# Authors

Kang Wang, Elchin Jafarov, Irina Overeem, Vladimir Romanovsky, Kevin Schaefer, Gary Clow, Frank Urban, William Cable, Mark Piper, Christopher Schwalm, Tingjun Zhang, Alexander Kholodov, Pamela Sousanes, Michael Loso, and Kenneth Hill



# A synthesis dataset of permafrost-affected soil thermal conditions for Alaska, USA

Kang Wang<sup>1</sup>, Elchin Jafarov<sup>2</sup>, Irina Overeem<sup>1</sup>, Vladimir Romanovsky<sup>3</sup>, Kevin Schaefer<sup>4</sup>, Gary Clow<sup>1</sup>, Frank Urban<sup>5</sup>, William Cable<sup>3,9</sup>, Mark Piper<sup>1</sup>, Christopher Schwalm<sup>6</sup>, Tingjun Zhang<sup>7,10</sup>, Alexander Kholodov<sup>3</sup>, Pamela Sousanes<sup>8</sup>, Michael Loso<sup>8</sup>, and Kenneth Hill<sup>8</sup> <sup>1</sup>CSDMS, Institute of Arctic and Alpine Research and Department of Geological Sciences,

University of Colorado Boulder, Boulder, CO 80309, USA <sup>2</sup>Los Alamos National Laboratory, Los Alamos, NM 87545, USA <sup>3</sup>Geophysical Institute Permafrost Laboratory, University of Alaska, Fairbanks, AK 99775, USA <sup>4</sup>National Snow and Ice Data Center, Cooperative Institute for Research in Environmental Sciences, University of Colorado Boulder, Boulder, CO 80309, USA <sup>5</sup>U.S. Geological Survey, Lakewood, CO 80225, USA <sup>6</sup>Woods Hole Research Center, Falmouth, MA 02540, USA <sup>7</sup>MOE Key Laboratory of Western China's Environmental Systems, College of Earth and Environmental Sciences, Lanzhou University, Lanzhou 730000, China <sup>8</sup>National Park Service Arctic Central Alaska Inventory and Monitoring Networks Fairbanks, AK 99709, USA <sup>9</sup>Alfred Wegener Institute Helmholtz Center for Polar and Marine Research, 14473 Potsdam, Germany <sup>10</sup>University Cooperation for Polar Research (UCPR), Beijing 100875, China

Correspondence: Kang Wang (kang.wang@colorado.edu)

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**Abstract.** Recent observations of near-surface soil temperatures over the circumpolar Arctic show accelerated warming of permafrost-affected soils. The availability of a comprehensive near-surface permafrost and active layer dataset is critical to better understanding climate impacts and to constraining permafrost thermal conditions and its spatial distribution in land system models. We compiled a soil temperature dataset from 72 monitoring stations in Alaska using data collected by the U.S. Geological Survey, the National Park Service, and the University of Alaska Fairbanks permafrost monitoring networks. The array of monitoring stations spans a large range of latitudes from 60.9 to 71.3° N and elevations from near sea level to  $\sim$  1300 m, comprising tundra and boreal forest regions. This dataset consists of monthly ground temperatures at depths up to 1 m, volumetric soil water content, snow depth, and air temperature during 1997–2016. These data have been quality controlled in collection and processing. Meanwhile, we implemented data harmonization evaluation for the processed dataset. The final product (PF-AK, v0.1) is available at the Arctic Data Center (https://doi.org/10.18739/A2KG55).

# 1 Introduction

Permafrost is frozen ground that remains at or below  $0 \,^{\circ}$ C for at least two consecutive years and may be found within about a quarter of the terrestrial land area in the Northern Hemisphere and 80% of the land area in Alaska (Brown et al., 1998; Zhang et al., 1999; Jorgenson et al., 2008). A continuous increase in near-surface air temperatures over the

Alaskan Arctic (Romanovsky et al., 2015; Wang et al., 2017) causes warming and thawing of permafrost, which is expected to continue throughout the 21st century with impacts on ecosystems and infrastructure (Callaghan et al., 2011; Hinzman et al., 2013; Liljedahl et al., 2016; Shiklomanov et al., 2017; Melvin et al., 2017). Thaw may have global consequences due to the potential for a significant positive cli-

mate feedback related to newly released carbon previously stored within the permafrost (Abbott et al., 2016; Schaefer et al., 2014; Knoblauch et al., 2018). Modeling studies indicate that greenhouse gas emissions following thaw would amplify current rates of atmospheric warming (McGuire et al., 2018). However, large uncertainties exist regarding the timing and magnitude of this permafrost-carbon feedback, in part due to challenges associated with the representation of permafrost processes in the climate models and the lack of comprehensive permafrost datasets with which to test such models (Koven et al., 2015; McGuire et al., 2018). There is an immediate need for ready-to-use reliable near-surface permafrost datasets, including ground temperatures, soil moisture, and related climatic factors (such as air temperature and snow depth), which can serve as benchmarks for the modeling community and help evaluate potential physical, societal, and economic impacts.

The permafrost extent map by Brown et al. (1998) is one of the most widely used metrics for comparing permafrost model results against ground-based data (Koven et al., 2015; McGuire et al., 2018). Another widely used dataset in model validation is the Russian soil temperature dataset of daily ground temperature measurements at different depths ranging from 0 to 3.2 m for 51 years (Sherstiukov, 2012). An additional ground temperature dataset includes daily-mean ground temperatures at various depths from 0 to 3.2 m at more than 800 stations in China, which for selected locations date back to the 1950s (Wang et al., 2015). In addition to shallow borehole ground temperatures data (i.e., depths less than 3 m) there are datasets that archive temperatures from much deeper boreholes (generally > 5 m) (Clow, 2014; Biskaborn et al., 2015). Moreover, the Circumpolar Active Layer Monitoring network measures active layer thickness - the maximum soil depth above permafrost that thaws every summer and refreezes in the winter (Brown et al., 2000; Shiklomanov et al., 2008). Here, we consolidated data from shallow borehole ground monitoring stations across Alaska from multiple government agencies. Shallow borehole data are important because they record the most immediate response to the changing environmental conditions, whereas deep ground temperatures take extensive time to respond.

