



Bacterial community composition changes independently of soil edaphic parameters with permafrost disturbance

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Abstract. Microbial degradation of frozen organic carbon increases with permafrost thaw, resulting in greater fluxes of the greenhouse gases CO₂ and CH₄. To examine the effect of disturbance-induced permafrost thaw on microbial communities, we assessed the microbial diversity of soils near a gold mine where thaw was induced by stripping the vegetation and topsoil at Dominion Creek, Yukon, Canada. Bacterial metabarcoding and soil physicochemical parameters were assessed across this disturbance including surface samples and three cores which included active layer and permafrost horizons. Bacterial communities changed in the absence of physicochemical parameter shifts after only 6 weeks of thaw, with a high proportion of active layer indicator species becoming more abundant with permafrost thaw. Three distinct communities emerged: (1) undisturbed active layer, (2) lower active layer, disturbed active layer, and disturbed permafrost samples, and (3) intact permafrost. Community composition shifts correlated with pH, Zn and community cohesion. These results suggest that active layer communities rapidly colonize thawed permafrost, combining with and replacing many resident permafrost taxa. Disturbances may induce a strong microbial community change in permafrost-affected soils before soil physicochemical parameter shifts.

1 Introduction

There is roughly 1,700 Gt of carbon in northern circumpolar soils, more than twice as much as currently in the atmosphere (Schuur et al., 2015; van Huissteden & Dolman, 2012). Although increased vegetation and greening of the Arctic may offset carbon output from permafrost thaw, the increased rate of forest fires (Chen et al., 2021) and thermokarst formation as a result of abrupt permafrost thaw (Turetsky et al., 2020) may already have shifted the Arctic from a net carbon sink to a net carbon source as carbon mineralization outpaces fixation (Schuur et al., 2020). Models suggest that thawed permafrost sediments will



release 41 PgC per 1°C of warming as greenhouse gases by the year 2100, representing one of the most significant biospheric sources of atmospheric carbon (IPCC, 2022). Newer models suggest that of this predicted 208 PgC per year, approximately 80 PgC will be
35 sourced from abrupt thaw areas which cover only 5% of global permafrost-affected areas (Turetsky et al., 2020). However, there is significant uncertainty in the timing and mechanisms of these models. A significant source of uncertainty is how the microbial communities will respond to permafrost thaw.

Permafrost thaw acts as a disturbance to the environment, changing the ice and water
40 content, leading to subsidence or mass wasting of overlying layers, and releasing preserved organic material (Kokelj & Jorgenson, 2013). Such disturbances can be the result of the rapidly rising temperatures in the Northern polar regions (i.e., polar amplification of climate warming) or industrial activity such as mining or road construction (Richter-Menge, et al., 2016). The extent and severity of these disturbances can vary from relatively small scale and
45 minor (e.g. subsidence and ponding due to road building) to large scale and extreme (e.g. active layer detachment and mass wasting due to the formation of retrogressive thaw slumps) (Kokelj & Jorgenson, 2013). These disturbances strongly affect bacterial communities in the permafrost, leading to shifts in both the structure and function of bacterial communities residing in permafrost (Wu et al., 2018). However, our knowledge of such shifts is mostly
50 limited to laboratory-based experiments, where there are no other sources of bacteria than the permafrost itself.

Bacterial community activity regulates the rate of carbon mineralization from permafrost, and so the characterization of these communities is paramount to modelling carbon flux from thawing permafrost soils (Monteux et al., 2018; McCalley et al., 2014).
55 Although permafrost microbial communities are not as diverse as in the seasonally thawing



active layer, permafrost microbial diversity is substantial (Hultman et al., 2015). Within the last decade, an abundance of information has been collected regarding the microbial response to *in situ* permafrost thaw (Taş et al., 2014; Taş et al., 2018; Singleton et al., 2018; Woodcroft et al., 2018; Emerson et al., 2018; Hultman et al., 2015). Recent field experiments have
 60 shown contradicting results; either that (1) thaw shifts the permafrost microbial community to become similar to the overlying active layer (Taş et al., 2014; Monteux et al., 2018), or that (2) subsidence creates an altogether new microbial community not previously seen (Mondav et al., 2014; Woodcroft et al., 2018).

Increased microbial activity in thawing permafrost has been observed through
 65 increases in respiration, methanogenesis, and denitrification (Hultman et al., 2015; Palmer et al., 2012). While specific taxa become more transcriptionally active with permafrost thaw, only a fraction of the total community participates in biogeochemical cycling (Coolen & Orsi, 2015). Despite low levels of activity under frozen conditions, the fraction of viable microorganisms in permafrost is highly variable: 18-63% (La Ferla et al., 2017; Hansen et al.,
 70 2007; Mackelprang et al., 2017); much lower than the 91.3% viability ratio found in temperate soils (Janssen et al., 2002). It is unknown whether increased microbial activity with thaw is driven by an increase in microbial viability or greater activity of a small fraction of live microbes.

Dramatic changes are induced by permafrost disturbances, with long-lasting impacts
 75 on plant community composition, plant physiognomy, and soil chemistry in both modern and historic sites (Forbes et al., 2001). Soil horizon removal is the most severe of these disturbances, requiring 20-75 years to recover plant community function (Forbes et al., 2001). As industrial activity becomes more commonplace in the subarctic, anthropogenic disturbances may disrupt plant communities and shift the source of this fluxed carbon to old,



80 frozen, and recalcitrant deposits. Both natural and artificial disturbances can induce lake
formation. Artificial disturbances – namely infrastructure development – are the most
common causes of thermokarst lake formation in the Qinghai-Tibetan Plateau (Lin et al.,
2016). The construction of oil wells, pipelines, gold mines, and other mineral extractions are
also becoming more common in the Arctic (Elias, 2014). These industrial developments are
85 conducive to the formation of thermokarst ponds across the Circumpolar North. It is unknown
how the microbial community of active layer and permafrost will change in response to these
direct industrial disturbances or if industrial disturbances differ from natural disturbances.

In this study, we assess the soil microbial community structure shifts and drivers at a
disturbed site where soils and vegetation were stripped in preparation for mining at Dominion
90 Creek, Yukon, Canada. The study site was disturbed by the installation of a drainage ditch a
few weeks prior to our arrival at the site by a large excavator (Figure 1). As microbial
diversity has been closely linked to edaphic parameters, we hypothesized that microbial
community shifts in disturbed permafrost are dependent on edaphic parameter changes. In
addition, we hypothesized that thaw would induce the proliferation of viable microbial cells,
95 increasing microbial viability ratios with disturbance, due to the exposure to atmospheric
temperatures for six weeks. This information is crucial to building upon how permafrost
communities restructure upon thaw.

3 Methods and Materials

3.1 Field Site and Sampling Procedure

100 Surface samples and soil cores were collected in May 2016 at a gold mining site near
Dominion Creek, Yukon Territory, Canada (NTS:116-B/3; DMS:
60°42'59.5"N, 138°33'0.14"W). Cores were taken with a light portable gas-powered
permafrost drill (EDR-260, ECHO Inc., Lake Zurich, IL, USA), (Saidi-Mehrabad et al.,



2020). Cores were collected using a system devised in Calmels et al. (2005) which takes individual ~40 cm cores which are then broken off from the surrounding permafrost and recovered. The study site was disturbed in preparation for placer gold mining a few weeks prior to our arrival at the site by a large excavator. The primary disturbance was the development of a drainage ditch (Figure 1c) which removed the upper active layer at Core Site 2, and all of the active layer at Core Site 3 (Figure 1b).

