REGULAR ARTICLE



Microbial community structure and functions differ between native and novel (exotic-dominated) grassland ecosystems in an 8-year experiment

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Abstract

Aims Grasslands dominated by non-native (exotic) species have replaced purely native-dominated areas in many parts of the world forming 'novel' ecosystems. Altered precipitation patterns are predicted to exacerbate this trend. It is still poorly understood how soil microbial communities and their functions differ between high diversity native- and low diversity exotic-dominated sites and how altered precipitation will impact this difference.

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Washington State University Extension Youth and Families Program Unit, Washington State University, Pullman, WA 99164, USA *Methods* We sampled 64 experimental grassland plots in central Texas with plant species mixtures of either all native or all exotic species; half with summer irrigation. We tested how native vs. exotic plant species mixtures and summer irrigation affected bacterial and fungal community composition and structure, the influence of niche vs. neutral processes for microbial phylotype cooccurrence (C-score analysis), and rates of phosphorus and nitrogen mineralization across an 8-year experiment.

Results Native and exotic-dominated plots had significantly different fungal community composition and structure, but not diversity, throughout the length of the study, while changes in bacterial communities were limited to certain wet and cool years. Nitrogen and phosphorus mineralization rates were higher under native plant mixtures and correlated with the abundance of particular fungal species. Microbial communities were more structured in exotic than native grassland plots, especially for the fungal community.

Conclusions The results indicate that conversion of native to exotic C_4 dominated grasslands will more strongly impact fungal than bacterial community structure. Furthermore, these impacts can alter ecosystem functioning belowground via changes in nitrogen and phosphorus cycling.

Keywords Grasslands \cdot Exotic plants \cdot Fungi \cdot Bacteria \cdot Microbial diversity \cdot Mineralization \cdot Neutral/niche processes

Introduction

The introduction and continued spread of exotic plant species are shaping landscapes of North America leading to the establishment of 'novel' ecosystems, sites dominated by non-native plant species from different regions (Hobbs et al. 2006, 2009, 2013). Novel ecosystems can function differently than the native systems that they replace, and a better understanding of how native and novel ecosystems differ will help management and policy efforts (Seastedt et al. 2008; Wilsey et al. 2009, 2017). Climate patterns have become novel as well (Allan and Soden 2008), both in the timing and intensity of rainfall events, and altered rainfall is predicted to favor exotic plant species (Dukes and Mooney 1999). Climate change could have indirect or direct effects on microbial communities, as well as an interactive effect that might enhance nativeexotic differences (Cruz-Martínez et al. 2009, 2012; Hawkes et al. 2011). Grasslands dominated by exotic species often have lower plant diversity, altered C₃-C₄ biomass proportions, and different phenologies (Christian and Wilson 1999; Martin et al. 2014; Wilsey and Polley 2006; Wilsey et al. 2009, 2011, 2017; Xu et al. 2015). These changes in the aboveground plant community could have important impacts on belowground nutrient cycling and soil microbial communities as novel ecosystems become more prevalent (Bardgett and van der Putten 2014). Gibbons et al. (2017) studied how microbial communities were impacted by one of three different annual exotic species: Centaurea stoebe (knapweed), B. tectorum, and Euphorbia esula (leafy spurge), and found that exotic species affected soil properties and the structure and composition of microbial communities.

Exotic-dominated plant communities could drive long-term differences in microbial communities by altering the plant carbon (C) to nitrogen (N) ratio in root and shoot litter or the root distribution with depth (Coleman et al. 2000; Wilsey and Polley 2006). This effect may be positive or negative depending on the mode of photosynthesis of the invading plant species' (Martin et al. 2014). In systems dominated by C₃ plant species, mineralization rates are usually increased by exotic species (Stark and Norton 2015; Wedin and Tilman 1992). In systems dominated by C₄ grasses or annual species, the invasion of exotic species led to increased litter biomass, C:N, and lignin:N ratios, which reduced mineralization rates (Evans et al. 2001). In our system, the southern plains of the USA, exotic communities are strongly dominated by perennial C₄ grasses with high C:N ratios, whereas native communities are diverse mixtures of perennial C_3 forbs, C_3 grasses, and C_4 grasses (Wilsey et al. 2011; Xu et al. 2015). Wilsey and Polley (2006) found that root:shoot ratios, deep root mass, and root mass fraction were lower in exotic than native perennial grasses.