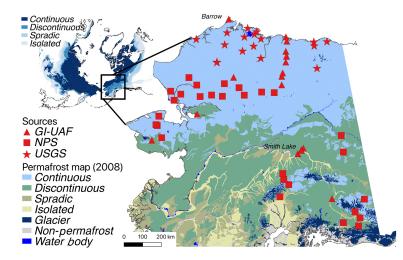
A typical permafrost monitoring station consists of an air temperature sensor, a snow depth sensor, soil moisture sensors, and soil temperature sensors. In situ observations of ground temperatures from the Alaskan Arctic region have been dispersed over different monitoring efforts, which are spread over varying time spans, and are observed at nonstandardized depths. The maximum depth of a typical monitoring station ranges from 1 to 3 m below the ground surface. However, not all stations use this design. For example, the National Park Service of Alaska network does not collect soil moisture data. Also, data from permafrost monitoring stations are not archived in a common standardized format and are hosted by different academic and government agencies, such as the Arctic Data Center, the Global Terrestrial Network for Permafrost (GTN-P), the Long Term Ecological Research Network (LTER), and the U.S. Geological Survey (USGS). Thus, we compiled a ready-to-use permafrost dataset in order to allow for efficient data retrieval and processing for permafrost-related analyses.

We compiled the first integrated shallow ground temperatures dataset for permafrost-affected soils across Alaska from the three most reliable monitoring networks operating over the past several decades: the Geophysical Institute Permafrost Laboratory at the University of Alaska Fairbanks (GI-UAF), the National Park Services in Alaska (NPS), and the USGS. This synthesis permafrost dataset for Alaska (PF-AK, version 0.1) includes measured air and ground temperatures at depth intervals up to 1.0 m, snow depth, and soil volumetric water content (VWC) for 72 permafrost monitoring stations across the state of Alaska. Detailed information and metadata are provided for the compiled dataset so that potential users can have a full understanding of the data and their associated limitations. Furthermore, two types of data evaluation were implemented: (i) testing for inconsistencies between air and ground temperature trends and (ii) the use of the snow and heat transfer metric (SHTM) to validate the relations between seasonal temperature amplitudes and snow depth. These technical evaluations are useful for proving data harmonization and reusing these data.

## 2 Data sources and processing

# 2.1 Permafrost monitoring networks

Our synthesis permafrost dataset for Alaska (Fig. 1 and Table 1) is based on observed in situ data collected by the USGS, NPS, and GI-UAF teams. In the late 1990s, researchers at the GI-UAF established a near-surface permafrost monitoring system consisting of 27 stations across Alaska, primarily along the Trans-Alaskan Highway (Fig. 1) (Romanovsky et al., 2015). Similarly, the USGS installed permafrost stations to monitor permafrost conditions within the two federally managed areas on the North Slope, the National Petroleum Reserve Alaska and the Arctic National Wildlife Refuge. Since August 1998, the USGS has maintained 17 automated stations in the area, spanning latitudes from 68.5 to 70.5° N and longitudes from 142.5 to 161° W (Fig. 1) (Urban and Clow, 2017). NPS has monitored ground temperatures since 2004 at several sites in national parks (Hill and Sousanes, 2015). All monitoring stations are installed on undisturbed land (Fig. 2) at a minimum specified distance from nearby infrastructure. This installation protocol ensures no biases occur associated with anthropogenic or ecosystem disturbances, which is one of the main differences with traditional meteorological stations which are often associated with airstrips and villages in Alaska. A brief description of environmental characteristics of each site, including dominant soil and vegetation type, is summarized in Table 2. Due to the differences in the station design and description



**Figure 1.** Locations of the Geophysical Institute at the University of Alaska Fairbanks (GI-UAF), the U.S. Geological Survey (USGS), and the National Park Services (NPS) permafrost monitoring stations in Alaska. The basemap shows the permafrost distribution of Alaska compiled by Jorgenson et al. (2008).

used by the various teams, the soil and vegetation descriptions may not be fully comparable and are not available at all sites.

These networks utilize radiation-shielded thermistors (Campbell Scientific CSI 107 temperature probes) to monitor air temperature. In the GI-UAF and NPS network, the air temperature sensors were installed at 1.5 or 2.0 m above the ground surface, whereas the USGS network monitors air temperature at 3.0 m above the ground surface in order to minimize damage by wildlife.

Instruments used in ground temperature monitoring are specified in Table 3. To monitor near-surface ground temperatures, the networks use either a probe with several thermistors embedded within a single rod, typically 1.0 to 1.5 m long, or several individual Campbell Scientific 107 thermistors anchored at specified depths within a single hole. The thermistor temperature sensors are designed to record temperatures ranging from -30 to  $75 \,^{\circ}$ C, with the exception of the 107 sensors, which record temperatures from -35 to  $50 \,^{\circ}$ C.

