

ORIGINAL ARTICLE

Nematode grazing promotes bacterial community dynamics in soil at the aggregate level

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Nematode predation has important roles in determining bacterial community composition and dynamics, but the extent of the effects remains largely rudimentary, particularly in natural environment settings. Here, we investigated the complex microbial–microfaunal interactions in the rhizosphere of maize grown in red soils, which were derived from four long-term fertilization regimes. Root-free rhizosphere soil samples were separated into three aggregate fractions whereby the abundance and community composition were examined for nematode and total bacterial communities. A functional group of alkaline phosphomonoesterase (ALP) producing bacteria was included to test the hypothesis that nematode grazing may significantly affect specific bacteria-mediated ecological functions, that is, organic phosphate cycling in soil. Results of correlation analysis, structural equation modeling and interaction networks combined with laboratory microcosm experiments consistently indicated that bacterivorous nematodes enhanced bacterial diversity, and the abundance of bacterivores was positively correlated with bacterial biomass, including ALP-producing bacterial abundance. Significantly, such effects were more pronounced in large macroaggregates than in microaggregates. There was a positive correlation between the most dominant bacterivores *Protorhabditis* and the ALP-producing keystone 'species' *Mesorhizobium*. Taken together, these findings implicate important roles of nematodes in stimulating bacterial dynamics in a spatially dependent manner.

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Introduction

Resource competition and predation are the two major driving forces underlying the dynamic changes of species composition in the biological community (Chesson and Kuang, 2008). For microorganisms inhabiting soil, the importance of resource competition has been well documented, particularly with the improved accessibility of next-generation sequencing and stable isotope techniques (Bulgarelli *et al.*, 2013). Although the importance of predation by microfauna has long been recognized, the potential effects of predation remain poorly defined. Few studies have addressed the complex microbial–microfaunal interactions in open-field environments (Neher, 2010). For example, nematodes can stimulate microbial activity, resulting in either an increase

or a decrease of microbial biomass in microcosm experiments (Trap *et al.*, 2016). The grazing-induced influences on microbial abundance vary according to pore structure and distribution of the accessible resources such as soil organic matter and plant roots (Rønn *et al.*, 2012).

Soils have a complex hierarchical structure including pore distribution and aggregates. Soil aggregates provide spatially heterogeneous habitats for microorganisms, which vary in nutrient availability, water potential and oxygen concentration as well as predation pressure (Ranjard, Richaume, 2001; Jiang *et al.*, 2013). Aggregate fractions are assembled by organic matter and mineral particles (Tisdall and Oades, 1982). Macroaggregates normally contain more labile substrates predominantly derived from plant residues (Bronick and Lal, 2005), and harbor higher amounts of fungal biomass than microaggregates (MAs, Rillig and Mummey, 2006). In contrast, MAs are characterized by the highest concentration of stable organic carbon, and more importantly, they provide a protective micro-environment for microbial growth (Six *et al.*, 2000). The relative small pore sizes make MAs inaccessible

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to large-sized bacterial-feeding nematodes (typically 30–90 µm in diameter; Quénéhervé and Chotte, 1996). Thus, it is crucial to understand the predator–prey interactions at the aggregate level (Ettema and Wardle, 2002).

Of particular significance is the rhizosphere soil as it functions as the critical interface for resource exchange between plants and soil. Compared with bulk soil, the rhizosphere contains a large amount of small organic compounds excreted from the roots of living plants, supporting high levels of microbial activity. Microorganisms are integral to the cycling of nutritional elements such as nitrogen and phosphorus (van der Heijden *et al.*, 2008), and bacterial-feeding nematodes predation releases nutrients sequestered in bacterial biomass in the rhizosphere niche (Bonkowski *et al.*, 2009). However, nematodes normally have special food preferences, and bacteria were not equally susceptible to predation by nematodes. Selective grazing by nematodes can alter the bacterial community composition (Djigal *et al.*, 2004). This leads to an important but unexplored hypothesis that nematode grazing affects total bacterial community and specific functional groups such as phosphorus (P) cycling in different manners.

Microbial–microfaunal interactions via the microbial loop determine the rate of P cycling in the rhizosphere (Bonkowski, 2004). However, the specific effects of nematode grazing on phosphate solubilizing microbial community remain poorly understood. Phosphorus is one of the most limiting nutrients in agricultural soils (Tabatabai, 1994). Predominant enzymes involved in organic P mineralization are alkaline phosphomonoesterases (ALPs, EC 3.1.3.1) and acid phosphomonoesterases (ACPs, EC 3.1.3.2) (Nannipieri *et al.*, 2011; Chang *et al.*, 2015). ALPs are mostly of bacterial origin, whereas ACPs are mainly excreted by plant roots and fungi in the rhizosphere (Tabatabai, 1994; Spohn and Kuzyakov, 2013). Significantly, ALP-producing bacterial community can be quantitatively analyzed using *phoD* gene as a molecular marker (Sakurai *et al.*, 2008). The *phoD* gene abundance is positively correlated with ALP activity as revealed by field studies with bulk soil (Tan *et al.*, 2013; Fraser *et al.*, 2015a, b).

Here, we investigated the reciprocal interactions between nematodes and bacteria in rhizosphere soil at the aggregate level, with an additional specific focus on ALP-producing bacteria. To this end, we performed a 13-year field experiment with red soils (Acrisol) under four fertilization regimes. Soil samples were taken from the rhizosphere of maize, and then separated into three aggregate size fractions for physiochemical and microbiological analyses. The nematode assemblages were quantitatively assessed under microscope, whereas the abundance and composition of bacterial community were examined using phospholipid fatty acid analysis and Illumina sequencing of 16S rRNA gene, respectively. Next, the abundance and composition of ALP-producing

bacterial community were estimated using quantitative polymerase chain reaction (PCR) and Illumina sequencing of *phoD* gene. We observed significantly positive influences of nematodes on bacterial abundance and activity, which were subsequently confirmed via pot experiments under well-controlled laboratory conditions. Our findings provided insights into the microbial–microfaunal interactions in the rhizosphere at the soil aggregate level.

Materials and methods

Site description and design

The long-term fertilization experiment was conducted at the National Agro-Ecosystem Observation and Research Station in a subtropical humid monsoon climate region China (Yingtian, 28°15'N, 116°55'E) with an annual average temperature 17.6 °C and precipitation 1795 mm. The soil is an acid loamy clay-derived Quaternary red clay (Udic Ferralsols in the Chinese Soil Taxonomy and Ferric Acrisols in the FAO classification system).