Changes in microorganisms can lead to feedback that affect plant communities by altering nutrient cycling (Berg and Smalla 2009). The plant-microbe-soil feedback loop is theorized to influence a whole range of ecosystem services and dynamics, ranging from litter decomposition to biodiversity-functioning relationships, and natural selection and fitness (Bardgett and van der Putten 2014; Kardol et al. 2013; van der Putten et al. 2013). For example, microbes decompose organic matter and convert N and phosphorous (P) into inorganic forms (mineralization), making them available for plant uptake. Due to the strong relationships between native plants and microorganisms that inhabit all parts of plants (rhizosphere, endosphere, and phyllosphere), as well as those residing in bulk soil, any changes in grassland plant community composition may have strong effects on microbial communities, and in turn, on ecosystem functioning (Bakker et al. 2013; Vandenkoornhuyse et al. 2015). Yet predictive capabilities for how the conversion from native to novel ecosystems will impact microbial community composition, diversity, neutral vs. niche processing, and biogeochemical processes remain unresolved. Microbial changes could be especially pronounced following exotic invasions, because exotic plants are recent arrivals with no evolutionary history with microbes in the invaded range, have differing phenologies than native plants, and could alter nitrogen-fixing microbes due to the variance in tissue types in exotic plant communities.

Replacement of native plant communities by exotic species could alter the structure as well as the composition of microbial communities. Both niche and neutral processes can shape microbial communities (Dini-Andreote et al. 2015; Dumbrell et al. 2010; Morrison-Whittle and Goddard 2015). Niche processes lead to structured microbial communities that reflect compositional variation across host plants, time periods, or soil properties. Neutral processes are random effects (ecological drift) unrelated to habitat conditions that can also lead to variation in microbial communities (Dumbrell et al. 2010; Stegen et al. 2012). If neutral processes are solely operating on microbial communities, then variation should be unrelated to native or exotic plant species shifts or changes in rainfall patterns. However, the influence of native vs. exotic plants or altered rainfall on microbial community structure has

not been examined. Exotic plant species are recent arrivals in North America, and they have a shorter history of plantmicrobe interactions in this environment compared to native plant species. Based on this, we predicted that neutral processes would dominate in exotic-dominated grasslands, and niche processes would be stronger in native plant communities.

We compared microbial community composition, diversity, and functioning (N and P mineralization) in exotic and native dominated grassland plots, with and without summer irrigation using the long-term Maintenance of Exotic vs. Native Diversity (MEND) experiment in Central Texas (Wilsey et al. 2011). Over time, exotic plant communities developed much lower plant species diversity, higher net primary productivity (NPP), and stronger dominance by C_4 grass species than native communities (Wilsey et al. 2011, 2014; Martin et al. 2014). This has led to changes in plant inputs into the soil that could affect microbial composition and functioning. We hypothesized that: 1) bacterial and fungal diversity and community composition differ between exotic and native plant communities, and that this difference is sustained over time, 2) the shifts under exotic vs. native plants will lead to changes in ecosystem functioning (N and P mineralization), 3) native-exotic differences will vary across rainfall treatments, with exotic plot microbial communities responding with greater variability to rainfall inputs, 4) structure of microbial communities and co-occurrence of microbial phylotypes is more impacted by niche than neutral processes in native than exotic communities.

Methods

Study experimental design

The Maintenance of Exotic vs. Native Diversity (MEND) experiment was established early in 2008 at the Grassland, Soil, and Water Research Laboratory (Temple, TX) (Polley et al. 2016; Wilsey et al. 2011, 2014). A detailed description of the experimental design can be found in Wilsey et al. (2011, 2014). Briefly, the experiment was designed as a factorial with 1 m \times 1 m plots of mixtures of all native or all exotic plant species crossed with a summer irrigation treatment (128 mm per year added from July 15 to August 15 or no additions as a control) with 16 plots per treatment. The 64 experimental mixtures were planted to identical plant densities, functional group proportions, and species diversity to determine whether differences

develop over time between native and exotic plant communities with and without altered precipitation. Either all native species or all exotic species were assigned to 9species mixtures using a paired species design and species pool of 36 native and exotic species (Table S1). All plant species used were perennials. Replication was achieved with 8 random species draws per treatment and 2 true replicates per random draw and treatment (n = 16 mixtures in each of the four treatments). The 2-m alleyways between plots were seeded with *Bouteloua curtipendula* (Daneshgar et al. 2013). Plots were not fertilized during the duration of the study.