An ice-bath calibration is a required procedure before installation of the GI-UAF temperature probes. This calibration includes placing the sensors into an insulated container filled with a mixture of ice shavings and distilled water, measuring the temperature, and recording the offset from 0 °C. The measured offset is then used to correct the temperature measurements. The average accuracy of these sensors is  $\pm 0.01$  °C (Romanovsky et al., 2008). For the USGS network, the thermistor sensors are installed inside a tight-fitting fluid-filled plastic tube, 1.25 m long, to measure ground temperatures at depths of 0.05, 0.10, 0.15, 0.20, 0.25, 0.30, 0.45, 0.70, 0.95, and 1.20 m (Urban and Clow, 2017). Newer USGS ground sensors are calibrated in the USGS temperature calibration facility while the older ones were calibrated in situ using an inversion (Urban and Clow, 2017). The NPS has three to four soil temperature sensors (CSI-107) installed in individual holes at depths of 0.10, 0.20 and 0.50 m, and at several locations an additional sensor is located at 1.00 m. The ground-measurement depths vary station by station within the GI-UAF network, typically ranging from the ground surface (i.e., 0 m) to 1 m below the ground surface. It is important to note that for most of the installed probes, frost heave occurs with time, and heaving depths are adjusted accordingly by subtracting the heaving values yearly. The USGS and NPS teams estimate frost heave by using ground temperature data from the topmost thermistor (at a depth of 0.05 or 0.10 m). If the temperature of the top thermistor during the thaw period exceeds air temperature, then the sensor is considered exposed or partly exposed to solar radiation. The GI-UAF team measures frost heave at every site and then subtracts heave depth from known sensors depths to correct for heaving (Romanovsky et al., 2008). Each team corrects for heaving every summer, and corrections are applied before releasing data. Our presented data thus already account for frost heave and consist of corrected ground temperatures.

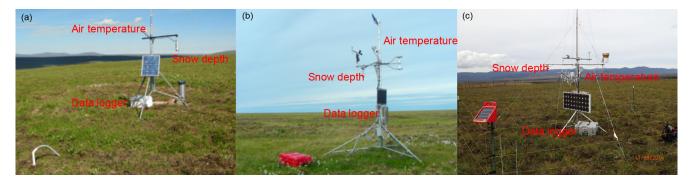
Both the USGS and the GI-UAF networks measure liquid soil moisture using a HydraProbe sensor developed by Stevens Water Monitoring Systems Inc. The Stevens HydraProbe has a reported accuracy of  $\pm 0.03 \text{ m}^3 \text{ m}^{-3}$  (Bellingham, 2015). Each volumetric water content sensor was calibrated in accordance with the manufacturer's recommendations. Uncertainties associated with the sensor's sensitivity still exist under certain specific conditions, e.g., for peat. The measured liquid soil moisture from a HydraProbe cannot be directly compared with the total soil moisture content values produced by land system models because in most of the models, soil moisture includes both ice and liquid water, whereas HydraProbe sensors only measure liquid soil moisture. The

Name	Latitude	Longitude	Onset	Last		Number	of availab	le annual s	tatistics		Snow depth	Source
					MAAT	MAGST	MAGT 0.25 m	MAGT 0.5 m	MAGT 0.75 m	MAGT 1 m	-	
Awuna1	69.17	-158.01	1998	2004	3	2	2	2	2	2	1	USG
Awuna2	69.16	-158.03	2003	2015	7	1	1	1	1	1	5	USC
Camden Bay	69.97	-144.77	2003	2015	7		1	1	1	1	1	USC
Drew Point	70.86	-153.91	1998	2015	11	12	12	12	12	12	8	USC
East Teshekpuk	70.57	-152.97	2004	2015	1	1	1	1	1	1	1	USC
Fish Creek	70.34	-152.05	1998	2015	14	15	15	15	15	15	11	USC
Ikpikpuk	70.44	-154.37	2005	2015	9	4	5				5	USC
Inigok	69.99	-153.09	1998	2015	12	7	1	1	1	1	14	USC
Koluktak	69.75	-154.62	1999	2015	9	6	11	11	11	11	1	USC
Lake145Shore	70.69	-152.63	2007	2015	4		_	_	_	_	5	USC
Marsh Creek	69.78	-144.79	2001	2015	12	1	7	7	7	7	12	USC
Niguanak	69.89	-142.98	2000	2015	14	14	14	14	14	14	11	USC
Piksiksak	70.04	-157.08	2004	2015	1	7	1	1	1	1	8	USC
Red Sheep Creek	68.68	-144.84	2004	2015	7	1	6	6	6	6	7	USC
South Meade	70.63	-156.84	2003	2015	1	8	1	1	1	1	8	US
Tunalik	70.20	-161.08	1998	2015	13	8	14	14	14	14	13	US
Umiat	69.40	-152.14	1998	2015	14	13	13	13	13	13	11	US
Barrow 2	71.31	-156.66	2002	2016	4	9	8	8	8	6	4	GI-U
Boza Creek 1	64.71	-148.29	2009	2016	6	1	6	6	6	6	5	GI-U
Boza Creek 2	64.72	-148.29	2009	2016	6	6	6	6	6	6		GI-U
Chandalar Shelf	68.07	-149.58	1997	2016	11	11	14	14	2			GI-U
Deadhorse	70.16	-148.47	1997	2016	3	3	4	4	4			GI-U
Fox	64.95	-147.62	2001	2016	3		5	5	4			GI-U
Franklin Bluffs	69.67	-148.72	1997	2016	13	1	13	13	8			GI-U
Franklin Bluffs boil	69.67	-148.72	2007	2016		4	8	8	8			GI-U.
Franklin Bluffs interior boil	69.67	-148.72	2006	2016		6	9	7	6			GI-U
Franklin Bluffs wet	69.68	-148.72	2006	2016	3	3	3	3	5			GI-U
Galbraith Lake	68.48	-149.50	2001	2016	6	6	6	6	6			GI-U
Happy Valley	69.16	-148.84	2001	2016	6	8	8	8	8		4	GI-U
Imnaviat	68.64	-149.35	2006	2016	8	8	8	8	8			GI-U.
Ivotuk 3	68.48	-155.74	2006	2013	2	2	2	2	2			GI-U
Ivotuk 4	68.48	-155.74	1998	2016	6	5	5	5	4	1	6	GI-U.
Pilgrim Hot Springs Sag1 MNT (moist	65.09 69.43	-164.90 -148.67	2012 2001	2016 2016	2	2 3	2 12	2 12	2 12	2 1	3	GI-U. GI-U.
nonacidic tundra) Sag2 MAT (moist	69.43	-148.70	2001	2010	,	11	12	12	12	3		GI-U
acidic tundra)	09.45		2001	2010		11	11	11	11	5		01-0.
Selawik Village	66.61	-160.02	2012	2016	3	3	3	3	3	3	3	GI-U
Smith Lake 1	64.87	-147.86	1997	2016	9	9	9	9	9	9		GI-U
Smith Lake 2	64.87	-147.86	2006	2016	9	7	9	9	9	9		GI-U
Smith Lake 3	64.87	-147.86	1997	2016	12	5	5	8	8	8		GI-U
Smith Lake 4	64.87	-147.86	2006	2016	7	7	4	4	4	7		GI-U
UAF Farm	64.85	-147.86	2007	2016	7	6	7	7	5	5	4	GI-U
West Dock	70.37	-148.55	2001	2016	9	4	11	11	11		3	GI-U
Gakona 1	62.39	-145.15	2009	2016	5	5	5	5	5	5		GI-U
Gakona 2	62.39	-145.15	2009	2016	5	5	5	5	5	3		GI-U
ASIA2	67.47	-162.27	2012	2016	3		3	3			2	Ν
CCLA2	65.31	-143.13	2004	2016	11		9	11	11		8	Ν
CHMA2	67.71	-150.59	2012	2016	3		3	3	2		2	Ν
CREA2	62.12	-141.85	2004	2016	11	5	1	1	5	5	11	Ν
CTUA2	61.27	-142.62	2004	2016	11	5	11	11			9	Ν
DKLA2	63.27	-149.54	2004	2016	9		4	4	4	4	7	Ν
DVLA2	66.28	-164.53	2011	2016	4		3	3				Ν
ELLA2	65.28	-163.82	2012	2016	3		3	3			1	Ν
GGLA2	61.60	-143.01	2005	2016	1	5	9	1			5	Ν
HOWA2	68.16	-156.90	2011	2016	3		2	2			1	N
IMYA2	67.54	-157.08	2012	2016	3		3	3			1	Ν

