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1 **Geophysical Monitoring Shows that Spatial Heterogeneity in Thermohydrological**
2 **Dynamics Reshapes a Transitional Permafrost System**

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11
12 **Key Points:**

- 13 • Transitional permafrost systems evolve through complex infiltration pathways and
14 energy fluxes, including lateral flow
- 15 • Snow pack and vegetation distribution play major role in permafrost thermohydrological
16 responses
- 17 • Monitoring shows spatially variable thermohydrological responses and intra- to inter-
18 annual dynamics in discontinuous permafrost systems
19

20 **Abstract**

21 Climate change is causing rapid changes of Arctic ecosystems. Yet, data needed to unravel
22 complex subsurface processes are very rare. Using geophysical and in-situ sensing, this study
23 closes an observational gap associated with thermohydrological dynamics in discontinuous
24 permafrost systems. It highlights the impact of vegetation and snow thickness distribution on
25 subsurface thermohydrological properties and processes. Large snow accumulation near tall
26 shrubs insulates the ground and allows for rapid and downward heat flow. Thinner snowpack
27 above graminoid results in surficial freezing and prevents water from infiltrating into the
28 subsurface. Analyzing short term disturbances, we found that lateral flow could be a driving
29 factor in talik formation. Inter-annual measurements show that deep permafrost temperatures
30 increased by about 0.2°C over two years. The results, which suggest that snow-vegetation-
31 subsurface processes are tightly coupled, will be useful for improving predictions of Arctic
32 feedback to climate change, including how subsurface thermohydrology influences CO₂ and CH₄
33 fluxes.

34

35 **Plain Language Summary**

36 When permafrost thaws, water can flow quicker through the ground, creating a very complex
37 subsurface flow system. In this study, we gain detailed insight into these complex processes by
38 measuring the electrical resistivity of the ground daily. Our results show that the type of
39 vegetation and the snowpack that accumulates on it in winter control the temperatures of the
40 ground, and therefore also how water flows. Above tall shrubs snow accumulates much more
41 than above grass. Therefore, temperatures below shrubs are warmer and water and energy from
42 snowmelt and rain can flow through the ground quickly, while colder temperatures below the
43 grass prevent this rapid flow. Longer-term dynamics show us that the temperature of permafrost
44 at about 10m depth increased by 0.2°C over a period of two years. The results of this study
45 should be useful for improving predictions of Arctic feedback to climate change.

46 **1 Introduction**

47 The average temperature of permafrost has increased globally by about 0.4°C in the last
48 century. This is partly due to the Arctic amplification of an increase in air temperature in the
49 Northern Hemisphere, but also due to increased snow thickness, especially in areas of
50 discontinuous permafrost (Biskaborn et al., 2019). This change in temperature changes the
51 physical properties of the subsurface, with impacts on infrastructure (Hjort et al., 2018),
52 groundwater resources, vegetation distribution (Jorgenson et al., 2013; Lloyd et al., 2003),
53 carbon and nitrogen cycling (Petronne et al., 2006), and greenhouse gas emissions (Jansson &
54 Taş, 2014), leading to further acceleration of climate change.

55 Jorgenson et al. (2010) show that complex feedbacks exist between permafrost dynamics
56 and topography, vegetation distribution, snow pack, ground temperature, and subsurface
57 hydrological properties. Rising permafrost temperatures cause increasing hydraulic
58 conductivities in the soil to bedrock column, enabling or enhancing surface water-groundwater
59 interactions, changes to the groundwater residence times, and eventual alterations to ground- and
60 stream-water temperature and compositional dynamics (Hinzman et al., 2005; Ireson et al.,
61 2013). These changes in hydrology enhance the importance of the deeper subsurface for carbon
62 and nutrient cycling (Koch et al., 2013; Lyon et al., 2010), and are particularly important for

63 discontinuous permafrost, which accounts for 19% of the Northern Hemisphere's land surface
64 that is covered by permafrost, i.e. $4.4 \times 10^6 \text{ km}^2$ (Zhang et al., 2003). This region is characterized
65 by a complex distribution of perennial frozen and unfrozen ground, and hence areas of year-
66 round unfrozen ground within permafrost landscapes, or taliks. Arctic discontinuous permafrost
67 is usually "warm" (likely $> -3 \text{ }^\circ\text{C}$), and a mean temperature increase of $0.2 \pm 0.1 \text{ }^\circ\text{C}$ has been
68 recorded over the last decade (Biskaborn et al., 2019). These changes are forming a transitional
69 permafrost environment, where areas of continuously frozen ground are becoming unfrozen,
70 impacting microbial and soil processes, hydrology, and flora and fauna (Vincent et al., 2017;
71 Woo et al., 2008). We currently lack data and predictive understanding of how these complex
72 interactions influence the evolution of this ecosystem - now and in the future. Gaining
73 information on the factors controlling near-surface ground temperatures and water distribution is
74 critical to being able to predict the fate of Arctic ecosystems and its feedback to climate
75 (Walvoord & Kurylyk, 2016).