By October 2009, the plots had stabilized into a high diversity native system and a low diversity exoticdominated system, which matches closely with the differences between native and exotic-dominated fields in the area (Wilsey et al. 2011, 2014). Exotic plots were strongly dominated by C_4 grasses, whereas, native plots had a diverse mixture of C_3 forbs and grasses and C_4 grass species (Daneshgar et al. 2013; Martin et al. 2014). There were also differences between native and exotic species in aboveground biomass production (peak biomass) and response to summer irrigation (Polley et al. 2014, 2016). Plant communities were sampled in June and October of each year as detailed by Wilsey et al. (2011) and Xu et al. (2015).

N and P mineralization

Polyvinyl chloride (PVC) rings, 10 cm width \times 15 cm depth, were pushed into the soil in the center of each plot in March 2015. Rings were kept root free by weeding to prevent root uptake of nutrients (Raison et al. 1987). Thus, the PVC ring provided a barrier to root uptake to separate microbial processes inside the ring from plant+ microbial processes outside the ring (Raison et al. 1987). Within each ring, one anion and one cation membrane (Western Ag Innovations, Saskatoon, Saskatchewan, Canada) were inserted on March 16th and removed June 1st, 2015 (Time period 1), inserted again on June 22nd and removed August 18th, 2015 (Time period 2), and inserted on August 25th and removed November 12th, 2015 (Time period 3). These dates were selected to cover the long growing seasons at our field site. Total N mineralization, taken as NO_3^- and NH_4^+ accumulation during each time period, was measured colorimetrically using an automated flow injection system. In the third time period, rodents damaged a few cation probes, and total N was calculated with NO₃

only. Analyzing the data without these plots did not change the results because NH_4^+ only contributed a trace amount to total N mineralization. Phosphorus mineralization, PO_4^- , was measured with an inductively coupled plasma spectrometer (ICP) for each time period.

Soil sample collection for microbial analysis

Two soil cores (3.2 cm diameter) were subsampled from each plot to 10 cm depth in October 2009, 2014, and 2015 at the end of the second, seventh, and eighth growing seasons. The soil cores were stored on dry ice and immediately shipped to Iowa State University (Ames, IA). The soil samples from the two cores per plot per date were composited, homogenized, subsampled, and stored at -80 °C until DNA extraction.

DNA extraction

Microbial DNA was isolated from 0.25 g of soil using the PowerMax Soil DNA Isolation Kit (MoBio Laboratories Inc., Carlsbad, CA) following the manufacturer's instructions. DNA concentration was determined using a NanoDrop 2000 spectrophotometer (ThermoScientific, Wilmington, DE). The DNA samples were stored at -80 °C until library preparation for sequencing.

Library preparation and amplicon sequencing

Amplicon libraries were prepared and sequenced at Argonne National Laboratory (Lemont, IL). The amplification of V4 region of 16S rRNA for construction of amplicon libraries was performed using primers (515F-806R) and protocol described by Caporaso et al. (2010) for samples collected in 2009, and the modified protocol for samples collected in 2014 and in 2015 (Caporaso et al. 2012). The amplification of Internal Transcribed Spacer (ITS) region for construction of amplicon libraries was performed for samples collected in each year using primers (ITS1f-ITS2) (Smith and Peay 2014) and the sequencing protocol of Caporaso et al. (2012). Following the multiplexing protocol, agarose gel electrophoresis was used to determine the presence of PCR products, and DNA concentration was measured with Quant-iT PicoGreen dsDNA Assay Kit (Invitrogen, Carlsbad, CA). The samples were sequenced using sequencing primers for pair-end sequencing. Samples from 2009 (V4 of 16S rRNA) were sequenced on Genome Analyzer IIx (GAIIx, Illumina, San Diego, CA) and samples from 2014 and 2015 were sequenced on MiSeq (Illumina, San Diego, CA).

Sequence processing

Bacterial and fungal sequences were processed through the open access 'hundo' v1.1.6 pipeline (https://zenodo. org/record/1193819). Bacterial sequence reads were demultiplexed with EA-Utils (Aronesty 2013) with zero mismatches allowed in the barcode sequence followed by quality filtering with BBDuk2 (Bushnell 2014) for removal of adapter sequences and PhiX with matching kmer length of 31 bp at a hammering distance of 1. Any reads shorter than 51 bp were removed. USEARCH was used to merge reads (Edgar 2010) with a minimum length threshold of 125 bp and maximum error rate of 1%. After sequences were dereplicated (minimum sequence abundance of 2), they were clustered using USEARCH (Edgar 2013) at 97% pairwise sequence identity among operational taxonomic unit (OTU) member sequences. Concurrently, de novo prediction of chimeric sequences was performed during clustering. BLAST was used to assigned taxonomy to OTU sequence (Camacho et al. 2009) alignments followed by least common ancestor assignments across SILVA database version 123 clustered at 99% (Quast et al. 2013). OTU seed sequences were filtered against SILVA database version 123 clustered at 99% to identify chimeric OTUs using USEARCH.