Quadruplicate surface samples (unfrozen soils) were taken at 6 locations including undisturbed permafrost-affected soils (site A; 474 cm from the thermokarst pond); disturbed active layer soils (sites B-D; 363 cm, 288 cm, and 213 cm from the thermokarst pond, respectively); and putatively disturbed permafrost sediments (sites E-F; 109 cm and 0 cm from the thermokarst pond, respectively). Organic layers and surface vegetation were removed with a spade before sampling. Samples were collected with a separate spade at approximately 5 cm depth and stored in sterile Whirlpak® bags and homogenized by mixing both in the field and in the lab prior to chemical and biological analyses.

Soil cores, which were 1-3 metres in depth, were collected at three sites along the same thaw gradient (from Core 1 – Core 3). Core 1 was sampled in a nearby clearing analogous to the conditions at sample A (the “undisturbed” site). Core 2 was sampled 2.6 m from the thermokarst pond between surface sample sites C and D. The Core 2 site had all vegetation, the organic soil horizon, and the surface soil horizon of active layer removed; however, active layer soils were still present in Core 2. Core 3 was sampled directly adjacent to the thermokarst pond, with all soil layers above the permafrost table removed. All thawed soil above 15 cm was removed prior to coring. Each core subsection had a 10 cm diameter and ranged in length from 14 – 36 cm long, the total core depth and reached at least 1 m for every core. Loose material on the surface of soil cores was removed by scraping with razor



blades and discarded. Frozen soil cores were placed in clear polypropylene bags (Uline, Pleasant Prairie, WI, USA), transferred to coolers with ice packs in the field, transported
130 frozen to the laboratory, and stored at -20°C until further analysis. Permafrost cores were collected frozen while surface samples were thawed at the time of collection. All samples were transported back to a freezer in Dawson City, frozen to ca. -20 ° C and transported frozen to the University of Alberta Permafrost Archives Laboratory.

3.2 Soil Chemistry Subsampling and Analysis

135 Physicochemical analysis was performed as in Saidi-Mehrabad et al., (2020). Surface soils were subsampled as follows: 0.5 g for loss on ignition (LOI), 0.5 g for gravimetric water content; 0.5 g for pH; 5 g for nitrate analysis; 0.5 g for dissolved metal and TN/TC (Total Nitrogen/Total Carbon) analyses. Cores were longitudinally sectioned into ~1/3 (3 cm width) and ~2/3 (7 cm width) sections for chemical and biological analyses, respectively. An
140 additional two longitudinal subsections were taken from the 1/3 portions (chemical analysis section) of the cores. Subsections were scraped with a razor blade to remove all thawing and contaminating materials. Section 1 was cut into 1 cm³ cubes and used for pH, SOM, and gravimetric water content throughout the entire profile of each core. Soil water content was determined by oven drying the samples at 105°C for 24 hours. Soil pH was determined using
145 a soil to 0.01 M CaCl₂ ratio of 1:2 with an AB15 pH meter (Fisher Scientific, Waltham, MA, USA). SOM was measured using loss on ignition (LOI) procedures (Lim & Jackson 1982), using a Lindberg SB Muffle Furnace (Thermo Fisher Scientific Inc., USA). Section 2 subsamples were homogenized, and 0.5 g of material was taken for TN, TC and dissolved metals while the remainder was used for NO₃ and NH₄ measurements at the Natural
150 Resources Analytical Laboratory (NRAL, Edmonton, AB, Canada). TN and TC were analyzed using standard dry combustion methods with a Costech Model EA 4010 Elemental



Analyzer (Costech International Strumatzione, Florence, Italy, 2003) (Sparks et al., 1996).

NO₃ and NH₄ were extracted using a 2M KCl extraction and measured using a Diazo

Coupling method with a SmartChem Discrete Wet Chemistry Analyzer, Model 47 200

155 (Westco Scientific, Brookfield, CT, USA) (Maynard et al., 1993). Trace metal analysis was

conducted after an HNO₃/HCl acid digest using Inductively Coupled Plasma-Optical

Emission Spectroscopy (ICP-OES) which measured P, K, S, Mg, Ca, Fe, Cu, Mn, Zn, Na

using standard protocols on a Thermo iCAP6300 Duo ICP-OES (ThermoFisher, Cambridge,

United Kingdom) (Skoog et al., 2007).

160 **3.3 Biological Subsampling and Contamination Detection**

The 2/3 portions of the cores (“biological sections”) were cut into discrete 5 cm long sections and subsamples were taken at 15 cm, 30 cm, 45 cm, 75 cm, and 95 cm below the soil surface: Core 1 was subsampled at all horizons; Core 2 was subsampled at 30 cm, 45 cm, 75 cm, and 95 cm; Core 3 was subsampled at 75 cm, and 95 cm. Contamination detection was

165 performed as in (Saidi-Mehrabad et al., 2020). To detect contamination, each subsample was painted with 10 mL of 1 × PBS solution containing *E. coli*:DH10B transformed with pBAD

mNeonGreen at 8.3×10^9 cells/mL; for a total of 8.3×10^{10} cells/core in a 4°C walk-in

refrigeration unit. All solutions (including 10% bleach and water) were kept at 4°C to

maintain the integrity of the core. Any thawed soil was removed using an autoclaved and

170 sterile razor blade. The remaining soil was reserved for DNA extraction. Following

decontamination, the presence of PCR-amplifiable pBAD vector DNA would be interpreted

as potential contamination. DNA extraction subsamples were prepared in a class 10,000 clean lab at the University of Alberta which has not been used previously for DNA amplification.

To decontaminate cores, samples were: 1) immersed in 100% bleach solution, 2) washed with

175 DNA-free water, and 3) scraped approximately 4-7 g of material using a razor blade; this



cycle was repeated twice. Subsamples were then homogenized within a sterile Whirlpak® bag. The resulting decontaminated soils were then stored at -20°C until DNA extraction. Genomic DNA was extracted from 0.5 g samples using the MOBio PowerSoil kit according to the manufacturer's instructions. Replicate extractions were pooled before contamination checks and sequencing.

Conditions for pBAD PCRs are outlined in Saidi-Mehrabad et al., (2020). In brief, PCR amplification with primers pBAD-forward (5'-ATGCCATAGCATTTTATCC3') and pBAD-reverse was used to detect potential contamination (5'-GATTTAATCTGTATCAGG-3'). PCR reagents included 1×PCR Buffer, (Invitrogen, Canada), 0.5 µM each primer, 200 µM dNTPs (Invitrogen/ThermoFisher, Canada), 1.5 mM MgCl₂ (Invitrogen/ThermoFisher, Canada), 1.25 U Platinum Taq DNA polymerase (Invitrogen/ThermoFisher, Canada), and 36.25 µl of H₂O, with 1 µl of template DNA. The thermal cycler protocol included a denaturing step at 95°C for 1 min, 30 amplification cycles of 30 sec at 95°C, 45 sec at the annealing temperature of 55°C, and 45 sec at 72°C, and a final extension for 10 minutes at 72°C in an S1000 Thermal Cycler (Bio-Rad Laboratories, Inc., California, USA). PCR products were absent in all DNA extractions, indicating no contamination. Blank extractions were performed on each of the three DNA extraction kits. To check for DNA contaminants, PCRs of blank exactions were performed using the primers 341F and 518R (Muyzer et al., 1993). No bands were observed following gel electrophoresis of blank extract PCR amplification.

