Han <sup>a,d</sup> , Cong-Ping Li <sup>b</sup> , Jun-Yuan
5	Lu <sup>b</sup> , Li-Mei Zhang <sup>a,d*</sup>
6	<sup>a</sup> State Key Laboratory of Urban and Regional Ecology, Research Center for
7	Eco-Environmental Sciences, Chinese Academy of Sciences, Beijing 100085, China.
8	<sup>b</sup> Soil and Fertilizer Station of Qujing City, Qujing, Yunnan Province 655000, China.
9	<sup>c</sup> School of Life Sciences, University of Warwick, CV4 7AL, Coventry, United Kingdom
10	<sup>d</sup> University of Chinese Academy of Sciences, Beijing 100049, China.
11	
12	*Correspondence to <a href="mailto:zhanglm@rcees.ac.cn">zhanglm@rcees.ac.cn</a> (Limei Zhang, phone +86-10-62953251)
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## Abstract:

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Biological nitrogen fixation (BNF) plays a vital role in nitrogen supply in agricultural ecosystem but is generally impaired by agricultural fertilization. Understanding the trade-off between fertilization and BNF, and the underlying mechanisms are essential to optimize fertilization management for sustainable agriculture production. In this study, we examined the potential rate of asymbiotic N2 fixation, nifH gene abundance, the composition and co-occurrence network of diazotrophic community in an acidic red soil received different organic and inorganic fertilization regimes for more than 40 years. Our results showed that long-term chemical fertilizer application drastically decreased soil microbial biomass, nitrogenase activity and nifH gene abundance in comparison to the unfertilized control. Organic manure application showed significantly positive effect on soil nitrogenase activity and crop yield via regulating soil pH and the key ecological cluster of diazotrophic community (module #2 which was mainly represented by Bradyrhizobium, Pseudacidovorax and Azospirillum), while phosphorus fertilization showed no obvious promotion effect. Organic manure amendment significantly increased the diversity of diazotrophs and enriched some diazotrophic taxa, particularly *Pseudacidovorax* and *Rhodopseudomonas* which were likely responsible for the high N<sub>2</sub>-fixation potential. The control and organic manure amendment treatments possessed a more complex and stable diazotrophic network than the chemical fertilizer treatments did, which greatly facilitated the resistance of diazotrophic community to environmental stress and thus sustained a high N<sub>2</sub> fixation potential. Together, our study demonstrated that organic manure application can effectively alleviate the inhibitory effect of nitrogen fertilization on N2 fixation via regulating soil property and shaping a more

stable diazotrophic network. **Keywords**: Acidic red soil; Long-term fertilization; Nitrogenase activity; Diazotrophs;
Co-occurrence network

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#### 1. Introduction

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Both nitrogen (N) and phosphorus (P) are the two principal nutrient elements constraining the productivity in natural and agro-ecosystems (Camenzind et al., 2018; Du et al., 2020; Hou et al., 2020). P deficiency is more serious in acidic red soils as released P by weathering or fertilized P is apt to be co-precipitated with iron and manganese oxyhydroxides, and iron aluminides, or absorbed onto their surfaces (Vitousek et al., 2010). To meet an ever increasing demand for food, large amounts of chemical fertilizers are applied to agro-ecosystems to alleviate limitation of N and P in agriculture ecosystems, which have substantially changed N and P cycles and resulted in negative impact on the environment, such as eutrophication, soil acidification, greenhouse gas emission (N2O) and biodiversity decreasing, etc. (Guo et al., 2010; Hu et al., 2015; Penuelas et al., 2013; Zhong et al., 2015). Unlike N fertilizer which can be chemically synthesized, P is mainly found in minerals with low bioavailability and is in short supply around the world. As the demand for P fertilizer in agriculture is ever increasing, confronting with the shortage of P-bearing minerals on a world scale, P is described as a "disappearing nutrient" (Gilbert, 2009). Furthermore, numerous studies have suggested that anthropogenic N inputs is distinctly increasing imbalance of N:P ratio and P limitation in tropical or subtropical regions, and consequently limit plant productivity and further impair ecological functions including biological N fixation, nitrification, litter decomposition, N mineralization and carbon storage, etc. in natural terrestrial ecosystems (Camenzind et al., 2018; Dai et al., 2020; Dynarski and Houlton 2018; Hou et al., 2020; Penuelas et al., 2013; Yao et al., 2018). However, the effect of imbalanced N:P ratio on soil ecological functions in agricultural ecosystems and the underlying

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mechanisms were less known though P limitation resultant crop yield reduce is well known.

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Biological nitrogen fixation (BNF), air dinitrogen reduction to ammonium catalyzed by nitrogenase (Canfield et al., 2010), plays an important role in ecosystem nitrogen input and contributes 40 - 100 Tg N to terrestrial ecosystem per year (Vitousek et al., 2013). According to whether diazotrophs form the symbiotic structure with plants, diazotrophs are recognized as symbiotic diazotrophs (e.g., rhizobia and Frankia, etc.) and non-symbiotic diazotrophs (e.g., Azotobacter and Azospirillum, etc.). Although symbiotic diazotrophs dominantly contribute ~60% of BNF, non-symbiotic diazotrophs are nearly ubiquitous in soil, litter, stalk, leaves and even endophyte of plants, and thus are the important contributor to the N budges in terrestrial ecosystems (Gupta et al., 2006; Reed et al., 2011). The results based on mass balance and mathematic modeling suggested that the annual N input via asymbiotic nitrogen fixation was more than 10 kg·ha<sup>-1</sup>·year<sup>-1</sup>, which almost balanced the N budget of mature tropical forest in Amazonia rainforest after deducting atmospheric N deposition (Cleveland et al., 2010). This estimate was corroborated by more findings from other tropical forests (Hedin et al., 2009). Moreover, large-scale mathematic modeling study showed that asymbiotic nitrogen fixation contributed a large proportion of N inputs than symbiotic nitrogen fixation on the global scale in terrestrial ecosystems (Reed et al., 2011). Some studies suggested that BNF are also important sources of N supply in fertilized agricultural ecosystems. For example, it was found that asymbiotic nitrogen fixation contributed 24% of biomass nitrogen in cereals (including maize, rice and wheat) on a global scale during a 50-year period (1961 to 2010) (Ladha et al., 2016). Similarly, it was estimated that 29% - 82% of N for maize (Zea mays L.) was derived from atmospheric nitrogen in arid and low nitrogen Sierra Mixe area, Mexico

(Van Deynze et al., 2018). Together, these studies suggest that BNF has the great potential to partially replace chemical nitrogen fertilizer and alleviate the negative environmental effects of N fertilization on agro-ecosystems (Reed et al., 2011; Wang et al., 2019). However, a number of studies also reported that the intensive use of chemical nitrogen fertilization in agricultural ecosystem usually exhibited an inhibitory effect on biological N fixation (Chao et al., 2017; Fan et al., 2019; Tang et al., 2017). Understanding the trade-off between fertilization and BNF and the underlying mechanisms in agricultural ecosystem is therefore critical to maximize BNF in agricultural ecosystem. Furthermore, non-symbiotic diazotrophs are highly diverse and functionally redundant in different soil environments (Chao et al., 2017; Angel et al., 2018; Fan et al., 2019). To identify the keystone diazotrophs and their main influential factors in different soils are prerequisite for field management optimizing and manipulation of diazotrophs for sustainable agriculture production.