Twelve concrete lysimeters, 2 m wide × 2 m long × 1.5 m deep, were used in the manure experiment since 2002. Four pig manure rates were compared in a completely randomized design with three replicates: (1) no manure (M0); (2) low manure with 150 kg N ha⁻¹ y⁻¹ (M1); (3) high manure with 600 kg N ha⁻¹ y⁻¹ (M2); and (4) high manure with 600 kg N ha⁻¹ y⁻¹ and lime (M3; Ca(OH)₂ applied once every 3 years at 3000 kg ha⁻¹). The pig manure contained an average total carbon of 386.5 g kg⁻¹, total nitrogen of 36.2 g kg⁻¹ and total phosphorus of 21.6 g kg⁻¹ on a dry matter basis. The monoculture maize (*Zea mays* L.), cultivar No.11 from Denghai, was planted annually in April and harvested in July from 2002 to 2014. There were no tillage and management measures with the exception of manual weeding.

Soil sampling and aggregate fractionation

Soil sampling was conducted in late July 2014 after 13 years of fertilization. Rhizosphere soils were collected from each plot at a depth of 0–15 cm, and then were placed on ice and immediately transported to the laboratory. After shaking off the loosely adhering soil, the tightly adhering rhizosphere soil was collected with a brush, passed through a 4 mm sieve. Next, 100 g root-free soil was manually fractionated through a series of two sieves (2000 µm and 250 µm) into three aggregate sizes: large macroaggregates (>2000 µm; LMA), small macroaggregates (250–2000 µm; SMA) and MA (<250 µm; Jiang *et al.*, 2014). Each aggregate fraction was homogenized for chemical and biological analyses. Standard methods were used to characterize soil chemical properties and phosphomonoesterase activities (Supplementary Appendix).

Characterization of total bacteria and ALP-producing bacteria

A modified method of phospholipid fatty acids (PLFAs) analysis was used to measure soil bacterial biomass, which is expressed as nanomoles of PLFA per gram of dry soil (Frostegård and Bååth, 1996). DNA was extracted from 0.5 g fresh soil using the Ultraclean Soil DNA Isolation Kit (Mo Bio Laboratories, Inc., Carlsbad, CA, USA) following the manufacturer's instructions. Real-time quantitative PCR analysis of *phoD* gene was performed with primers ALPS-F730 and ALPS-R1101 (Sakurai *et al.*, 2008). For high-throughput sequencing at the Illumina MiSeq platform, the V3–V4 region of 16S rRNA gene and *phoD* gene were amplified separately using primers 338 F/806 R and ALPS-F730/ALPS-R1101, respectively. Raw sequences were quality screened and trimmed, including quality trimming, de-multiplexing, taxonomic assignments, chimera detection, and screening for frame shifts. Thereafter, the 16S rDNA and *phoD* sequences were subjected to a similarity search against the Ribosomal Database Project database and the GenBank non-redundant nucleotide database, respectively. Finally, the sequence reads from each sample were clustered to operational taxonomic units (OTUs) at 97% similarity. Alpha diversity metrics and community relatedness were calculated at the same sequencing depth. The 16S rDNA and *phoD* sequences are available at the NCBI Sequence Read Archive under accession number SRP090422 and SRP044878, respectively (see details in Supplementary Appendix).

Nematode faunal composition

Nematodes were extracted using a modified Baermann funnel method (Barker, 1985), and visually examined with an inverted compound microscope. At least 100 nematodes were identified to the genus level for each sample. Nematodes were divided into four trophic groups: bacterivores (Ba), fungivores (Fu), plant parasites (Pp) and omnivores-predators, characterized by known feeding habitats or stoma and esophageal morphology (Yeates *et al.*, 1993). The guilds were characterized on the colonizer-persister (*c–p*) scale (1–5) as previously described (Bongers and Bongers, 1998).

Microcosm experiment

Rhizosphere soils were sterilized by acute gamma irradiation at 40 kGy doses (Buchan *et al.*, 2012). Bacterial suspensions of fresh soils were prepared by passing through 1 µm pore-size Millipore filters (Millipore, Bedford, MA, USA) whereby nematodes and other small eukaryotes were eliminated. The dominant bacterivorous nematode, *Protorhabditis* spp., isolated from the experimental site was cultivated in nematode growth medium at 28 °C by feeding on *Escherichia coli*. Before use, nematodes

were washed five times with sterile distilled water to minimize the effects of *E. coli*.

To set up the microcosms, 50, 150, 500 and 600 individuals were introduced into 100 g soil per pot for soils obtained from the M0, M1, M2 and M3 treatments, respectively. Nematode-free control was set up in triplicate to ensure no nematode contamination. Microcosms were incubated in the dark at 28 °C, with soil moisture being maintained at 25% (w/w). Soils were destructively sampled in 0, 3, 7, 14 and 21 days after inoculation, and then separated into three aggregate fractions for analysis of nematodes, ALP-producing bacteria, ALP and ACP activities.

Statistical analyses

The statistical procedures, including Pearson's correlation analysis, were conducted by SPSS statistical software (SPSS Inc., Chicago, IL, USA). The aggregated boosted trees analysis was carried out to evaluate the effects of different factors on ALP-producing bacterial abundance and activity (De'Ath, 2007). The canonical analysis of principal coordinates was performed to assess the influence of different experimental factors on beta diversity (Anderson and Willis, 2003). Driving factors for nematodes and ALP-producing bacterial community composition were quantitatively evaluated using the permutational multivariate analysis of variance (ANOVA; Anderson, 2001). Structural equation modeling was used to understand how soil chemical properties altered nematodes and bacterial community in three aggregate fractions (Byrne, 2010). Interaction networks were constructed by calculating the pairwise Spearman's rank correlations (see the details in Supplementary Appendix).

Results

Soil physiochemical properties at the aggregate level

Rhizosphere soils from the four fertilization treatments were separated into three aggregate fractions: LMA (>2 mm), SMA (0.25–2 mm) and MAs (<0.25 mm). Results of two-way ANOVA revealed significant differences in soil physiochemical properties among treatments ($F_{(3,32)} = 64.59–1222.85$, $P < 0.001$) and aggregate fractions ($F_{(2,33)} = 3.73–21.15$, $P < 0.05$). High levels of manure treatments (M2 and M3) contained higher proportions of LMA fractions compared with low manure treatment (M1) and the control (M0; Supplementary Figure 1a). Soil pH was significantly elevated by high manure application (Supplementary Figure 1b). The MA fraction tended to have higher nutritional substrates than the LMA and SMA fractions in terms of soil organic carbon (Supplementary Figure 1c), total nitrogen (Supplementary Figure 1d) and phosphate contents (Supplementary Figures 2a and b). The similar trend was found for soil enzymatic activities

of ACP and ALP, respectively (Supplementary Figures 2c and d). Both ACP and ALP activities showed significant correlations with total phosphate ($r=0.637$ and $r=0.953$, respectively) and available phosphate ($r=0.607$ and $r=0.958$, respectively) at the level of $P<0.001$.

