



1 **Soil bacterial community and functional shifts in response to**
2 **thermal insulation in moist acidic tundra of Northern Alaska**

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8



1 **Abstract**

2 Soil microbial communities play a central role in the cycling of carbon (C) in Arctic tundra
3 ecosystems, which contain a large portion of the global C pool. Climate change predictions for
4 Arctic regions include increased temperature and precipitation (i.e. more or less snow), resulting
5 in increased winter soil insulation, increased soil temperature and moisture, and shifting plant
6 community composition. We utilized an 18-year snowfence study site designed to examine the
7 effects of increased winter precipitation on Arctic tundra soil bacterial communities within the
8 context of ecosystem response to climate change. Soil was collected from three pre-established
9 treatment zones representing varying degrees of snow accumulation (DEEP, INT, LOW), soil
10 physical properties (temperature, moisture, active layer thaw depth) were measured, and samples
11 were analysed for C content, nitrogen (N) content, and pH. DNA was extracted and the 16S
12 rRNA gene was sequenced to reveal phylogenetic community differences between samples and
13 determine how soil bacterial communities might respond (structurally and functionally) to
14 changes in winter precipitation and soil chemistry. We analysed relative abundance changes of
15 the six most abundant phyla and found four (Acidobacteria, Actinobacteria, Verrucomicrobia,
16 and Chloroflexi) responded to deepened snow. All six phyla correlated with at least one of the
17 soil chemical properties (%C, %N, C:N, pH), however a single predictor was not identified
18 suggesting that each bacterial phylum responds differently to soil characteristics. Overall
19 bacterial community structure (beta diversity) was found to be associated with snow
20 accumulation treatment and all soil chemical properties. Bacterial functional potential was
21 inferred using ancestral state reconstruction to approximate functional gene abundance, revealing
22 a decreased abundance of genes required for soil organic matter (SOM) decomposition in the
23 organic horizon of the deep snow accumulation zones. These results suggest that predicted
24 climate change scenarios may result in altered soil bacterial community structure and function,
25 and indicate either a reduction in decomposition potential that may limit C loss from the system,
26 or alleviated temperature limitations on enzymatic efficiency, or both. The fate of stored C in
27 Arctic soils ultimately depends on the balance between these mechanisms.

28



1 **1 Introduction**

2 Broad and rapid environmental changes are threatening the stability of both above- and
3 belowground community structure in the Arctic (Elmendorf et al., 2012a, 2012b; Tape et al.,
4 2006, 2012; Wallenstein et al., 2007). It is well established that soil microbial communities may
5 alter their composition in response to changing environmental factors such as nutrient
6 availability, moisture, pH, temperature, and aboveground vegetation shifts (Lauber et al., 2009;
7 Morgado et al., 2015; Semanova et al., 2015), and ecological and climate induced changes to
8 Arctic soil microbial community structure and function have important effects on ecosystem
9 carbon (C) cycling and nutrient availability for plant growth (Deslippe et al., 2012; Graham et
10 al., 2012; Waldrop et al., 2010; Zak and Kling, 2006). Because many of these environmental
11 features are rapidly changing in Arctic tussock tundra ecosystems, and because of the large
12 amounts of C stored in Arctic soils, it is imperative to examine microbial responses in this
13 system.

14 Soil microorganisms play a key role in the decomposition of soil organic matter (SOM), which
15 releases nutrients into the soil and stored C into the atmosphere in the forms of CO₂ and CH₄,
16 two major greenhouse gases that contribute to global warming (Anisimov et al., 2007).
17 Decomposition of SOM by soil microorganisms amounts to at least half of the 80-90 Gt C
18 released each year by soil respiration, the second largest terrestrial flux after gross primary
19 productivity (GPP; Davidson and Janssens, 2006; Hopkins et al., 2013; Raich et al., 2002).
20 Because global soils contain about 2,000 Gt of C, ~1,500 Gt of which is in the form of SOM
21 (Batjes, 1996; IPCC, 2000), large scale changes in the rate of microbial decomposition will have
22 an impact on the rate at which CO₂ accumulates in the atmosphere (Schimel and Schaeffer,
23 2012).

24 The decomposition rate of SOM, resulting in heterotrophic respiration from soils (R_h), has been
25 shown to be temperature and moisture sensitive (Davidson and Janssens, 2006; Frey et al., 2013;
26 Hopkins et al., 2012; Xia et al., 2014). As the climate warms, increasing R_h may be capable of
27 producing a positive feedback on the climate system as C stored in soils over millennia is
28 released back to the atmosphere (Czimeczik and Welker, 2010; Lupascu et al., 2013, 2014b;
29 Nowinski et al., 2010; Oechel et al., 1993; Schuur et al., 2008). This is particularly true in cold



1 regions, such as the Arctic, where low temperatures and nutrient availability limit SOM
2 decomposition rates.

3 Northern latitude permafrost soils house over 50% of the world's soil organic C (SOC; the C
4 component of SOM), approximately twice the amount of C present in the atmosphere (Hugelius
5 et al., 2013; Ping et al., 2008; Schuur et al., 2009; Tarnocai et al., 2009). In addition, Arctic
6 ecosystems are more susceptible to the effects of climate change, warming at approximately
7 twice the rate as temperate zones and exhibiting increased winter precipitation patterns
8 (Anisimov and Vaughan, 2007; Liston and Hiemstra, 2011). Deeper snow has a suite of
9 cascading consequences in tundra ecosystems as snow acts to insulate soil from extreme winter
10 air temperatures resulting in soil temperatures under deeper snow pack up to 10°C warmer than
11 soils under ambient snow depths (Schimel et al., 2004). These altered soil conditions under
12 deeper snow may thus lead to increased SOM decomposition, causing changes in SOC stocks
13 and releasing nutrients for plant and microbial growth (Anisimov et al., 2007; Leffler and
14 Welker, 2013; Rogers et al., 2011; Welker et al., 2005). The predicted increase in soil
15 temperature as a result of deeper winter snow accumulation should enhance the rate of SOM
16 decomposition by: 1) a direct temperature effect on enzyme activity and kinetics, and 2) by
17 increasing substrate availability to decomposers as the active layer deepens and permafrost thaws
18 (Lützow and Kögel-Knabner, 2009; Nowinski et al., 2010; Schuur et al., 2008). Therefore,
19 warming and deeper snow in the Arctic are likely to expose C stored over millennia to
20 decomposers, resulting in a major source of C to the atmosphere.