76 Measuring thermohydrological properties and processes in permafrost environments is
77 difficult due to inaccessibility, sensitive ecosystems, and the harsh Arctic environment. Hence,
78 data associated with surface water-groundwater interactions, and infiltration and subsurface flow
79 processes are sparse (Bring et al., 2016). Geophysical techniques are known to complement
80 point observations and to assess the intermediate depths (1 - 10's of m) at spatial and temporal
81 resolutions critical to understanding the impact of climate change on permafrost hydrological
82 dynamics (Dafflon et al., 2017; Kneisel et al., 2008; Minsley et al., 2012; Parsekian et al., 2019).
83 Electrical properties of soils, particularly at temperatures below freezing, are highly sensitive to
84 variations in temperature (Wu et al., 2017). Below the freezing point, resistivity changes are
85 several orders of magnitude larger than above freezing and depend on the initial liquid water
86 content and the pore size distribution (Ming et al., 2020). Hence, in frozen environments,
87 monitoring changes in subsurface electrical resistivity can highlight variations in subsurface
88 temperature and hydrological conditions (Farzamian et al., 2020; Krautblatter et al., 2010).

89 By combining geophysical and in-situ point sensing along a single transect, this study
90 aims at providing insight to two questions: (1) how spatially and temporarily variable are
91 thermohydrological properties and processes in transitional permafrost environments, and (2)
92 what is the impact of topography, vegetation and snow-pack distribution on those properties?
93 This integrated, spatially and temporally resolved study closes an observational gap with regards
94 to thermohydrological fluxes and deep permafrost dynamics that currently exists in the
95 understanding of permafrost-dominated systems. While the observations are representative for a
96 small domain, the processes that were observed are likely valid for a wide range of Arctic
97 permafrost environments. To our knowledge, this is the first study to remotely monitor sub-
98 seasonal through multi-annual thermohydrological processes in transitional permafrost
99 environments at spatiotemporal resolutions required to discover controls on subsurface
100 infiltration and temperature dynamics that ultimately shape this evolving Arctic ecosystem.

101 **2 Study Site and Methods**

102 A permafrost monitoring site was established on the Seward Peninsula (64.72°N ,
103 165.94°W) in September 2017 (Fig. 1A). The study site is located in the Southern part of the
104 Seward peninsula, which is classified as discontinuous permafrost (Brown et al., 2002) The
105 monitoring site includes a 127m long transect located within the lower elevations of a watershed,
106 which is a focus of the Department of Energy Next Generation Ecosystem Experiments (NGEE)

107 Arctic project. The transect is perpendicular to the main slope gradient and crosses two different
108 vegetation types; one covered with graminoid and the other primarily with tall shrubs (Léger et
109 al., 2019). Graminoids are vascular, herbaceous plants with a morphology similar to grass that
110 grow up to a few 10's of cm, while the tall shrubs here are mainly composed of willow with
111 heights up to 2m. At five locations along this transect (Fig. 1A) soil temperature and moisture
112 content are measured hourly at 0.1, 0.2, 0.3, and 0.4m depth, with additional temperature
113 measurements at 1.5m below ground level (bgl, Fig. 1B); several soil cores were recovered along
114 the transect for laboratory analysis (see supplementary information). Rainfall and air
115 temperatures were recorded at a local weather station (Busey et al., 2017), while winter snow fall
116 records were obtained from a station at Nome Airport (NOAA-ID: GHCND:USW00026617).
117 Snow thickness was measured at 1m intervals across the transect in late March 2018 and 2019.