Converse to the inhibitory effect of chemical N fertilizer input on N<sub>2</sub> fixation, it was found that phosphorus addition can significantly promote N<sub>2</sub>-fixation activity in P-limited forest and marine ecosystem (Camenzind et al., 2018; Dynarski and Houlton 2018; Mills et al., 2004; Sanudo-Wilhelmy et al., 2001; Zheng et al., 2016), and significantly change diazotrophic community in karst grassland soils and a Chinese fir plantation (Wang et al., 2018; Xiao et al., 2020). Significant improvement of N<sub>2</sub>-fixation activity and elevated *nif*H gene expression under phosphorus fertilization were also observed in agriculture field (Tang et al., 2017; Xun et al., 2018). However, these views were challenged by other studies. For example, some studies showed that phosphorus fertilization alone had promotive effect on N<sub>2</sub>-fixation and diazotrophic abundance, but such an impact diminished when phosphorus

fertilizer was applied together with nitrogen fertilizer (Chao et al., 2017; Wang et al., 2018). Similarly, some studies showed that organic mature fertilizer application had significantly positive effect on the N<sub>2</sub>-fixation and diazotrophic abundance in a rice paddy soil (Liao et al., 2017). However, it was also reported that organic manure fertilizer alone or organic manure combined with low-level chemical nitrogen fertilizer (262.5 kg-N ha<sup>-1</sup>-year<sup>-1</sup>) promoted the N<sub>2</sub> fixation, but the positive effect disappeared when both organic manure and high-level nitrogen fertilizer (420 kg-N ha<sup>-1</sup>·year<sup>-1</sup>) were applied in a vertisol (Chen et al., 2020). These contradictory results indicated that N2-fixation and diazotrophic community vary largely in different spatial scale and soil conditions and are synergistically determined by multiple factors. A holistic understanding of how different fertilization practices (e.g., nitrogen, phosphorus or organic manure fertilizations) interactively influence the N2 fixation and diazotrophs in different soils are therefore greatly needed to accurately estimate the contribution and potential of asymbiotic N<sub>2</sub> fixation to N input in fertilized agricultural ecosystem. Furthermore, most previous studies on the estimation of asymbiotic N2 fixation under different fertilization regimes were mainly based on the short-term trial (Fierer et al., 2007; Rodríguez-Blanco et al., 2015). As such, our knowledge on the long-term effects of inorganic and organic fertilization on N fixation rates and their associated N2 fixers in agroecosystems were still relatively scarce (Fan et al., 2019), particularly in acidic red soils in which P could be a main limitation factor on N<sub>2</sub> fixation.

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Therefore, in this study, nitrogenase activity and diazotrophic communities in an upland red soil received 41-year fertilization practices including non-fertilization control (Control), chemical N fertilizer only (N), chemical N and P fertilizers (NP), N fertilizer plus organic

manure (NM), NP plus organic manure (NPM) and chemical N, P and potassium fertilizers (NPK) were examined. We aimed to (1) assess the singular and combined effect of long-term application of N fertilizer, P fertilizer and organic manure on asymbiotic N<sub>2</sub> fixation rate and diazotrophic community in the acidic red soil, and (2) to characterize the key diazotrophic taxa responding to different fertilization regimes and estimate the possible regulation way to stimulate N<sub>2</sub> fixation in agricultural ecosystem. We hypothesized that the suppressive effect of N fertilization on N<sub>2</sub> fixation could be alleviated by P addition in P-limited acidic red soil, and that some key diazotrophic taxa might be sensitive to fertilization and fertilization-induced environment change, thus can be up-regulated via proper practice.

#### 2. Materials and methods

## 2.1. Field trial description and soil sample collection

The field fertilization trials was established in 1978 at Qujing City, Yunnan province, Southwest China (25°18′6.8"N, 103°53′55.4"E). The site has a subtropical monsoon climate with an annual mean temperature of 15 °C, and annual mean precipitation of 1000 mm, and the soil is classified as chromic cambisol according to the FAO soil classification system. The soil contained 20.6 g·kg<sup>-1</sup> soil organic matter, 1.0 g·kg<sup>-1</sup> total nitrogen, 67.0 mg·kg<sup>-1</sup> available potassium (AK) and trace amounts of available phosphorus (AP) before the experiment started (Dai et al., 2009). The fertilization trials included six treatments: (1) non-fertilizer control (Control); (2) nitrogen fertilizer only (N); (3) inorganic nitrogen and phosphorus fertilizers (NP); (4) inorganic N fertilizer plus organic manure (NM); (5) inorganic nitrogen, phosphorus and potassium fertilizers plus organic manure (NPM) and (6) inorganic nitrogen, phosphorus and

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potassium chloride were applied annually at a rate of 276 kg N hm<sup>-2</sup>, 120 kg-P<sub>2</sub>O<sub>5</sub>•hm<sup>-2</sup> and 112.5 kg-K<sub>2</sub>O•hm<sup>-2</sup>, respectively. Farmyard pig manure was applied as organic manure at a rate of 30 t hm<sup>-2</sup>•year<sup>-1</sup> and contained ~ 83% organic matter, ~ 2% TN, ~ 0.60% AP and ~0.45% AK. Each treatment had three replicate plots, and each plot was about 33 m<sup>2</sup>. All plots were randomly arranged and managed according to local habits, with maize (*Zea mays* cv Qidan 7) sown in summer and fallowed in winter.

Soil samples were collected in July (maize tasseling stage) and October (after harvest) 2019. After the litters were removed, five subsamples of topsoil (0 – 20cm) were collected between two maize plants and mixed as a biological sample for each plot. A total of 36 samples were collected. Soil samples were transported to the laboratory on dry ice. Subsequently, the soil was mixed and sieved (< 2mm) to remove the roots and stones. Then the soil samples were separated into two parts, with one stored at 4°C for soil physicochemical properties and microbial enzyme activity analyses, and another one at -80 °C for DNA extraction.

#### 2.2. Soil physicochemical property analyses

The soil physicochemical characteristics were determined according to established protocols (Zhao et al., 2019; Xiong et al., 2021). Briefly, soil pH was determined in deionized water (soil: water, 1 : 2.5) using a pH meter. Soil water content was determined by the oven-drying method at 105 °C to constant weight. Soil ammonium (NH<sub>4</sub>+-N) and nitrate (NO<sub>3</sub>--N) were extracted with 1 M KCl and determined with a continuous flow analyzer (AA3, Bran +Luebbe, Germany). Soil available phosphorus (AP) was determined by the molybdenum blue colorimetric method (Murphy and Riley 1962). Total carbon (TC) and

nitrogen (TN) were determined by the Dumas method with Element Analyser (Vario EL III-Elementar, Germany). Total phosphorus (TP) was digested with H<sub>2</sub>SO<sub>4</sub> and HClO<sub>4</sub>, and determined according to the molybdenum blue colorimetric method (Murphy and Riley 1962).

## 2.3. Soil respiration, microbial biomass carbon and nitrogenase activity analysis

Soil basal respiration (SR) was determined by the microcosm method (Franz 1995). Briefly, 10g of fresh soil was placed in a sterile 120 ml serum bottle, and the soil water content was adjusted to 60% of field water capacity. Then the bottles were sealed with rubber stopper and aluminum cover and incubated at 25 °C for 24 h, and the CO<sub>2</sub> concentration in the headspace of bottles was determined using a gas chromatograph (Agilent 7890A, USA).

Soil microbial biomass carbon (MBC) was determined by the chloroform fumigation method (Franz 1995). Briefly, 10g fresh soil was placed in glass culture dish in duplicate, with one fumigated with chloroform at 25 °C in the dark for 24 h and another one incubated under the same condition without fumigation as the control. Then, all the soil samples were extracted with 0.5 M K<sub>2</sub>SO<sub>4</sub> and measured by a TOC/TON analyzer (Multi N/C 3100, Analytik Jena, Germany).

Nitrogenase activity was evaluated using the acetylene reduction method as described previously (Han et al., 2019). Briefly, 10 g fresh soil were weighted into sterile 120 ml serum bottles, and glucose (1 mg C  $g^{-1}$  dry soil) and a citric acid (1 mg C  $g^{-1}$  dry soil) solution were added to the bottles to ensure non-limitation of carbon source for diazotroph growth. The bottles were sealed with rubber stoppers and 10% (v/v) acetylene ( $C_2H_2$ ) was injected into each bottle, which were incubated at 28 °C for 48 h. The ethylene ( $C_2H_4$ ) concentration in the

headspace of bottles were determined with gas chromatograph (Agilent 7890A, USA).

# 2.4. Soil DNA extraction and quantitative PCR of nifH gene

Soil total DNA was extracted from 0.5 g soil using the PowerSoil DNA Isolation Kit (MO BIO laboratories, Carlsbad, USA) according to the manufacturer's protocol. The concentration and purity of the extracted DNA were determined using a Nanodrop ND-2000c UV-Vis spectrophotometer (NanoDrop Technologies, Wilmington, DE, USA). All the DNA samples were stored at -40 °C for downstream experiment.