Characterizing the bacterial community in soil aggregates

Soil aggregate samples were subjected to PLFA analysis for bacterial biomass, and Illumina sequencing of 16S rRNA gene for the diversity and composition of bacterial community. The results indicated significant differences in fertilization treatments and aggregate fractions (Figure 1, $P<0.05$). Higher manure application resulted in higher bacterial biomass and diversity, showing a general trend of $M3 \approx M2 > M1 > M0$ (Figures 1a–c). The MA fraction possessed the highest bacterial biomass and diversity than the LMA and SMA fractions, with the SMA as the intermediates (Figures 1a–c).

The bacterial communities were dominated by *Chloroflexi* (19.6%), *Actinobacteria* (19.0%), *Alphaproteobacteria* (11.3%), *Firmicutes* (10.3%), *Acidobacteria* (8.3%), *Deltaproteobacteria* (6.7%) and *Gammaproteobacteria* (5.1%; Figure 2a). In addition, *Betaproteobacteria*, *Bacteroidetes*, *Cyanobacteria*, *Gemmatimonadetes*, *Planctomycetes* and *Verrucomicrobia* were present at lower abundances, accounting

for 14.7% of all sequences (Figure 2a). Bray-Curtis distances derived from a canonical analysis of principal coordinates were used to compare bacterial community composition between three aggregate fractions. Bacterial community composition in the MA fraction was well separated from those of the LMA and SMA fractions, mainly because of the higher abundance of *Chloroflexi* and *Cyanobacteria* but the lower abundance of *Alphaproteobacteria*, *Gammaproteobacteria* and *Actinobacteria* (Figure 3a). Finally, permutational multivariate ANOVA of bacterial community composition showed that 75.5% of variations could be explained by fertilization (59.3%) and aggregate fractions (14.2%; Supplementary Table 1).

Characterizing the ALP-producing bacterial community in soil aggregates

The abundance of ALP-producing bacteria was expressed as the *phoD* gene copy number per gram of dry soil as estimated by quantitative PCR analysis (Figure 1d). It followed a similar trend as total bacterial biomass, with relatively higher abundance under manure treatments ($M3 \approx M2 > M1 > M0$). There were significantly more ALP-producing bacteria in the MA fraction compared with the LMA and SMA fractions under M2 and M3 treatments. There was a significant positive correlation between ALP-producing bacterial abundance and ALP activity

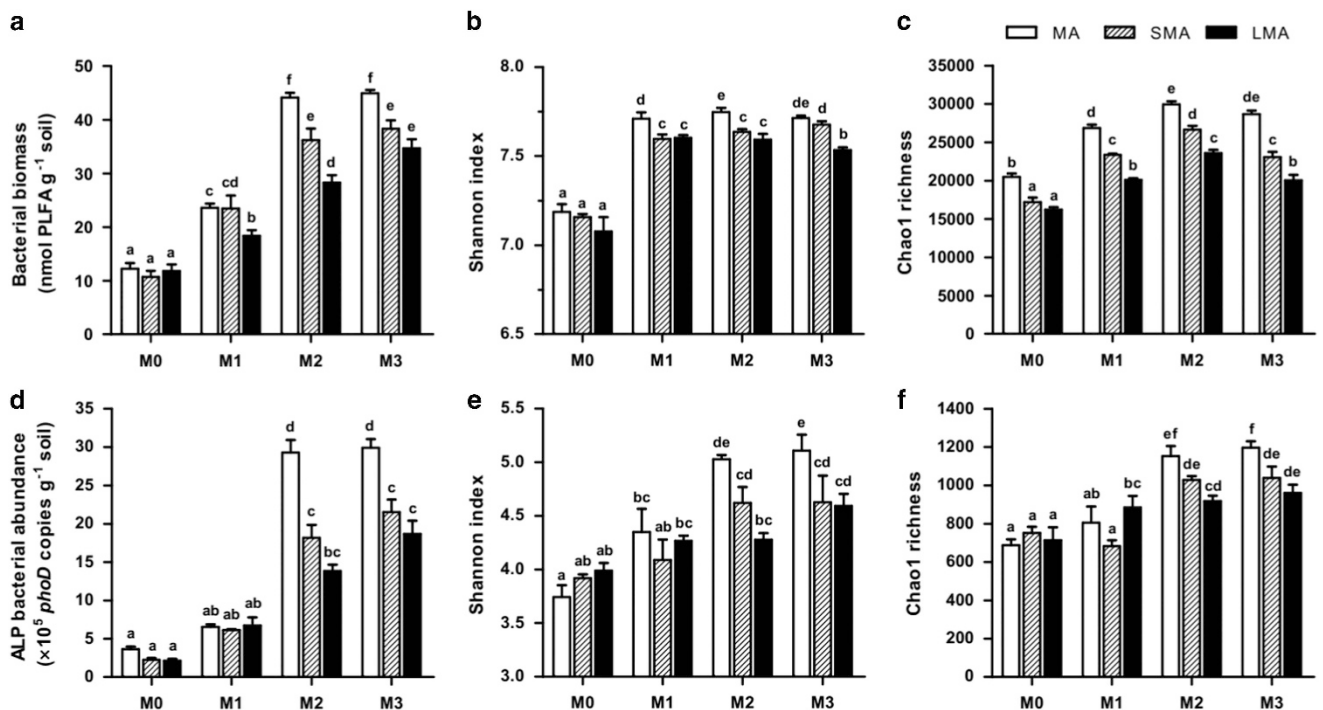


Figure 1 Fertilization and aggregate fractions alter rhizosphere bacterial biomass and diversity. The biomass (a), diversity (b) and richness (c) of total bacterial community were examined together with the abundance (d), diversity (e) and richness (f) of the ALP-producing bacteria in the rhizosphere. Calculation of diversity and richness is based on OTU tables rarified to the same sequencing depth. Error bars represent standard errors of three replicates. Bars with the different letter (shown above each) are significantly different ($P<0.05$) by Tukey's HSD test. ALP, alkaline phosphomonoesterase. M0, no manure; M1, low manure; M2, high manure; M3, high manure plus lime. HSD, honest significant difference; LMA, large macroaggregate; MA, microaggregate; SMA, small macroaggregate.