3.4 16S rRNA Gene Amplicon Sequencing and Analysis

The microbial communities of soil samples were surveyed by small-subunit rRNA gene amplicon sequencing. DNA from the V4 region of the 16S rRNA gene was amplified with the primers 515F and 806R primers (Caporaso et al., 2012). Sequencing was performed



200 commercially by Microbiome Insights (Microbiome Insights, Vancouver, BC, Canada), with
 an Illumina MiSeq using V2 chemistry (Illumina, San Diego, California, United States).
 Before sequence processing, a total of 552,252 reads were recovered from 23 samples
 including surface samples, core samples, blank extractions, negatives. The read count ranged
 from 10,525 to 47,389 reads per sample, and most samples had high coverage (Figure S3).

205 Sequence processing was performed in USEARCH v10 (Edgar, 2010). Overlapping reads
 were combined from forward and reverse reads with the following qualifiers: no unknown
 base pairs allowed (Ns), a maximum number of sequence mismatches of 10 nt in the
 alignment, a minimum merge length of 230 bp, a maximum merge length of 300 bp, and an
 ID cut-off of 80%. Of the 552,252 reads recovered, 515,916 reads were aligned into

210 overlapping reads (93.4% of the total), at an average length of 253 bp, with an expected size
 of 291 bp. Quality filtering with a maximum expected error cut-off of 1.0 resulted in 510,757
 (99.0% of the total) reads passing (Edgar & Flyvbjerg, 2015). Dereplication identified
 148,294 unique sequences and 105,589 singletons (71.2% of the unique reads) for the total
 dataset. OTU clustering at 97% using UPARSE identified a total of 5,964 OTUs as well as

215 identifying and removing 12,508 chimeras while removing all singletons and doubletons
 (Edgar, 2013). After sequence processing 386,419 reads remained. Taxonomy was assigned
 using *de novo* picking as implemented in SINTAX using the RDP v16 database at a bootstrap
 cut-off of 80 (Ribosomal Database Project) (Edgar, 2016). Sequences were separated for
 bacterial (377,578 reads) and archaeal (8,841 reads) analysis. Taxa identified as

220 chloroplast/streptophyta using SINTAX were removed from the downstream analysis and no
 mitochondrial reads were observed, leaving 361,034 reads in the bacterial dataset (Edgar,
 2016). Reads identified in extraction blank samples were removed from analysis. A



NEWICK formatted 16S rRNA phylogenetic tree was constructed using USEARCH v10. For bacterial analysis, samples were rarefied to 10,000 reads.

225 3.5 Microbiological Diversity, Taxonomy and Assembly

α -diversity metrics, including species richness, Chao 1 richness estimation, Shannon Diversity, Shannon Evenness, Simpson Diversity, Simpson Evenness, and Heip's Evenness were calculated using Mothur v 1.39.5 (Schloss et al., 2009). A Kruskal-Wallis test followed by posthoc testing with Kruskal-Wallis multiple comparisons as implemented in SigmaPlot v13.0 tested for significant differences between samples. β -diversity was calculated USEARCH v10 using Bray-Curtis, Jaccard presence/absence, and weighted UniFrac distance metrics. Visualization of community dissimilarities and significance testing were carried out using R v3.4.1, in the RStudio IDE with the *vegan* package v2.4-4 (Philip, 2003). Hierarchical clustering was visualized with the dendextend package v1.5.2 (Galili, 2015).

235 Visualization of microbial clusters their correlation with soil physicochemical parameters was performed using a non-metric multidimensional scaling (NMDS) plot. Statistical differences in community composition between clusters were assessed using permutational multivariate analysis of variance in the *vegan* package v2.4-4. Environmental parameters were fitted to the NMDS based on a significant Spearman correlation ($p < 0.05$) plotted using a total of 999
 240 permutations. The direction of vector indicates the direction of change while the length is proportional to the correlation between the communities and variable. Differences in soil chemistry were visualized in a redundancy analysis (RDA). Values used a Z-score standardization technique ("standardize") to create a standard normal distribution of 0 with a mean standard deviation of 1. A backward selection of the model using ordiR2step in *vegan*
 245 was used to determine the most appropriate variables for the RDA. Differences between permafrost – and permafrost layers – as well as active layer – and active layer – were



determined using a PERMANOVA test in R. Phylum, class, and genus level tables were constructed using SINTAX (Edgar, 2016). A stacked bar chart of relative abundance for class-level taxonomic classification was constructed in MS Excel. Assessment and visualization of significant ($p < 0.05$) differential abundances were assessed using analysis of the composition of microbiomes (ANCOM) (Mandal et al., 2015). Significance testing was followed by post-hoc analysis using a false discovery rate to correct for multiple comparisons. Only significantly different groups were visualized. Indicator OTUs for either permafrost cores or active layer cores were determined using the *indicspecies* package in R (De Caceres et al., 2016) using an $\alpha < 0.05$ and a minimum IndVal of 0.8. The presence of either permafrost indicator OTUs or active layer OTUs was then determined in surface soils using Mothur v 1.39.5 using the shared richness function.

3.6 Cell Enumeration

Permafrost, active layer, and surface soils (0.5 g) were diluted 1:100 (w/v) in 10 mM tetrasodium pyrophosphate (Fisher Scientific, Hampton, NH, USA). The resulting soil slurry was hand shaken for 15 minutes with 5 ml of 2 mm glass beads then sonicated at 42kHz for 2 × 40 s in an ultrasonic bath (Elma, Singen, Germany), and allowed to settle for 5 minutes. Slurry taken from the middle of the sample bottle was further diluted to a final 1:100 (or 1:500 for surface sample A) in 10 mM tetrasodium pyrophosphate (v/v) before pre-filtration through a 5 µm pore size polysulfone filter (Burlington, Massachusetts, United States) to remove larger particles. The resulting filtrate was then passed through a black polycarbonate 0.22 µm filter (Burlington, Massachusetts, United States). Bacterial cell counts were determined by epifluorescence microscopy using the LIVE/DEAD® BacLight™ staining solution with 6 µM Syto 9 and 30 µM propidium iodide (Carlsbad, California, United States) (Boulos et al., 1999). Filters were stained in a 1:1 mixture (300 µL stain solution: 300 µL



0.85% NaCl) for 1 h in the dark at 4°C. Fifteen random fields of view were counted on a Leica DMRXA fluorescent microscope. The resulting live and dead cell counts were averaged for each sample, and corrected for by dry weight, with the sum of both live and dead representing the total cell counts.

275 Surface samples were sampled in triplicate ($n = 3$; A-F). Permafrost samples were grouped across Core 1, Core 2, and Core 3, including depths 75 – 80 cm and 95 – 100 cm as well as 45 – 50 cm in Core 1 ($n = 7$). active layer samples were grouped together across Core 1 (15 – 20 cm, 30 – 35 cm) and Core 2 (30 – 35 cm, 45 – 50 cm) ($n = 4$).