Quantitative PCR (qPCR) analysis of *nif*H gene was conducted on a Roche LightCycler® 480 system (Roche Life Science, USA) using the SYBR Green method, with the primer set PolF/PolR (Poly et al., 2001). The amplification was carried on using the thermal cycle program: 95 °C for 10 min, 35 cycles of 95 °C for 30 s, 62 °C for 30 s, 72 °C for 30 s and plate read at 86 °C. The qPCR reactions (25  $\mu$ L) contained 12.5  $\mu$ L 2× SYBR Premix Ex Taq (TaKaRa Bio Inc., Shiga, Japan), 2  $\mu$ L of DNA template (1–10 ng), 0.5  $\mu$ L (10  $\mu$ M) of each primer and 2  $\mu$ l of Acetylated Bovine Serum Albumin (10 mg/ml, BSA-C, Promega, USA). Standard curves were generated using 10-fold serial dilutions of plasmid containing *nif*H gene fragment. Amplifications efficiencies for *nif*H gene were estimated at 100.4% ( $R^2$ > 0.99).

## 2.5. High-throughput sequencing and bioinformatics analysis

PCR amplification of the *nif*H gene was conducted with barcoded primer sets PolyF-PolyR (Poly et al., 2001). The PCR reactions were conducted in three parallels in 25 μL mixtures containing 12.5 μL 2 × Premix (TaKaRa Bio Inc., Shiga, Japan), 0.5 μL (10 μM) of each barcode primer, 2 μL of 10mg·ml<sup>-1</sup>Acetylated Bovine Serum Albumin (BSA, Promega,

USA) and 2  $\mu$ L of DNA template (1-10 ng). Negative control was also included to ensure no contamination. The thermocycling parameters for PCR were the same as above mentioned. The PCR products were purified using the Agarose Gel DNA purification kit (TaKaRa Bio) following the manufacturer's instructions. Purified amplicons were pooled in equimolar and then sequenced on the platform of Illumina NovaSeq PE250 sequencer (Personalbio, Shanghai, China).

The *nif*H sequences were analyzed with the QIIME-1.9.1 pipeline (Caporaso et al., 2010) and USEARCH v10 (Edgar, 2010). Firstly, primer sequences and low-quality sequences with score less than 20 or containing ambiguous nucleotides were removed. Then the paired-end reads of each sample were merged to a single sequence. The remaining sequences were converted to amino acid sequences using the FunGene Pipeline of the Ribosome Database Project (Wang et al., 2013). The sequences that do not match the *nif*H protein sequences or contain termination codons were discarded. The remaining sequences were compared against the *nif*H gene database (Gaby and Buckley 2014). The remaining high-quality sequences were clustered into operational taxonomic units (OTUs) at 95% similarity using UCLUST (Edgar 2010) algorithm, and all singleton OTUs were discarded.

## 2.6. Co-occurrence network analysis and structural equation model construction

The co-occurrence network of diazotrophic community was constructed according to previous protocols (Hartman et al., 2018; Huang et al., 2019). Firstly, the OTUs occurring in less than 1/3 of the samples were removed and the sensitive OTUs were identified using the R package 'indicspecies' and 'edgeR' (Hartman et al., 2018). Then, Spearman correlations between diazotrophic species were calculated with the R package 'Hmisc', and the adjusted

P-values were calculated using the method of Benjamini-Hochberg (BH) (Csardi and Nepusz 2006). The network modules were identified using the method of fast greedy algorith, with the adjusted P-values and r values cutoff at 0.01 and 0.6, respectively (Clauset et al., 2004). Finally, the network images were visualized with the Fruchterman-Reingold layout using R package 'igraph'. The co-occurrence patterns of diazotrophic community between chemical fertilizer group (N, NP and NPK treatments) and non-chemical fertilizer group (Control, NM and NPM treatments) were further constructed by combining sequence data from each three treatments and the two seasons following the above-mentioned method, and were visualized with Gephi (https://gephi.org/). We defined the nodes as network hubs (degree > 130; closeness centrality > 0.4) referring to their roles in network structure (Agler et al., 2016; Xiong et al., 2021). The robustness of microbial network was evaluated using the index of 'proportion of the giant component' by removing nodes in the network and assessing the degradation rate of network robustness using both deliberate attacks and random attacks methods. The deliberate attack indicated that the pre-specifies nodes were removed from static network based on the importance of nodes (degree), and random attacks indicated that the nodes were randomly removed from static network regardless of their importance (Fan et al., 2018). The structural equation model (SEM) was conducted using IBM SPSS Amos 22 to quantify the direct and indirect effects of the soil physicochemical properties (e.g., pH, TN, TC/TN and AP) and the relative abundance of the main modules on the nitrogenase activity. All variables were standardized by Z transformation (mean = 0, standard deviation = 1) using

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the function of 'scale' in R package. Maximum likelihood method was used to fit the model

(Zhao et al., 2019). The standardized total effects (STEs) of the soil properties and fertilization treatments on the nitrogenase activity were calculated.

# 2.7. Statistical analysis

The raw data of gene abundance were log-transformed in order to ensure the normality. One-way and two-ways variance analysis (ANOVA) based on Duncan test (P < 0.05) were performed to test the difference between treatments with SPSS 22.0 (IBM, USA). The beta-diversity of diazotrophic community was assessed by computing weighted UniFrac distance matrices and then ordinated using nonmetric multidimensional scaling (NMDS). The significance of community dissimilarity was tested with PERMANOVA using the 'adonis' function (permutations = 999) of the 'vegan' package in R (Dixon 2003). Redundancy analysis (RDA) was conducted to test the influence of environmental parameters on community structure with R software in 'vegan' package (Dixon 2003). The alpha-diversity of nifH gene was calculated using Faith's phylogenetic diversity (PD) (Faith 1992).

## 2.8 Accession numbers

The raw sequencing reads were deposited in the NCBI Sequence Read Archive (SRA) under the accession number PRJNA694102.

## 3. Results

# 3.1 Soil properties and crop yields

Soil properties varied greatly after 41-years fertilization treatments (Table 1). For both seasons, the Control treatment had the highest pH value ranging from 6.57 to 6.6, followed by manure addition treatments (NM and NPM, pH at 5.80 - 5.98), with the lowest pH recorded in three chemical fertilizer treatments (N, NP and NPK, pH at 4.52 - 4.71) (P < 0.001, Table 1).

In summer, NH<sub>4</sub>\*-N concentration ranged between 9.9 - 24.55 mg·kg<sup>-1</sup> and was the highest in the NPK treatment, and then in the N treatment (P < 0.001, Table 1). In autumn, NH<sub>4</sub>\*-N concentration was significantly decreased and showed no significant difference among six treatments (0.40 - 1.63 mg·kg<sup>-1</sup>) (P < 0.001, Table 1). Similarly, NO<sub>3</sub>\*-N concentration decreased across the seasons, and the Control treatment had the lowest NO<sub>3</sub>\*-N concentration for both seasons. (P < 0.001, Table 1). Phosphorus fertilization significantly increased the AP and TP contents in the NP, NPM and NPK treatments compared to non-phosphorus addition treatments (Control, N and NM) (P < 0.001, Table 1), but showed no visible effect on the TC and TN contents. The N fertilization significantly decreased the TC and TN contents by 24.9% and 14.3%, (P < 0.001, Table 1), while organic manure application significantly increased the TC and TN contents by 21.2% and 55.3%, respectively, compared to the Control treatment (P < 0.001, Table 1).

drastically reduced maize yield to total crop failure since 1985, while there was no significant difference among other five treatments, with a mean yield of recent three years (2017-2019) ranging between 7230.0 and 8677.5 kg\*hm $^{-2}$  (P < 0.05, Fig. 1a).

## 3.2 Soil respiration and microbial biomass carbon

Soil respiration (SR), soil respiration quotient (SQ) and microbial biomass carbon (MBC) showed significant difference among treatments (Fig. 1b-c). SR was significantly lower in the N treatment (0.31 ug C d<sup>-1</sup>·g<sup>-1</sup> dry soil) than any other treatments (0.47 - 0.57 ug C d<sup>-1</sup>·g<sup>-1</sup> dry soil) in summer (P < 0.05, Fig. 1b), but showed no significant difference among treatments in autumn (P > 0.05, Fig. 1b). MBCs in three chemical fertilizer treatments (N, NP and NPK)

were significantly lower than that in Control and organic manure treatments (NM, NPM), with lowest value observed in the N treatment (P < 0.05, Fig. 1c). Consequently, SQ showed an opposite trend to SR, with a significantly higher SQ in the N treatment than any other treatments (P < 0.05, Fig. 1d), indicating a suppression of microbial metabolism by unbalanced N fertilizer application.