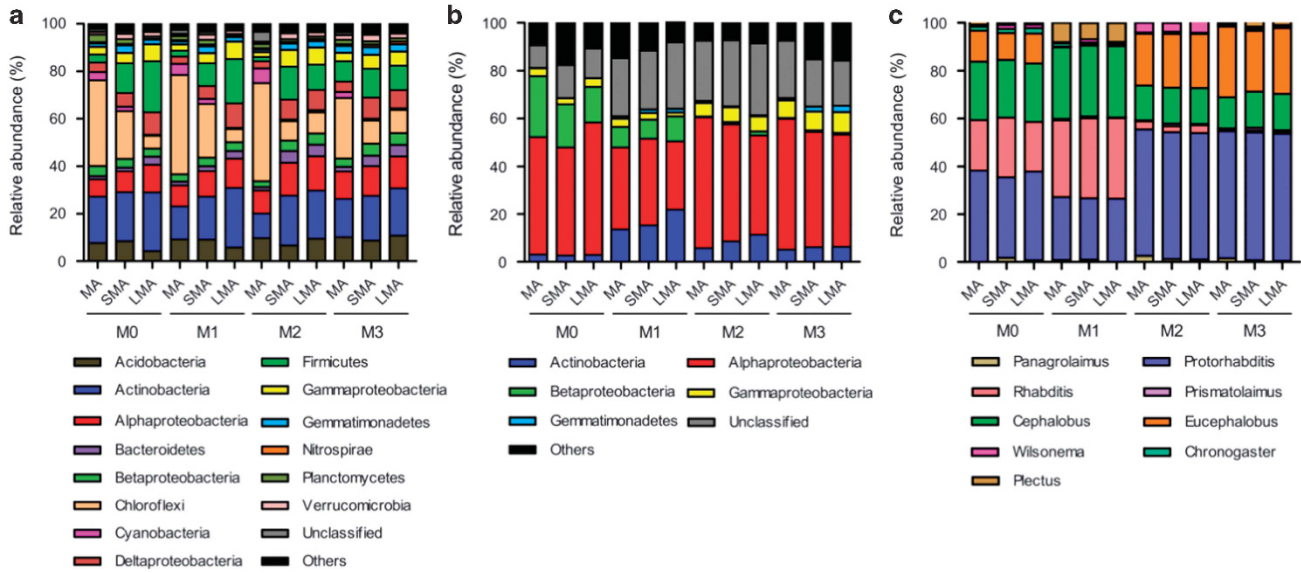


Figure 2 Taxonomic compositions of bacterial community and bacterivores assemblages. The abundances of total bacterial (a) and ALP-producing bacterial (b) communities are based on the proportional frequencies of 16S rRNA- and *phoD*-like sequences. The abundance of bacterivores (c) is calculated in bacterivorous guilds. ALP, alkaline phosphomonoesterase. M0, no manure; M1, low manure; M2, high manure; M3, high manure plus lime. LMA, large macroaggregate; MA, microaggregate; SMA, small macroaggregate.

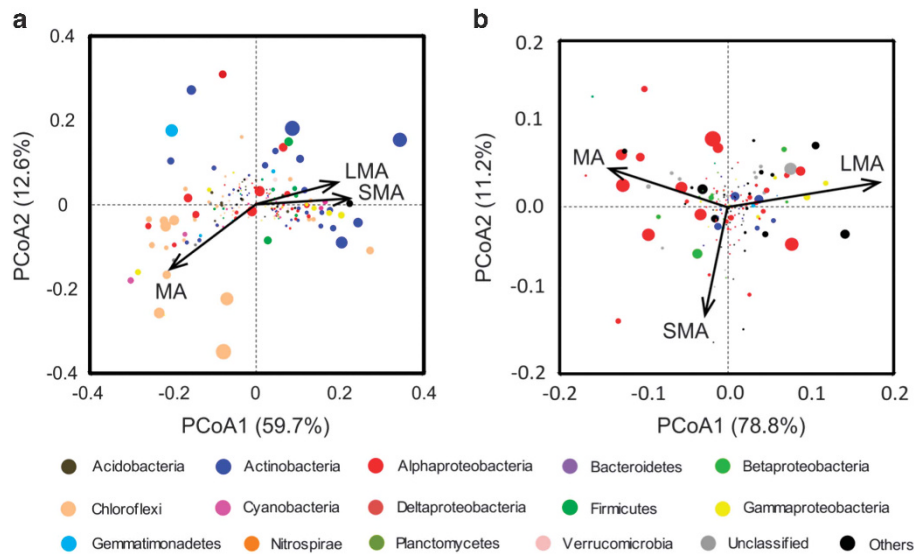


Figure 3 Aggregate fractions alter the bacterial community composition. The dominant OTU (relative abundance >0.1%) scores in (a) total bacterial and (b) ALP-producing bacterial community by principal coordinate analysis, which are constrained by aggregate fractions and based on Bray-Curtis distances among all the samples. The arrows point to the centroid of the constrained factor. Circle sizes correspond to the abundance of total bacterial and ALP-producing bacterial OTUs, and colors are assigned to different phyla/classes. ALP, alkaline phosphomonoesterase. M0, no manure; M1, low manure; M2, high manure; M3, high manure plus lime. LMA, large macroaggregate; MA, microaggregate; SMA, small macroaggregate.

($r=0.965$, $P<0.001$; Supplementary Figure 3). Both were most significantly influenced by soil pH, as indicated by aggregated boosted tree analysis (Supplementary Figure 4).

The diversity and composition of ALP-producing bacterial community were examined using Illumina sequencing of the *phoD* gene. Similar trends of the Shannon index and Chao1 richness were found for total bacteria and the specific functional group of

ALP-producing bacteria: $M3 \approx M2 > M1 > M0$ for the effects of manure addition, and $MA > SMA > LMA$ for variations among soil aggregates (Figure 1). The ALP-producing bacterial community was dominated by *Alphaproteobacteria* (45.4%), *Actinobacteria* (8.5%), *Betaproteobacteria* (7.5%) and *Gammaproteobacteria* (5.0%; Figure 2b). The ALP-producing bacterial communities from the three aggregate fractions were well separated by PCoA1 alone

(78.8%, Figure 3b). There were significant differences among soil aggregates in regards to the abundance of ALP-producing *Alphaproteobacteria* ($P=0.033$) and *Gammaproteobacteria* ($P=0.001$; Supplementary Figure 5). The permutational multivariate ANOVA showed that the variations of ALP-producing bacterial community structure under fertilization treatments (61.5%) were much bigger than those among aggregate fractions (9.7%; Supplementary Table 1). This has been further demonstrated by hierarchical clustering analysis of dominant OTUs based on their co-occurrence (Supplementary Figure 6).

Investigating the nematode assemblages in soil aggregates

A total of 26 nematode genera were identified including nine bacterivores, five fungivores, four plant parasites and eight omnivores-predators (Supplementary Table 2). On average, bacterivores (46.6%) and plant parasites (30.5%) were the two most abundant trophic groups. The five dominant genera of nematodes were *Protorhabditis*, *Cephalobus*, *Eucephalobus*, *Pratylenchus* and *Mesodorylaimus*, cumulatively representing over 70% of all nematodes identified (Supplementary Table 2). The average number of total nematodes increased with increasing aggregate size, such that the LMA fraction had a significantly higher number than the SMA and MA fractions (Supplementary Table 2, $P<0.05$). The bacterivores, plant parasites and omnivores-predators, particularly the dominant genus within each guild (*Protorhabditis*, *Pratylenchus* and *Mesodorylaimus*, respectively), appeared to exhibit a general trend of LMA > SMA > MA, which was similar to that of the number of nematodes in total (Figure 2c, Supplementary Table 2). The permutational multivariate ANOVA showed that the nematode community structure was influenced by fertilization treatments (56.7%) and aggregate fractions (11.0%), which collectively explained 67.7% of the total variations (Supplementary Table 1).