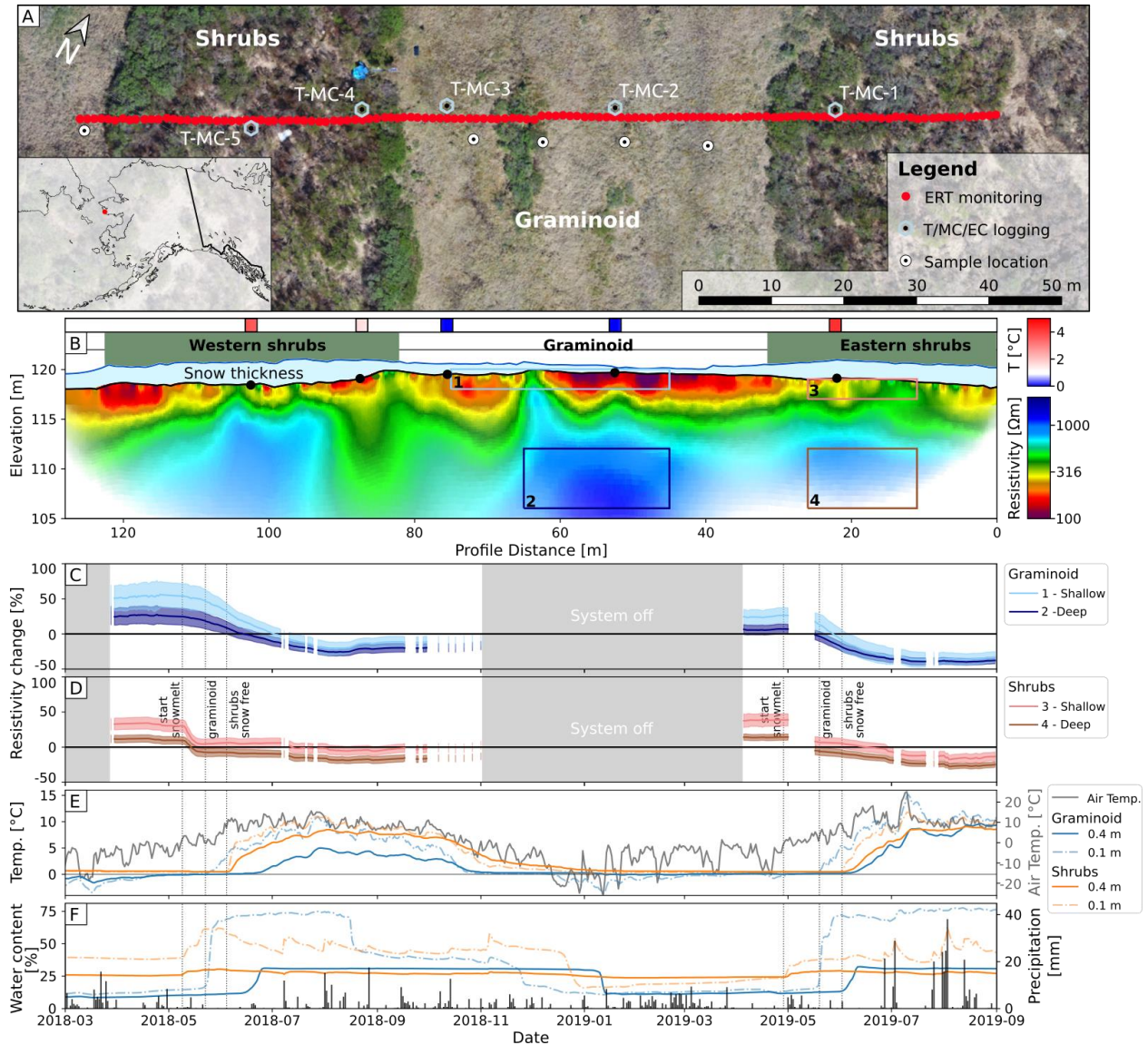
118 An Electrical Resistivity Tomography (ERT) monitoring transect, using 128 electrodes
119 spaced at 1m, is the primary dataset for this study. ERT data were acquired daily between late
120 March and September of 2018 and 2019 using dipole-dipole measurements. Data were filtered
121 based on an error model (Tso et al., 2017) that was developed from reciprocal measurements
122 acquired in September 2017 and March 2018. To transform measured transfer resistances to
123 subsurface resistivity models, the acquired data were inverted using E4D (Johnson et al., 2010)
124 applying a conventional L2-norm regularization, with stronger spatial than temporal constraints
125 (ratio 2/1). The inversions converged at root-mean-squared misfits between measured and
126 modelled data of 1.5% to 4.3%. The depth of investigation of the ERT measurements was
127 determined using an approach introduced by Oldenburg & Li (1999), and confirmed that those
128 measurements were sensitive to depths of ~15m bgl.

129 **3 Data Overview**

130 The baseline electrical resistivity model (Fig. 1B) of September 2017 shows a conductive
131 upper layer varying in thickness, which can be related to the unfrozen organic and soil layers. It
132 is underlain by a highly resistive layer, which is representative of permafrost. The highest
133 resistivities (~1000 Ω m) were recorded in the center of the profile at depths >5m below the
134 graminoid area. High resistivity features were also imaged at similar depths below the eastern
135 and western shrubs (~900 and ~800 Ω m, respectively), but end of summer soil temperatures
136 recorded at 1.5m bgl (squares above Fig. 1B) were higher in the shrub than in the graminoid area
137 (4.6°C and -0.1°C, respectively). Similar spatial trends are observed in snow thickness
138 distribution. The thickest snow pack was recorded in the shrub areas (1.83 \pm 0.27m) and the
139 thinnest over the graminoid (0.70 \pm 0.24m). The winter periods of 2017/2018 and 2018/2019 had
140 mean air temperatures of -8.0 \pm 5.7°C and -8.9 \pm 6.7°C, respectively, and summer precipitation
141 accumulated to 226.9 and 451.3mm in 2018 and 2019, respectively. With the exception of the
142 2019 rainfall, these values are within the long-term average and representative of the climate of
143 the Seward Peninsula.

144 Figs. 1C and D show the temporal variability in electrical resistivity for four zones (with
145 respect to the baseline measurement), representing shallow (surface to 2m bgl, boxes 1 and 3)
146 and deep (8 to 14m bgl, boxes 2 and 4) areas underneath the graminoid and shrub areas. From
147 the start of monitoring in March to the onset of snowmelt, resistivities stay at their yearly
148 maxima reflecting cold and (below the graminoid) frozen conditions. The start of snowmelt
149 causes a rapid decrease in the shallow resistivities underneath the shrubs (27% in 10 days), and a
150 slower decrease underneath the graminoid (5% during the same period). This is related to
151 thawing of the near surface and infiltration of snowmelt. Deeper parts of the model show

152 comparable trends and time lags, but smaller amplitudes. Although soil moisture at 0.1m depth
 153 shows a clear response to snowmelt and rainfall events, soil moisture at 0.4m bgl below the
 154 shrubs remains almost constant throughout the year ($27.1 \pm 1.7\%$), indicating fully saturated
 155 conditions (see supplementary information). Below the graminoid area, soil moisture changes at
 156 0.4m bgl can be linked to the freeze and thaw cycles, and hence to changes in liquid water
 157 content. Given the saturated conditions, we can assume that the observed resistivities are mainly
 158 affected by changes in temperature conditions.