# 3.3 Soil nitrogenase activity and nifH gene abundance

Nitrogenase activity, evaluated with the acetylene reduction method, ranged from 0.36 to 310.89 nmol·d<sup>-1</sup>·g<sup>-1</sup> dry soil among all treatments (Fig. 2a). The highest nitrogenase activity was found in the Control treatment for both seasons (310.89 and 120.43 nmol·d<sup>-1</sup>·g<sup>-1</sup> dry soil in summer and autumn, respectively), followed by NM and NPM treatments (P < 0.05, Fig. 2a). The nitrogenase activity was almost completely inhibited in N fertilizer alone application treatment (N) (P < 0.05, Fig. 2a). Compared to N treatment, P fertilization treatments (NP and NPK) showed slight promotion on nitrogenase activity (P > 0.05 in NP treatment and P < 0.05 in NPK treatment), while organic manure fertilization (NM and NPM) significantly enhanced nitrogenase activity about 35 times (P < 0.05, Fig. 2a). The *nif*H gene abundance showed similar pattern as nitrogenase activity, and was significantly higher in Control, NM and NPM treatments (P < 0.05, Fig. 2b).

# 3.4 Diversity and community composition of diazotrophic community

A total of 3,228,024 high quality *nif*H gene sequence reads were obtained from 36 soil samples, with a mean of 89,667 reads per sample. To equalize the sequencing effort, all samples were then rarefied to 66,774 sequences, and the resulting 2597 OTUs at 95%

similarity were subjected to alpha- and beta-diversity analyses. The Chao 1 diversity and Phylogenetic diversity ranged between 350.72-1077.71 and between 45.12 -88.62 in all treatments, respectively, with significantly higher values in NM and NPM treatments than any other treatments (P < 0.05, Table S1).

The Non-metric multidimensional scaling (NMDS) analysis clearly showed that the diazotrophic communities were clearly separated among NM-NPM, Control and N-NP-NPK treatments but showed no visible separation between two seasons (Fig. 3a). The significant differences of diazotrophic community among different treatments were also confirmed by Adonis test (Treatment:  $R^2 = 0.743$ , P < 0.001, Table S2). Redundancy analysis (RDA) further showed that the first two axes explained 29.28% and 11.65% of variation for diazotrophic community. The ANOVA test showed that pH, TC, TC/TN and NO<sub>3</sub>-N were the most important factor influencing the diazotrophic community (P < 0.05, Fig. 3b).

Taxonomic analysis showed that the diazotrophic communities mainly consisted of *Bradyrhizobium* (30.27%), *Rhodopseudomonas* (11.95%), *Pseudacidovorax* (5.42%), *Azospirillum* (4.92%), *Rhizobium* (3.82%), *Burkholderia* (3.46%) and *Methylobacterium* (2.35%) within Proteobacteria (Fig. 4). *Bradyrhizobium* (14.32% - 50.38%), *Pseudacidovorax* (0.69% - 16.18%) and *Azospirillum* (0.47% - 19.65%) were widely present in all soil samples while the relative abundance varied largely among six treatments. Particularly, the relative abundance of *Pseudacidovorax* was significantly higher in the Control, NM and NPM treatments (2.75% - 16.18%) than in three chemical fertilizer treatments (N, NP and NPK) (0.69% - 4.54%, *P* < 0.05, Fig. 4). Intriguingly, *Ectothiorhodospira* was exclusively present in three chemical fertilizers treatments (N, NP and NPK) with a proportion of 2.19% - 23.18%

while *Rhodopseudomonas* was significantly enriched in NM and NPM treatments with a proportion of 19.98% - 39.53%, (P < 0.05, Fig. 4).

## 3.5 The co-occurrence network and keystone taxa of diazotrophic community

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Correlation network analysis was further conducted to evaluate the effect of long-term fertilization on the association of diazotrophs. It showed that diazotrophs network was clearly grouped into three major modules (modules #1, #2 and #5) and long-term fertilization drastically changed the cumulative relative abundance of major genera in three modules (Fig. 5a, c). Each module was composed of different genera, with the module 1 mainly represented by Rhodopseudomonas and Rhizobium, the module 2 by Bradyrhizobium, Azospirillum and Pseudacidovorax and the module 5 by Bradyrhizobium and Azotobacter (Fig. 5b). Bradyrhizobium and Pseudacidovorax dominated module 2 with a significantly higher proportion than other modules (Fig. 5b). The cumulative relative abundance of module 1 was highest in NM and NPM treatments while the values of module 5 was highest in N, NP and NPK treatments (Fig. 5c). Interestingly, the cumulative relative abundance of module 2 significantly decreased in N, NP and NPK treatments in comparison to the Control, NM and NPM treatments, showing similar trend as nitrogenase activity (Fig. 2a and Fig. 5c). More intriguingly, a significantly positive correlation was observed between cumulative relative abundance of module 2 and nitrogenase activity ( $R^2 = 0.46$ , P < 0.001, Fig. 5d), but not between the cumulative relative abundance of module 1, module 5 and the nitrogenase activity (Fig. 5d). Coincidently, significantly positive correlation was observed between the cumulative relative abundance of dominant genera in module 2 (e.g., Pseudacidovorax, Bradyrhizobium and Azospirillum) and soil nitrogenase activity (P < 0.001, Fig. S1), but not

found for the dominant genera in module #1 and #5 (Fig. S1).

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As the most distinct difference in soil physiochemical parameters, nitrogenase activity, nifH gene abundance, and the dissimilarity of diazotrophic community were observed between three chemical fertilizer (N, NP and NPK) and three non-chemical fertilizer (Control, NM and NPM) treatments. We further assessed the co-occurrence patterns of diazotrophic communities between N-NP-NPK treatments and Control-NM-NPM treatments by combining sequence data from each three treatments and the two seasons. The result showed that three non-chemical fertilizer treatments (Control-NM-NPM group) had higher network nodes (1105), edges (26512) and average degree (47.986) than three chemical fertilizer treatments (N-NP-NPK group) did (nodes: 392, edges: 1042, average degree: 5.316; a higher average degree representing a greater network complexity) (Fig. 6a). A higher proportion of negative correlation was also observed in the network of Control-NM-NPM group (10.19%) than in N-NP-NPK group (0.96%), and a typical power-law degree distribution pattern was observed for both groups (Fig. 6c). We also estimated network stability by removing nodes randomly or deliberately in static network, and found that the network structure in Control-NM-NPM group was more stable than those of N-NP-NPK group (Fig. 6d). All these suggested that non-chemical fertilizer treatments had a more complex and stable diazotrophic network association than chemical fertilizer treatments (Fig. 6a, d). Furthermore, the number of 'hub nodes' (nodes with high values of degree (> 130) and closeness centrality (> 0.4) was also higher in the network of Control-NM-NPM group than that of N-NP-NPK group, and these hub nodes were mainly affiliating within the genera of Bradyrhizobium, Pseudacidovorax, and Azospirillum (Fig. 6b).

Structural equation model (SEM) was used to quantify the effect of long-term fertilization treatments on soil properties, diazotrophic keystone taxa and nitrogenase activity and crop yield. The result showed that 83% and 71% of variation in nitrogenase activity and maize yield were directly or indirectly explained by different fertilization practices and fertilization-induced change in soil properties and diazotrophs attributes, respectively (Fig. 7a). Nitrogen fertilizer application alone (N treatment) significantly decreased soil pH and TC: TN value and thus negatively affected soil nitrogenase activity (P < 0.001, Fig. 7a), and accounted for the strongest negative effect on nitrogenase activity and crop yield (with a STE value of -0.913 for nitrogenase activity and -0.86 for crop yield) (Fig. 7b). Organic mature application (NM and NPM treatments) had significantly positive effect on soil pH and the cumulative relative abundance of module 2, and then on soil nitrogenase activity (P < 0.05, Fig. 7a). Organic manure application (with a STE value of 0.841) also positively affected maize yield synergistically with increased pH (with a STE value of 0.875) (Fig. 7b). Phosphorus fertilization showed no significant effect on nitrogenase activity (P > 0.1), but positively influenced crop yield via increasing AP content (P < 0.05, Fig. 7a).