Ecological interactions between nematodes and bacteria in soil aggregates

The abundance of bacterivorous nematodes were positively correlated with the two different measures of bacterial abundance, that is, total bacterial biomass ($r=0.798$, $P<0.001$) and ALP-producing bacterial abundance ($r=0.783$, $P<0.001$), and ALP activity ($r=0.843$, $P<0.001$), rather than ACP activity ($r=0.318$, $P=0.059$; Supplementary Figure 3, Supplementary Table 3). Intriguingly, the obtained data revealed positive correlations between bacterivore abundance and bacterial diversity: total bacterial diversity ($r=0.655$, $P<0.001$) and richness ($r=0.430$, $P<0.001$), as well as ALP-producing bacterial diversity ($r=0.675$, $P<0.001$) and richness ($r=0.715$, $P<0.001$; Supplementary Table 3).

Furthermore, the community composition of total bacteria and ALP-producing bacteria were significantly affected by nematodes (21.0 and 22.3%), with the largest contribution from bacterivores (12.9 and 13.5%) (Supplementary Table 4).

The structural equation model was used to assess the effects of soil properties and nematodes on the bacterial community in the three aggregate fractions. Soil organic carbon produced the strongest effects on total bacterial biomass and community composition, while total bacterial diversity was primarily determined by soil pH (Figure 4). More importantly, bacterivores had positive effects on bacterial diversity (path coefficient: 0.35, $P=0.017$) and community composition (path coefficient: 0.48, $P=0.003$) in the LMA fraction (Figure 4c). For ALP-producing bacteria, soil pH was one of the most important causal factors determining ALP-producing bacterial abundance and ALP activity (Figures 4d–f). Bacterivores exerted more prominent contribution to ALP-producing bacterial abundance in the LMA fraction (path coefficient: 0.57, $P<0.001$) than in the SMA (path coefficient: 0.29, $P=0.026$) and MA (path coefficient: 0.32, $P=0.022$) fractions. Similar to total bacteria, the ALP-producing bacterial community composition was positively affected by bacterivores in the LMA fractions (path coefficient: 0.44, $P<0.001$; Figure 4f).

Interaction network between nematodes and bacterial community

We sought to determine the co-occurrence patterns of nematodes and bacteria using network analysis based on strong and significant correlations. The calculated modularity index was larger than 0.4 (Table 1), indicating a typical module structure (Newman, 2006). Overall, aggregate fractions showed a remarkable effect on association networks of nematodes and bacteria, as well as ALP-producing bacteria. For total bacteria and ALP-producing bacteria, the values of average path length, average clustering coefficient (*avgCC*) and modularity in these empirical networks were higher than those of their respective identically sized Erdős–Rényi random networks (Table 1). Furthermore, average connectivity (*avgK*) and modularity was greater in the LMA than in the SMA and MA networks, whereas average path length followed the opposite trend.

The co-occurrence patterns between bacterivores and ALP-producing bacteria were further compared across three aggregate fractions. Notably, there were more positive than negative correlations in all networks, regardless of aggregate fractions (Table 1). Bacterivores were more closely (for example, more abundant nodes) correlated with ALP-producing bacteria in the LMA than in the SMA and MA fractions (Figure 5, Table 1). In particular, the dominant bacterivores *Protorhabditis* (degree = 15) showed stronger positive correlations with ALP-