Fungal sequences were processed using the same approach with a few differences: 175 bp as a minimum length threshold and UNITE v. 7 database for assigning the taxonomy and identification of chimeric OTUs. In both cases, sequences were aligned using Clustal Omega (Sievers et al. 2011) and FastTree2.0 (Price et al. 2010) was used to generate the phylogenetic tree in a Newick format.

For 16S sequences, any non-prokaryotic or phylumunassigned sequences were removed from the OTU table and a total number of sequences for all three years for bacteria was 11,839,740 (2009: 8,033,517; 2014: 1,949,334; 2015: 1,856,889). For ITS sequences, unassigned sequences were removed and the total number of sequences for all three years for fungi was 4,317,020 (2009: 1,344,230; 2014: 826,862; 2015: 2,145,928). The sequences were assigned across 20,804 bacterial and 3280 fungal OTUs.

Statistical analyses

The preliminary statistical analysis was conducted in QIIME using "core diversity" script (Caporaso et al. 2010). The number of sequences per sample was normalized by rarefaction to the lowest number of reads in bacterial and fungal libraries (4306 for bacteria and 5613 for fungi). Subsampling a given population allows for the comparison of multiple samples, that otherwise varies in abundance because of the sequencing process. The normalized (rarefied) data were used in all statistical tests.

Microbial diversity analysis

Alpha diversity was estimated by calculating Simpson's reciprocal $(1/\sum p_i^2)$, Faith's phylogenetic diversity (PD) indexes, and Chao1 richness estimator. To determine the impact of native and exotic plant treatments and irrigation on microbial diversity measures, a mixed model ANOVA (Proc MIXED), with main effects of plant treatments (Native vs. Exotic) and irrigation (128 mm or 0 mm) as fixed effects, and draw and rep as random terms was performed. Repeated measures analyses (diversity measures) used first-order autoregressive (AR(1)) covariance structure calculations in SAS 9.4 (SAS Institute, Cary, NC).

Microbial community composition analysis

To determine how plant treatments, irrigation, and their interaction shaped microbial community composition, R Studio v. 1.0.136 was used to perform permutationbased non-parametric multivariate analysis of variance on microbial OTU abundance using 'Vegan' package. OTU abundance was used for a PERMANOVA analysis, using a two-way factorial design (plant treatment, summer irrigation, and plant and irrigation treatments) with 999 permutations for each year. Samples that had low read counts, <1000 reads, were removed from the analysis and the corresponding draws were removed from PERMANOVA. Additionally, a non-metric multidimensional scaling (NMDS) analysis using a Bray-Curtis dissimilarity matrices was performed with plant treatments (native vs. exotic), summer irrigation, and the interaction between plant treatments and irrigation, to determine their impact on OTU abundance, microbial composition. Following, NMDS scree plots were used to determine the number of dimensions for presenting each ordination. The normalized data were filtered to contain only OTUs representing at least 0.1% of total reads in each sample using QIIME ("filter otus from otu table" command).

Niche and neutral processes analyses

We determined the influence of both neutral and niche processes on microbial community structure under native vs. exotic plants by using checkerboard scores (C-scores). The C-score (Stone and Roberts 1990) was calculated in EcoSim v. 7.0 (Gotelli and Entsminger 2004) as a presence/absence matrix on normalized OTU table that was previously filtered (only including OTUs with >0.1% absolute abundance). The C-score determines the strength of this non-random co-occurrence: the higher the C-score, more segregation and presumably, competition exist between species (niche differentiation). If the Cscore is low, species co-exist together without competition (neutral processes dominate). Another measure of significant non-random co-occurrence is the standardized effect size (SES). SES is significant at values below -2 or above 2. Statistical significance was based on a permutation procedure comparing calculated C scores to randomly derived C scores.

Microbial functional group analyses

To evaluate unique OTUs to each plant treatment, the group significance command with Kruskal-Wallis test to estimate mean abundance of individual OTUs in native and exotic plots, with the Benjamini-Hochberg false discovery rate (FDR) correction applied to *p* values. Functional trophic modes were analyzed for the differentially abundant fungal OTUs within native and exotic samples by using FUNguild (https://github.com/UMNFuN/FUNGuild) (Nguyen et al. 2016).

