Plant and soil fungal but not soil bacterial communities are linked in long-term fertilized grassland

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**Supplementary Table S1**. Fungal community compositions in the long-term unfertilized control (C), liming (L), nitrogen (N), N-phosphate-potassium (NPK) and P treatments of the Ossekampen experiment. Fungal phyla were included if the average proportion of classified sequences was above 1% in at least one treatment.

Euroal Dhula	Effect size	Aver	rage p	roportion	of c	lassified s	equer	ces in tr	eatme	ents (%)	
Fungal Phyla	Effect size	С		L		Ν		NP	K	Р	
Agaricomycotina	0.506	61±17		46±21		62±10		63±9		89±3	
Saccharomyceta	0.405	28±15		32±16		30±10		22±7		$7\pm2$	
"mitosporic"+	0.679	$2\pm 2$	a*	8±3	b	$1\pm0$	a	5±2	ab	$1\pm0$	а
Ascomycota	0.740	6±2	a	$5\pm0$	а	3±1	ab	$1\pm1$	b	$1\pm1$	b
Glomerales	0.682	$1\pm0$	а	3±2	b	$2\pm1$	ab	$4\pm1$	b	$1\pm0$	а
Paraglomerales	0.768		а		а		a	$1\pm1$	b		a
Chrytidiales	0.608		а	$2\pm1$	b		a		a		a
Pucciniomycotina	0.208			1±2				1±1			

+bolded phyla indicate significant difference among treatments (ANOVA, corrected p<0.05 from STAMP analysis)

\*Similar letters represent no significant differences between treatments (Tukey-Kramer, 95% CI, Benjamini-Hochberg FDR multiple test correction)

**Supplementary Table S2**. PERMANOVA test results of treatment and diversity effects on plant, bacterial and fungal community compositions in the Ossekampen experiment.

ommunity	Source of Variation	Pseudo-F	p-value
	Treatment	3.1444	0.045
	Plant Richness	14.9652	0.001
	Interaction	3.4186	0.043
	Treatment	60.824	0.001
	Bacterial Shannon	3.975	0.014
	Interaction	3.371	0.002
	Treatment	51.359	0.001
Plant	<b>Bacterial Inverse</b>	2.901	0.053
species	Simpson	2.701	
	Interaction	2.571	0.016
	Treatment	42.879	0.001
	Fungal Shannon	1.048	0.351
	Interaction	2.077	0.041
	Treatment	35.710	0.001
	Fungal Inverse Simpson	0.862	0.450
	Interaction	1.314	0.245
	Treatment	33.772	0.001
	Plant Richness	15.379	0.001
	Interaction	6.753	0.001
	Treatment	20.4142	0.001
	Bacterial Shannon	8.8261	0.001
	Interaction	3.2105	0.009
	Treatment	13.0175	0.001
acterial	<b>Bacterial Inverse</b>	6.1752	0.006
phyla	Simpson		
	Interaction	1.0046	0.482
	Treatment	9.1368	0.001
	Fungal Shannon	0.9903	0.395
	Interaction	0.7958	0.643
	Treatment	8.5066	0.001
	Fungal Inverse Simpson	0.7469	0.473
	Interaction	0.6123	0.784
	Treatment	5.3954	0.007
Fungal phyla	Plant Richness	0.6262	0.458
	Interaction	3.1178	0.048
	Treatment	3.3005	0.033
	Bacterial Shannon	0.6617	0.464
	Interaction	0.8668	0.548
	Treatment	3.2082	0.057
	Bacterial Inverse Simpson	0.4438	0.583
	Interaction	0.8226	0.582
	Treatment	9.3895	0.002
			0.067
	Fungal Shannon	3.6953	
	Fungal Shannon Interaction		
		6.6252	0.005
	Interaction		

**Supplementary Table S3**. Bacterial community compositions in the long-term unfertilized control (C), liming (L), nitrogen (N), N-phosphate-potassium (NPK) and P treatments of the Ossekampen experiment. Phyla were included if the average proportion of classified sequences was above 1% in one or more treatments.