 Table 1. Overview of the data from the permafrost monitoring stations in Alaska.

Name	Latitude	Longitude	Onset	Last		Number of available annual statistics										
					MAAT	MAGST	MAGT 0.25 m	MAGT 0.5 m	MAGT 0.75 m	MAGT 1 m						
KAUA2	67.57	-158.43	2012	2016	3		3	3			1	NPS				
KLIA2	67.98	-155.01	2012	2016	2		2	2			1	NPS				
KUGA2	68.32	-161.49	2014	2016	1		1	1			1	NPS				
MITA2	65.82	-164.54	2011	2016								NPS				
MNOA2	67.14	-162.99	2011	2016	4		2	2	2		1	NPS				
PAMA2	67.77	-152.16	2012	2016	2		2	2			2	NPS				
RAMA2	67.62	-154.34	2012	2016	1		1	1				NPS				
RUGA2	62.71	-150.54	2008	2016	4						2	NPS				
SRTA2	65.85	-164.71	2011	2016	4		2	2			3	NPS				
SRWA2	67.46	-159.84	2011	2016	1		1	1			2	NPS				
SSIA2	68.00	-160.40	2011	2016	4		3	3	2		2	NPS				
TAHA2	67.55	-163.57	2011	2016	3		1	1	1		3	NPS				
TANA2	60.91	-142.90	2005	2016	5		2	2			3	NPS				
TEBA2	61.18	-144.34	2005	2016	8		5	5			6	NPS				
TKLA2	63.52	-150.04	2005	2016	1	1					8	NPS				
UPRA2	64.52	-143.20	2005	2016	9	3	6	6			4	NPS				
WIGA2	63.81	-150.11	2013	2016	2		2	2			1	NPS				

 Table 1. Continued.



**Figure 2.** Typical permafrost observing stations. (a) Imnaviat site  $(68.64^{\circ} \text{ N}, 149.35^{\circ} \text{ W})$  in the GI-UAF network (source: http://permafrost. gi.alaska.edu/site/im1, last access: 15 December 2018); (b) the Drew Point station (70.86° N, 153.91° W) in the USGS network (source: http://pubs.usgs.gov/ds/0977/DrewPoint/DrewPoint.html, last access: 15 December 2018); (c) the Wigand site (63.81° N, 150.109° W) in the NPS network.

USGS network measures soil moisture at one depth, approximately 0.15 m below the ground surface in all cases. The soil moisture sensors depths vary between stations for the GI-UAF network because they are installed at representative depths depending on the soil profile and texture within the active layer. The GI-UAF network measures soil moisture typically at three different depths within the active layer, ranging from 0.10 to 0.60 m. The NPS network does not include moisture probes at any of their monitoring stations. Our processed dataset only presents the upper layer (up to 0.25 m) soil water content.

Snow depth is measured once per hour with a SR50 or SR50A ultrasonic distance sensor (Campbell Sci. Inc.) at all of the available stations. This downward-looking sensor is mounted on a crossarm typically at 2.5 m above the ground surface for the USGS and NPS networks, and 1.5 m above the ground surface for the GI-UAF network. The factory evaluated accuracy is  $\pm 0.01$  m or 0.4% of the distance to the ground surface. It is important to note that vegetation at the ground surface might influence shallow snow depth measurements.