N and P mineralization analyses

A mixed model ANOVA was used to determine the impact of plant treatment (exotic vs. native) and summer irrigation on microbial mineralization of N and P. A mixed model ANOVA was performed using plant treatment and irrigation as fixed effects and draw and rep as random terms. Mineralization data was analyzed as a repeated measure and first-order autoregressive covariance structure was used in calculations. To determine if particular microbial community members had a significant correlation with N or P mineralization, an NMDS biplot with cutoff R^2 value = 0.2, was performed on microbial community data from 2015 (the same year as mineralization) and average total N and P mineralization rates.

Results

Microbial community composition

The majority of bacterial sequences were assigned at the phylum level at a minimum (99.75%). Dominant bacterial phyla included: *Proteobacteria* (35%), *Acidobacteria* (19.3%), *Bacteroidetes* (17.3%), *Actinobacteria* (9.5%), and *Verrucomicrobia* (8.9%) (Table S2). Fungal communities were dominated by the *Ascomycota* (65.5%) and *Zygomycota* (14.8%) phyla, with less abundant phyla being unclassified phyla (9.4%), *Basidiomycota* (9%) and *Glomeromycota* (0.11%).

Plant treatment but not irrigation had a strong effect on fungal community composition at the OTU level across the years (factorial PERMANOVA, P < 0.05) (Table 1). There was no significant interaction effect of plant treatment and irrigation except in 2015 (P = 0.015). As demonstrated in the NMDS plots, differences in community structure were driven primarily by plant treatment (P < 0.05), however, the differences between native and exotic communities were relatively small (Fig. 1).

To further evaluate the impact of plant treatment on the fungal community composition, we performed a differential abundance test between the native and exotic plant community plots. The testing was not performed for summer irrigation treatment because of no effect on microbial communities as determined by PERMANOVA. Fourteen fungal OTUs differed in their abundance between native and exotic plots (P < 0.05after Benjamini-Hochberg FDR correction) (Table 2) and were classified based on the trophic mode: saprotrophs, pathogens, or the OTUs with unknown function. Among the listed OTUs, only four were identified to the genus level: Stagonospora, Humicola grisea var. grisea, Lophiostoma and Basidioascus undulatus. OTU representing Stagonospora genus was assigned to the pathogen group, and it was more abundant in native plots. Saprotrophs were represented by six OTUs. One OTU of order Hypocreales was more abundant in exotic plots. The remaining OTUs are unknown in their trophic mode by FUNguild analysis. Unlike the fungal community, no bacterial OTUs were found to be significantly different in their mean abundance between native and exotic plots (Kruskal-Wallis test, P > 0.05after Benjamini-Hochberg FDR correction).

Two-way factorial PERMANOVA showed an effect of plant treatment on bacterial community composition in 2009 and 2015 (P < 0.05). The summer irrigation treatment had a marginal effect on the bacterial community only in 2009, which was the second growing season. No interactions effects of plant treatment with summer irrigation were detected for the bacterial community. NMDS revealed patterns consistent with PERMANOVA results showing significant sample clustering based on plant treatment in 2009 and 2015 although similarly to fungi the differences were relatively small (Fig. 2).

Bacterial OTU differential abundance was also analyzed to determine the impact of the plant treatment on the bacterial community. However, unlike the fungal community, no bacterial OTUs were found to be

Table I	wo-way PERMANOVA results for bacterial and fungal communities OIU abundance with plant treatment and summe	r irrigation
as factors	used for grouping (bold font indicates significant P values; df – degrees of freedom)	

Treatment	Year	df	Bacteria [F (P)]	df	Fungi [F (P)]
Plant Treatment (Native vs. Exotic)	2009	1,59	2.447 (0.001)	1,59	1.563 (0.013)
	2014	1,59	1.126 (0.2)	1,51	1.642 (0.018)
	2015	1,63	1.27 (0.04)	1,59	1.394 (0.056)
Summer Irrigation (0 or 128 mm)	2009	1,59	1.365 (0.058)	1,59	1.169 (0.169)
	2014	1,59	1.021 (0.338)	1,51	1.127 (0.254)
	2015	1,63	0.918 (0.719)	1,59	0.973 (0.491)
Plant Treatment x Summer Irrigation	2009	1,59	1.244 (0.109)	1,59	0.8 (0.872)
	2014	1,59	0.901 (0.669)	1,51	0.71647 (0.924)
	2015	1,63	0.984 (0.478)	1.59	1.64 (0.015)

a) 1.5

1.0

0.5

-0.5

b)