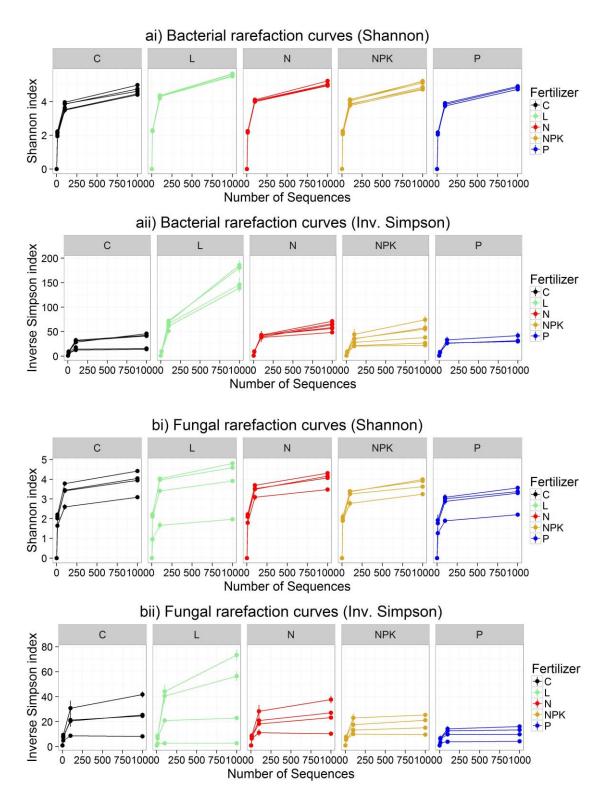
Destarial Dhyla	Effect size		Ave	rage pro	porti	on of cla	assifi	ed seque	ences (	(%)	
Bacterial Phyla	Effect size	С		L		Ν		NP	Κ	Р	
Proteobacteria+	0.836	35±2	a*	51±1	с	41±4	b	38±3	ab	37±2	ab
Acidobacteria	0.501	$28 \pm 4$	a	19±4	b	20±3	b	23±2	ab	$23\pm2$	ab
Verrucomicrobia	0.642	$24 \pm 7$	ac	8±2	b	13±4	bc	19±4	a	$20\pm2$	a
Actinobacteria	0.675	$5\pm2$	а	9±3	ab	$18\pm5$	c	12±2	b	$11\pm1$	ab
Bacteroidetes	0.900	3±0	а	$8\pm1$	b	$2\pm1$	a	$2\pm1$	a	3±0	a
Firmicutes	0.285	2±0		3±1		$2\pm1$		$2\pm1$		3±0	
Planctomycetes	0.709	2±0	abc	$1\pm0$	ab		ac	$1\pm0$	abc	$1\pm0$	ab
Gemmatimonadetes	0.527	1±0				$1\pm0$		1±1		1±0	

+bolded phyla indicate significant difference among treatments (ANOVA, corrected p<0.05 from STAMP analysis)

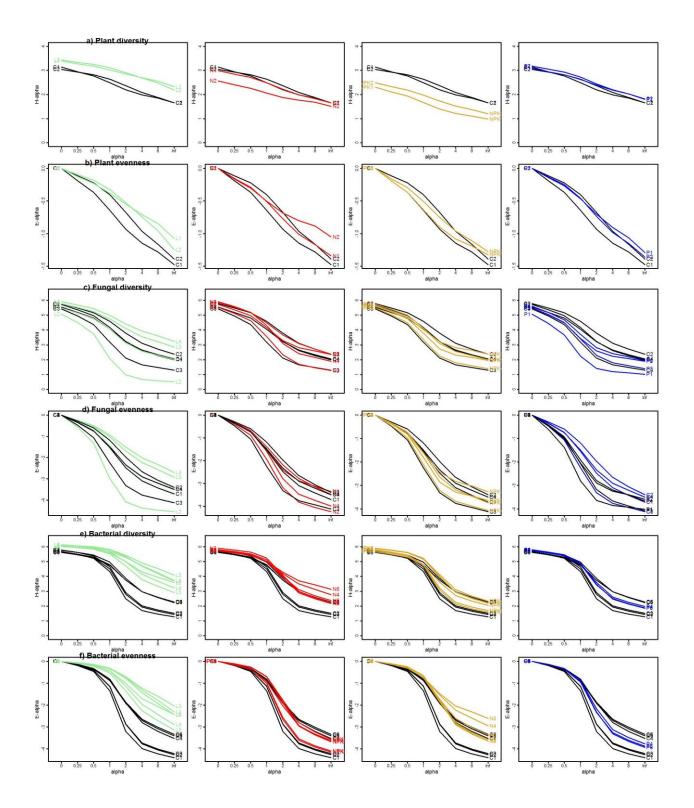
\*Similar letters represent no significant differences between treatments (Tukey-Kramer, 95% CI, Benjamini-Hochberg FDR multiple test correction)