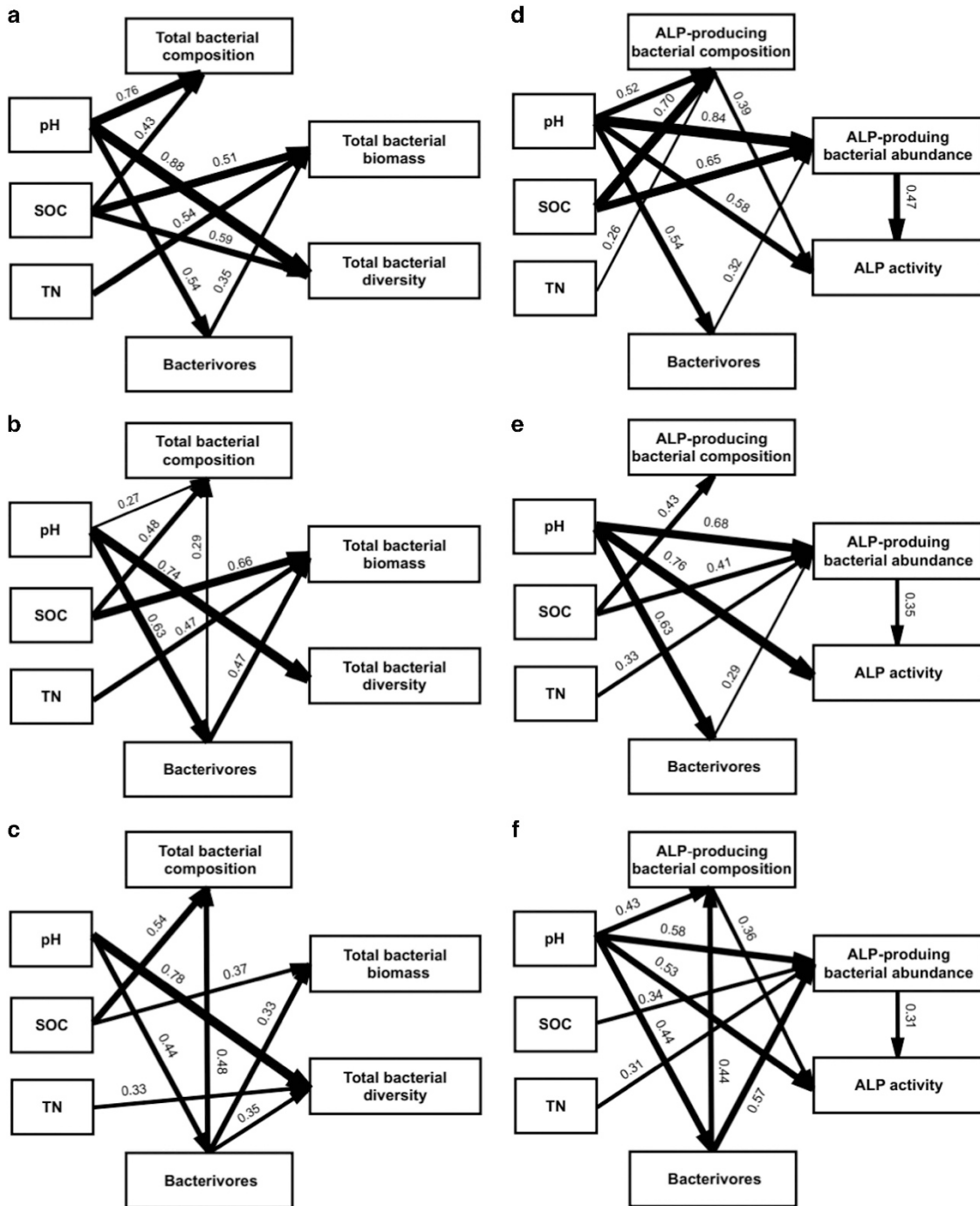


Figure 4 The effects of soil properties and nematodes on bacterial community as estimated using the structural equation model. For total bacteria, (a) microaggregates, $\chi^2 = 7.969$, GIF = 0.977, $P = 0.527$, AIC = 37.692, RMSEA = 0.001; (b) small macroaggregates, $\chi^2 = 4.341$, GIF = 0.956, $P = 0.332$, AIC = 48.701, RMSEA = 0.003; and (c) large macroaggregates, $\chi^2 = 5.058$, GIF = 0.951, $P = 0.561$, AIC = 59.408, RMSEA = 0.008. For ALP-producing bacteria, (d) microaggregates, $\chi^2 = 5.949$, GIF = 0.957, $P = 0.486$, AIC = 57.496, RMSEA < 0.001; (e) small macroaggregates, $\chi^2 = 4.219$, GIF = 0.958, $P = 0.183$, AIC = 50.190, RMSEA = 0.007; and (f) large macroaggregates, $\chi^2 = 4.115$, GIF = 0.961, $P = 0.245$, AIC = 69.151, RMSEA < 0.001. The first principal coordinates (PCoA1 explained 59.7 and 78.8% of the variations, see Figure 3) are used to represent the composition of total bacterial and ALP-bacterial community. The width of black arrows indicates the strength of significant standardized path coefficients ($P < 0.05$). ALP, alkaline phosphomonoesterase; SOC, soil organic carbon; TN, total nitrogen.

producing bacteria in the LMA network (Figure 5). Topologically, the individual nodes played different roles in the networks according to two properties: the within-module degree Z and among-module degree

P . The genus *Mesorhizobium* (class *Alphaproteobacteria*) was categorized as the module hub for all three networks (Figure 5, Table 2). Notably, bacterivores *Protorhabditis* showed strong positive correlations

Table 1 Topological properties of co-occurring bacterivores–bacteria networks obtained in three aggregate fractions and their respective identically sized Erdős–Rényi random networks

Network metrics	Total bacterial community			ALP-producing bacterial community		
	MA	SMA	LMA	MA	SMA	LMA
<i>Empirical networks</i>						
Number of nodes ^a	186 (6)	190 (6)	198 (9)	67 (5)	75 (5)	74 (9)
Number of edges	2320	2769	3287	271	339	371
Number of positive correlations ^b	1269 (74)	1542 (81)	1798 (126)	183 (17)	251 (19)	263 (35)
Number of negative correlations ^b	1051 (45)	1227 (38)	1489 (48)	88 (17)	88 (13)	108 (8)
Average connectivity (<i>avgK</i>)	24.95	29.15	33.20	8.09	9.04	10.03
Average clustering coefficient (<i>avgCC</i>)	0.555	0.588	0.599	0.571	0.625	0.598
Average path length (APL)	3.43	2.75	2.53	3.19	3.80	2.91
Network diameter	14	8	9	7	11	6
Graph density	0.135	0.154	0.172	0.123	0.122	0.137
Modularity (M)	0.460	0.489	0.527	0.485	0.505	0.518
<i>Random networks</i>						
APL ± s.d.	2.12 ± 0.10	2.01 ± 0.11	1.94 ± 0.08	2.17 ± 0.14	2.21 ± 0.08	2.21 ± 0.09
<i>avgCC</i> ± s.d.	0.067 ± 0.004	0.076 ± 0.007	0.090 ± 0.006	0.057 ± 0.001	0.065 ± 0.011	0.064 ± 0.003
M ± s.d.	0.15 ± 0.01	0.14 ± 0.02	0.12 ± 0.01	0.31 ± 0.02	0.25 ± 0.03	0.24 ± 0.02

Abbreviations: ALP, alkaline phosphomonoesterase; LMA, large macroaggregate; MA, microaggregate; SMA, small macroaggregate.

^aNumber of bacterivorous nematodes is in parentheses.

^bNumber of correlations between bacterivores and bacteria is in parentheses.

with module hubs OTU2517 ($r=0.861$, $P=0.006$), OTU1444 ($r=0.822$, $P=0.009$) and OTU1352 ($r=0.958$, $P<0.001$), and explained more than one-fourth of variations in the abundance of three module hubs (Supplementary Table 5).

Verifying the nematodes–bacteria interactions by soil microcosm experiments

Having found positive effects of nematode grazing on ALP-producing bacterial abundance and activity in open-field environments, we proceeded to demonstrate this in the microcosm under well-controlled laboratory conditions. We applied the natural microbial community with and without bacterivorous nematodes to pre-sterilized soils. Dynamic changes of bacterivores, ALP-producing bacteria and ALP activity were monitored over a period of 21 days. Parallel to our expectation, there were remarkable increases in nematodes, ALP-producing bacteria abundance and ALP activity over time ($P<0.001$), particularly under M2 and M3 treatments. Specifically, the abundance of *Protorhabditis* was approximately 25% higher in the LMA fraction than that in the MA fraction (Figure 6). *Protorhabditis* produced significant effects on ALP-producing bacterial abundance and ALP activity under M2 and M3 treatments compared to under M0 and M1 treatments (Supplementary Figure 7). After 14 days' incubation, ALP-producing bacterial abundance and ALP activity were elevated by 23.1 and 12.3% with bacterivores addition under the M2 treatment, and increased by 30.3 and 14.1% under the M3 treatment, respectively (Figure 6). Significantly, the effects of *Protorhabditis* grazing were two to three times larger in the LMA fraction relative to the MA fraction under M2 and M3 treatments (Figure 6).

Discussion

Predator–prey interactions are building blocks of food webs, whose stability requires a negative feedback loop. Specifically, an increase of predator abundance causes declines in prey populations, which in turn prevents further increase of the predator population (Djigal *et al.*, 2004). However, a great number of theoretical and empirical studies show that predators can also produce positive effects on their prey, and vice versa (Ingham *et al.*, 1985; Brown *et al.*, 2004; Fu *et al.*, 2005). The underlying mechanisms include enhanced nutrient mineralization (Diehl *et al.*, 2000), disposal to new niches for colonization (Ingham *et al.*, 1985), as well as the emergence of novel physical and behavioral prey refuges (Cressman and Garay, 2009). The net influence between predator and prey is dependent on a combination of both positive and negative effects, and it is likely subject to temporal and spatial dynamic changes. Significantly, when the predator–prey interactions are extended from simple pairs to community levels, such as the bacterivores–bacteria relationships in soil, it remains possible that the two communities may display no ecological correlations, likely owing to the effects of species compensation. In heterogeneous soil environments, the complex bacterivores–bacteria interaction networks form the basis of the heterotrophic eukaryotic food web, ensuring energy flows through the bacterial energy channel to higher trophic levels (Bonkowski *et al.*, 2009). It is thus important to understand the ecological relationships between the bacterial community and their predatory bacterivores in various soils.