159

160 **Figure 1 Sensor installation and annual variability of electrical resistivity, soil temperature,**
 161 **and water content.** (A) Overview map of the monitoring installation. The center of the
 162 monitoring transect is characterized by graminoid, and both ends by dense tall shrubs. Inset
 163 shows the location within Alaska, US. (B) Baseline electrical resistivity model (09/2017), with
 164 low resistivities in warm and high resistivities in cold colors. Resistivities with a DOI > 0.15
 165 (Oldenburg & Li, 1999) are blended out. Shown are sensor locations, areas for which resistivity
 166 is analyzed, soil temperatures (1.5m bgl, colored squares), and snow thickness (04/2018). (C, D)

167 Change in electrical resistivity with respect to baseline measurement for areas indicated in (B).
168 (E) Temperature variation at 0.1 and 0.4m bgl, and air temperature records. (F) Moisture content
169 at the same locations as in (C), and measured precipitation. Temperature and moisture data were
170 measured at T-MC-1 and T-MC-2.

171 **4 Heavy rainfall supplies energy deep into permafrost system**

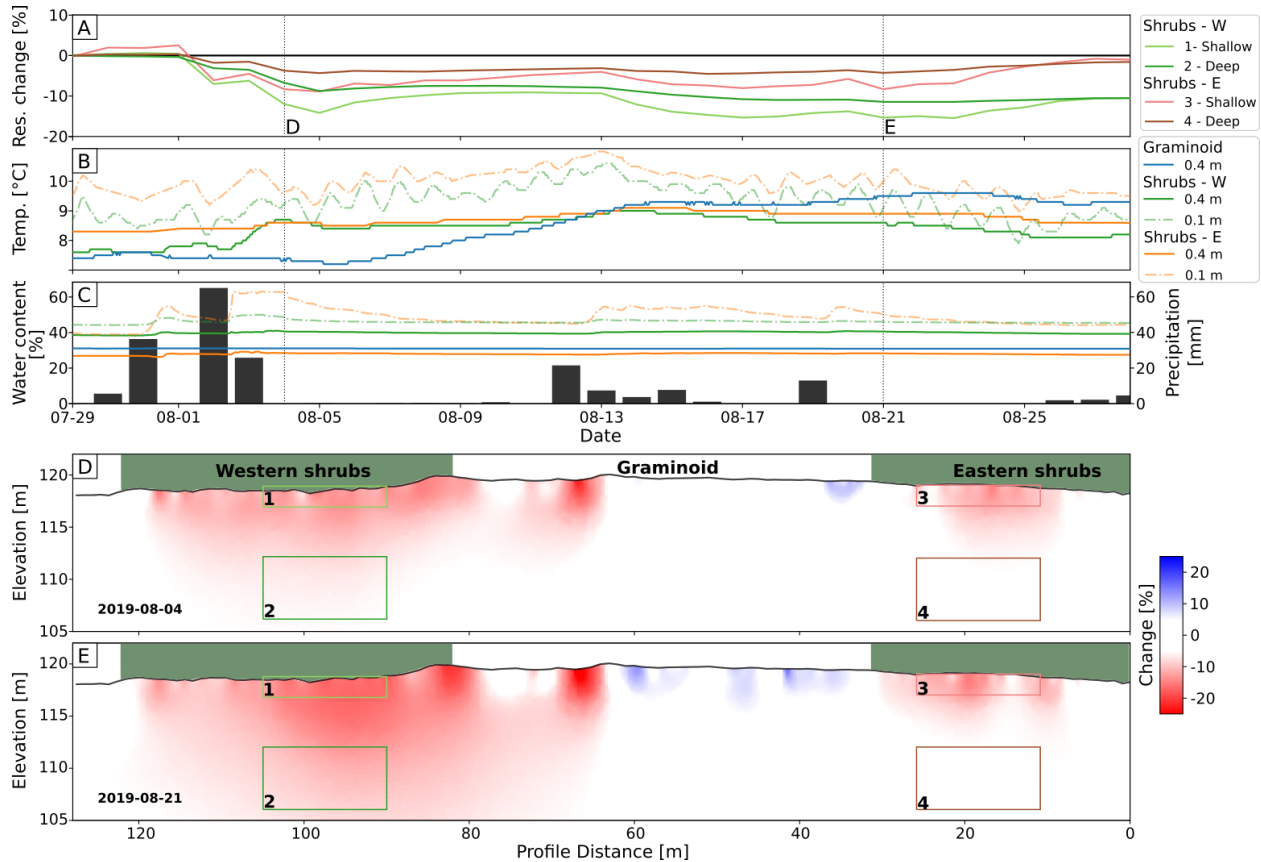
172 Rainfall can provide significant energy input into permafrost systems, causing rapid
173 changes in soil temperature to depths >0.5m bgl and increasing methane emissions from thawing
174 permafrost (Neumann et al., 2019). Yet, depth and laterally resolved data are sparse, particularly
175 at depths greater than 0.5m. To explore this phenomena, we focus on a natural rainfall event that
176 took place in August 2019, accumulating 127.1mm rainfall in four days (Fig. 2). While the
177 shallowest soil moisture sensor in the shrubs recorded increasing water content in response to the
178 rainfall (particularly within the eastern shrubs), sensors 0.4m bgl remained almost constant
179 throughout August ($39.0 \pm 0.6\%$, $27.9 \pm 0.5\%$, and $31.0 \pm 0.01\%$ for eastern and western shrubs,
180 and graminoid, respectively).