#### 4. Discussion

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Our result showed that long-term inorganic chemical fertilizer application (N, NP and NPK treatments) and organic mature application (NM and NPM treatments) in the acidic red soil had opposite effects on nitrogenase activity, *nif*H gene abundance, diazotrophic community composition and co-occurrence pattern. Compared to the Control, inorganic chemical fertilizer application significantly decreased the nitrogenase activity and *nif*H gene

abundance, and N fertilizer application alone (N treatment) almost completely inhibit the nitrogenase activity. This was consistent with previous observations that chemical fertilizer (N) addition significantly inhibited the N<sub>2</sub>-fixation activity and *nif*H gene abundance in a Chinese fir forest and red soil (Tang et al., 2017; Wang et al., 2018). Some studies based on long-term fertilization trial also showed that nitrogen fertilization significantly decreased N<sub>2</sub>-fixation activity and diazotrophs abundance in both upland and paddy soils (Chao et al., 2017; Tang et al., 2017). As N<sub>2</sub> fixation is a metabolically costly process, diazotrophs preferentially use available nitrogen in the environment, and the nitrogenase enzyme is highly sensitive to ammonia (Chao et al., 2017; Masepohl and Hallenbeck 2010; Shi et al., 2016). It is therefore reasonable to see the suppressive effect of N fertilization on soil N<sub>2</sub>-fixation activity in these studies.

Our results further suggested that organic manure application (NM and NPM) significantly improved nitrogenase activity and *nif*H gene abundance in comparison to three chemical fertilizer treatments, and that soil nitrogenase activities were positively associated with pH, TC, TN and TC/TN ratio but negatively with inorganic nitrogen. Similarly, Huan and colleagues (2020) found that the combination of chemical and organic fertilizers significantly increased biological N<sub>2</sub>-fixation rate and *nif*H gene abundance in vertisol soil, and attributed it to the increased soil nutrient status and pH (Chen et al., 2020). In addition to nitrogen, soil pH and carbon were generally recognized as the crucial factors affecting N<sub>2</sub> fixation activity and diazotrophic abundance (Chao et al., 2017; Chen et al., 2020; Fan et al., 2018; Li et al., 2019; Wakelin et al., 2010; Wang et al., 2018). It has been suggested that low pH is not conducive to the activity of nitrogenase and the optimal pH for diazotrophs is

between 7.5 and 8.0 (Roper and Gupta 2016). A study based on field <sup>15</sup>N<sub>2</sub> labeling technique also suggested that the amount of BNF in four types of paddy soils is positively correlated with soil pH, and that the aluminum toxicity is another limiting factor for BNF in acidic red soil (Wang et al., 2019). It was also found that lime addition can alleviate the inhibition effect of nitrogen application on N<sub>2</sub>-fixation activity and nifH gene abundance in acidic red soil (Chao et al., 2017). In our study, inorganic chemical fertilization drastically decreased soil pH by ~ 2 units (pH at 4.5 - 4.7 in N, NP and NPK) compared with the Control (pH at 6.6). In contrast, organic manure application significantly improved soil pH by 1.1 - 1.5 units in comparison to inorganic chemical fertilization treatments. All these suggested that soil pH is also a determinative factor for BNF and soil acidification caused by nitrogen fertilization can greatly exacerbate the inhibitory effect of N fertilization on N<sub>2</sub>-fixation in acidic red soils. Moreover, diazotrophs in soil and rhizosphere are mainly heterotrophic and highly dependent on the carbon source from plant and organic matter as they metabolically maintain higher respiration to avoid the inhibition effect of O<sub>2</sub> on nitrogenase (Hill 1988; Li et al., 2021; Reed et al., 2011). The increased soil pH and high organic carbon input in NM and NPM treatments greatly facilitate the growth of diazotrophs, and thus enhance the nitrogenase activity and nifH gene abundance. The similar favorable soil condition in the Control (e.g., the highest pH and higher TC/TN ratio induced by rare N input condition) well explained the reason that it possessed the highest nitrogenase activity and nifH gene abundance among all treatments. This could be further corroborated by the lowest soil respiratory quotient and the highest microbial biomass carbon in the Control, NM and NPM treatments. The high N2-fixation potential in the Control also partially explained why the crop yield in this treatment did not

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markedly reduce after long-term "zero" fertilization, while the real N budget and nutrient balance in the Control need to be further explored.

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As nitrogen fixation is an energy-intensive process, BNF is supposed to be highly dependent on the availability of phosphorus. Coincidently, significant promotion of N<sub>2</sub>-fixation activity by phosphorus addition was commonly observed in P-limited forest soils (Wang et al., 2018; Zheng et al., 2016), marine water (Garcia et al., 2015; Mills et al., 2004; Sanudo-Wilhelmy et al., 2001), and upland red soil without fertilization for long-term (Dynarski and Houlton 2018). Similarly, significant promotion in N2-fixation activity and nifH gene expression by long-term phosphorus fertilization were also observed in a paddy soil (Tang et al., 2017). Acidic red soils are particularly prevalent in arable lands in Southern China, and P deficiency is much more pronounced as P is readily co-precipitated with iron and manganese oxyhyduoxides, iron aluminides, or directly absorbed onto their surfaces in red soils (Vitousek et al., 2010). Thus we hypothesized that P addition would promote N<sub>2</sub> fixation and alleviate the suppressive effect of N fertilization on it in the acidic red soil. Surprisingly, we found that phosphorus fertilizer application (NP, NPK, NPM) showed slight or no obvious promotion effect on nitrogenase activity and *nif*H gene abundance in this study. The inconsistency between findings in our study and others could potentially be attributed to two factors. One is that the phosphorus might not reach the limitation threshold for nitrogenase activity in our study site as this area is one of the most important phosphate producing area in China, and the AP content (9-10 mg·kg<sup>-1</sup> in the Control and N treatments) in our study site is relatively higher than those in P-limited natural ecosystems and the paddy soil in Tang's study (2017) in which AP in the Control was less than 4 mg·kg<sup>-1</sup>. Secondly, the

inhibitory effect of long-term nitrogen fertilizer input and the resulting soil acidification on nitrogenase activity may greatly weaken the promoting effect of phosphorus fertilization in NP and NPK treatments. Similarly, the strong promotion effect of organic manure also may conceal the impact of phosphorus fertilization in NM and NPM treatments. Together, all these suggested that long-term application of organic manure, rather than phosphorus fertilization, effectively alleviated the inhibitory effect of nitrogen fertilization on N<sub>2</sub> fixation process by regulating soil property in this acidic red soil.

NMDS and RDA analyses suggested that the diazotrophic communities largely varied among different fertilization practices but not between two seasons, suggesting strong impacts of long-term fertilization on diazotrophic community. Diazotrophic community was clearly separated among NM-NPM, Control, N-NP-NPK treatments, with pH, TC, TC/TN and NO<sub>3</sub>-as the main influencing factor. These findings were consistent with a number of previous observations showing that long-term fertilization significantly changed diazotrophic community composition (Chao et al., 2017; Fan et al., 2019; Fan et al., 2018; Tang et al., 2017), and further confirmed the vital role of soil pH, N fertilization and organic carbon in determining the community composition, *nif*H gene abundance and N<sub>2</sub> fixation rate.

Our network and SEM analyses further suggested that organic manure application positively influenced nitrogenase activity by regulating soil pH and the relative abundance of module #2 (which was mainly represented by *Bradyrhizobium*, *Pseudacidovorax* and *Azospirillum*). Except for nitrogen fixation with leguminous plants, *Bradyrhizobium* also acts as the important plant growth promoting rhizobacteria on non-legume plants (e.g. secreting phytohormones and siderophores, and exhibiting antagonistic effects towards many plant

pathogenic fungi) (Antoun et al., 1998; Shin et al., 2016). It is therefore frequently identified as the most abundant diazotrophic taxa in different soil types across fertilized agriculture field to natural forest (Fan et al., 2018; Han et al., 2019; Meng et al., 2019). Bradyrhizobium and Azospirillum were also identified as the putative keystones potentially responsible for the observed active N<sub>2</sub> fixation rate in a semi-arid desert based on <sup>15</sup>N<sub>2</sub> labelling technology (Miao et al., 2020). Pseudacidovorax is a newly discovered genus (Kämpfer et al., 2008), and the members of *Pseudacidovorax* have been isolated from soil, plant endophyte and marine water with high N<sub>2</sub> fixation capability being confirmed (Wedage et al., 2019; Zhang and Chen 2012). The module #2 was positively correlated with soil nitrogenase activity and Azospirillum, Bradyrhizobium and Pseudacidovorax were present in all treatments with varied proportion. All these suggested that Azospirillum, Bradyrhizobium and Pseudacidovorax may act as the keystone taxa in diazotrophic community and play a vital role in N<sub>2</sub> fixation in diverse habitats. In laboratory condition, the nitrogenase activity of isolate Pseudacidovorax austerolens is sensitive to inorganic nitrogen addition and the optimal pH is at 7.0 for both nitrogenase activity and its growth (Tyagi and Singh 2015). Coincidingly, *Pseudacidovorax* were much more abundant in three non-chemical fertilization treatment than in the chemical fertilizer treatments, suggesting that *Pseudacidovorax* is highly sensitive to the chemical nitrogen input and soil acidification, but can be greatly enriched in unfertilized soil and soils amended with organic manure. Furthermore, Rhodopseudomonas was significantly enriched in NM and NPM treatments with a proportion of 19.98% ~39.53%. Rhodopseudomonas has been identified as the active soil free-living diazotrophs based on <sup>15</sup>N-RNA-SIP technique (Angel et al., 2018). Moreover, it was showed that