Soil Factor	Soil Factor ID	Units	Method	Notes
Total K	Kt	mg/kg	F-AES	Aqua Regia digestion
Total N	Nt	g/kg	SFA-Nt/Pt	H <sub>2</sub> SO <sub>4</sub> -H <sub>2</sub> O <sub>2</sub> -Se digestion
Total P	Pt	mg/kg		6
Al	Al	mg/kg	<b>ICP-AES</b> Thermo	0,01M CaCl <sub>2</sub> extraction
As	As	mg/kg	<b>ICP-AES</b> Thermo	
Cd	Cd	mg/kg	<b>ICP-AES</b> Thermo	
Cr	Cr	mg/kg	<b>ICP-AES</b> Thermo	
Cu	Cu	mg/kg	ICP-AES Thermo	Factor removed from dataset; values all the same
Fe	Fe	mg/kg	ICP-AES Thermo	Factor removed from dataset; values fell below detection limit
Extractable K	K	mg/kg	ICP-AES Thermo	
Mg	Mg	mg/kg	ICP-AES Thermo	
Mn	Mn	mg/kg	ICP-AES Thermo	
Na	Na	mg/kg	ICP-AES Thermo	
Ni	Ni	mg/kg	ICP-AES Thermo	
Extractable P	Р	mg/kg	ICP-AES Thermo	
Pb	Pb	mg/kg	ICP-AES Thermo	
S Zn	S Zn	mg/kg	ICP-AES Thermo ICP-AES Thermo	
		mg/kg		
$\mathrm{NH}_{4^+}$	$\mathrm{NH}_{4^+}$	mg/kg	SFA-CaCl <sub>2</sub>	
$NO_3^-$	$NO_3^-$	mg/kg	SFA-CaCl <sub>2</sub>	
Extractable N	Nts	mg/kg	SFA-CaCl <sub>2</sub>	
$PO_4$		mg/kg	SFA-CaCl <sub>2</sub>	Factor removed from dataset; values fell below detection limit
С	C.1	mg/kg	SFA-TOC	
Organic matter	ОМ	%	baking oven	Loss on ignition (105- 550°C)
С	C.2	g/kg	spectrophotometer	Kurmies
pН	рН	at 20±1°C	pH-meter	pH-H <sub>2</sub> O
Moisture	Moisture	% dry- matter	dry matter	moisture determination

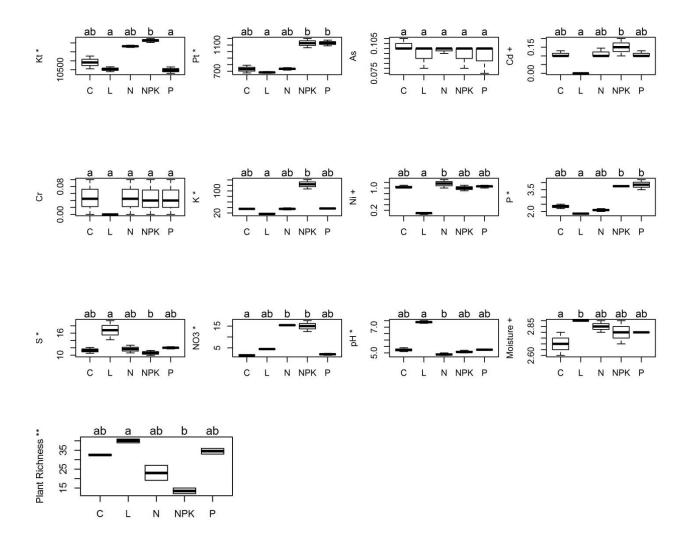
**Supplementary Table S4**. Additional information regarding the soil factors measured in the Ossekampen experiment. Horizontal lines group measurements from the same method.