181 Since soil moisture remained mostly unchanged during and past this storm event, we
182 consider electrical resistivity changes to be associated mostly with changes in temperature. The
183 main precipitation event occurred on August 2nd (65mm), and within one day caused a 1.0°C and
184 0.2°C increase in soil temperature at 0.4 m bgl in the western and eastern shrubs, respectively.
185 The shrub areas show a general warming trend until mid-August 2019, followed by decreasing
186 temperatures towards the end of the month (Fig. 2A). In the graminoid area, these trends appear
187 delayed, showing increasing temperatures five days after the storm event and continuing until the
188 end of the month. The subsurface electrical resistivities show a decreasing trend in the first three
189 days after the rainfall event, after which resistivities remain reasonably stable until increasing
190 towards the end of August (Fig. 2A). Amplitudes in the resistivity changes are higher in the
191 shallow than in the deep subsurface. While this could be an effect of the reduced sensitivity of
192 the ERT measurement with depth, this decrease in amplitude is also expected given the imaged
193 processes.

194 The changes in the electrical resistivity (with respect to a measurement prior to the event)
195 show distinct patterns for the two shrub units and the graminoid (Fig. 2D-E). Fig. 2D shows the
196 western shrubs to be dominated by decreasing resistivities between -5 and -20%, while the
197 eastern shrubs show small reductions in the shallow subsurface only. Lateral heat flow was
198 observed at depths >5m bgl, where a decreasing resistivity trend advanced from the western
199 shrubs toward the graminoid. Resistivities decreased further in the two weeks past the storm
200 event. No significant decrease was recorded in the deeper sections below the graminoid.

201 We associate those rapid changes to heat advection dominating the thermodynamics, as
202 diffusion would be a slower processes. Heat advection has been shown to accelerate permafrost
203 degradation (Rowland et al., 2011), particularly in response to rainfall events (Mekonnen et al.,
204 2020). Chen et al. (2020) present a field study showing temperature data that suggests a thermal
205 response of permafrost to rainfall to depths >7m within 4 days past rainfall events. The variable
206 magnitude in changes observed across the transect can be explained by different initial
207 temperatures and hence ice content. Based on the imaged electrical resistivities, graminoid and
208 eastern shrubs are expected to correspond to lower subsurface temperatures and larger ice
209 content than the western shrubs. Given this initial situation and assuming that the resistivity
210 change is indicative of coupled thermohydraulic flow dynamics, thermal and hydraulic

211 conductivities are likely higher underneath the western shrubs (Hinzman et al., 1991; Thomas et
 212 al., 2009), facilitating rapid movement of precipitation energy into depths >1m. With higher ice
 213 content underneath the eastern shrubs and graminoid, hydraulic conductivities are lower and
 214 energy from the precipitation is likely not being transported vertically into the deeper subsurface,
 215 but horizontally through lateral flow.



216 **Figure 2 Heavy rainfall causes rapid change in electrical resistivity underneath the western**
 217 **tall shrubs.** (A) Change in electrical resistivity with regards to a measurement prior to the onset
 218 of a rainfall event (07/29/2019). (B-C) recorded soil temperature and moisture content from in-
 219 situ sensors, and precipitation. (D-E) distribution of changes in electrical resistivity at two dates.

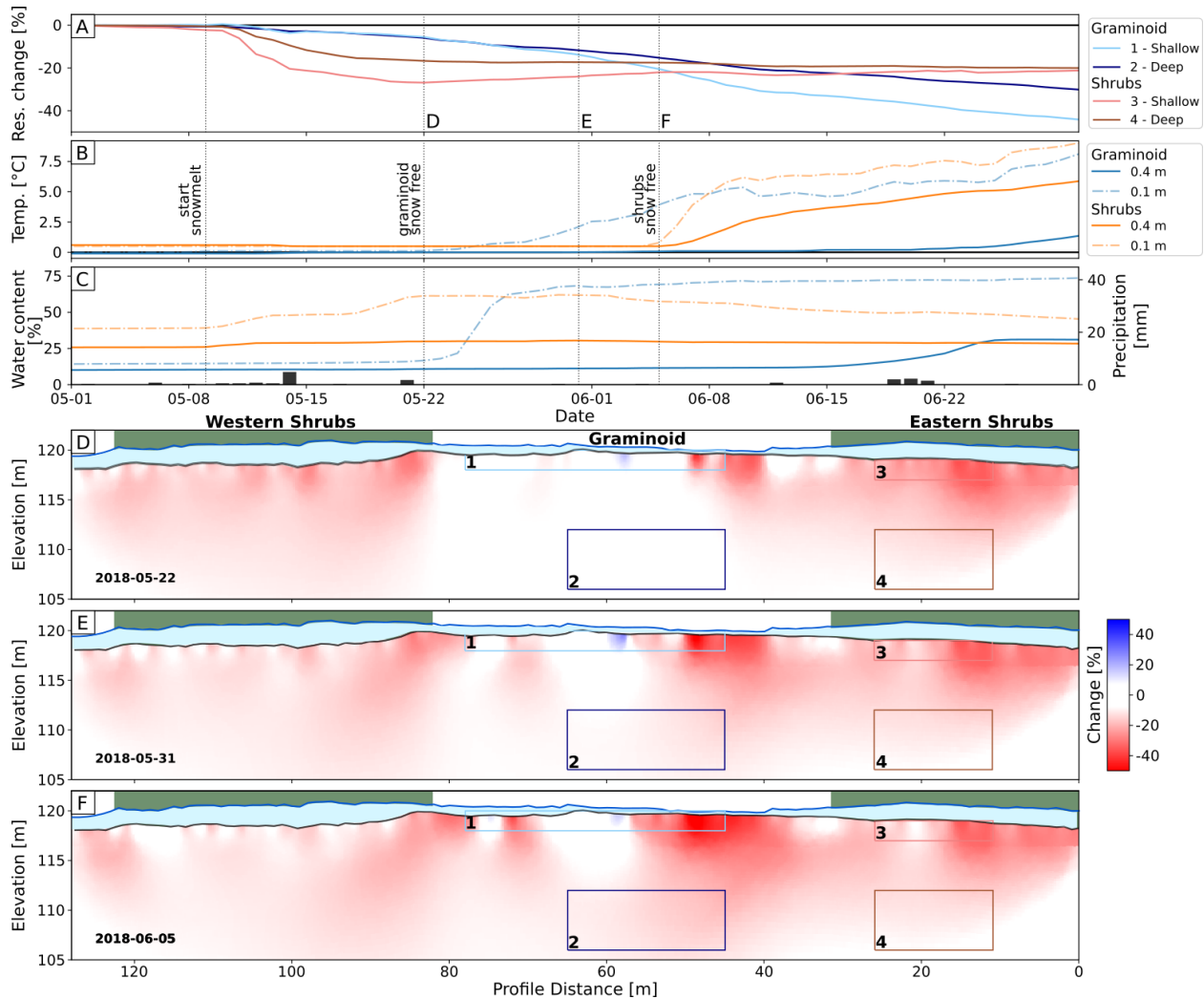
221 5 Snowmelt processes highlight spatially variable dynamics