4 Results

280 To assess the impacts of disturbance and thaw on permafrost-affected soils, we sampled at a disturbed site along a gradient from undisturbed to a thawed thermokarst pond (see methods for more details; Figure 1). Triplicate surface samples were collected at 6 sites (A-F) across the disturbance gradient, denoted as surface samples. In addition to these surface samples, ~1 m long cores were collected at three sites; Core 1 was collected in the
 285 undisturbed region near-surface sample A and had a thaw depth of 45 cm at the time of sampling, Core 2 was collected between surface samples C and D and had a thaw depth of 34 cm, and Core 3 was collected between surface samples E and F and was fully thawed (Figure 1). In this study we consider the following as active layer samples: Core 1 - 30 cm, Core 2 - 30 cm, and Core 2 - 45 cm. We consider the deeper samples as representing permafrost
 290 samples due to the presence of a water table at 45cm as shown in Figure S1: Core 1 - 45 cm, Core 1 75 cm, Core 1 95 cm, Core 2 75 cm, Core 2 95 cm, Core 3 75 cm, and Core 3 95 cm. Principle component analysis supported this classification of permafrost layers (Figure 1). Surface sample A was denoted as an undisturbed active layer soil, surface samples B-E were



denoted as disturbed active layer soil, and sample F was denoted as a disturbed permafrost
295 soil (Figure 1).

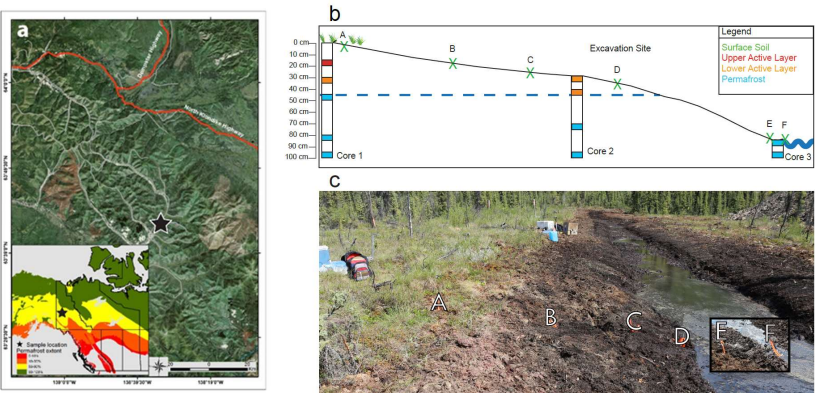


Figure 1: Dominion Creek core and surface sample locations. (a) Map of Dominion Creek
area and sampling site within Yukon Territory (Source: USGS & The Government of
Canada). The map of the Dominion Creek region was assembled in ArcGIS 10.6.1. (b) Cross-
300 section of disturbance gradient soils and permafrost cores. The horizontal line represents the
surface soil profile as it had been disturbed from road construction preparation. The
undulating line refers to the forming thermokarst pond. A scale depicts the depth of each
permafrost sampling layer. The dashed blue line refers to the permafrost table. (c) The
disturbance gradient soils including A (least disturbed), B-D (disturbed active layer), and E-F
305 (disturbed permafrost). Disturbed permafrost samples are inset and were found 3 metres away
at a shallower location of the thermokarst pond.

4.1 Edaphic Parameter Analysis of Dominion Creek Soils

Edaphic parameters separated active layer soils from permafrost soils in soil cores
310 (Figure 2 and Supplementary Tables 1 and 2; $p = 0.035$). Disturbed soils did not form a



separate grouping to the exclusion of permafrost and active layer core samples ($p = 0.084$).
 Of the surface soils, A-E grouped with active layer soils, while F grouped with permafrost
 soils (Figure 2; $p = 0.022$), indicating that while A-E likely originated from active layer soils,
 F likely originated as a permafrost soil. Surface soil samples of C and D were distinct from
 315 other soil samples (Figure 2); C and D had higher Mn, P, SOM, and water content than other
 samples (Table S1 & S2). Taken together, these data indicate that the edaphic parameters
 measured did not shift as a result of permafrost thaw or disturbance.

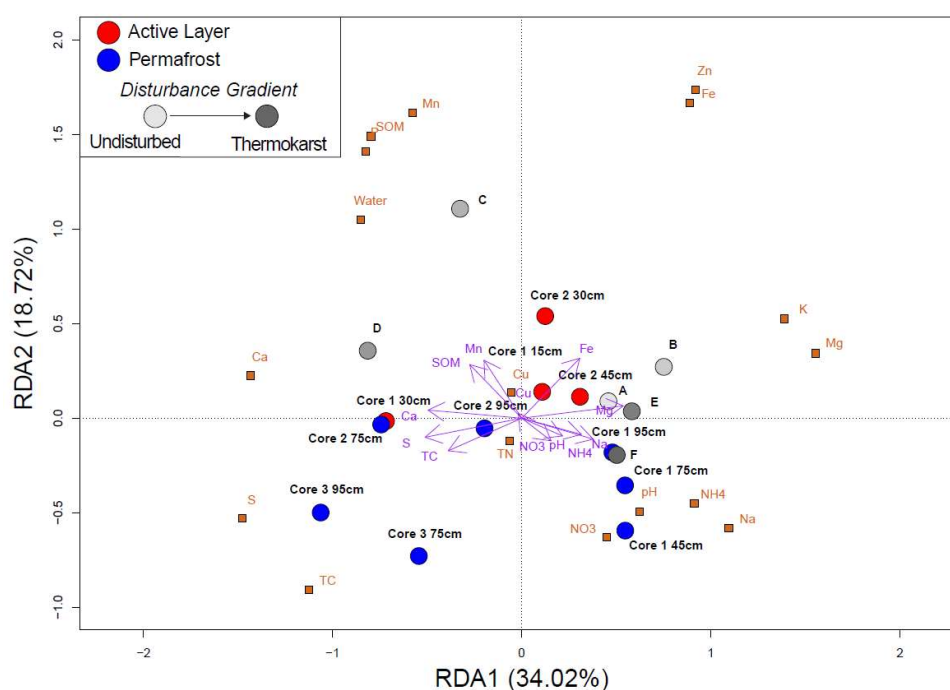


Figure 2: Thawed permafrost surface soils were similar to intact permafrost samples, while
 320 thawed active layer surface soils were similar to intact active layer samples. Redundancy
 analysis of permafrost, active layer, and disturbance gradient soils based on soil
 physicochemical parameters ($R^2 = 0.9890434$). Soil chemical parameters are represented by



arrows, and sites are distinguished by coloured circles. Darker circles represent greater disturbance across the disturbance gradient soils.

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4.2 Viability is negatively impacted by disturbance

To assess the impact of disturbance on active layer and permafrost microbial cell abundance and viability, counts of live and dead cells were determined across surface samples and core samples. The proportion of viable cells (Table 1) ranged from 18-86%.

330 Microbial cell counts ranged from 9.10×10^7 (in Core 1 95 cm) to 9.20×10^8 (in surface sample A) cells gdw^{-1} . Total microbial abundance in active layer cores was greater than in permafrost cores, with microbial abundance averages of $1.26 \times 10^8 \pm 6.30 \times 10^7$ cells gdw^{-1} in active layer cores and $2.30 \times 10^7 \pm 2.79 \times 10^7$ cells gdw^{-1} in permafrost cores (Table 1). The viability ratios of permafrost soils were not significantly different from active layer
 335 soils ($p = 0.07$). Surface soil cell abundance declined significantly in surface samples E and F ($\sim 1.8 \times 10^8$ cells gdw^{-1}) in comparison to other surface soils ($\sim 5.2 \times 10^8$ cells gdw^{-1}) (Table 1). Viability ratios did not change significantly with the degree of disturbance, although viability ratios in disturbed permafrost and active layer soils (B – F) were significantly lower than undisturbed active layer (A) (Table 1).