0.5

0.25

0.0

-0.25

-0.5

c)

0.5

0.25

0.0

-0.25

-0.5

NMDS2

NMDS2

NMDS2 0.0



Fig. 1 Fungal non-metric multidimensional scaling (NMDS) based on Bray-Curtis dissimilarity distance measures for OTU abundance by plant treatment (native vs. exotic) by sampling year,

NMDS1

axis 1 vs. 2 and axis 1 vs. 3 are shown, **a**) 2009 (2D stress 0.229, 3D stress 0.171), **b**) 2014 (2D stress 0.253, 3D stress 0.182), **c**) 2015 (2D stress 0.243, 3D stress 0.182)

NMDS1

Table 2 Differentially abundant fungal OTUs in native vs. exoticplots (the means OTU abundance tested across years). The taxon-omy of each OTU is assigned to the lowest taxonomic level

identified. The unclassified sequences belong to Fungi domain. Their ecological roles were based on the analysis by FUNguild

Function	Otu no.	Mean Abundance		Kruskal-Wallis	P value	Taxonomy	Literature
		Native Plots	Exotic Plots	Test-Statistic			
Saprotrophs	OTU 7	112.75	96.06	8.39	0.04	Humicola grisea var. grisea	(Costa et al. 2012)
	OTU 36	28.98	64.69	9.44	0.03	Lophiostoma	(Tedersoo et al. 2014)
	OTU 38	35.95	14.2	13.94	0.01	Basidioascus undulatus	(Sterkenburg et al. 2015)
	OTU 57	30.25	22.68	9.16	0.03	Tetracladium	(Tedersoo et al. 2014)
	OTU 89	2.93	20.14	20.25	0.0005	Hypocreales	(Sterkenburg et al. 2015)
Pathogens	OTU 52	26.18	0.55	22.86	0.0002	Stagonospora	(Cunfer 2000; Tedersoo et al. 2014)
Unknown	OTU 8	120.47	61.28	13.46	0.006	Mortierellales	
	OTU 13	66.07	146.68	9.83	0.02	Basidiomycota	
	OTU 18	80.67	28.56	8.19	0.04	Ascomycota	
	OTU 51	26.32	12.11	7.82	0.05	Ascomycota	
	OTU 59	16.8	12.98	10.47	0.02	Zygomycota	
	OTU 70	19.29	1.36	16.34	0.002	Unclassified fungi	
	OTU 86	11.24	9.34	8.54	0.04	Sordariomycetes	
	OTU 114	2.17	57.95	9.99	0.02	Auriculariales	
	OTU 129	9.33	4.34	17.97	0.001	Unclassified fungi	
	OTU 3718	28.77	70.54	10.44	0.02	Basidiomycota	

significantly different in their mean abundance between native and exotic plots (Kruskal-Wallis test, P > 0.05 after Benjamini-Hochberg FDR correction).

Microbial diversity

Diversity measurements for the microbial community were analyzed to determine if plant treatment or irrigation had an impact on the diversity of the microbial community. Fungal diversity measures, Chao1 and Faith's phylogenetic diversity, were similar between plant treatment and summer irrigation treatments, and the interaction of the plant treatment and summer irrigation was not significant (Fig. S1). However, there was a large drop in fungal diversity in 2014 compared to sampling years, 2009 and 2015. The interaction between plant treatment and summer irrigation moderately affected fungal Simpson's reciprocal, but plant treatment and summer irrigation did not (interaction: $F_{1,185} = 3.542$, P = 0.061).

On the other hand, bacterial diversity measures did differ between native and exotic plots, with Chao1 richness and Faith's phylogenetic diversity showing significantly higher values for exotic than native mixtures ($F_{1,185} = 10.18$, P = 0.015 and $F_{1,185} = 7.85$, P = 0.027, respectively). Faith's phylogenetic diversity was much higher during 2009 than 2014 and 2015. However, Chao1 richness had the opposite pattern, with lower richness values in 2009 than in 2014 and 2015. Simpson's diversity measures (Fig. S2) were not statistically significant for any treatment.

Microbial functioning: mineralization rates in native vs. exotic mixtures

Microbial functioning was assessed as mineralization of N and P. Nitrogen mineralization was significantly higher under native than exotic plots ($F_{1,27} = 34.2$, P < 0.001). This was consistent across time periods and irrigation treatments (i.e., there was no time x plant treatment interaction). Nitrogen mineralization was lowest during the middle (warmest) part of the growing season (Time $F_{2,118} = 41.2$, P < 0.001) (Fig. 3a).