## 2.2 Data processing workflow

All three networks apply data processing and qualitycontrol checks before release. Typically, quality control occurs shortly after annual summer field campaigns; the fully processed and quality-controlled data become publicly available a year after the data collection. In the

Table 2.	Brief	description	of vegetatio	n and soil	type of m	nonitoring	stations in Alaska.

Name	Vegetation	Soil type
Drew Point	Moist meadow, tussock-tundra complex	Silt
Fish Creek	Moist meadow, tussock-tundra complex	Silt
Inigok	Moist meadow, tussock-tundra complex	Silt
Tunalik	Moist meadow, tussock-tundra complex	Silty sand
Umiat	Moist tussock tundra	Silt
Barrow 2	Graminoid-moss tundra (wet and moist acidic)	Typic Histoturbel, Typic Aquiturbel
Boza Creek 1	Open black spruce forest	Pergelic Cryaquepts
Boza Creek 2		_
Chandalar Shelf	Alpine meadow with low shrubs	Ruptic-Histic Aquiturbel
Deadhorse	Graminoid-moss tundra and graminoid, prostrate-dwarf-shrub,	Terric Aquiturbel
	moss tundra (wet and moist nonacidic)	
Franklin Bluffs	Graminoid-moss tundra and graminoid, prostrate-dwarf-shrub,	Ruptic-Histic Aquorthel
	moss tundra	Rupue Insue Aquorator
Franklin Bluffs wet	Graminoid-moss tundra and graminoid, prostrate-dwarf-shrub,	_
I falikilli Diulis wet	moss tundra	
Galbraith Lake	Graminoid-moss tundra and graminoid, prostrate-dwarf-shrub,	Ruptic-Histic Aquiturbel
	moss tundra (wet and moist nonacidic)	Rupic-Histic Aquituibei
II		Duratia III-atia A antidarahat
Happy Valley	Tussock-graminoid, dwarf-shrub tundra and low-shrub	Ruptic-Histic Aquiturbel
<b>.</b>	tundra (moist acidic)	
Imnaviat	Tussock-graminoid, dwarf-shrub tundra and low-shrub	Typic Histoturbel,
	tundra (moist acidic)	Typic Aquorthel
Ivotuk 3	Horsetail-rich variation of nonacidic tundra	-
Ivotuk 4	Moss dominated	-
Sag1 MNT (moist	Moist nonacidic tundra	Pergelic Cryaquolls (43%), P. Cryaquepts (18%)
nonacidic tundra)		P. Cryoborolls (14%), others (25%)
Sag2 MAT (moist	Moist acidic tundra	Pergelic Cryaquepts (79%),
acidic tundra)		Histic Pergelic Cryaquepts (21 %)
Selawik Village	Upland dwarf birch-tussock shrub	-
Smith Lake 1	White spruce forest with high canopy	-
Smith Lake 2	Dense diminutive black spruce forest	-
Smith Lake 3	Forest surrounded by black spruce trees and tussock shrubs	-
Smith Lake 4	Hummocks of sedges (tussocks) and shrubby vegetation	-
	with sparse black spruce	
West Dock	Moist to wet tundra	Typic Aquahaplel
ASIA2	Dryas octopetala	Lithic Haplogelept
DVLA2	Arctagrostic latifolia, Petasites frigidus, Carex bigelowii,	Aquic Molliturbel
	Empetrum hermaphroditum, Ledum palustre,	
	Vaccinium uliginosum, Arctous alpina,	
	Hylocomium splendens, Lupinus arcticus, Salix pulchra	
ELLA2	Umbilicaria, Alectoria nigricans, Carex	Typic Haploturbel
HOWA2	Dryas octopetala, Salix phlebophylla	Typic Gelorthent
IMYA2 IMYA2	Dryas octopetala, Hierochloe alpine, Salix phlebophylla	Typic Gelorthent
KAUA2		Typic Gelorthent
KUGA2	Dryas octopetala, Vaccinium uliginosum Detala Europetana listera Ladore adversa	<b>21</b>
KUGAZ	Betula, Empetrum hermaphroditum, Ledum palustre,	Typic Gelorthent
	Vaccinium vitis-idaea	
MNOA2	Dryas integrifolia, Potentilla biflora	Typic Haploturbel
SRTA2	Betula, Ledum palustre, Loiseleuria procumbens, Stereocaulon,	Typic Haplogelept
	Flavocetraria cucullata, Vaccinium uliginosum	
SRWA2	Betula, Dryas octopetala	Typic Gelorthent
SSIA2	Dryas octopetala, Arctous alpinus, Lupinus arcticus, Rhytidium rugosum	Typic Haplorthel
TAHA2	Betula, Dryas octopetala, Vaccinium uliginosum,	Typic Gelorthent
UPRA2	Betula, Empetrum hermaphroditum, Ledum palustre, Picea glauca	Typic Dystrogelept

present version of the permafrost dataset, we use the USGS Data Series 1021, which includes data through July 2015 (https://doi.org/10.3133/ds1021; USGS data through July 2016 were released after the analysis presented in this paper Urban and Clow, 2018). The latest available quality-controlled data for the GI-UAF and NPS networks is through

August 2016. The GI-UAF data are available at http:// permafrost.gi.alaska.edu/sites\_map (last access: 15 December 2018), while NPS data are available from https://irma. nps.gov/DataStore/Reference/Profile/2240059 (last access: 15 December 2018) and https://irma.nps.gov/DataStore/ Reference/Profile/2239061 (last access: 15 December 2018).