21 However, ecosystem C loss may be offset by increased soil moisture and soil compaction,
22 causing hypoxic conditions and limiting R_h . Also, microbial mineralization of plant nutrients,
23 such as nitrogen (N) and phosphorus (P), from SOM decomposition are likely to contribute to
24 increased net primary productivity (NPP; Hinzman et al., 2005; Natali et al., 2012; Pattison and
25 Welker, 2014) and cause shifts in vegetation from herbaceous species (Cottongrass tussock-
26 *Eriophorum vaginatum*) towards woody species (Arctic shrubs – *Betula nana* and *Salix pulchra*)
27 that may produce a larger amount of plant litter compounds that are more resistant to
28 decomposition (Bret-Harte et al., 2001; Pearson et al., 2013; Sturm et al., 2005; Wahren, 2005).
29 The balance between these processes will determine the extent to which Arctic tundra
30 ecosystems feedback on the global climate, making the fate of this stored C unclear (Sistla et al.,
31 2013).



1 This study examined changes in soil microbial community composition due to increased winter
2 snow accumulation and subsequent altered biotic and abiotic factors using a long-term snow
3 fence manipulation experiment that mimics changes in winter precipitation by creating a gradient
4 of snow depths from much deeper than ambient to shallower than ambient (Jones et al., 1998;
5 Pattison and Welker, 2014; Welker et al., 2000). We postulated that increased soil thermal
6 insulation from deeper winter snow accumulation would elicit microbial community response
7 via: 1) altered soil physical characteristics such as soil temperature, moisture, structure, and O₂
8 availability, and 2) altered soil chemistry produced by increased microbial mineralization of
9 SOM resulting in increased nutrient availability and changes in plant species composition and
10 litter. If the shifting phylogenetic and functional diversity of microorganisms under changing soil
11 conditions is unable to degrade SOM inputs from shrubs with more chemically recalcitrant
12 compounds, SOC may increase over time, contradicting current model predictions. Here we
13 evaluated phylum level shifts in microbial community phylogeny using 16S rRNA gene analysis
14 and predicted bacterial function using the program PICRUST (Langille et al., 2013) to test
15 whether increased snow accumulation and associated changes in soil conditions (warmer
16 temperatures, altered plant inputs, and increased hypoxia) would cause shifts in microbial
17 community structure and functional potential that reflect increased SOM decomposition and
18 nutrient mineralization.

19

20 **2 Methods**

21 **2.1 Site description and sample collection**

22 The study utilized a long-term snow depth manipulation experiment site (Jones et al., 1998;
23 Walker et al., 1999) established in 1994 in a moist acidic tundra ecosystem located near Toolik
24 Lake Field Station, Alaska (68°37'N, 149°32'W). It consists of a strategically placed snow fence
25 designed to simulate the increased precipitation patterns and continuous snow-cover episodes
26 predicted under global warming scenarios, resulting in a gradient of increasing snow
27 accumulation (and thus increasing soil thermal insulation, soil temperatures, and active layer
28 thaw depth/permafrost thaw) with proximity to the fence. The soil is classified as Typic
29 Aquiturbel, exhibiting characteristics of cryoturbation and poor drainage (Ping et al., 1998; Soil
30 Survey, 2015). Four experimental zones were identified according to their snow accumulation



1 regime: Control (CTL, taken outside the effects of the snowfence), Deep snow (DEEP ~ 100%
2 increase in snow cover relative to the Control), Intermediate snow (INT, ~50% increase in snow
3 cover relative to the Control), and Low snow (LOW, ~25% decrease in snow cover relative to
4 the Control; Fig. 1). The DEEP snow zone is unique in that it is waterlogged during thaw
5 periods, and dominated not by Cottongrass tussock or woody shrub species (e.g. *Eriophorum*
6 *vaginatum*, *Betula nana*, or *Salix pulchra*), but by a sedge species, *Carex bigelowii*. However,
7 the vegetative history of this plot includes a transition from tussock cottongrass to woody
8 species, and finally to wet sedge species (Arft et al., 1999; Walker and Wahren, 2006).

9 Three soil cores were taken from each experimental snow zone in August of 2012. All soil
10 coring equipment was cleaned and sterilized in the field between each sample using water and
11 100% ethanol. The top 10cm representing the organic horizon was taken first using a sharpened
12 steel pipe (5.08cm diameter X 12cm length) and serrated knife to cut through surface vegetation
13 and to minimize soil compaction. A slide hammer with 2x12" split soil core sampler (AMS Inc.,
14 ID, USA) was used to obtain the remainder of the active layer down to permafrost (~35–65cm
15 soil depth), including mineral horizons. The soil cores were stored in sterile Whirl-pak® bags,
16 immediately frozen on site, and shipped to the Stable Isotope Laboratory at the University of
17 Illinois at Chicago where they were sectioned horizontally into 2cm depth segments using a
18 sterilized ice-core cutter, providing a 2cm resolution soil depth profile for each core. A portion of
19 each segment was ground into a fine powder using a Spexmill mixer/mill 8000 (SPEX
20 SamplePrep, NJ, USA) and analysed for C and N content and stable isotopes using a Costech
21 Elemental Analyser (Valencia, CA, USA) in line with a Finnigan Deltaplus XL IRMS (isotope
22 ratio mass spectrometer) (Bremen, Germany). Soil pH was measured from portions of the same
23 segments by creating a soil slurry mixture (2ml H₂O:1g soil) and using an Accumet Basic AB15
24 pH meter with a calomel reference pH electrode (Thermo Fisher Scientific Inc., MA, USA). In
25 addition, at the time of collection, soil temperature, soil moisture, and active layer thaw depth
26 were measured and recorded at four points around each soil core hole to characterize the soil
27 environment. Soil temperatures (°C) at four soil depths (10cm, 20cm, 30cm, and 40cm) were
28 measured using a SPER Ultimate Thermometer 800043 (SPER Scientific Inc., AZ, USA) with a
29 40" (101.6 cm) profile probe (Omega Inc., CT, USA), surface (top 12cm) volumetric water
30 content (%) was measured using an HS2 HydroSense II Soil Moisture Measurement System



1 (Campbell Scientific Inc., UT, USA), and active layer thaw depths (cm) were measured by
2 inserting a meter stick attached to a metal rod into the ground until it hit ice.