222 Snowmelt provides another natural tracer to study the permafrost thermohydrological
 223 processes and to image the feedback to variabilities in snow thickness. Here, we focus on the
 224 effects of snowmelt in May 2018 (Fig. 3). Daily photographs of the site confirmed that the
 225 graminoid was mostly snow free on May 22nd, while the shrub dominated area, due to thicker
 226 snowpack, showed snow free conditions two weeks later, on June 5th. These dates coincide with
 227 an increase in shallow and deep temperatures (Fig. 3B). Liquid water content in the shallow
 228 subsurface below the shrubs increases beginning May 8th, which was defined as the start of
 229 snowmelt. Coinciding with this date, subsurface electrical resistivities decrease throughout the
 230 imaging domain, with a more rapid decrease below the shrubs. The graminoid area shows a
 231 slower response and continuously decreasing resistivities throughout the analyzed period. The
 232 shrub areas show increasing resistivities once they became snow free.

233 More detail on the subsurface thermohydrological response to snowmelt can be inferred
234 from the imaged changes in resistivity. Initially, minimal change was recorded below the
235 graminoid, whereas the shrub areas showed decreasing resistivity >5m bgl two weeks after the
236 start of snowmelt (Fig. 3D). This difference can be explained by the surface temperature
237 conditions in response to the snow thickness distribution. While below the thick snowpack of the
238 shrubs ($1.83 \pm 0.27\text{m}$) surface temperatures remained above 0°C throughout the winter, the
239 thinner snowpack ($0.70 \pm 0.24\text{m}$) of the graminoid allowed cold winter air temperatures to
240 penetrate the subsurface and the permafrost body to cool the shallow subsurface so that soil
241 temperatures were below 0°C . Hence, snowmelt could readily infiltrate below the shrubs, while
242 the frozen conditions of the graminoid prevented infiltration of liquid water. This is confirmed
243 by the shallow soil moisture sensors. In the shrubs, a clear increase in liquid water content was
244 recorded, while the value in the graminoid remained unchanged until the graminoid became
245 snow free and shallow temperatures started to increase. Within the shrubs, liquid water content at
246 0.4m bgl remained constant throughout the snowmelt event, indicating fully saturated conditions.
247 Hence, changes in the deeper parts of the imaging transect indicate processes similar to the
248 rainfall event, in that snowmelt is providing energy to the deeper permafrost system, causing
249 changes to the permafrost temperature and unfrozen water content.

250 Once the graminoid became snow free and warm air temperatures led to thawing of the
251 surficial layer, snowmelt started to infiltrate. Heterogeneities within the graminoid,
252 microtopography, and presence of near surface permafrost ($x = 65\text{m}$) caused variable changes in
253 the upper 5m bgl. Areas known to be characterized by near surface permafrost and
254 microtopographic highs showed small changes in the shallow subsurface ($x = 65\text{m}$ and 75m ,
255 respectively), while depressions showed more pronounced changes. Interestingly, the deeper
256 subsurface (>5m bgl) showed a continuous decrease in resistivity. Investigating the spatio-
257 temporal changes in the graminoid area (Fig. 3D-F) showed that lateral flow from the shrub areas
258 caused decreasing resistivities below the graminoid. Hence, lateral flow is expected to be a
259 significant factor in the formation and development of taliks at this site.

260 Changes occurred most rapidly underneath the western shrubs. Four weeks after the
261 snowmelt event the trend reverses and resistivities are increasing slightly (Fig. 3E), particularly
262 in the shallow subsurface. This shows that the snowmelt pulse traveled through the system
263 quickly, and indicates that thermal and hydraulic conductivities are likely higher below the
264 western than the eastern shrubs, where changes occurred at slower rates and remained longer.