Network	Temperature sensor	Data logger	Measurement depths (m)	Temperature ranges (°C)	Accuracy (°C)	Maintenance visits
USGS	MRC thermistor	CR10X or CR1000	Surface, 0.10, 0.20, 0.25, 0.30, 0.45, 0.70, 0.95, and 1.20 m (except for Lake145Shore, where only 0.25 m was available)	-30 to 75	0.01	July, August
GI-UAF	Campbell Scientific 107 MRC thermistor	CR10x or CR1000 CR10x or CR1000	Surface to $> 1$ m, but various in stations Surface to $> 1$ m, but various in stations	-35 to 50 -30 to 75	0.02 0.01	July, August July, August
NPS	Campbell Scientific 107	CR-1000 XT	Surface, 0.10, 0.20, 0.50, 0.75, and 1.00 m, but various in stations	-35 to 50	0.02	July, August

Table 3. Summary of ground temperature instruments from the USGS, GI-UAF, and NPS networks of Alaska, USA.

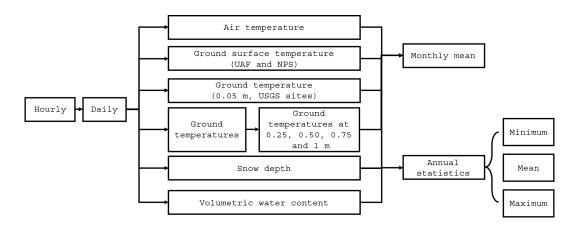


Figure 3. Schematic representation of the data processing workflow used to compile the permafrost dataset in the Alaska.

Figure 3 shows a schematic representation of the data processing workflow used to compile our synthesis dataset. To standardize the ground temperature depths in the dataset, we linearly interpolate ground temperatures for target depths: 0.25, 0.50, 0.75, and 1.00 m. We only implemented interpolation for those stations with measurements at least four depths, which assures a relatively small interval around the specified target depths. In addition, soil temperatures were not extrapolated beyond the maximum observed depth at any site; ground surface temperature is only calculated when supporting measurements are indeed available. Then, the calculated soil temperature at a specific depth depends on the linear slope between the observations at adjacent depths. Therefore, using a linear interpolation method does not necessarily result in a linear prediction from the ground surface to 1 m. We examined the uncertainty resulting from our linear interpolation method for the most data-sparse case, i.e., when we only have observations at four depths. To do so we selected the entire year of data without any missing values or depths and used linear interpolation to predict temperatures at five depths. Then we randomly selected only four depths, and interpolated again by using these four depths. This analysis demonstrates that while missing depths would reduce the number of available interpolation results, the influence from missing depths is limited.

The USGS and NPS network releases data at hourly resolution, whereas the GI-UAF network releases data at daily resolution. Since the most common model data output intervals of the land system and global climate models are monthly, the monthly means were calculated for all variables, including air and ground temperatures, snow depth, and soil water content. In addition to monthly data, annual means were calculated to allow evaluation of the relationship between air and ground temperatures. Thus, the dataset also provides annual statistics, including mean-annual air temperature (MAAT); mean-annual ground surface temperature (MAGST); mean-annual ground temperature at 1 m (MAGT at 0.25, 0.50, 0.75, and 1.00 m); mean and maximum seasonal snow depth (SND); and maximum, mean, and minimum soil volumetric water content (VWC).

Data from many sites have gaps and discontinuities due to harsh environmental conditions and wildlife that may interrupt the monitoring. There are various methods for calculating monthly means from incomplete time series data. For example, the USGS standards allow only 5 % of missing values for both monthly and annual mean temperature data (Urban and Clow, 2017). The World Meteorological Organization (WMO) does not allow gaps of more than three consecutive days or more than 5 days total from each monthly data series (Plummer et al., 2003). Other researchers are more tolerant of missing data, acknowledging the difficulty of data collection in remote cold regions. Menne et al. (2009) allow up to 10 missing days in a monthly time series. Bieniek et al. (2014) calculated monthly averages using at least 15 days. Here we calculated monthly means for any station which has at least 20 days of measurements for that specific month. The annual means were calculated from daily data. Due to the scarcity of the data, we only calculate the annual means for those years with a coverage of at least 90 % of the daily data. For this reason, we separately present annual means for air and ground temperatures as well as soil moisture, derived from daily data.

During the dataset compilation, we identified similarly named sites with different installation times and locations that do not match precisely. It is important to note that these sites, even when located nearby each other, may have considerably different environmental conditions, and thus, different ground temperature thermodynamics. A unique name is assigned to each site. Deadhorse site, maintained by GI-UAF, and Awuna site, maintained by USGS, have new monitoring stations, and the old ones have been decommissioned. The new and retired systems ran simultaneously for a few months in order to evaluate the data consistency. The environmental conditions for the newer Deadhorse station remained the same, assuring data consistency. Environmental conditions between two monitoring stations at Awuna are quite different: the original Awuna site was located on a ridge, whereas the new site is in a valley 1.9 km away. Nevertheless, the temperature data are consistent between the old and new station at Awuna. The old site (Awuna1) did not monitor soil moisture, which would be expected to be more site-specific and spatially variable. Thus, in this dataset, we present both the new and old sites' records.