3 **2.2 DNA extraction, sequencing, and analysis**

4 Samples from organic and mineral soil horizons, as well as the transition between the two, were
5 selected for DNA extraction initially based on visual examination of each individual core section
6 and further classified by %C in saturated soils as per the Soil Survey Division Staff, (1993;
7 Organic \geq 12% SOC, Mineral: $<$ 12% SOC). Organic samples were collected just below where
8 plant tissue transitioned into dark brown/black soil, typically between 0-6cm soil depth, except in
9 one case where the top 10cm was primarily plant tissue. Transitional samples were taken from
10 the visual border of organic to mineral layers based on change in soil colour. Mineral samples
11 were collected 10cm below this transition and was more variable (ranging from 15-36cm soil
12 depth) due the varying depths of transition. Samples were sent to Argonne National Laboratory
13 for DNA extraction, amplification, and sequencing as per standards used by the Earth
14 Microbiome Project (Gilbert et al., 2014). DNA extractions were performed using MoBio's
15 PowerSoil®-htp 96 Well Soil DNA Isolation Kit as per protocol, the V4 region of the 16S rRNA
16 gene was amplified using PCR primers 515F/806R, DNA quantification was performed using
17 PicoGreen, and 2x150bp paired-end sequencing was performed using an Illumina Mi-Seq
18 instrument.

19 Samples were barcoded prior to sequencing for downstream sample identification and paired-end
20 assembly, demultiplexing, quality filtering, operational taxonomic unit (OTU) picking, and
21 preliminary diversity analyses were performed using the QIIME software package version 1.8.0
22 (Caporaso et al. 2010). Forward and reverse reads were assembled using fastq-join (Aronesty,
23 2011) with 15bp overlap at 15% maximum difference. Quality filtering included removal of
24 reads that didn't have at least 75% consecutive high quality (phred $>$ q20) base calls and
25 truncation of reads with more than three consecutive low quality (phred $<$ q20) base calls. This
26 resulted in an assembled-read median sequence length of 253bp.

27 To reveal phylogenetic abundance and relationships, sequences were assigned taxonomic
28 identities using closed reference OTU picking that clusters and matches the sequences to a
29 reference database. All default QIIME parameters were used (reference database = Greengenes



1 (13_8), OTU picking method = uclust, and sequence similarity threshold = 97%). Because many
2 organisms are known to possess multiple copies of the 16S rRNA gene in their genome, the
3 abundance assignments were corrected based on known copy numbers using PICRUST's
4 *normalize_by_copy_number.py* script. The relative abundances of the six most abundant phyla
5 were analyzed for treatment effects and alpha and beta diversities were examined using
6 rarefaction curves to determine adequate sampling depth, the Shannon diversity index to estimate
7 within sample diversity, and Bray Curtis dissimilarity matrices to determine community structure
8 differences.

9 The genetic functional potential of bacterial communities was determined using the software
10 package PICRUST version 1.0.0 (Langille et al., 2013) which predicts functional gene copy
11 numbers in a community based on 16S rRNA sequencing results. Recent advances in sequencing
12 technologies and bioinformatics has greatly enhanced our current knowledge of the genetic
13 potential of soil microorganisms, allowing us to determine what genes a group of organisms is
14 likely to possess based on ancestral state reconstruction of metagenome assemblies from current
15 genomic databases (Langille et al., 2013; Martiny et al., 2013). PICRUST utilizes this knowledge,
16 revealing functional potential, in the form of gene abundance, associated with phylogenetic
17 community structure. For this study, we targeted Kyoto Encyclopedia of Gene and Genomes
18 (KEGG) ortholog assignments for enzymatic genes commonly associated with SOM
19 decomposition, nutrient (nitrogen and phosphate) mobilization, and environmental stress
20 responses (full list in Table S1). These genes were then grouped according to functional role,
21 resulting in the following nine gene groups: 1) lignin degradation, 2) chitin degradation, 3)
22 cellulose degradation, 4) pectin degradation, 5) xylan degradation, 6) arabinoside degradation, 7)
23 nitrogen mobilization, 8) phosphate mobilization, and 9) superoxide dismutation.

24 **2.3 Statistical analyses**

25 Differences between treatments, including abiotic measurements, bacterial relative abundance,
26 and enzyme gene relative abundance, were determined using the Kruskal-Wallis test with a
27 significance threshold of $p < 0.05$. All abiotic factors, phyla/classes, and enzyme gene groups
28 were analysed individually to elucidate the treatment effects for each group separately, and
29 pairwise comparisons were made to determine significant differences between treatments using



1 the Nemenyi post hoc test. In addition, linear regressions were performed to determine
2 relationships between soil chemical properties (%C, %N, C:N, and pH) and bacterial abundance
3 at the phylum level, as well as SOM degrading enzyme gene abundance (Supplementary Figs.
4 S1-S15). Only R^2 values > 0.30 are discussed.

5 Bacterial diversity statistics were calculated using the QIIME scripts
6 *compare_alpha_diversity.py*, *compare_categories.py*, and *compare_distance_matrices.py*. The
7 Shannon alpha diversity metric was compared across treatments using non-parametric two-
8 sample t-tests with 999 Monte Carlo permutations. Beta diversity was analysed by comparing
9 Bray-Curtis dissimilarity matrices of bacterial abundance data to soil chemical properties and
10 snow accumulation treatments using adonis tests with 999 permutations. Analyses of soil
11 chemical properties were further substantiated by Mantel tests, again using 999 permutations.
12 This data was visualized by creating a non-metric multidimensional scaling (NMDS) plot
13 (Stress=0.090, Shepard plot non-metric $R^2=0.992$) using the same Bray-Curtis dissimilarity
14 matrices (Fig. 2).

15

16 **3 Results**

17 **3.1 Environmental changes**

18 Significant differences in soil temperature ($\chi^2=33.29$, $df=3$, $p<0.001$), active layer thaw depth
19 ($\chi^2=21.35$, $df=3$, $p<0.001$), and organic layer %C ($\chi^2=9.74$, $df=3$, $p=0.021$) were associated with
20 the four different snow zones. Post hoc tests revealed higher temperatures in the DEEP snow
21 zone relative to the CTL ($p=0.009$), the INT ($p=0.001$), and the LOW snow zone ($p<0.001$;
22 Table 1). Active layer depth data revealed similar results, increasing in the DEEP snow
23 accumulation zone and decreasing as snow cover was experimentally reduced. Only in the DEEP
24 zone was the active layer thaw depth significantly ($p=0.020$) deeper than the CTL zone.
25 However, along the snow accumulation gradient, thaw depth significantly increased from LOW
26 to DEEP plots (LOW/INT - $p=0.021$, LOW/DEEP - $p<0.001$; Table 1). Soil moisture was not
27 correlated with snow accumulation, possibly the result of surface hydrology at the site, which
28 was largely saturated throughout the growing season. In the organic soil horizon, the %C content
29 of soil declined with increased snow accumulation (LOW/DEEP - $p=0.03$), while the %N
30 content increased (LOW/DEEP - $p=0.32$), resulting in lower C:N ratios in all of the snow



1 accumulation treatment zones relative to the control (CTL/DEEP - $p=0.14$). Soil pH increased
2 (became more neutral) with increased snow accumulation (LOW/DEEP - $p=0.06$). In the mineral
3 soil layers, C:N ratios decreased further and became more similar between treatments, while soil
4 pH again increased in the DEEP zone but did not show a trend along the treatment gradient
5 (Table 1). Because of these differing trends between organic and mineral soil horizons, all
6 bacterial and gene abundance analyses were evaluated by individual horizon.