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Table 1: Live-dead cell counts of viable and non-viable microbial cells across the disturbance (A-F) gradient, as compared to undisturbed permafrost and active layer core samples. Counts are grouped (like letters are the same group) based on a one-way ANOVA ($P < 0.05$) with a post-hoc Tukey HSD calculator. Error indicates standard deviation as
 345 calculated through propagation of error across each field of view as well as biological replicates.



	Viable (cells gdw ⁻¹)	Non-Viable (cells gdw ⁻¹)	Total (cells gdw ⁻¹)	Ratio (%)
A	6.28 × 10 ⁸ ± 1.27 × 10 ⁸ (a)	2.92 × 10 ⁸ ± 1.46 × 10 ⁸ (ab)	9.20 × 10 ⁸ ± 1.31 × 10 ⁸ (a)	26.79 ± 10.14 (a)
B	1.15 × 10 ⁸ ± 4.86 × 10 ⁷ (bc)	1.68 × 10 ⁸ ± 1.41 × 10 ⁸ (bc)	2.83 × 10 ⁸ ± 1.87 × 10 ⁸ (bcd)	18.13 ± 3.87 (ab)
C	8.65 × 10 ⁷ ± 2.46 × 10 ⁷ (bc)	2.78 × 10 ⁸ ± 7.37 × 10 ⁷ (ab)	3.64 × 10 ⁸ ± 8.48 × 10 ⁷ (bc)	21.29 ± 13.59 (b)
D	1.29 × 10 ⁸ ± 4.53 × 10 ⁷ (bc)	3.95 × 10 ⁸ ± 9.24 × 10 ⁷ (a)	5.24 × 10 ⁸ ± 1.88 × 10 ⁷ (b)	26.93 ± 4.98 (b)
E	8.57 × 10 ⁷ ± 8.09 × 10 ⁷ (bc)	1.18 × 10 ⁸ ± 5.1 × 10 ⁷ (bc)	2.03 × 10 ⁸ ± 1.15 × 10 ⁷ (cd)	49.08 ± 11.86 (b)
F	4.20 × 10 ⁷ ± 6.76 × 10 ⁶ (bc)	1.16 × 10 ⁸ ± 4.25 × 10 ⁷ (bc)	1.58 × 10 ⁸ ± 4.84 × 10 ⁷ (cd)	36.74 ± 7.76 (b)
Permafrost	2.30 × 10 ⁷ ± 2.79 × 10 ⁷ (b)	6.77 × 10 ⁷ ± 2.86 × 10 ⁷ (c)	9.07 × 10 ⁷ ± 4.11 × 10 ⁷ (d)	25.43 ± 14.41 (b)
Active Layer	1.26 × 10 ⁸ ± 6.3 × 10 ⁷ (c)	1.84 × 10 ⁸ ± 7.27 × 10 ⁷ (bc)	3.10 × 10 ⁸ ± 1.14 × 10 ⁷ (bc)	39.92 ± 9.21 (b)

4.3 Diversity of disturbed soil resembles active layer soils

Observed OTU richness across all samples ranged from a low of 387 OTUs in the deepest Core 1 permafrost sample to a high of 1738 OTUs in surface sample F, the disturbed permafrost soil (Table S3). Higher Shannon diversity, Shannon evenness, and OTU richness in active layer indicate that active layer communities harboured a more diverse microbial community at the OTU level than in permafrost (Figure 3 and Table S3). Lower evenness suggests the permafrost microbial communities were dominated by a small number of abundant OTUs.

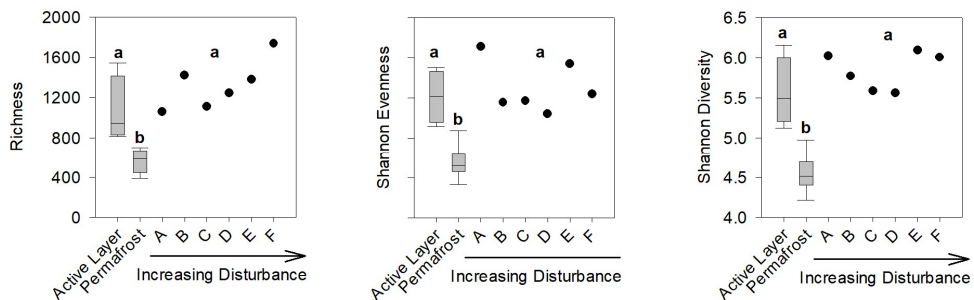




Figure 3: Microbial diversity in permafrost responds to abrupt thaw. Box and whisker plots

of diversity metrics across active layer, permafrost, and disturbance gradient soils.

Disturbance gradient soils were combined for statistical testing. Letters signify statistically different groupings ($p < 0.05$) as assessed using one-way ANOVA with a post-hoc Tukey

test. Surface samples were sampled in triplicate ($n = 3$; A-F). Permafrost samples were

grouped across Core 1, Core 2, and Core 3, including depths 75 – 80 cm and 95 – 100 cm as

well as 45 – 50 cm in Core 1 ($n = 7$). active layer samples were grouped together across Core 1 (15 – 20 cm, 30 – 35 cm) and Core 2 (30 – 35 cm, 45 – 50 cm) ($n = 4$).

Surface soils were not significantly different from active layer soils in any α -diversity metric; both had higher richness, diversity, and evenness than permafrost soils (Figure 3 and

Table S3). Microbial diversity of disturbance gradient soils most closely resembled undisturbed active layer soils and differed from permafrost.

4.4 Microbial community composition shifts with disturbance

There were three distinct bacterial community clusters in the studied soils: Cluster 1 included upper active layer and undisturbed soils (surface sample A); Cluster 2 included

lower active layer and the disturbed soils (surface samples B-F); and Cluster 3 included only permafrost ($p < 0.05$) (Figure 4). These clusters were observed with different community

distance metrics, including Jaccard presence/absence (Figure S4), OTU composition (Figure 4), and phylogenetic dissimilarity (Figure 6). All disturbed soil communities clustered with

lower active layer soil communities (including Core 1 30 – 35 cm, Core 2 30 – 35 cm, and

Core 2 45 – 50 cm). Sample groups separated across NMDS1, while NMDS2 separated

within-cluster community differences. Active layer and disturbed soils group together to the exclusion of permafrost soils (Figure 4).