#### 2.3 Derived variables

We calculated three derived variables from monthly temperature curve at each site: (i) degree days of freezing (DDF), (ii) degree days of thawing (DDT), and (iii) frost number (FN). Nelson and Outcalt (1987) and Zhang et al. (1996) have demonstrated that these variables calculated from monthly data closely correspond to those calculated from daily data. DDT and DDF are given by

$$DDT = \int T(t)dt, \ T(t) > 0^{\circ}C$$
(1)

and

$$DDF = \int |T(t)| dt, T(t) \le 0^{\circ}C.$$
 (2)

The FN index was calculated for both air temperature and ground temperatures following Nelson and Outcalt (1987):

$$FN = \frac{\sqrt{DDF}}{\sqrt{DDF} + \sqrt{DDT}}.$$
(3)

Here, dt is a day. FN serves as a simplified index for the likelihood of permafrost occurrence. A FN index of 0.5 implies equal freezing and thawing index. When the FN index is > 0.5, it indicates that the annual period of freezing dominates thaw, implying climate conditions that promote permafrost.

#### 2.4 Data evaluation

Despite the fact that individual station observations had originally been quality controlled, we still need to examine our own results for data harmonization. Here we implemented two methods of evaluation. The first one compares the trends in air and ground temperature trends, while the second method examines the effects of snow on the ground's thermal state.

The primary objective of the trend analysis is to evaluate the consistency between trends at each station (for different depths) and between stations rather than inform interannual variability. Most of the estimated trends have a short observational period (see Table 1). We chose to show trends only for those stations with more than 10 available annual means. Currently, some of the time series are still too short to provide significant trends. As more data become available in the future, a more rigorous analysis will be possible. It is well known that climatic trend analysis requires more than 30 years of time series (IPCC, 2013). On the other hand, Box et al. (2005) showed that 15 years is sufficient for interannual variability diagnosis to be statistically significant. Since the time series for most of the stations do not exceed 15 years, we calculate trends for temperatures at different depths to determine inconsistencies between air and ground temperature trends in terms of signs' differences.

The second evaluation effort examines the physical mechanism among air temperature, snow cover, and ground thermal states, which is an auxiliary evaluation of the dataset. Seasonal snow cover will keep the ground warm by reducing cooling (or heat loss) during the winter (Yershov and Williams, 2004). Considering a semi-infinite column, the damping of the ground temperature annual cycle is dependent on both snow depth and soil thermal properties. In this study, the snow period is defined as October through March. We averaged the snow depth measurements over the period to obtain the effective snow depth (SND<sub>eff</sub>) (Slater et al., 2017). The amplitudes of air temperature (Ampair) and ground surface temperature (Ampgnd) were calculated following Slater et al. (2017), for those stations with available snow depth data. The snow and heat transfer metric (SHTM) captures the correlation between the normalized temperature amplitude

Table 4. Summary of the air, ground surface, ground temperature at 1 m, volumetric water content, and snow depth over the entire observation period.