7 **3.2 Bacterial community shifts**

8 Some bacterial phyla exhibited shifting trends in response to snow depth, both across treatments
9 and relative to the control, while other community shifts were either not significant or did not
10 appear to be the result of the snow depth treatments. Noticeable trends included increased
11 abundance of Verrucomicrobia ($p=0.068$), Actinobacteria ($p=0.083$), and Chloroflexi ($p=0.010$)
12 in the organic horizon from the LOW to DEEP snow zones, while Acidobacteria showed
13 decreased abundance from the CTL to DEEP plots ($p=0.055$; Fig. 3). In the mineral horizon,
14 significant increases in the phylum Chloroflexi ($p=0.011$) occurred from the CTL to DEEP
15 zones, and significant decreases ($p=0.019$) were observed from CTL to DEEP zones in the
16 phylum Verrucomicrobia (Fig. 3).

17 Bacterial abundance in each phylum correlated with at least one of the soil chemical properties
18 we measured (%C, %N, C:N, or pH). The best overall predictor was %C, correlating with four
19 out of the six phyla. It showed negative relationships with Actinobacteria ($R^2=0.38$, $p=0.010$;
20 Fig. S4) and Chloroflexi ($R^2=0.34$, $p<0.001$; Fig. S6), and positive relationships with
21 Bacteroidetes ($R^2=0.33$, $p<0.001$; Fig. S5) and Proteobacteria ($R^2=0.32$, $p<0.001$; Fig. S2).
22 Actinobacteria was also negatively correlated with %N ($R^2=0.34$, $p<0.001$; Fig. S4), and
23 Chloroflexi, positively with soil pH ($R^2=0.34$, $p<0.001$; Fig. S6). The best and only predictor for
24 Acidobacteria abundance was soil pH, which correlated negatively ($R^2=0.46$, $p<0.001$; Fig. S1).
25 Verrucomicrobia abundance correlated positively with %N ($R^2=0.36$, $p<0.001$; Fig. S3).

26 While analysis of alpha diversity via the Shannon index did not reveal significant differences
27 between treatments, beta diversity of bacterial communities showed significant associations with
28 winter snow depth ($R^2=0.13$, $p = 0.017$), %C (adonis $R^2=0.24$, $p < 0.001$; Mantel r statistic= 0.63 ,
29 $p < 0.001$), %N (adonis $R^2=0.14$, $p < 0.001$; Mantel r statistic= 0.34 , $p < 0.001$), C:N (adonis



1 $R^2=0.19$, $p < 0.001$; Mantel r statistic= 0.42 , $p < 0.001$), and pH (adonis $R^2=0.15$, $p < 0.001$;
2 Mantel r statistic= 0.49 , $p < 0.001$).

3 **3.3 PICRUST functional analysis**

4 Of the functional gene groups examined, the most significant treatment effects occurred in the
5 organic horizon where a decreased abundance of enzymes involved in cellulose ($p=0.018$) and
6 chitin ($p=0.029$) degradation was observed relative to the CTL, and lignin ($p=0.023$), pectin
7 ($p=0.018$), and xylan ($p=0.014$) degradation was observed across treatments from LOW to DEEP
8 (Fig. 4). A similar trend was observed in enzymes responsible for the regulation of oxygen
9 radicals ($p=0.083$). Shifts along the snow accumulation gradient were also observed in nutrient
10 mobilization enzyme gene groups with an increase in N mobilization genes (CTL/DEEP –
11 $p=0.14$) and a decrease in phosphate mobilization genes (CTL/DEEP – $p=0.39$).

12 Trends in the mineral horizon were less clear. Significant shifts included an increase in enzyme
13 groups involved in arabinoside degradation ($p=0.049$) and a decrease in enzymes involved in N
14 mobilization ($p=0.019$) relative to the control (Fig. 4). Lignin-degrading enzymes again showed
15 decreasing abundance along the treatment gradient from LOW to DEEP ($p=0.051$).

16 All soil chemical properties were found to be poor predictors of gene abundance, with the
17 exception of genes associated with lignin degradation. Both %C and C:N showed positive
18 relationships ($R^2=0.32$, $p<0.001$ and $R^2=0.54$, $p<0.001$, respectively; Fig. S10), and soil pH
19 showed a negative relationship ($R^2=0.41$, $p<0.001$; Fig. S10).

20 While the analysis did reveal significant changes in enzyme gene abundance across the snow
21 zones, many of the KEGG ortholog groups of enzymes targeted in this study were either not
22 found in any of the samples or were found in very low quantities, including phenol oxidases,
23 peroxidases, and laccases. These are primarily associated with the degradation of more complex
24 plant compounds, suggesting that microbial communities may be preferentially degrading
25 microbial biomass and simple cellulosic and polysaccharide polymers.

26

27 **4 Discussion**

28 This study documents changes in soil bacterial community structure in the active layer of moist
29 acidic tundra in response to long-term experimental changes in winter precipitation. We



1 examined inherent phylogenetic functional associations to reveal how microbial community
2 response to climate forcing factors might affect SOM degradation and alter the C balance of this
3 Arctic tundra ecosystem. Low temperatures in Arctic ecosystems limit soil C availability and
4 decomposability (Conant et al., 2011; Davidson and Janssens, 2006). However, global warming-
5 induced permafrost thaw may partially alleviate this temperature limitation, potentially releasing
6 large amounts of C into the atmosphere via SOM decomposition and further increasing the rate
7 of global warming (Lupascu et al., 2013, 2014a; Lützow and Kögel-Knabner, 2009; Schuur et
8 al., 2008).

9 After 18 years of experimental winter snow addition, bacterial phylogenetic and functional
10 potential in Arctic moist acidic tundra changed under deeper winter snow accumulation,
11 resulting in potentially reduced SOM decomposition. Possible explanations for this shift may
12 include: 1) altered microbial C substrate preferences towards more labile sources under lowered
13 O₂ availability that would result in decreased SOM enzyme activity, and 2) a reduced amount of
14 enzymatic machinery (and fewer gene copies) necessary to accomplish similar metabolic results,
15 as increased soil temperatures under insulating snow accumulation may alleviate kinetic
16 limitations of enzymatic decomposition reactions (Blanc-Betes et al., 2015; German et al., 2012;
17 Nowinski et al., 2010; Sinsabaugh et al., 2008). The changes in bacterial functional potential
18 described in this study are consistent with reports of little to no net C loss from permafrost
19 ecosystems under increased snow accumulation as a result of altered vegetation cover and
20 increased NPP (Schuur et al., 2009).