265

266 **Figure 3 Snowmelt is causing rapid change in electrical resistivity, particularly underneath**
 267 **the shrubs.** (A) Change in electrical resistivity relative to measurements prior to the start of
 268 snowmelt (05/01/2018). (B-C) variation in soil temperature and moisture content, and
 269 precipitation. (D-F) distribution of changes in electrical resistivity at three dates past snowmelt
 270 event. Indicated snow thickness corresponds to measurements in 04/2018.

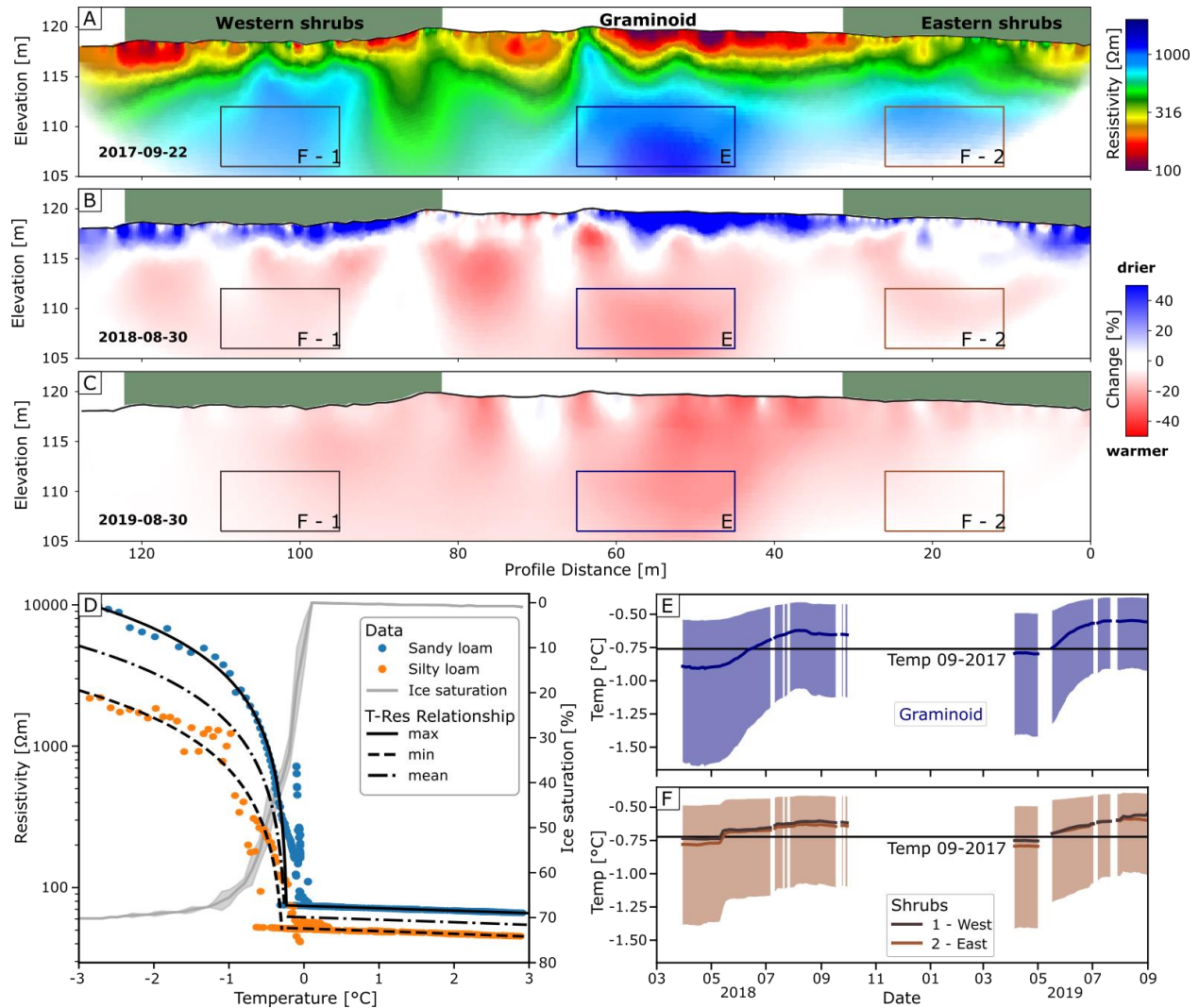
271 **6 Inter-annual thermohydrological dynamics**

272 Although rainfall and snowmelt events provide insights about permafrost
 273 thermohydrological processes, investigation of longer-term dynamics is needed to explore the
 274 evolution of permafrost systems. Fig. 4 shows the resistivity distribution at the beginning of the
 275 monitoring period in September 2017, and changes in resistivity with respect to that
 276 measurement for the end of August 2018, and from 2018 to 2019 (Fig. 4B and C, respectively).
 277 These measurements are representative of the warmest subsurface temperatures, reached at the
 278 end of summer. Changes in resistivity from 2017 to 2018 (Fig. 4B) are different in the shallow
 279 and deep subsurface. The shallow subsurface (<3m bgl) is characterized by increasing resistivity,
 280 which can be related to a decreasing trend in soil moisture, and hence drier conditions. From
 281 2018 to 2019 (Fig. 4C) this trend reverses and decreasing resistivities were recorded. This is in
 282 agreement with a wetter summer of 2019 compared to 2018. The deeper subsurface shows a

283 decreasing trend over the two years, with the strongest changes being observed in the area
284 underneath the graminoid.