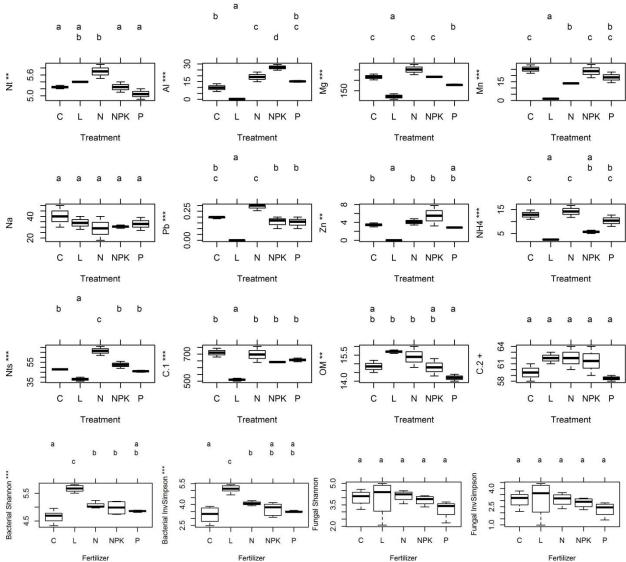
**Supplementary Figure S1**. Rarefaction curves of the sequenced communities from the Ossekampen experiment, including the a) bacterial and b) fungal communities, are presented using (i) Shannon and (ii) Inverse Simpson diversity indices. Legend: control (C), liming (L), nitrogen (N), nitrogen-potassium-phosphorus (NPK and phosphorus (P) fertilizer treatments.



**Supplementary Figure S2**. Renyi diversities and evenness of a-b) plant (n=10), c-d) fungal (n=20) and e-f) bacterial (n=27) communities in the Ossekampen experiment. Legend: control (C), liming (L), nitrogen (N), nitrogen-potassium-phosphorus (NPK) and phosphorus (P) fertilizer treatments.



Kruskal-Wallis H test significance: \*\* p<0.01, \* p<0.05, + p<0.1Dunn's post-hoc test significance: similar letters mean no difference at alpha level 0.10

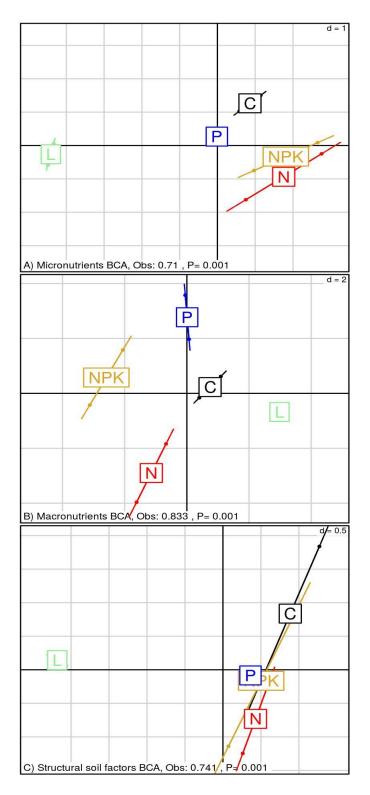


b)

Normal soil factors and diversity indices

ANOVA test significance: \*\*\* p < 0.001, \*\* p = 0.001, \* p = 0.01, + p = 0.1Tukey-Kramer post-hoc test significance: similar letters represent no difference at alpha < 0.05

**Supplementary Figure S3**. Boxplots of the a) non-normal and b) normal soil physicochemical parameters and community diversity indices in the Ossekampen experiment. Legend: control (C), liming (L), nitrogen (N), nitrogen-potassium-phosphorus (NPK) and phosphorus (P) fertilizer treatments. Asterisks by variable names indicate significantly different mean or median values across all treatments from Kruskal-Wallis or ANOVA tests, respectively. Soil factor identifiers (IDs) are listed in Table S4.