Here, we found that bacterivores significantly enhanced bacterial abundance in the maize

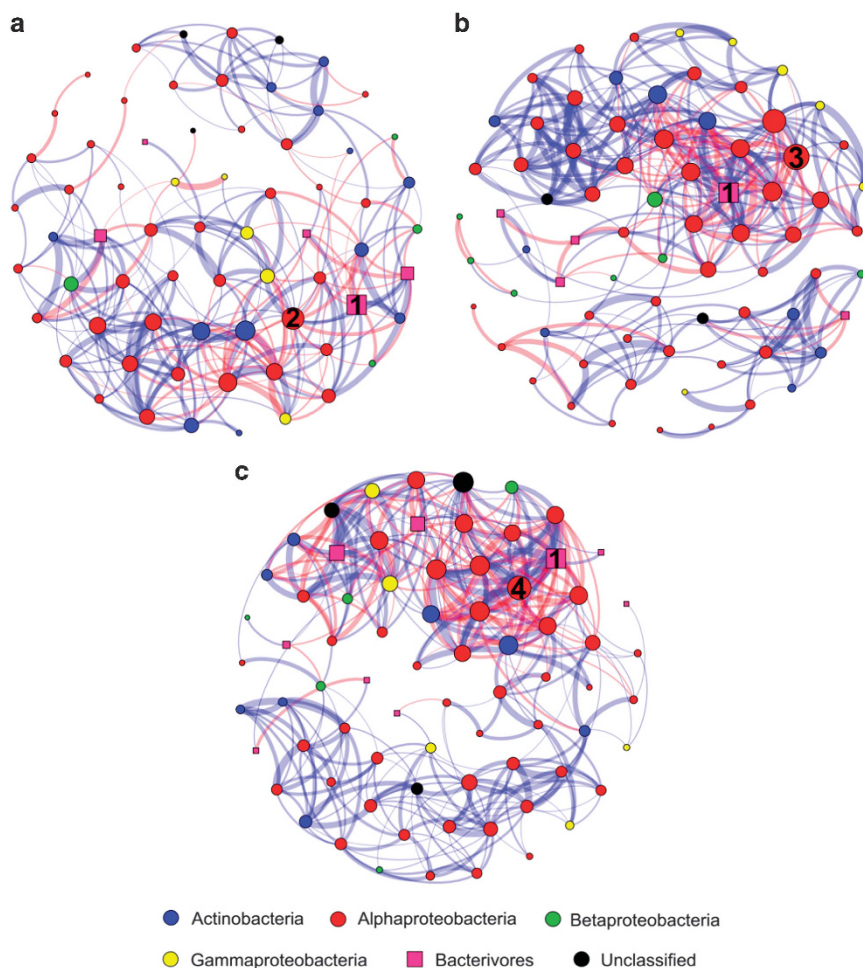


Figure 5 Interaction networks between bacterivorous nematodes and ALP-producing bacterial communities. A connection stands for a strong (Spearman's $\rho > 0.8$) and significant ($P < 0.01$) correlation for the MA (a), SMA (b) and LMA (c) fractions. The co-occurring networks are colored by phylum/class. For each panel, the size of each node is proportional to the number of connections (that is, degree), and the thickness of each connection between two nodes (that is, edge) is proportional to the value of Spearman's correlation coefficients. A blue edge indicates a positive interaction between two individual nodes, while a red edge indicates a negative interaction. The numbers inside the nodes are as follows: (1) the dominant bacterivores *Protorhabditis*, (2) the module hub OTU2517, (3) the module hub OTU1444 and (4) the module hub OTU1352. ALP, alkaline phosphomonoesterase; LMA, large macroaggregate; MA, microaggregate; SMA, small macroaggregate.

rhizosphere across four fertilization treatments and three aggregate fractions. This result was initially surprising, as a recent meta-analysis revealed that bacterivores caused a 16 and 17% reduction in soil microbial biomass and bacterial abundance, respectively (Trap *et al.*, 2016). However, our findings were consistent with previous results from microcosm studies, showing that moderate grazing of bacterivores on microflora could stimulate microbial growth (Fu *et al.*, 2005). A plausible explanation is that certain bacterivores feed on senescent bacterial cells, and consequently stimulate nutrient cycling (Ingham *et al.*, 1985). In addition, many bacteria reside at the body surfaces or in the digestive systems of nematodes (Neher, 2010). The movement of nematodes can help disperse bacteria to new niches for colonization in heterogeneous soil environments.

With regard to the effects of bacterivores on bacterial community, we observed positive correlations between bacterivores abundance and bacterial diversity in terms of both Shannon index and Chao1 richness. Moreover, bacterivores caused significant changes in bacterial community composition. These data clearly indicated that nematode predation had significant roles in driving dynamic changes of the bacterial community. Bacterivorous nematodes could potentially promote bacterial diversification by generating new ecological opportunities through the evolution of novel predator-resistant strategies or in the form of access to predator-free space (Nosil and Crespi, 2006; Meyer and Kassen, 2007). More importantly, bacterial strains were not equally susceptible to predation. They used different physical and chemical means against nematodes predation, such as bacterial cell shape, filamentation,

Table 2 The nodes identified as module hubs or connectors in the networks between bacterivorous nematodes and alkaline phosphomonoesterase producing bacteria among three aggregate fractions

Networks	OTU ID	Role	Abundance (%)	Degree	Phylum	Genus	Z-value ^a	P-value ^a	Cluster coefficient	Correlation ^b
MA	OTU2517	Module hub	1.396	19	Alphaproteobacteria	Mesorhizobium	2.514	0.152	0.404	0.861**
SMA	OTU1444	Module hub	0.130	22	Alphaproteobacteria	Mesorhizobium	2.656	0.244	0.476	0.822**
LMA	OTU1352	Module hub	0.179	21	Alphaproteobacteria	Mesorhizobium	2.886	0.117	0.605	0.958***

Abbreviations: LMA, large macroaggregate; MA, microaggregate; SMA, small macroaggregate.

^aThe topological role of each node is determined according to two properties: the within-module connectivity Z_i and the among-module connectivity P_i .