285 To quantify these effects, we performed a laboratory analysis of the temperature-
286 electrical relationship of soil samples obtained along the monitoring transect (for details see
287 supplementary information). Fig. 4D shows data from two samples, sandy and silty loams, which
288 present the two end members of recovered samples in terms of their electrical behavior, as well
289 as the bilinear temperature-resistivity relationships for those samples. At temperatures above
290 0°C, increasing temperatures decrease resistivity by about 2%/°C, while between -2 and -0.5°C
291 resistivity decreases by about 67%/°C due to decreasing ice content.

292 Employing these relationships, we converted the time series of electrical resistivity of
293 deep (between 8 and 14 m bgl) permafrost units into temperature (Fig. 4E-F). Due to the
294 uncertainty in the subsurface properties' variations, the range in estimated temperatures is large.
295 The results show an annual variability with minimum temperatures in late spring, and maximum
296 temperatures in late summer. For the graminoid area (Fig. 4E), September 2017 were on average
297 -0.76°C, while below the eastern and western shrubs temperatures were slightly warmer at -
298 0.72°C and -0.66°C (Fig. 4F), respectively. Temperature was on average 0.20°C higher at the
299 end of summer 2019 than recorded in 2017 (0.11°C higher in 2018). Given the uncertainties in
300 the subsurface properties and related petrophysical relationships, temperatures during this two-
301 year period increased by at least 0.09°C. During the same period, a temperature sensor at 1.5m
302 bgl recorded an increase of 0.08°C, at a location where a smaller resistivity change was observed
303 (-16.9% compared to -37.9%). Starting at slightly warmer temperatures, eastern and western
304 shrubs had deep temperatures increasing by about 0.12 and 0.11°C, respectively. Here, direct
305 temperature measurements at 1.5m depth showed consistently unfrozen conditions, and end of
306 summer temperatures increased by 2.22 and 2.05°C in the eastern and western shrubs,
307 respectively. This change in unfrozen conditions would relate to an about 4% change in
308 resistivity, and hence is in agreement with the 3.8% observed change.



309

310 **Figure 4 Electrical resistivity indicating variable subsurface warming of up to 0.2°C within**
 311 **a two year period.** (A) Baseline resistivity model indicating areas analyzed in (E) and (F).
 312 Distribution of annual changes in resistivity from the start of monitoring in September 2017 to
 313 the end of summer of (B) 2018, and (C) from 2018 to 2019. (D) Laboratory-derived temperature-
 314 resistivity relationship. (E-F) temperature variation for deep permafrost bodies (boxes in A-C)
 315 derived from applying the petrophysical relationship.

316 7 Discussion and Conclusion

317 We investigated the subsurface response to both rapid and longer term perturbations
 318 along a transect located in a transitional, discontinuous permafrost environment on the Seward
 319 Peninsula. Our analysis highlights that the thermohydrological response to snowmelt and rainfall
 320 in this transitional permafrost environment is rapid and penetrates to depths of >10m. The data
 321 show that the response of these systems is driven by the heterogeneity in snowpack, which at this
 322 scale is highly influenced by vegetation and topography. Rapid propagation of snowmelt and
 323 precipitation energy were observed in shrub dominated landscapes, while the frozen ground
 324 below the thin snowpack of graminoid areas prevented rapid and deep movement. While

325 observed on a local scale, we expect those processes to be representative for similar
326 environments throughout the Arctic.

327 Our results show a clear increasing trend in permafrost temperatures over the two year
328 monitoring period. Larger changes were recorded in the graminoid, which showed higher
329 resistivities and hence lower temperatures at the start of the monitoring period. Assuming similar
330 climatic conditions, the estimated temperatures and temperature changes would likely cause
331 permafrost at this site to disappear within the next decade. These conclusions are robust to
332 common uncertainties associated with geoelectrical measurements (see supporting information
333 for more detail). Given the expected increase in winter snow accumulation and increased
334 frequency of summer atmospheric rivers, these processes may even be accelerated, as the thicker
335 snow pack will better insulate the ground from freezing temperatures, and early summer rainfall
336 will easily infiltrate into the subsurface, thereby driving advective heat transport into the
337 permafrost bodies. Projecting local observations to regional trends, the southern Seward
338 Peninsula may see a transition from a discontinuous permafrost environment to sporadic
339 occurrences of permafrost within the next few decades, which is supported by recent modelling
340 studies (Debol'skiy et al., 2020). This will impact hydrological fluxes, where increasing hydraulic
341 conductivities will enable improved infiltration through and drainage of shallow soil layers,
342 resulting in a change to plant water availability throughout the year. This will also result in
343 significant changes to latent and sensible heat fluxes (Yoshikawa & Hinzman, 2003), and likely
344 alter greenhouse gas emissions, resulting in increasing CO₂ and decreasing CH₄ emissions
345 (Lawrence et al., 2015). These changes will be accompanied by changes in vegetation types, as
346 has been seen in response to wildfires and rapidly degrading permafrost in other areas (Frost et
347 al., 2020). Although this study focused on a natural ecosystem, even faster changes can be
348 expected for developed areas, with severe impacts on infrastructure and communities due to
349 permafrost thaw.

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352 enabling the ERT monitoring system. This research has been supported by the Office of
353 Biological and Environmental Research in the DOE Office of Science (grant no. DE-AC02-
354 05CH11231). Data of this study is available from the NGEA Arctic data portal
355 (<https://doi.org/10.5440/1728709>).

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