21 **4.1 Bacterial community shifts**

22 Our results indicate that altered snow accumulation has a significant effect on soil bacterial
23 community structure in Arctic moist acidic tussock tundra ecosystems. For instance, we observed
24 shifts in the relative abundance in many of the most abundant phyla including Verrucomicrobia,
25 Acidobacteria, and Actinobacteria, particularly in the DEEP snow zone (Fig. 3). Shifts in
26 Verrucomicrobia were primarily driven by increases in the order Chthoniobacterales in the
27 DEEP snow zones relative to the LOW snow zones. This order contains facultative aerobic
28 heterotrophs able to utilize saccharide components of plant biomass, but unable to use amino
29 acids or organic acids other than pyruvate (Sangwan et al. 2004). Shifts in Actinobacteria were
30 dominated by the order Actinomycetales, a gram-positive facultative aerobic bacteria that has



1 been linked to the stimulation of ectomycorrhizal growth and recalcitrant C degradation
2 (Goodfellow and Williams, 1983; Maier et al., 2004; Pridham and Gottlieb, 1948). While not as
3 abundant, the phylum Chloroflexi also responded significantly ($p=0.010$) to snow depth
4 treatments, increasing in abundance from LOW to DEEP snow zones (Fig. 3). Shifts in
5 Chloroflexi were the result of increasing abundance of the class Anaerolineae in the DEEP zone.
6 Anaerolineae include green non-sulfur bacteria able to thrive in anaerobic environments and
7 have previously been found in similar cold saturated soils (Costello and Schmidt 2006).

8 These shifts indicate that even at the coarsest level of phylogeny and a high degree of variance
9 between samples, deeper snow in winter and associated changes in soil conditions may be
10 driving changes in the belowground community resulting in potentially altered substrate
11 preference, and thus genetic functional activity, of the microbial community. This is supported
12 by other studies from Arctic soil and permafrost ecosystems that provide evidence of altered
13 microbial community composition and rapid functional response to temperature manipulations,
14 thawing soils, and fertilization treatments (Deslippe et al., 2012; Koyama et al., 2014;
15 Mackelprang et al., 2011). For example, Actinobacteria abundance was found to increase in
16 response to both increased temperature (Deslippe et al., 2012) and in freshly thawed permafrost
17 soils (Mackelprang et al., 2011), similar to the response we observed in the DEEP zone (Fig. 3).
18 Mackelprang et al. (2011) also reported varying shifts in a wide array of functional genes in
19 response to permafrost thaw. In addition, Koyama et al. (2014) documented a decrease in the
20 Acidobacteria phylum in response to fertilizer soil inputs which they attributed to be a direct
21 result of competition with α -, β -, and γ - Proteobacteria (oligotrophic vs. copiotrophic bacteria,
22 respectively) which increased in abundance with fertilizer treatment. While oligotrophic
23 organisms such as Acidobacteria are adapted to survive in low nutrient environments, they are
24 often outcompeted in more fertile environments by generalist copiotrophs (such as
25 Proteobacteria) who are better equipped to harvest available nutrients. Our results did not show a
26 significant shift or clear pattern for Proteobacteria, but they do show that Acidobacteria
27 abundance shifts associate negatively with Proteobacteria shifts in the DEEP zone where C:N
28 soil values are lowest (most fertile; Table 1 and Fig. 3). By broadly classifying groups of bacteria
29 and identifying common trends, we can apply ecological theory to these complex ecosystems and
30 improve our understanding of soil microbial relationships.



1 Correlations between soil chemical characteristics (%C, %N, C:N, and pH) and bacterial phylum
2 abundance partially support findings reported in Fierer et al. (2007). They identified C
3 mineralization rates (a proxy for C availability) to be the best predictor of bacterial abundance in
4 the dominant phyla, including positive relationships with Bacteroidetes and β -Proteobacteria,
5 and a negative relationship with Acidobacteria (Fierer et al., 2007). Carbon mineralization and
6 availability differ from %C in that regardless of carbon content, physical and chemical factors
7 such as temperature limitations, physical protection of SOM, and high tannin concentrations may
8 limit C mineralization (Davidson and Janssens, 2006; Schimel et al., 1996). However, our study
9 did find weak positive relationships between %C and Proteobacteria ($R^2=0.32$, $p<0.001$; Fig. S2)
10 as well as Bacteroidetes ($R^2=0.33$, $p<0.001$; Fig. S5), similar to Fierer's (2007) study.
11 Interestingly, although N can be a limiting factor for microbial growth, %N only correlated to
12 two phyla, positively with Verrucomicrobia ($R^2=0.36$, $p<0.001$; Fig. S3) and negatively with
13 Actinobacteria ($R^2=0.35$, $p<0.001$; Fig. S4). While identifying individual abiotic factors that may
14 predict bacterial abundance at the phylum level is informative, it is important to recognize that
15 often a variety of interacting factors determine microbial community composition, and effects at
16 the phylum scale may be too coarse for adequate interpretation. Our results suggest that while
17 C:N is a poor indicator of individual bacterial phylum abundance, %C and %N (and in some
18 cases soil pH) alone may be more reliable. More detailed studies that address the relationships
19 between soil chemical/abiotic characteristics and microbial community composition at finer
20 phylogenetic scales are needed to adequately identify dependable predictors.