Phosphorus mineralization was greater in native than exotic plots only at the final sampling (plant treatment $F_{1,59} = 15.09$, P = 0.0003; time x plant treatment interaction $F_{2,118} = 9.02$, P = 0.0002). Phosphorus



Fig. 2 Bacterial non-metric multidimensional scaling (NMDS) based on Bray-Curtis dissimilarity distance measures for OTU abundance by plant treatment (native vs. exotic) by sampling year,

axis 1 vs. 2 and axis 1 vs. 3 are shown, **a**) 2009 (2D stress 0.187, 3D stress 0.130), **b**) 2014 (2D stress 0.149, 3D stress 0.113), **c**) 2015 (2D stress 0.226, 3D stress 0.160)



Fig. 3 Nitrogen (a) and phosphorus (b) mineralization rates in native vs. exotic plant mixtures at three different time points collected in 2015 (time point 1: March 16th to June 1st, time point 2: June 22nd to August 18th, time point 3: August 25th to November 12th)

mineralization was significantly lower in exotic plots in the last sampling period (Fig. 3b). Several fungal taxa were associated with the change in mineralization (Fig. 4). Increased N and P mineralization were associated with fungal OTUs representing *Humicola grisea* var. *grisea*, order *Mortierellales*.



Fig. 4 Non-parametric multidimensional scaling (NMDS) based on Bray-Curtis dissimilarity distance measure for fungal community in 2015 with averaged total N and P content as variables

Niche vs. neutral processed in microbial communities

The checkerboard score (C-score) was calculated for the co-occurrence analysis in native vs. exotic plots to determine if niche or neutral processes predominated. If the C-score for the observed data is significantly different than the C-score for simulated data, species occur non-randomly (e.g., communities are more structured). Generally, in both native and exotic plots, non-random co-occurrence was observed ($P_{obs} <=P_{sim}$) (Table 3). The C-scores were much higher for fungal than bacterial communities, implying less randomness, and more niche differentiation among fungi than bacteria. C-scores were higher in exotic than native plots for both bacterial and fungal communities, suggesting greater structure in microbial communities under exotic than native plant communities.

Discussion

We conducted an eight-year study of microbial communities in soils beneath native and exotic plant species mixtures that either were exposed to summer irrigation or were non-irrigated controls. In this highly replicated experiment that was established in 2008 and sampled through 2015, we observed that composition, structure, and function of microbial communities differed between native and exotic plant communities. Summer irrigation did not significantly change the microbial community structure. Fungal community composition was more strongly affected by native vs. exotic plant plots than was bacterial community composition. The differences in composition were driven through the differential

Table 3 Non-random co-occurrence of OTUs in native vs. exotic plots. The number in bold indicates significant C-score (P < 0.05) for non-random co-occurrence (obs – observed; sim – simulated)

	Native plots	Exotic plots
Fungi		
C-score _{obs}	170.5	196.6
C-score _{sim}	168	192.3
SES	15.9	17.9
Bacteria		
C-score _{obs}	103.8	108.6
C-score _{sim}	70.6	74.2
SES	191.7	118

abundance of certain fungal phylotypes, among which a pathogen and saprotrophs were detected, as well as some with unknown function. This coincided with differences in function, with lower N and P mineralization in exotic than native plots. Finally, fungal community composition was more non-random in co-occurrence in plots of exotic than native plant communities.

We hypothesized that because native plant-microbe communities co-evolved together they would be more structured than microbial communities under exotic plants. Notably, we found support for the opposite outcome; exotic plots had stronger niche processes than native plots. As the MEND experiment progressed over time, native and exotic plots diverged from each other in terms of diversity, with lower plant diversity in exotic plots. The exotic plots were strongly dominated by various C4 grasses, whereas native plots contained mixtures of C₃ and C₄ grasses and C₃ forbs (Wilsey et al. 2011, 2014; Martin et al. 2014). The microbial community composition and diversity differed between exotic and native plots as well. These plant differences could have had a stronger filtering effect on the microbial community in exotic plots generating higher incidences of non-random co-occurrence. Fungi, in particular, had higher non-random co-occurrence than bacterial communities in exotic than native plots.