**Supplementary Figure S4**. Between-Class Analysis (BCA) of the soil factor subsets (A) micronutrients, B) macronutrients, C) structural) over the long-term control (C), liming (L), nitrogen (N), nitrogen-potassium-phosphorus (NPK) and phosphorus (P) treatments of the Ossekampen experiment are presented. Significance of groups was assessed by Monte-Carlo tests.

## **Supplementary Methods**

**Diversity and evenness calculations.** Renyi diversities and evenness were calculated and visualized from the fungal (n=20), bacterial (n=27) datasets and the plant species (n=10) frequency dataset using the "BiodiversityR" R package. Plant richness was measured during sampling as the total number of species present. To obtain alpha diversity indices for the sequenced datasets, the bacterial and fungal OTU tables were rarified to the size of the smallest sample in each dataset. For the bacterial and the fungal samples, Renyi diversity indices at alpha = 1 (Shannon) and alpha = 2 (Inverse Simpson) were kept for group testing.

**STAMP analysis.** The fungal (n=20) and bacterial (n=27) datasets were agglomerated at the taxonomic rank of Phylum for the STAMP<sup>1</sup> analysis. Missing taxonomy information in the 18S rRNA dataset was resolved as follows: 1) if an entry was blank with classified entries before and after, then the blank was replaced with a copy of the entry after (eg. "Eukaryota", "", "Fungi", became "Eukaryota", "Fungi", "Fungi"), 2) if an entry was blank and the previous or following entry was "unclassified", it was replaced with "unclassified" (eg. "Eukaryota", "Fungi", "unclassified" (eg. "Eukaryota", "Fungi", "unclassified") and 3) if an entry was blank and the previous entry was "Fungi" and the next entry was "fungal", the blank space was replaced with "Fungi." In addition, for the 18S rRNA dataset, ambiguous classifications (e.g. "environmental" and "unknown") were replaced with "unclassified". Unclassified reads were removed; then, the ANOVA statistical test was selected with a Tukey-Kramer post-hoc test (CI= 95%). A Benjamini-Hochberg FDR multiple test correction was applied.

**Treatment effects on plant, bacterial and fungal communities and soil factor profiles.** Between-Class Analysis (BCA) selects the orthogonal axis that maximizes between-group variance and measures the amount of variance restricted to the grouping factor as a percentage of the inertia captured through the new axis over the total inertia<sup>2</sup>. This allowed us to assess the amount of variability that could be explained by treatment for each community. The bacterial and fungal OTU abundances were summarized at the Phylum and Genus, or Phylum and Class levels, respectively. The plant species frequencies and the bacterial and fungal abundances were converted to relative abundances (contingency tables), and the soil factors were normalized and scaled to unit variance.

**Between-component analyses.** Co-inertia analysis is a multivariate method that identifies the common structure in two tables related by the same samples<sup>3</sup>. We chose this analysis because it can tolerate a high variable-to-sample ratio. Furthermore, we leveraged the imposed structure of the long-term fertilizer treatments. The co-inertia of two ordinations is the sum of squares of the co-variances of the variables in each table; thus, co-varying variables can be identified through correlation with the co-inertia axis<sup>3</sup>. Here we could simultaneously identify, for example, the taxonomic groups from two communities that contributed to treatment groupings in the factor map. The degree of multivariate co-variance between two ordinations is summarized within an array correlation and co-variance coefficient, the RV value, which is a measure of the global similarity.

## References

- 1. Parks, D. H., Tyson, G. W., Hugenholtz, P. & Beiko, R. G. Stamp: statistical analysis of taxonomic and functional profiles. *Bioinformatics* **30**, 3123–3124 (2014).
- 2. Dray, S. & Dufour, A. B. The ade4 package: implementing the duality diagram for ecologists. *J. Statist. Software*, **22**:1-20 (2007).

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