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Rhodopseudomonas palustris could use multiple carbon compounds (including aromatic compounds) as carbon source and electron donors (Sasika et al., 1994), and possessed three types of nitrogenases and multiple pathways for energy metabolism (Larimer et al., 2004). These may help to explain why Pseudacidovorax and Rhodopseudomonas were markedly enriched in the NM and NPM treatments. Together with the significantly improved nitrogenase activity in the NM and NPM treatments, it suggested that long-term organic manure amendment had great potential to enrich some active diazotrophic group like Pseudacidovorax and Rhodopseudomonas to drive high N<sub>2</sub> fixation and offset the inhibitory effect of N fertilization in agriculture soil.

Interaction among species, rather than the presence or absence of species strongly affected ecosystem function through directly regulating pathways of energy and material flows or indirectly regulating abundance of functional microbial groups (Faust and Raes 2012). Considering the high similarity in soil properties and diazotrophic community traits within N-NP-NPK treatments and within Control-NM-NPM treatments, we evaluated the co-occurrence patterns of diazotrophic communities for the two groups. Our results showed that the diazotrophic community had higher network complexity (more nodes and edges, and higher average degree), stability (higher network robustness and negative correlation) and 'hub nodes' in three non-chemical fertilization treatments (Control-NM-NPM group) than in three chemical fertilization treatments (N-NP-NPK group). The results were consistent with previous studies, showing that organic fertilizer application significantly increased the network complexity and stability than chemical fertilizer treatments for bacterial and diazotrophic communities (Chen et al., 2020; Schmid et al., 2018). It has been suggested that

the interactions of species were generic and representative features of ecosystem function, and more stronger interactions among species represented more active ecosystem process and function (Faust and Raes 2012). Large-scale ecological surveys across the major grain-producing areas of China also indicated that organic amendment strongly shaped soil microbial community and co-occurrence pattern, and generated a more complex microbial network with more functional modules and higher abundant functional groups involving in carbon, nitrogen and phosphorus recycling in comparison to chemical fertilizer application (Ling et al., 2016). In addition to the complexity of network, the types of interaction (e.g., cooperative and mutual exclusion) among species are also important facets of ecosystem processes and functions (Röttjers and Faust 2018). It was suggested that the stronger cooperative interaction in microbial community result in more coupling and positive feedback and thus decrease the stability of community, while the higher proportion of negative interaction is beneficial to ecosystem network stability and multifunctionality maintenance in response to environmental perturbation over time (Coyte et al., 2015). We further found that the diazotrophic network in the Control-NM-NPM group possessed a much higher proportion of negative correlation and was more stable compared with the N-NP-NPK group. This could be largely attributed to the mitigation of soil acidification in these treatments, as some previous studies also suggested that soil pH is a major driver of diazotrophic community assembly, and the network in neutral pH range (6.6 - 7.5) has a higher complexity and higher proportion of negative correlations than aciddic or alkaline soils (Feng et al., 2018, Fan et al., 2018, Wang et al., 2017). All these, together with the higher N<sub>2</sub>-fixing potential in the Control and two organic manure treatments, further confirmed that higher microbial network

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complexity is beneficial to soil ecosystem functions such as nutrient cycling (Wagg et al., 2019), and implied that the increased network complexity and stability induced by long-term organic manure amendment greatly facilitate the resistance and adaptation of diazotrophic community to the environmental stress caused by the large amount of chemical N fertilizer input, and thus sustain the high N<sub>2</sub>-fixing potential in the acidic red soil.

#### 5. Conclusion

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Overall, our study based a long-term fertilization field trial in an acidic red soil suggested that inorganic chemical fertilizer containing N fertilizer application significantly decreased soil nitrogenase activity and nifH gene abundance as a result of soil acidification and inhibition by ammonia, while organic manure application greatly mitigated the inhibitory effects of nitrogen fertilization on nitrogenase activity and nifH gene abundance. Contrary to our hypothesis, phosphorus fertilizer application showed no obvious promotion effect on nitrogenase activity and nifH gene abundance, which may be attributed to the dominant effect of nitrogen fertilizer and organic mature and the lower phosphorus limitation threshold in this soil. We further found that different long-term fertilization regimes largely changed diazotrophic community composition due to the variations in soil properties such as soil pH, TC and TC/TN ratio. Moreover, SEM analysis further revealed that organic manure application positively influenced nitrogenase activity and crop yield by regulating soil pH and keystone taxa which was mainly represented by Bradyrhizobium, Pseudacidovorax and Azospirillum. Organic manure amendment significantly increased the diversity of diazotrophs and specifically enriched diazotrophic taxa like Pseudacidovorax and Rhodopseudomonas which is likely responsible for the high N<sub>2</sub>-fixation potential. The co-occurrence network

analysis further suggested that the control and organic manure amendment treatments shaped a more complex and stable diazotrophic network, which potentially improved the resistance and adaptation ability to the environmental stress caused by the nitrogen fertilization over time. Collectively, our study provides strong field evidences showing that the application of organic manure combined with chemical fertilizers could effectively alleviate the inhibitory effect of nitrogen fertilization on N<sub>2</sub> fixation by regulating soil property, diazotrophic keystone, and shaping a more stable diazotrophic network. Our work shed new insight into the mechanisms of long-term fertilization affecting asymbiotic nitrogen fixation and provided a theoretical basis for manipulating soil microbiome for agricultural sustainability.

# Acknowledgement

This work is funded by a joint Royal Society -National Natural Science Foundation of China (RS-NSFC) Newton Advanced Fellowship award (NAF/R1/180191, 41861130357). We would like to thank Gui-Bao Wang for assistance in field sampling, and Chao Xiong, An-Hui Ge for their generous help in data analyses.

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Table 1. Soil physiochemical properties in different treatments and the significance difference analyses based on two-way ANOVA for the effect of fertilization and sampling season on soil properties