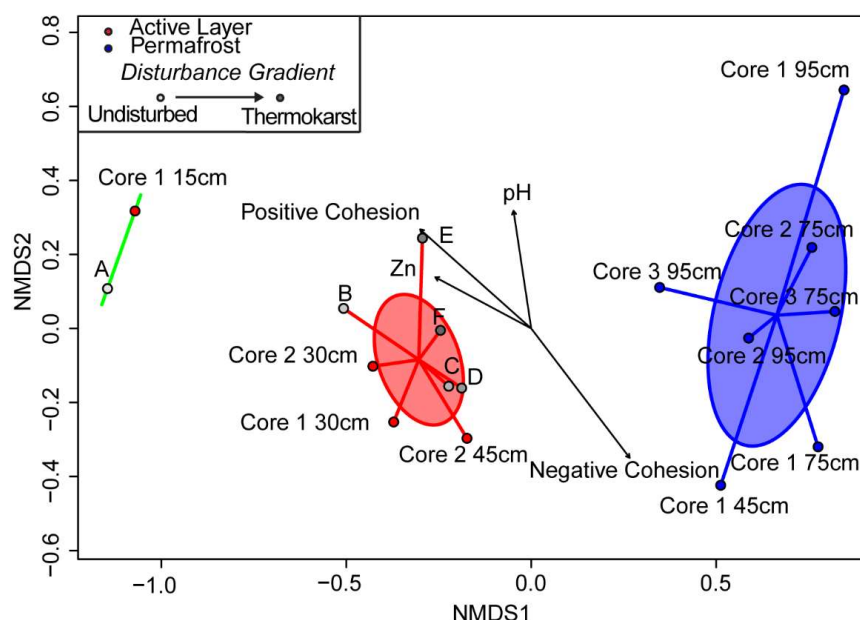


Figure 4: Dissimilarity of microbial communities visualized by nonmetric multidimensional scaling (NMDS) of total microbial assemblages. Groupings of soil samples are based on clusters recovered from a hierarchical clustering algorithm using Bray-Curtis community distances. Ellipses encompass clusters determined by weighted average algorithms: Cluster 1 (upper active layer and undisturbed soils), Cluster 2 (lower active layer and disturbed soils), and Cluster 3 (permafrost). Stress = 0.06.

Both community composition (i.e. OTU relative abundance as measured by the Bray-Curtis distance metric) and community membership (i.e. presence/absence of OTUs as measured by the Jaccard distance metric) within clusters correlated significantly with differences in pH ($r^2 = 0.4316$ and 0.5000 , respectively, $p < 0.05$), while differences across clusters correlated with Zn ($r^2 = 0.3609$ and 0.3461 , respectively, $p < 0.05$) (data not shown).



In an attempt to describe additional community variation, cohesion metrics (where positive cohesion represents a situation in which both taxa become more abundant with association while negative cohesion where the presence of one taxon negatively impacts another taxon) were compared against Bray-Curtis dissimilarity. Positive cohesion ($r^2 = 0.6760$) and negative cohesion ($r^2=0.8069$) explained 29.0% of bacterial community variation and 40.2% of the community variation when combined with pH and Zn (Figure 4). Cohesion not only explained a greater fraction of bacterial community variation but also explained an additional 20.3% of variation beyond environmental parameter differences, as Zn and pH explained only 19.9% of the variation alone. These findings indicate that microbial interactions, rather than edaphic parameters, were the primary driver of community composition.

4.5 Persistence of permafrost indicator OTUs in disturbed permafrost soils

Indicator taxon analysis identified 94 active layer indicator OTUs (Table S4) and 60 bacterial permafrost indicator OTUs (Table S5). Despite disturbance and thaw, permafrost indicator OTUs persisted following permafrost thaw at relatively high proportions in sample F. The proportion of permafrost indicator OTUs present in surface samples increased in both disturbed active layer and disturbed permafrost soils, with less than 5% of permafrost indicator OTUs present in the undisturbed surface sample (sample A) increasing to 80% of bacterial permafrost indicator OTUs present in sample F (Figure 5a). By comparison, the presence of permafrost indicator OTUs ranged from 93-100% in permafrost soils.

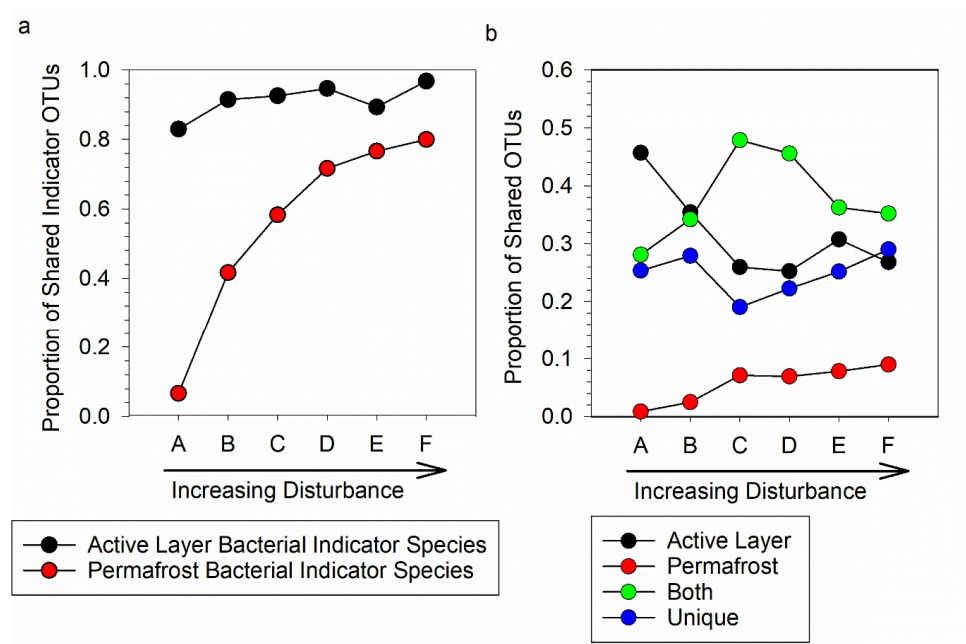


Figure 5: Indicator species analysis and shared richness assessed across the disturbance

gradient as compared to combined active layer and permafrost soils. (a) The proportion of

420 indicator OTUs assigned to permafrost or active layer soils that are shared within disturbance
 gradient soils. Indicator OTUs were defined as having indicator values above 0.80. (b) Shared
 richness of disturbance gradient soils compared against the combined assemblages of
 permafrost or active layer. “Uniques” were unique to the disturbance gradient soil, and
 “Boths” were found in both active layer samples and permafrost samples.

425

Across the surface soils, F shared the highest proportion of OTUs with permafrost
 soils (9.0%) and the lowest with active layer soils (26.8%) (Figure 5b). Likewise, the
 undisturbed soil shared the lowest proportion of OTUs with permafrost soils (0.1%), and the
 highest with active layer soils (45.7%). Endemism was highest in soil F (29.0%), but lowest
 430 in intermediately disturbed soils C and D (19.1% and 22.3% respectively). Endemic OTUs



were lowest in disturbed active layer but increased within disturbed permafrost. OTUs shared with permafrost soil communities increased in prominence with greater levels of disturbance. Thus, although the overall community composition in the most disturbed soils was quite similar to active layer soils, indicator bacterial OTUs of relict permafrost were still present.

435 We interpret these findings to indicate that the permafrost microbial communities were still present but were being supplanted by a colonizing active layer community following thaw.