21 While the alpha diversity of soil bacterial communities via the Shannon index did not differ
22 between snow zones, this does not elucidate community structural or functional differences
23 between samples and fails to distinguish shifts in genetic potential between treatments. Beta
24 diversity analyses more appropriately reveal how soil microbial communities respond to snow
25 accumulation. Non-metric multidimensional scaling (NMDS) plots of Bray-Curtis dissimilarity
26 indices constructed from community matrices (Stress=0.090, Shepard plot non-metric $R^2=0.992$)
27 showed bacterial community structures to be associated with the snow accumulation treatment
28 ($p=0.017$), but even more so with all measured soil chemical properties (%C, %N, C:N, and pH;
29 $p < 0.001$; Fig. 2), indicating that bacterial β -diversity may be more directly related to soil
30 chemistry rather than winter snow accumulation, active layer thaw depth, or soil temperature.
31 These physical factors resulting in subsequently freed permafrost SOM are likely initially



1 contributing to increased SOM decomposition through increased availability and rate of enzyme
2 kinetics, and leading to shifts in aboveground plant communities and increased NPP. However,
3 increasing soil moisture and compaction reduce O₂ diffusion into the soil, inhibiting aerobic
4 SOM decomposition (O'Brien et al., 2010), and altering microbial community composition by
5 selecting for facultative anaerobic microorganisms that utilize simple C substrates, leaving
6 behind complex organic matter compounds and plant polymers. In addition, tannins produced by
7 expanding woody shrubs may act to inhibit microbial activity (Schimel et al., 1996). This in
8 combination with increased N availability may further slow decomposition rates of SOM
9 (Schimel, 2003). This is supported by the lower %C and C:N in the DEEP snow accumulation
10 zone where we observed the most significant shifts in bacterial community composition (Table 1
11 and Fig. 3). The balance between these two competing processes, and the functional shifts
12 associated with them, will ultimately influence the C balance of the system.

13 **4.2 Functional shifts**

14 To examine the influence of shifting bacterial abundances on this C balance and soil community
15 function, we focused on the genetic potential of the bacterial community to produce enzymes
16 required for the degradation of various forms of SOM. The overall absence of bacterial genes
17 encoding for peroxidases, phenol oxidases, and laccases may indicate that the decomposition of
18 more recalcitrant forms of C in Arctic soils is performed by fungi. Fungi typically play a key role
19 in the degradation of recalcitrant organic matter and may dominate that ecological niche in
20 Arctic tundra ecosystems, particularly under warmer soil conditions (Deslippe et al., 2012;
21 Morgado et al., 2015). The absence of these genes could also be due to the presence of tannins in
22 the soil, which are common in the Alaskan floodplain and are produced by encroaching shrub
23 species (DeMarco et al., 2014; Schimel et al., 1996). Tannic compounds have been shown to
24 inhibit microbial activity and decrease decomposition by binding to vital enzymes (Schimel et
25 al., 1996). If production of phenol oxidases and peroxidases yield little to no benefit for bacteria in
26 this ecosystem due to interference from tannins and other phenolic compounds, genes encoding
27 for these enzymes may be reduced.

28 Of the genes for enzymes responsible for SOM decomposition that were found in this study,
29 there were fewer in the organic layer of the DEEP snow zone compared to the CTL and LOW
30 snow zones (Fig. 4). The genes most affected encode enzymes required for the breakdown of



1 various plant compounds, including cellulose, xylan, pectin, and lignin, all major constituents of
2 plant cell walls. Xylans in particular are common in woody plant tissues (Timell, 1967). The
3 observed decrease in these genes suggests microbial preferential use of more easily available
4 substrates, such as microbial biomass or root exudates (Sullivan and Welker, 2005; Sullivan et
5 al., 2007, 2008) whose production may be stimulated by increased soil temperatures and NPP
6 predicted under a climate change scenario and that require less energetic investment in exo-
7 enzyme production (Schimel, 2003). The production of enzymes for the degradation of complex
8 polysaccharides is energetically demanding. Therefore, in an energy and nutrient limited
9 ecosystem such as the Arctic tundra, more labile substrates are likely preferable, which may lead
10 to accumulation of SOM, and thus SOC (Lupascu et al., 2013, 2014a).

11 This is consistent with other long-term snowfence studies from Arctic tundra ecosystems that
12 report zero net C loss (or even C gain) during the growing season (Blanc-Betes et al., submitted;
13 Natali et al., 2012, 2014; Sistla et al., 2013). Blanc-Betes et al. found that increased snow
14 accumulation and soil thermal insulation resulted in an initial loss of soil C in the active layer, as
15 hypothesized, but that this loss of C was recovered after 15-16 years of treatment. While initial
16 soil conditions likely favoured R_h in the organic horizon, and decomposition rates increased in
17 response to increased temperatures resulting in C loss, over time changing soil conditions (e.g.
18 increased moisture, compaction, decreased O_2 availability) may have selected for
19 microorganisms that use alternate energetic pathways, limiting heterotrophic decomposition of
20 complex plant compounds. If at the same time, microbial communities increase the production of
21 genes involved in N mineralization and mobilization, access to this previously limited nutrient
22 would facilitate increased microbial biomass, decreased microbial decomposition rates, higher
23 leaf N, increased photosynthesis, greater NPP, and plant community shifts (Pattison and Welker,
24 2014; Schimel, 2003; Welker et al., 2005). This could partially explain the re-accumulation of C
25 observed in Blanc-Betes et al. study, and is supported by our data showing a decreased
26 abundance of genes involved in SOM decomposition in conjunction with trends suggesting
27 increased abundance of N mobilization genes in the organic horizon of the DEEP snow
28 accumulation plots (Fig. 4).

29 Another explanation that may contribute to the decreased abundance of genes associated with
30 SOM decomposition in the organic layer of the DEEP snow accumulation zone (Fig. 4) requires



1 an understanding of the factors influencing enzyme activity and how gene abundance was used
2 to quantify it. Enzyme activity is partially regulated by the rate of gene expression as well as
3 post-transcriptional regulating factors, which are often responsive to environmental stimuli
4 (Gross et al., 1989). For example, Michaelis-Menton enzyme kinetics are sensitive to
5 temperature (German et al., 2012), and in warmer soils, the maximum rate of enzyme activity
6 (V_{\max}) is increased independent of enzyme or substrate concentrations. This may result in
7 decreased expression or post-transcriptional down regulation of genes required for enzyme
8 production, because fewer enzymatic proteins are needed to reach V_{\max} . In the context of this
9 study, this temperature sensitivity may partially explain the decreased abundance of genes for
10 enzymes responsible for SOM decomposition as these soils are warmed in winter due to the
11 deep, insulative snow pack (Table 1 and Fig. 4). Gene abundance, while not a direct
12 measurement of gene expression or enzyme activity (Wood et al., 2015), provides a measure of
13 genetic potential and may be correlated to enzyme activity and gene expression. Reason suggests
14 that a gene or enzyme that is commonly used or required for survival in a particular environment
15 is likely to be more abundant in a community than a gene or enzyme that is rarely used or
16 unnecessary. This common assumption, while understudied, is supported by a meta-analysis
17 from 2014 showing “a significant but weak positive relationship between gene abundance and
18 the corresponding process” (Rocca et al., 2014), as well a few studies specific to the industrial
19 utilization of microbial processes (Morris et al., 2014; Neufeld et al., 2001). To truly measure
20 enzymatic functional potential or gene expression will require a targeted genomic and
21 transcriptomic approach.