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Treatments	SWC (%)	NH <sub>4</sub> <sup>+</sup> -N(mg/kg)	NO <sub>3</sub> -N (mg/kg)	AP (mg/kg)	рН	TC (%)	TN (%)	TP (g•kg-1)	TC/TN	
	Summer									
Control	0.28±0.01(ab)	11.76±1.50(c)	31.25±5.92(d)	9.01±2.62(c)	6.60±0.04(a)	2.32±0.29(b)	0.14±0.01(c)	0.76±0.05(b)	16.04±1.79(a)	
N	0.27±0.01(b)	16.26±0.61(b)	66.22±16.59(c)	10.29±5.47(c)	4.61±0.26(c)	1.67±0.129(c)	0.12±0.01(c)	0.59±0.02(c)	13.98±0.23(b)	
NP	0.28±0.01(ab)	11.45±1.87(c)	55.76±30.90(cd)	154.85±35.91(a)	4.52±0.00(c)	1.89±0.09(c)	0.14±0.01(c)	1.26±0.06(a)	13.68±0.36(b)	
NM	0.28±0.02(ab)	9.90±0.50(c)	135.40±12.95(b)	20.21±0.97(c)	5.80±0.26(b)	2.56±0.15(ab)	0.20±0.02(b)	0.76±0.08(b)	12.75±0.40(b)	
NPM	0.29±0.01(a)	11.49±2.10(c)	203.27±3.11(a)	113.72±7.14(b)	5.95±0.18(b)	2.90±0.27(a)	0.23±0.03(a)	1.37±0.10(a)	12.47±0.52(b)	
NPK	0.29±0.01(a)	24.55±3.51(a)	34.55±2.61(d)	126.53±30.29(ab)	4.70±0.05(c)	1.82±0.16(c)	0.13±0.01(c)	1.21±0.17(a)	13.61±0.41(b)	
				Autumn						
Control	0.22±0.00(B)	1.28±0.79(A)	5.90±0.97(C)	9.14±2.51(E)	6.57±0.07(A)	2.15±0.24(B)	0.14±0.01(B)	0.54±0.05 (C)	14.82±1.42(A)	
N	0.24±0.01(AB)	1.42±0.18(A)	42.24±12.83(B)	5.41±1.15(E)	4.54±0.06(C)	1.68±0.14(C)	0.12±0.01(C)	0.46±0.01(BC)	14.23±0.47(AB)	
NP	0.25±0.01(A)	1.63±0.94(A)	64.95±2.38(A)	114.69±6.56(A)	4.56±0.05(C)	1.86±0.12(BC)	0.14±0.01(BC)	1.25±0.10(A)	13.55±0.35(BC)	
NM	0.24±0.02(AB)	0.61±0.06(A)	70.13±2.15(A)	27.28±1.90(D)	5.84±0.11(B)	2.67±0.04(A)	0.22±0.00(A)	0.71±0.03(B)	12.13±0.43(D)	
NPM	0.25±0.01(A)	0.40±0.08(A)	67.38±1.53(A)	99.25±8.73(B)	5.98±0.13(B)	2.76±0.02(A)	0.22±0.00(A)	1.28±0.15(A)	12.46±0.26(CD)	
NPK	0.25±0.01(A)	1.59±1.83(A)	49.16±12.66(B)	77.71±11.64(C)	4.71±0.05(C)	1.98±0.34(BC)	0.15±0.03(B)	1.17±0.19(A)	13.14±0.32(BCD)	
Treatment(P)	0.057	< 0.001	< 0.001	< 0.001	< 0.001	< 0.001	< 0.001	< 0.001	< 0.001	
Season(P)	< 0.001	< 0.001	< 0.001	0.002	0.692	0.863	0.469	0.014	0.154	
Treatment $\times$ Season( $P$ )	0.2	< 0.001	< 0.001	0.013	0.998	0.623	0.484	0.53	0.604	

Note: Control: non-fertilizer control; N: inorganic nitrogen fertilizer only; NP: inorganic nitrogen and phosphorus fertilizers; NM: inorganic N fertilizer plus organic manure; NPM: inorganic nitrogen, phosphorus fertilizers plus organic manure; NPK: inorganic nitrogen, phosphorus and potassium fertilizers. SWC: soil water content; NH<sub>4</sub><sup>+</sup>-N: ammonium nitrogen; NO<sub>3</sub><sup>-</sup>-N: nitrate nitrogen; AP: available phosphorus; TC: total carbon; TN: total nitrogen; TP: total phosphorus; TC/TN: carbon-nitrogen ratio. Data in the table were mean  $\pm$  standard deviation (n = 3). Different lowercase and uppercase letters represent significant differences (P < 0.05) among treatments in the summer and autumn season, respectively. The same as below.

### Figure legends

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Fig. 1.Effects of different fertilization practices on (a) maize yield (mean value of 2017-2019), (b) soil respiration rate (SR), (c) microbial biomass carbon (MBC) and (d) soil respiration quotient (SQ). MBC and SQ in samples from summer were not measured. Control: non-fertilizer control; N: inorganic nitrogen fertilizer only; NP: inorganic nitrogen and phosphorus fertilizers; NM: inorganic N fertilizer plus organic manure; NPM: inorganic nitrogen, phosphorus fertilizers plus organic manure; NPK: inorganic nitrogen, phosphorus and potassium fertilizers. Different lowercase and uppercase letters represent significant differences (P < 0.05) among treatments in the summer and autumn season, respectively. Vertical bars indicate standard deviation of three replicates. Fig. 2. Soil nitrogenase activity based on acetylene reduction method (a) and the nifH gene abundances (b) among different fertilization treatments. Different lowercase and uppercase letters represent significant differences (P < 0.05) among treatments in the summer and autumn season, respectively. Vertical bars indicate standard deviation of three replicates. The treatment denotations are the same as Fig. 1. Fig. 3. Non-metric multidimensional scaling analysis (NMDS) (a) and redundancy analysis (RDA) (b) of diazotrophs community among different fertilization treatments. The different colors and shapes represent the different treatments and sampling stages, respectively. And the "\*" next to the arrows represent the variables significantly influencing diazotrophic community. Significant levels: \* P < 0.05, \*\* P < 0.01, \*\*\* P < 0.001. The treatment denotations are the same as Fig. 1. Fig. 4. The relative abundances of top 10 nifH gene phylotypes at the genus level in different

treatments. Vertical bars indicate standard deviation of three replicates within each treatment.

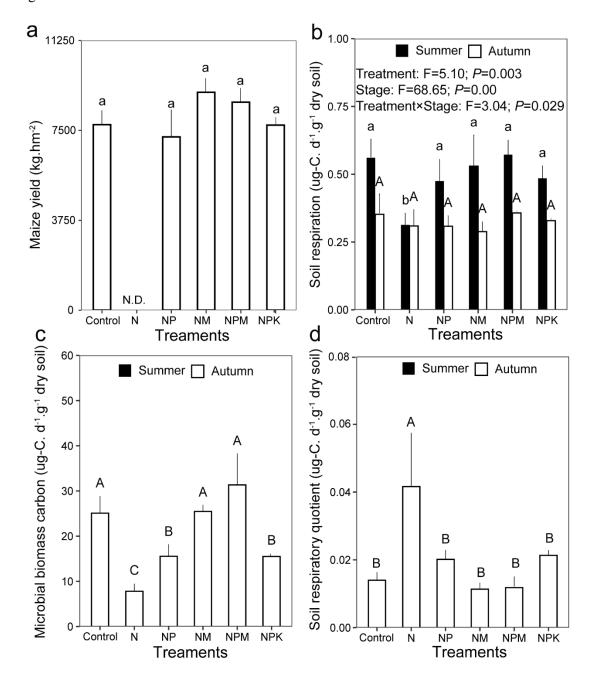
The treatment denotations are the same as in Fig. 1.

**Fig. 5.** Network diagram with nodes colored according to different treatments (a). The nodes were grouped into three ecological clusters (modules #1, #2 and #5). The relative abundance of dominant diazotrophic genera in three main ecological clusters (b). The cumulative relative abundance of three ecological clusters in different fertilization treatments (c). Regressions relationship between the nitrogenase activity and the cumulative relative abundance of the main diazotrophic ecological clusters (d).

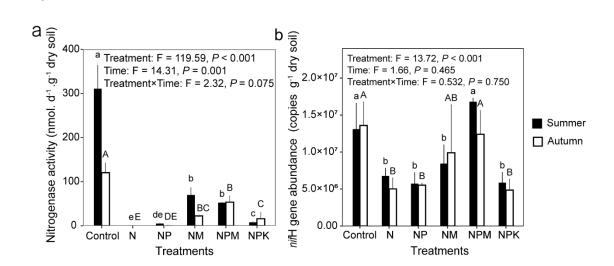
**Fig. 6.** The co-occurrence network of diazotrophic community within non-chemical fertilizer treatment group and chemical fertilizer treatment group (a), "networks hubs" of network within each group (b), degree distribution pattern (c) and robust analysis of network (d). Note: the non-chemical fertilizer group includs the N, NP and NPK treatments, and the chemical fertilizer group includs the Control, NM and NPM treatments.

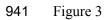
**Fig. 7.** Structural equation modeling (SEM) showing the effects of nitrogen, phosphorus and organic manure fertilizer inputs on nitrogenase activity and crop yield (a), and the standardized total effect (STE) derived from SEM (b). Note: the red and black arrows represent the positive and negative impact, respectively. The dotted arrow indicates non-significant effect between two variables. The thickness of the arrow and the value next to the arrow represent the size of the path coefficient, and  $r^2$  represents the variance that can be explained by endogenous variables. Chi\_Squre, P\_value, NFI, IFI and RMSEA represent the degree of model fitting. Significance level:  ${}^{\#}P < 0.1$ ,  ${}^{\#}P < 0.05$ ,  ${}^{*\#}P < 0.01$ ,  ${}^{*\#}P < 0.001$ .