Our results show bacterial communities were more impacted by neutral processes compared to fungal communities, which were more strongly impacted by niche processes. Due to the differences in spatial scale of a bacterium's habitat vs. that of a fungus, it is often more common to find differences in fungal community processes when studied at relatively large spatial scales, e.g. bulk soil compared to targeted studies, e.g. rhizosphere or soil aggregates (Bach et al. 2018; Nemergut et al. 2013). Further exploration of this relationship between rhizosphere and bulk soil in native and exotic plots can test whether the occurrence is even less random due to varying fungal trophic modes. In addition, use of this finer spatial scale design may reveal stronger bacterial roles within changes between native and exotic plant community interactions, to account for their smaller physical size.

Plant treatment (native vs. exotic plots), also impacted fungal community phylotype abundance. The plant pathogen genus *Stagonospora* (Solomon et al. 2006) was significantly more abundant in native plots. This higher accumulation of the genetic signatures of this genus in native plots compared with exotic plots might suggest a ready accumulation of pathogens in native plants. Similarly, we detected a few fungal OTUs belonging to saprotrophic groups and the majority had unclassified functions. The majority of environmental microorganisms are unculturable, consequently most sequences identified organisms have unknown ecological roles; as our understanding of individual fungi's physiology increases so will our determination of their ecology relevance (Rondon et al. 1999; Vartoukian et al. 2010).

Native and exotic plant communities had distinctly different microbial communities with altered microbial mineralization rates. Microorganisms have been shown to directly and indirectly influence plant communities via mineralization (Schimel and Bennett 2004). Mineralization rates were much higher in native than exotic plots. Native mixtures were more diverse, with a mixture of C3 and C4 plant species present, which would lead to higher substrate quality entering the soil compared to the C₄ grass dominated exotic plots (Martin et al. 2014; Xu et al. 2015). C₄ grasses have lower N content than C3 species, and this potentially was responsible for the reduced N mineralization in exotic plots. An increase in microbial mineralization has been linked to greater plant biomass as well as increases in tolerance of drought (Panke-Buisse et al. 2015; Treseder and Lennon 2015). The lower mineralization rates under exotic plots may have been constraining their growth response over time, reducing the differences in productivity between native and exotic plots. Under native plant communities, microorganisms provided greater ecosystem services in the plant-microbe-soil feedback loop.

Fungal community changes due to plant treatment were associated with changes in mineralization of N and P. In particular, the abundance of fungal class *Agaricostilbomycetes*, known saprotrophs, was positively correlated with mineralization rates. *Agaricostilbomycetes* may represent a key group in this system that regulates mineralization rates of N and P, and this should be tested in the future with more direct manipulations. N and P mineralization rates, in turn, could be affecting plant productivity and both plant and microbial community composition and diversity.

Unlike native-exotic plant differences, we found surprisingly small and non-significant effects of summer irrigation. Few have studied the direct influence of altered precipitation on fungal and bacterial communities. Cruz-Martínez et al. (2009, 2012) found that microbial communities changed within days after rainfall manipulations, showing a pulse response, but remained unchanged over longer multi-year time periods. The short-term change was associated with the relative abundance of the most abundant phyla. Hawkes et al. (2011) investigated how fungal communities responded to periods of altered precipitation and also found the impact to be time-related, with less diverse fungal communities during wetter periods immediately following a rainfall event, but long-term effects were smaller. However, the long-term effects of rainfall events vary, dependent upon the magnitude of change in the aboveground community (Cruz-Martínez et al. 2009). In our study, we did not see any direct effects of irrigation, however, we do see potentially indirect impacts due to changes in plant communities within both exotic and native plots. Irrigation may have a direct short-term impact on the microbial community function, however, the long-term impacts can be mediated by the aboveground community.

We did have large effects on microbial communities from year to year differences, especially in sampling years 2014 vs. 2015. Both years were wet, but 2014 was cooler than average (Xu et al. 2017). Temperature may have had important effects on microbial communities, and the effects of temperature on microbial in grasslands deserve more study.

In summary, fungal community composition and Cscores differed between diverse native and exotic C₄ grass dominated plots. Bacterial communities were not as strongly affected by plant community treatments. The fungal communities were more structured in exotic than native plots, potentially due to the simplification of the aboveground plant community. We also showed that nutrient cycling for N and P was higher under the more diverse C_3 - C_4 mixed native than the low diversity, C_4 dominated exotic mixtures. The changes in plant production and functional group abundance that characterized exotic compared to native plant communities had a significant impact on the belowground microbial community structure, composition, and function. Our study demonstrates that exotic plants can have cascading impacts on ecosystems by changing microbial community composition and biogeochemical cycles.

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