22 **4.3 Ecosystem response to snow accumulation**

23 Whether bacterial communities are responding to changing plant inputs that could contribute to
24 altered SOM quality (decreased C:N; Table 1) or whether they are directly altering SOM
25 chemistry through selective decomposition remains unclear. Most likely it is a combination of
26 the two. It is clear that increased snow accumulation leads to changes in both bacterial
27 community composition and SOM chemistry (Table 1 and Fig. 3). Unlike other ecosystems
28 where plants are the first responders to abiotic climate change factors, in the Arctic microbes are
29 likely the first responders, initially increasing nutrient mineralization under increased
30 temperatures facilitating plant community shifts and increased NPP (Chapin III et al., 1995).
31 Over time, the combination of increased snow accumulation and soil compaction may lead to



1 anaerobic soil conditions and further vegetative shifts to wet-sedge (*Carex*) species, limiting
2 SOM decomposition while maintaining nutrient mineralization. This in combination with a
3 recent history of more recalcitrant plant litter inputs could result in re-accrual of SOC, ultimately
4 mitigating the positive feedback loop hypothesized in current literature (Davidson and Janssens,
5 2006; Natali et al., 2014; Schuur et al., 2009).

6

7 **5 Conclusions**

8 The results presented here support the hypothesis that bacterial community structure and function
9 shift as a result of consistently deepened snowpack and that over time, SOM decomposition
10 becomes an unfavourable mode of energy acquisition. If current climate change predictions of
11 increased precipitation in the Arctic hold true, various and significant changes in soil conditions
12 are imminent, and how soil microbial communities respond to these changes will determine
13 whether the Arctic becomes a C sink or source. It is important that we continue to study these
14 shifts to understand whether soil bacteria are responding to, or driving SOC dynamics, and
15 determine how moist acidic tundra ecosystems will ultimately equilibrate (C loss or gain) over
16 time.

17



1 **Author Contributions**

2 J. M. Welker built and maintained the experimental site. M. P. Ricketts, J. M. Welker, and M. A.
3 Gonzalez-Meler designed the experiment. R. S. Poretsky provided expertise and insight into the
4 bioinformatics and data analyses. M. P. Ricketts performed all sample collections, lab work, and
5 data analyses. M. P. Ricketts prepared the manuscript with contributions from all co-authors.

6

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17



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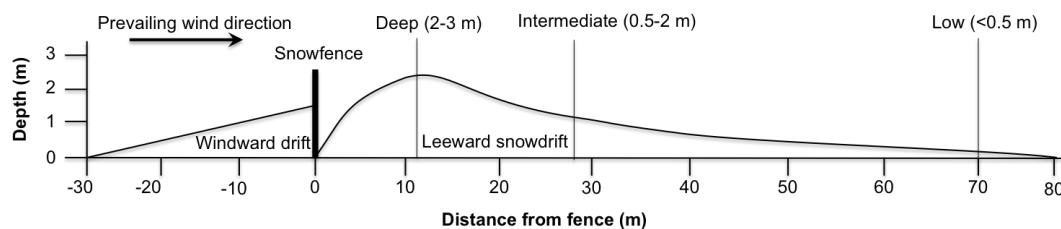
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- 1 Table 1. Abiotic characteristics of soil from snow accumulation treatments. Values are means \pm
 2 standard errors. n=4 for all replicates except temperature / thaw depth (n=12), and Control -
 3 Mineral, Int – Organic & Mineral, and Low - Mineral (n=3). Nemenyi post hoc significance
 4 ($p < 0.05$) indicated by _{a,b,c}.

Treatment	Soil Horizon	%C	%N	C:N	pH	Temp @ 12cm (°C)	Thaw Depth (cm)
Control	Organic	45.21 \pm 1.09 _{ab}	1.01 \pm 0.20	50.04 \pm 9.44	4.59 \pm 0.09	4.32 \pm 0.27 _b	59.17 \pm 1.23 _{bc}
	Mineral	2.57 \pm 0.39 _c	0.15 \pm 0.03	17.67 \pm 1.34	5.15 \pm 0.05		
Low	Organic	46.63 \pm 0.73 _a	1.06 \pm 0.07	44.59 \pm 2.54	4.44 \pm 0.08	2.92 \pm 0.24 _b	50.92 \pm 3.20 _c
	Mineral	4.18 \pm 1.92 _c	0.22 \pm 0.11	19.42 \pm 0.65	5.16 \pm 0.20		
Int	Organic	40.59 \pm 2.43 _{ab}	1.17 \pm 0.25	38.38 \pm 8.85	4.69 \pm 0.41	4.08 \pm 0.25 _b	61.88 \pm 1.19 _{ab}
	Mineral	2.58 \pm 0.49 _c	0.14 \pm 0.02	18.58 \pm 1.45	5.01 \pm 0.04		
Deep	Organic	36.51 \pm 4.27 _b	1.40 \pm 0.07	26.27 \pm 3.41	5.61 \pm 0.21	6.49 \pm 0.20 _a	65.42 \pm 1.49 _a
	Mineral	1.65 \pm 0.19 _c	0.10 \pm 0.01	16.41 \pm 0.56	5.83 \pm 0.17		