^bThe correlations between the dominant bacterivores *Protorhabditis* and keystone species were calculated. *** $P < 0.001$; ** $P < 0.01$.

biofilms as well as the production of pigments, polysaccharides and toxins (Jousset *et al.*, 2009; Jousset, 2011; Bjørnlund *et al.*, 2012). In addition, bacterivores possessed selective feeding traits, which were largely determined by physical constraints of their feeding apparatus and specific detection of chemical cues produced by taxonomically different bacteria (Bonkowski *et al.*, 2009). Clearly, selective predation was fundamentally important for bacterivores to maximize their own fitness and elicit the influences on bacterial community dynamics.

Bulk soils are a resource-limited environment when compared with rhizosphere. Bacterivores–bacteria interactions were previously examined in bulk soils obtained from the same experimental sites (Jiang *et al.*, 2013, 2014). The average total number of nematodes and total bacterial biomass in bulk soils were about half of those found in rhizosphere soils. Interestingly, nematodes and bacteria displayed the similar relationships in the rhizosphere and bulk soils, that is, positive correlations between bacterivores abundance and bacterial biomass as well as bacterial diversity. The data thus suggest that resource constraints may not be the major factor to determine the bacterivores–bacteria community interactions in soils.

In this work, our understanding on the ecological interactions between bacteria and bacterivorous nematodes has been extended to a specific functional group of ALP-producing bacteria. Our results revealed that bacterivores enhanced ALP-producing bacterial abundance and ALP activity, but produced no significant effects on ACP activity. This finding makes sense as soil ACPs were mostly derived from plant and fungi (Tabatabai, 1994). Selective predation likely accounted for the significant effects of nematodes on determining ALP-producing bacterial community composition. For example, bacterivores abundance was positively correlated with *Gamma-proteobacteria* ($r = 0.878$, $P < 0.001$) and *Betaproteobacteria* ($r = -0.812$, $P < 0.001$), rather than *Actinobacteria* ($r = 0.014$, $P = 0.936$). The data support the previous notion that bacterial-feeding nematodes prefer to feed on Gram-negative bacteria (for example, *Pseudomonas*, a typical rhizosphere colonizer) over Gram-positive bacteria, likely because their thinner cell walls are easier to be digested (Salinas *et al.*, 2007).

We examined the interaction networks between bacteria and bacterivorous nematodes, and identified *Mesorhizobium* as the keystone species for ALP activity across three aggregate fractions. These keystone species served as gatekeepers in the ecological functions of the bacterial community, with important contributions to biogeochemical cycling (Lynch and Neufeld, 2015). It was different from the ammonia-oxidizing bacterial and archaeal community, which occupied two different keystone species (a module hub and a connector) in three aggregate fractions (Montoya *et al.*, 2006; Jiang *et al.*, 2015). This result suggested that the ALP-producing bacterial

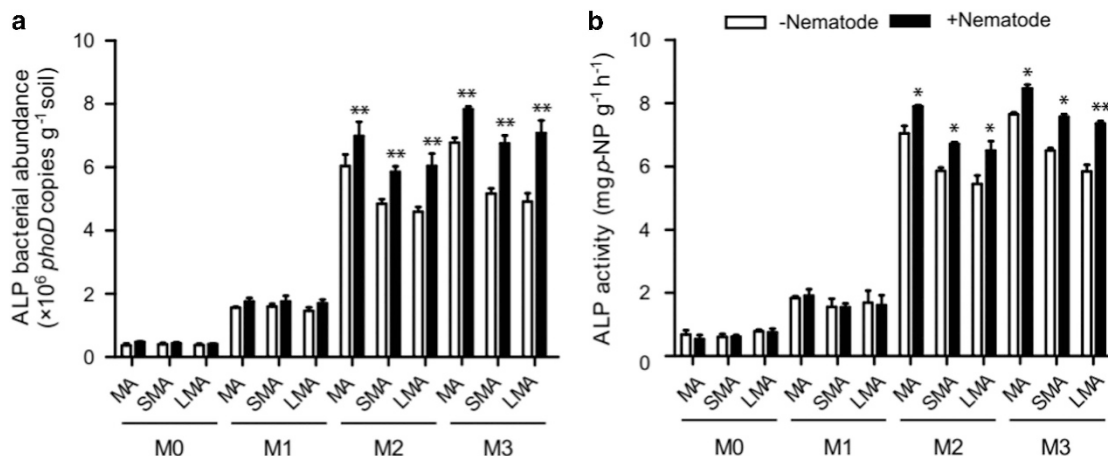


Figure 6 Microcosm experiment showing the effects of nematode grazing on ALP-producing bacterial abundance (a) and ALP activity (b). Data are means and standard errors of three replicates with (+Nematode) and without (–Nematode) the inoculation of *Protorhabditis* in 14 days. Asterisks over the time indicate a significant difference (** $P < 0.01$; * $P < 0.05$). M0, no manure; M1, low manure; M2, high manure; M3, high manure plus lime. ALP, alkaline phosphomonoesterase; MA, microaggregate; LMA, large macroaggregate; SMA, small macroaggregate.

community was more susceptible to nematode predation than the ammonia oxidizers. Manure applications promoted the formation of the LMA fraction, the intra-aggregate pore spaces of which were more suitable for bacterivorous nematode survival. Higher density of bacterivores population comprised the vast and complex networks of the nematodes–bacteria associations. The stronger positive effect of bacterivores on *Mesorhizobium* in the LMA probably grew more predominant contribution to ALP-producing bacterial abundance and ALP activity. Thus, the LMA network could be considered as a better-organized soil food web with more functional interrelated bacterivorous nematodes and bacteria.

In conclusion, the data presented here showed that nematode predation promotes bacterial community dynamics in red soil, and the extent of the effects varied greatly at the level of soil aggregates. Specifically, the abundance of bacterivores was positively correlated with bacterial biomass and the levels of bacterial diversity. Moreover, nematode predation produced significant influences on species compositions of the bacterial community. In regards to the specific functional groups of ALP-producing bacteria, they displayed the similar effects as the total bacterial community. There was no sufficient evidence to suggest that ALP-producing bacteria were disproportionally affected (or specifically targeted) by nematodes. Interaction network analysis revealed significant effects of nematode on the keystone species of the bacterial community. More specifically, there was a positive correlation between the most dominant nematode *Protorhabditis* and the ALP-producing keystone 'species' *Mesorhizobium*. This may explain the findings that nematode grazing stimulated ALP activity. Finally, a systematic and comprehensive understanding of nematodes–bacteria interactions has been achieved at the level of

soil aggregate. In general, microaggregates contain higher levels of bacterial abundance and diversity but less amount of bacterivorous nematodes compared with large macroaggregates. Conversely, nematode predation occurred more actively in large macroaggregates than in microaggregates. Together, nematode predation has an important role in determining the composition and dynamics of bacterial community in a spatially dependent manner.

Conflict of Interest

The authors declare no conflict of interest.

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