4.6 Community membership of disturbed soils resembles active layer soils

Phylogenetic distances of community composition (weighted UniFrac) indicated similar cluster structure as found in Bray-Curtis and Jaccard distances (Figure 6). Community
 440 dissimilarity was greatest in permafrost soils, indicating that permafrost soil microbial communities were more heterogeneous than those of disturbed active layer and undisturbed active layer soils. A total of 26 phyla, 66 classes, and 235 genera were assigned across all soils, with 32.4%, 46.1%, and 62.3% of all sequences unassigned at the phylum, class, and genus levels, respectively. At the phylum level, all bacterial communities were predominantly
 445 composed of Proteobacteria (21.1%), Actinobacteria (8.6%), Acidobacteria (7.9%), Bacteroidetes (7.9%), and Firmicutes (5.5%), with substantial proportions of Verrucomicrobia (4.2%), and Planctomycetes (4.0%) and above a 3% cut-off. Across class levels, Actinobacteria (8.5%), Alphaproteobacteria (6.6%), Deltaproteobacteria (4.2%), Planctomycetia (4.0%), Gammaproteobacteria (3.7%), Clostridia (3.3%), and
 450 Betaproteobacteria (3.2%) were most abundant and above a 3% cut-off (Figure 6). Bacilli, Clostridia, Anaerolineae, and Bacteroidia were significantly more abundant in permafrost soils than in active layer soils, while Acidobacteria group 4, Acidobacteria group 17, and Nitrospira were all significantly more abundant in active layer soils than permafrost (Figure S2). Class level taxonomic composition across the surface soils was relatively static with



455 some exceptions: Clostridia (A= 0.04%, B =0.529%, F= 1.96%), Bacteroidia (A=0.03%,
 B=0.49%, F=2.1%), and Acidobacteria group 7 (A=0.71%, B=1.81%, F= 3.19%) all
 increased with disturbance, while Planctomycetia decreased (A=2.85%, B=1.63%,
 F=0.775%). Bacteroidia and Clostridia were more abundant in disturbed and permafrost soils
 than in active layer soils.

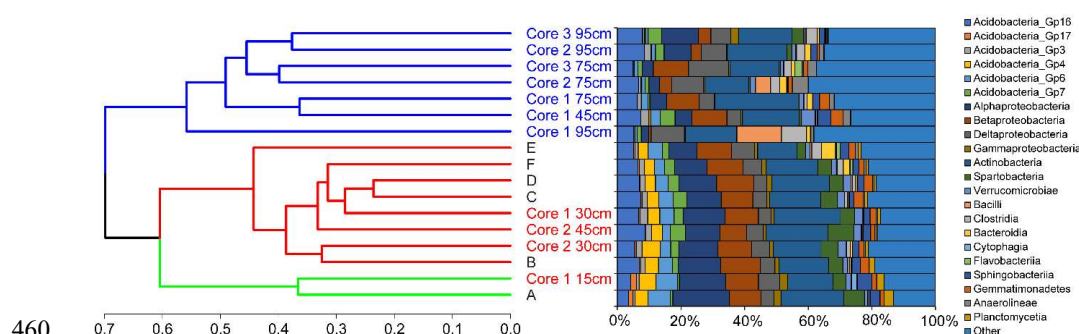


Figure 6: Hierarchical clustering of cores and surface sample communities alongside class level relative abundances. Classes <1% in any sample was grouped into “other” alongside unassigned taxa. Samples which are not significantly different ($P < 0.05$) across weighted UniFrac distances have the same colour. Active layer samples are labelled in red, permafrost is labelled in blue, and disturbance gradient soils are labelled in black.

5 Discussion

5.1 Analogues of natural disturbances

470 Discrete naturally occurring physical disturbances to active layer and permafrost soils (such as retrogressive thaw slumps, thermokarst thaw ponds, and active layer detachment slides) are becoming increasingly common. Removal of the active layer, as well as subsequent detachment slides of the newly forming active layer, results in a similar



geographic formation as anthropogenic excavation. Indeed, anthropogenic disturbances can
475 also result in active layer detachment slides and thermokarst formation (Lin et al., 2016).
However, the fate of soil physicochemistry is dependent upon the soils that are exposed
during these disturbances. The exposure of preserved organic acids, such as fulvic acids and
humic acids, likely decreased the pH in our disturbed permafrost soils. Both excavated sites
and naturally disturbed sites undergo slow re-vegetation, and we predict that although
480 microbial community replacement occurs rapidly, plant community succession may occur
over decadal time scales in anthropogenically and naturally disturbed sites (Forbes et al.,
2001; Lantz et al., 2009). With time, additional nutrients may be released into the newly
formed surface soils from permafrost soils, including $\text{NO}_3\text{-N}$, $\text{NH}_4^+\text{-N}$, Na, and S found in
disturbed permafrost samples in this study. Future studies should follow industrially disturbed
485 sites over multiple years to investigate how evolving edaphic parameters change with
increased mobilization.

5.2 Anthropogenic Disturbance does not reliably shift edaphic parameters

As water potential, nitrogen content, carbon content, and nutrient availability are
amongst the most important drivers of microbial community composition in these soils,
490 permafrost thaw is expected to lead to microbial community shifts. Anthropogenic
disturbance alters soil pH, while thawing permafrost leaches micronutrients and
macronutrients into downstream thaw waters (Forbes et al., 2011; Lantz et al., 2011). Organic
matter in permafrost is generally more recalcitrant and holds higher concentrations of
dissolved nitrogen than active layer soils above it (Keuper et al., 2012). The dissolved
495 nitrogen preserved within permafrost can be rapidly released following permafrost thaw,
releasing nutrients into the active layer and downstream aquatic systems (Reyes & Loughheed,
2015). Thus, we expected dramatic changes in soil edaphic parameters following disturbance



in the Dominion Creek system, including a lowered pH, increased mineral nitrogen, increased carbon content, and increased micronutrient abundance. However, the measured edaphic parameters did not shift within six weeks of thaw, although higher nitrogen contents found in disturbed permafrost were similar to the high levels of nitrogen found in undisturbed permafrost. The lack of a shift may be due to the short timeline since thaw; environmental parameters may need more time to shift in these disturbed soils, particularly as many of our analyzed metals have a slow rate of change.

5.3 Permafrost bacterial communities respond to disturbance

Most experiments studying *in situ* permafrost thaw show either that microbial communities shift to resemble the active layer (Tas et al., 2014), or that new microbial communities develop (Mondav et al., 2017). Unlike *in situ* experiments, laboratory thaw experiments identify significant changes in microbial community structure, transcriptional activity, respiration, and genetic potential (Coolen & Orsi, 2015; Coolen et al., 2011; Oelbermann et al., 2008; Mackelprang et al., 2011). Interestingly, we observe rapid microbial community shifts in disturbed permafrost soils in response to thaw. Previous incubation experiments identify microbial community changes in both active layer and permafrost soils with rapid thaw and suggest that the rapid succession of microbial communities is related to carbon recalcitrance (Coolen et al., 2011). However, while we observed a significant shift in microbial composition in disturbed permafrost soils, we did not observe the same trend in disturbed active layer soils. Together, we suggest that microbial community dynamics with significant physical disturbance is likely to induce rapid microbial community shifts in permafrost soils, but not in active layer soils. This can be extended not only to anthropogenic disturbances, but to thermokarst formation as well. During *in situ* thaw experiments, successional patterns within the communities are observed; however, interpretations of



function from taxonomic assignment must be made with caution, requiring further study into the genetic potential and activity of the community.