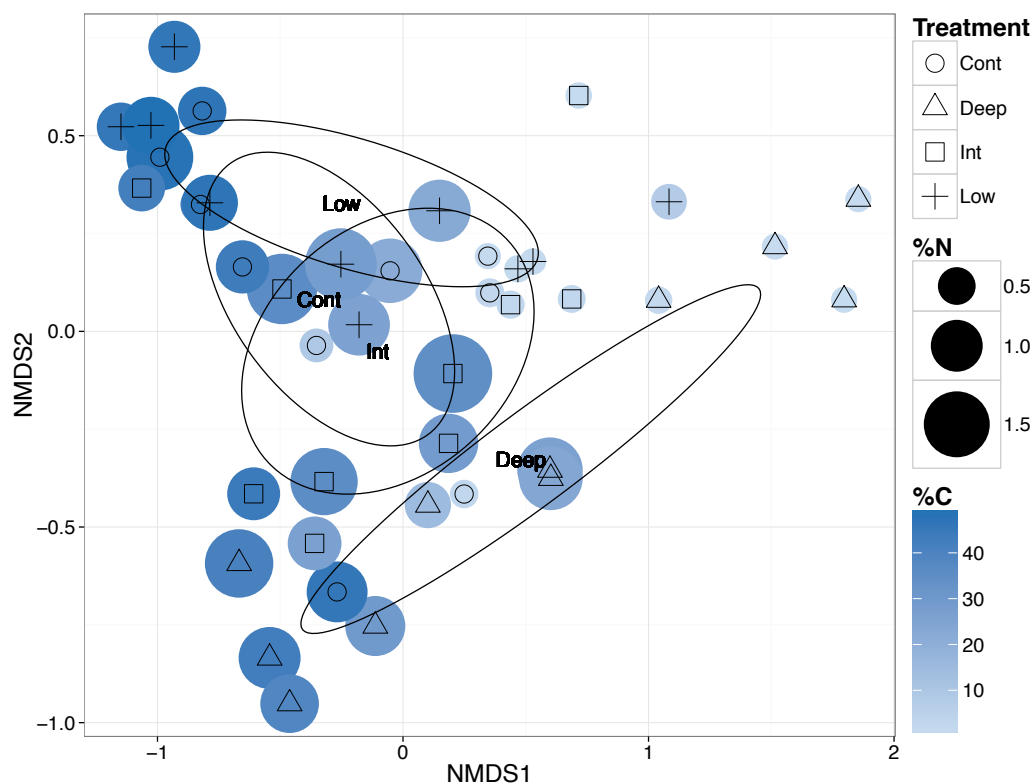
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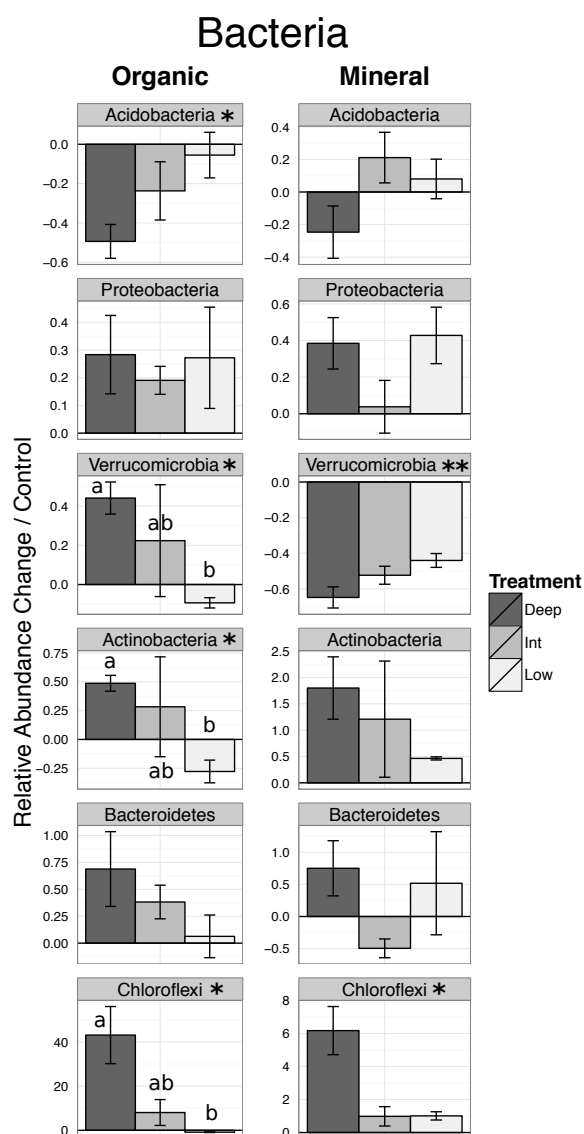
2 Figure 1. Modified from Walker et al., 1999. Schematic of snow accumulation depth at moist
3 acidic tundra site from snow fence manipulation.

4



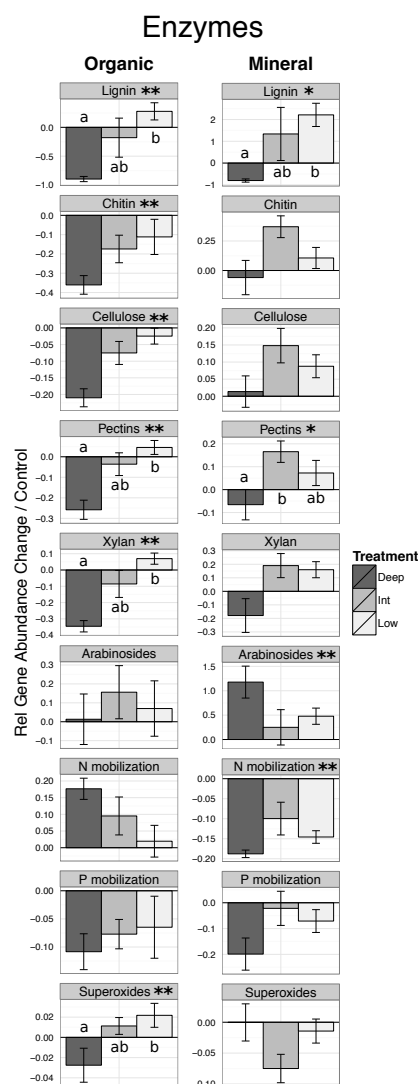
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2 Figure 2. Non-metric multidimensional scaling (NMDS) plot using Bray-Curtis dissimilarity
3 matrices (Stress=0.090, Shepard plot non-metric $R^2=0.992$). Each point represents microbial
4 community structure within a sample. Colours indicate %C ranging from 1.4% (light blue) to
5 48.6% (dark blue), bubble size indicates %N ranging from 0.09% (small) to 1.95% (large), and
6 shapes indicate snow accumulation treatments (CTL, DEEP, INT, LOW). Ellipse centroids
7 represent treatment group means while the shape is defined by the covariance within each group.



1

2 Figure 3. Averaged relative abundance of the six most abundant bacterial phylum separated by
 3 treatment and in order of abundance (top to bottom). Error bars represent standard error
 4 (standard error of controls ranged from 12.929 in Chloroflexi to 0.026 in Verrucomicrobia).
 5 Significance determined by Kruskal-Wallis tests is indicated by asterisks (* = $p < 0.1$, ** =
 6 $p < 0.05$), while post-hoc Nemenyi test results are indicated by “a, b, ab”, except where significant
 7 differences were to the control.



1

2 Figure 4. Averaged relative abundance of genes for enzyme functional groups relative to the
 3 control and separated by snow accumulation treatment. Functional groups involved in soil
 4 organic matter decomposition are ordered from recalcitrant to labile substrates (top to bottom).
 5 Error bars represent standard error (standard error of controls ranged from 1.220 in the lignin
 6 group to 0.008 in the superoxides group). Significance determined by Kruskal-Wallis tests is
 7 indicated by asterisks (* = $p < 0.1$, ** = $p < 0.05$), while post-hoc Nemenyi test results are indicated
 8 by “a, b, ab”, except where significant differences were to the control.