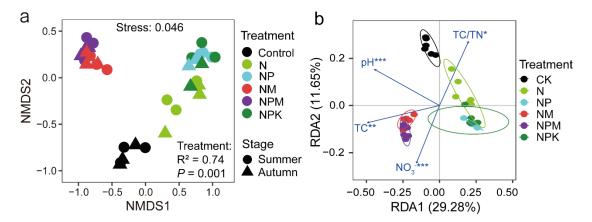
927	Supplementary tables and figures:
928	<b>Table S1.</b> The alpha- and phylogenetic diversity of <i>nif</i> H genes among different fertilization
929	treatments
930	Table S2. ADONIS (PERMANOVA) analyses for the effect of fertilization practice and
931	season on diazotrophic community
932	Table S3. Spearman correlation between nitrogenate activity, nifH gene abundance, PD, and
933	the cumulative relative abundance of module 2 and soil physiochemical properties.
934	
935	Fig. S1. Regression relationship between soil nitrogenase activity and the cumulative relative
936	abundance of dominant genera and in module #1, #2 and #5.

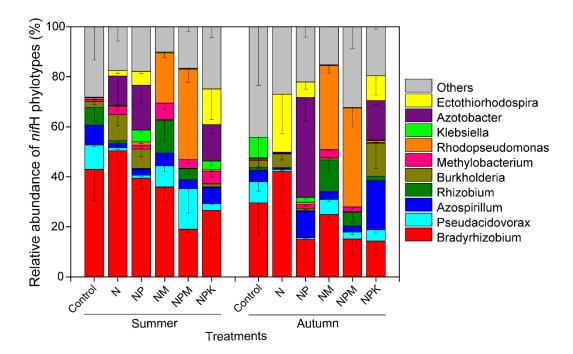


# 939 Figure 2

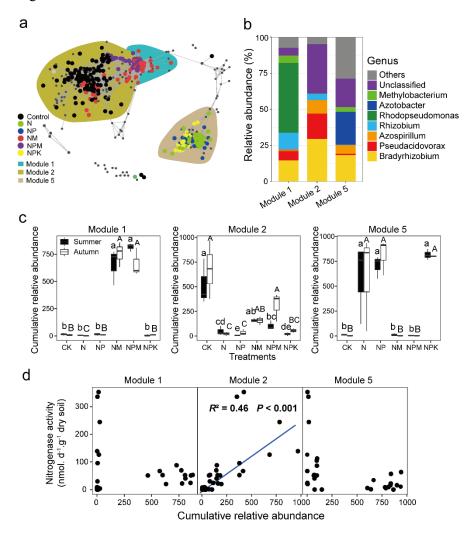




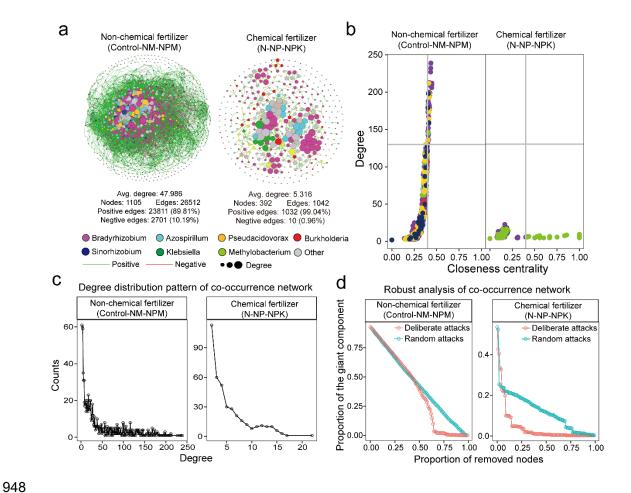


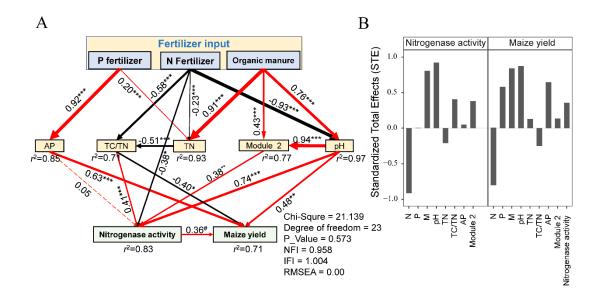


### 945 Figure 5



# 947 Figure 6





### 952 Supplementary tables and figures

Table S1. The alpha diversity of diazotrophic community among different fertilization treatments.

		Summer		Autumn				
	Chao1	PD	Shannon	Chao1	PD	Shannon		
Control	643.69(176.29) b	62.37(9.97) b	4.96(0.78) ab	607.92(64.35) b	59.64(5.40) b	3.92(2.10) a		
N	418.35(150.07) b	51.63(10.55) b	3.96(0.33) c	341.74(96.83) c	45.12(9.09) b	3.15(0.68) a		
NP	350.72(38.74) b	47.09(5.25) b	4.45(0.20) bc	357.98(25.41) c	49.14(5.67) b	3.62(0.84) a		
NM	1077.71(256.42) a	88.62(13.49) a	5.71(0.57) a	1038.91(104.47) a	88.43(6.50) a	5.09(0.45) a		
NPM	986.68(224.87) a	86.36(12.81) a	4.73(0.50) bc	946.53(194.27) a	82.58(16.95) a	3.96(1.26) a		
NPK	356.12(95.88) b	47.14(10.91) b	4.01(0.34) c	398.77(86.91) c	50.09(5.27) b	4.39(0.03) a		

Note: Values in the table are the means of three replicates. Different lower letters within a column represent significant difference among different treatments (Duncan's test, P < 0.05). Control: non-fertilizer control; N: nitrogen fertilizer only; NP: inorganic nitrogen and phosphorus fertilizers; NM: inorganic N fertilizer plus organic manure; NPM: inorganic nitrogen, phosphorus fertilizers plus organic manure; NPK: inorganic nitrogen, phosphorus and potassium fertilizers. PD: phylogenetic diversity.

Table S2. ADONIS (PERMANOVA) analyses for the effect of fertilization practice and season on diazotrophic community

		<u> </u>	
	F	$\mathbb{R}^2$	<i>P</i> _value
Treatments	17.45	0.743	< 0.001***
Season	1.794	0.015	0.124
Treatments × Season	1.076	0.046	0.415
Neffect	17.712	0.159	< 0.001***
$P_{effect}$	7.798	0.069	< 0.001***
$OM_{effect}$	52.778	0.473	< 0.001***
$P_{effect} \times OM_{effect}$	3.477	0.031	0.009**

Note:  $N_{\text{effect}}$ ,  $P_{\text{effect}}$  and  $OM_{\text{effect}}$  represent the effect of nitrogen fertilizer, phosphorus fertilizer and organic manure on diazotrophic community. Significant levels: \*P < 0.05, \*\*P < 0.01, \*\*\*P < 0.001.

Table S3. Spearman correlation between nitrogenate activity, *nifH* gene abundance, PD, and the cumulative relative abundance of module 2 and soil physiochemical properties

	pН	TC	TN	TC/TN	NO <sub>3</sub> -N	NH <sub>4</sub> <sup>+</sup> -N	AP
Nitrognase activity	0.888**	0.657**	0.598**	-0.113	-0.038	-0.090	-0.082
nifH abundance	0.744**	0.653**	0.550**	-0.079	0.174	-0.014	-0.087
Phylogenetic diversity (PD)	0.652**	0.712**	0.709**	-0.0539**	0.532**	-0.312	-0.025
Cumulative relative abundance of module 2	0.885**	0.587**	0.522**	-0.105	0.030	-0.328	-0.334*

Note: Significant levels: \*P < 0.05, \*\*P < 0.01, \*\*\* P < 0.001.

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# 958 Figure S1

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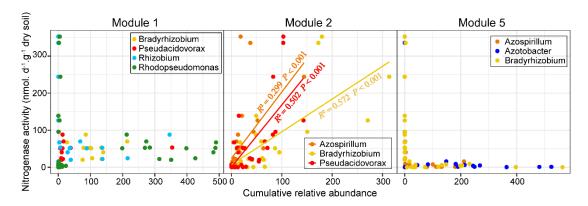


Fig. S1. Regression relationship between soil nitrogenase activity and the cumulative relative

abundance of dominant genera and in module #1, #2 and #5