Indeed, longer-term field warming experiments show a deepening of the ice table,
525 allowing the colonization of plant roots into deeper soil horizons (Monteux et al., 2018).
Microbial communities in these thawed permafrost layers shifted to resemble those of the active layer. The mechanism of this change is the colonization of active layer taxa into deeper soil horizons. Our results support these findings, as permafrost microbial communities shifted to resemble the community of the lower active layer. However, in the absence of plant roots,
530 we suggest the perturbation of soil horizons by anthropogenic activities allowed the colonization of active layer microbial communities into thawed permafrost horizons. These results are supported by the presence of both active layer and permafrost indicator OTUs within disturbed permafrost soils, as a small abundance of permafrost microbiota may have persisted after disturbance. We expect that disturbances, such as thermokarst formation, in
535 the Arctic and subarctic are likely to create homogenous microbial communities similar to the active layer regardless of the soil source. Rather than observing indigenous microbial communities shifting in abundance in response to thaw, we observed dispersal of active layer microorganisms into exposed permafrost layers. Therefore, we suggest that discrepancies between *in situ* thaw experiments and laboratory thaw experiments may be due in part to the
540 lack of surrounding active layer disturbance in the *in situ* experiments.

5.4 Drivers of Microbial Community Composition are Biotic

Resident microbiota must adapt to numerous shifting environmental variables in response to permafrost thaw or they will be supplanted by active layer microbiota. Physicochemical parameters are suggested to control the fate of microbial communities in
545 response to permafrost thaw (Hayden et al, 2012; Rousk et al, 2012); however, rapid



microbial community shifts have been observed under only seven days of warming, before any significant changes in chemistry or physical parameters in the system would be possible (Mackelprang et al 2011). Therefore, it is unknown if: (1) physicochemical characteristics control microbial communities following permafrost thaw, and so microbial communities in samples with similar environmental parameters should resemble each other (environmental filtering) or (2) permafrost thaw induces microbial community shifts, and so environmental and microbial groupings do not resemble one another (biotic filtering). Soil microbial communities in thawing permafrost are generally driven by environmental factors, most significant of which is pH (Chen et al., 2017; Tripathi et al., 2018). However, in our study the variance in bacterial community composition was poorly explained by physicochemical parameters. While diversity was controlled by pH within each cluster, permafrost and active layer community clusters could not differentiate between permafrost and active layer community clusters. Previous studies have shown permafrost and active layer prokaryotic communities are controlled by distinct mechanisms (Chen, et al. 2017; Tripathi et al., 2018). However, we observed no such correlation between microbial composition and these parameters in our system. Our results therefore support hypothesis 2, that microbial community changes are induced by biotic filtering.

Interestingly, while the short 6-week time frame since disturbance in our study did not lead to a significant shift in environmental parameters, the microbial community profiles found in permafrost underwent substantial changes. We suggest that the indigenous microbial community of permafrost cannot respond to the opportunities presented by permafrost thaw (e.g. increased nutrient availability, increased temperatures, and the availability of new niches) as rapidly as the overlying active layer community. Instead of a “blooming” viable permafrost microbial community, active layer taxa appear to invade the disturbed permafrost



570 environment. While taxon membership in disturbed soils appears to be partly of permafrost origin, as indicated by the presence of numerous permafrost indicator taxa in disturbed soils, this signal is not strong enough to affect overall community membership or composition. The disturbed permafrost microbial community converges with the active layer community, is driven by biotic processes, and likely occurs through the invasion of active layer taxa.

575 Cohesion metrics support the hypothesis that biotic filtering was impacting microbial community composition with disturbance.

5.5 Taxonomic profiles resemble other regional studies across the Arctic

Taxonomic profiles in our study were similar to other periglacial soils and differential abundance analysis identified numerous taxa that may be ecologically significant across

580 active layer and permafrost habitats (Malard & Pearce, 2018). Previous studies have indicated that complex hydrocarbons preserved in permafrost are both aerobically and anaerobically degraded into greenhouse gases, including CO₂ and CH₄, as well as volatile fatty acids. While physiology cannot be directly inferred from taxonomy, trends in the membership of these communities are consistent with these previous findings. Classes containing Aerobic

585 heterotrophic bacteria (e.g. class Bacilli and most class Actinobacteria), anaerobic heterotrophic bacteria (e.g. class Clostridia), and volatile fatty acid oxidizers (e.g. *Smithella propionica*) were all prominent across Dominion Creek soils and are common globally in active layer and permafrost soils (Jansson & Taş, 2014; Malard & Pearce, 2018; Metje & Frenzel, 2007). Planctomycetes phylum sequences were more abundant in active layer than in

590 permafrost, and disturbance also decreased the relative abundance of Planctomycetes-related sequences in these surface soils, as has been seen in previous studies (Taş et al., 2014). Relatives of spore-forming bacteria, including Clostridia and Bacilli, were more abundant in permafrost soils than in active layer soils. Increased abundance of these putative spore



formers is likely due to niche partitioning and survival strategies precluding spore formation
595 (Johnson et al., 2007). The distinct life strategies between permafrost and active layer classes
suggest that community functional may also differ across permafrost, active layer, and
disturbed soil communities, similar to previous findings (Hultman et al., 2015).

5.6 Viability and survivability in permafrost

The impact of permafrost thaw on microbial survivability is unknown. We posit that
600 shifts in microbial community structure could be accomplished by growth of active bacteria
and/or death of poorly adapted bacteria. Viability did not differ between the active layer and
permafrost soils at Dominion Creek; we propose this lack of difference is due to long-term
adaptation to both seasonal thaw in the active layer (Schostag et al., 2015), as well as
constant and perennial stressor adaptations in the permafrost horizons (Mackelprang et al.,
605 2017). Our data suggests that abrupt thaw does not dramatically increase microbial cell
abundance or viability of microorganisms in permafrost soils. However, previous studies
have suggested increases in microbial activity, transcription, and genetic potential with
permafrost thaw in the laboratory, and in the field (Coolen et al., 2011; Coolen & Orsi, 2015;
Hultman et al., 2015; Mackelprang et al., 2011). Due to these increases in metabolic activity,
610 transcriptional activity, and genetic potential under both rapid and long-term thaw, lower
biomass and lower viability with discrete and substantial perturbation were unexpected.
Therefore, activity changes may result from a small but viable community in thawing
permafrost which becomes more abundant with thaw.

6 Conclusions

615 Six weeks of thaw following disturbance is sufficient to shift bacterial community
composition, membership, and diversity in disturbed permafrost soils to become more similar
to lower active layer soils. These communities are driven primarily by the biotic filtering of



an invading active layer microbial community in disturbed permafrost communities. Thaw
does not increase the viability or abundance of bacteria, suggesting increasing activity,
620 transcription, and genetic potential found in other thawing soils may be due to a more active,
yet sparse, microbial community. This study should be expanded to determine if disturbance
creates similar microbial community shifts in naturally occurring rapid permafrost thaw
zones. Interpretation of activity measurements and characterization of important active
microbial taxa may suggest future avenues of research to develop our understanding of
625 microbial succession in response to permafrost thaw induced by direct anthropogenic
disturbance.

Data Availability

The data for the findings in this manuscript can be found at:

630 <https://dataview.ncbi.nlm.nih.gov/object/PRJNA999916>.

Author Contributions

Supervision and resources were provided by BL and DF; conceptualization was undertaken
by BL, DF, and ASM; methodology was designed and undertaken by ASM and PN; curation
of data, formal analysis, and manuscript writing was performed by PN; reviewing and editing
635 of the manuscript was performed by BL, DF, and ASM. All authors made substantial
contributions to the publication of this work.

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Conflict of interest

The researchers declare no conflict of interest.

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