Site	Air	(°C)	re		ound surfa mperature (°C)			Ground mperature t 1 m (°C)			VWC $(m^3 m^{-3})$	)	Snow depth (m)		
	Min	Mean	Max	Min	Mean	Max	Min	Mean	Max	Min	Mean	Max	Mean	Max	
Awuna1	-28.51	-10.61	9.62	-11.30	-4.16	2.79	-9.38	-4.52	-0.93				0.39	0.61	
Awuna2	-30.47	-9.88	11.60	-13.21	-3.34	8.10	-10.84	-4.43	-0.64	0.02	0.21	0.43	0.37	0.54	
Camden Bay	-28.89	-10.35	6.92				-14.47	-7.49	-1.20				0.20	0.26	
Drew Point	-28.62	-10.84	6.04	-20.60	-7.63	4.74	-16.02	-7.84	-1.68				0.18	0.29	
East Teshekpuk	-28.19	-10.27	7.79	-17.97	-6.26	4.07	-14.20	-6.91	-1.90	0.01	0.18	0.42	0.23	0.32	
Fish Creek	-29.07	-10.55	8.81	-16.85	-6.02	4.50	-14.11	-6.82	-1.17	0.01	0.17	0.41	0.20	0.28	
Ikpikpuk	-29.15	-10.27	9.21	-18.08	-5.49	5.60							0.22	0.37	
Inigok	-29.98	-10.58	10.55	-16.28	-4.80	7.73	-12.68	-5.58	-0.60	0.00	0.12	0.33	0.22	0.33	
Koluktak	-30.02	-10.18	11.64	-15.20	-3.77	8.75	-13.77	-4.69	1.16	0.02	0.13	0.36	0.20	0.30	
Lake145Shore	-28.72	-10.50	7.30	4607						0.06	0.21	0.41	0.28	0.42	
Marsh Creek	-26.51	-8.65	10.20	-16.87	-5.28	5.26	-14.39	-6.11	-0.82	0.03	0.16	0.41	0.19	0.25	
Niguanak	-27.80	-9.97	8.48	-18.13	-6.09	4.66	-14.87	-6.72	-1.02				0.15	0.21	
Piksiksak	-29.21	-9.93	10.71	-17.65	-5.76	6.21	-13.44	-5.94	-0.87				0.10	0.16	
Red Sheep Creek	-23.94	-6.81	12.88	-10.04	-2.76	8.84	-8.78	-3.56	-0.36	0.02	0.25	0.74	0.23	0.38	
South Meade	-29.90	-10.42	9.35	-19.91	-6.45	5.89	-15.74	-7.19	-1.12				0.19	0.29	
Tunalik	-28.26	-10.17	9.15	-21.58	-7.12	6.81	-16.18	-7.35	-0.92				0.17	0.28	
Umiat	-28.67	-9.84	11.18	-14.24	-4.66	4.71	-10.96	-5.14	-1.04	0.02	0.16	0.20	0.32	0.44	
Barrow 2	-26.55	-10.23	5.09	-19.17	-6.87	5.33	-15.46	-7.41	-1.59	0.02	0.16	0.39	0.14	0.22	
Boza Creek 1	-25.00	-3.20	16.03	-9.17	1.13	12.93	-4.58	-1.27	-0.29	0.00	0.20	0.55	0.18	0.36	
Boza Creek 2	-23.60	-2.18	16.31	-3.62	2.28	12.00	-0.46	0.09	1.23	0.06	0.22	0.40			
Chandalar Shelf	-23.66	-7.64	11.41	-9.54	-1.29	7.74				0.00	0.22	0.74			
Deadhorse	-28.04	-9.97	8.27	-14.89	-3.65	7.13				0.03	0.16	0.38			
Fox	-26.02	-2.99	16.03	14.65	2.00	0.20				0.08	0.24	0.40			
Franklin Bluffs	-30.15	-10.62	10.74	-14.65	-3.89	8.38				0.02	0.19	0.47			
Franklin Bluffs boil				-18.04	-4.15	11.99									
Franklin Bluffs				16.05	2.00	11.10									
interior boil	20.50	10.40	10.04	-16.85	-3.66	11.12									
Franklin Bluffs wet	-28.56	-10.49	10.84	-14.52	-3.36	10.28									
Galbraith Lake	-28.77	-9.35	10.72	-14.38	-3.45	9.34				0.02	0.14	0.21	0.27	0.47	
Happy Valley	-30.01	-9.49	12.30	-9.31	-1.63	7.19				0.02	0.14	0.31	0.27	0.47	
Imnaviat Ivotuk 3	-22.95 -29.85	-6.81	10.57	-8.48	-0.81 -1.14	8.54 6.99									
	-29.83 -29.10	-10.12	11.30	-9.97	-1.14 -1.24		5 16	1.90	0.52	0.00	0.27	0.77	0.43	0.60	
Ivotuk 4 Dilarim Hat Springs		-9.70	11.23	-9.21	-1.24 0.08	8.26	-5.16	-1.89 -2.30	-0.53 -0.27		0.27	0.77 0.73		0.00	
Pilgrim Hot Springs Sag1 MNT	-16.78 -26.72	-2.04 - 8.39	14.63 10.68	-11.95 -17.14	-4.27	13.52 9.48	-7.56 -13.50	-2.30 -5.00	-0.27 0.24	0.00	0.30 0.20	0.75	0.06	0.21	
Sag2 MAT	-20.72	-0.39	10.08	-17.14	-4.27 -3.76	9.48 9.01	-13.30 -11.03	-3.00 -4.49	-0.45	0.04	0.20	0.40			
Selawik Village	20.26	-3.72	14.91	-11.16	-0.74	12.18	-7.99	-4.49 -3.09	-0.43 -0.45	0.02	0.20	0.03	0.05	0.12	
-	-20.26 -23.88			1						0.02	0.14	0.31	0.05	0.12	
Smith Lake 1 Smith Lake 2	-25.88 -24.91	$-3.06 \\ -3.74$	16.06 15.98	-11.29 -7.32	-0.11 1.10	12.98 12.86	-2.02 -4.10	-0.73 -1.11	$-0.26 \\ 0.00$	0.02	0.14 0.29	0.51			
Smith Lake 3	-24.91 -27.29	-3.74 -4.70	13.98	-7.32 -3.49	2.57	12.80	-0.33	0.00	0.00	0.07	0.29	0.39			
Smith Lake 4	-27.29 -26.15	-4.70 -3.58	18.20	-15.81	-2.37	9.68	-10.33	-3.81	-0.62	0.07	0.23	0.40			
													0.28	0.47	
UAF Farm West Dock	-22.09 -28.82	-1.48 -10.53	16.57 6.81	-10.91 -20.30	$0.68 \\ -6.68$	13.00	-0.83	1.18	5.43	0.01	0.20	0.55	0.28	0.47 0.09	
Gakona 1	-28.82 -23.06	-10.53 -2.76		-20.30 -5.29	-0.08 1.55	5.46 11.26	-1.62	-0.63	-0.22	0.01	0.20	0.55	0.04	0.09	
Gakona 2	-23.00 -23.01	-2.76 -2.45	13.70	-5.54	1.35	9.63	-1.02 -0.72	-0.03 -0.18	-0.22 0.75						
ASIA2	-25.01 -15.10	-2.43 -3.20	14.00 12.24	-5.54	1.55	9.03	-0.72	-0.18	0.75				0.02	0.07	
CCLA2	-13.10 -27.39	-3.20 -4.52	12.24										0.02	0.07	
CHMA2	-27.39 -15.97	-4.32 -5.24	9.81										0.33	0.32	
CREA2	-16.41	-3.24 -3.87	8.57	-12.35	-1.78	11.22	-6.00	-2.13	0.35				0.04	0.08	
CTUA2	-14.15	-2.52	8.61	-12.83	-1.09	12.43	0.00	2.13	0.55				0.12	0.21	
DKLA2	-14.13 -17.19	-2.32 -3.32	10.72	12.05	1.07	12.73	-3.33	1.22	7.03				0.08	0.10	
DKLA2 DVLA2	-17.19 -21.84	-5.32 -5.38	10.72					1.22	1.05				0.59	0.04	
ELLA2	-21.84 -17.18	-3.38 -4.81	9.93										0.29	0.43	
GGLA2	-17.18 -13.51	-4.81 -2.01	9.93 9.13	-1.50	2.54	12.18							0.29	1.45	
HOWA2	-13.31 -23.29	-2.01 -6.64	9.15	-1.50	2.34	12.10							0.90	0.11	
IMYA2	-25.29 -15.30	-6.04 -5.19	8.96										0.05	0.11	
111117742	-15.50	-5.19	0.90										0.15	0.20	

Site	Air	temperatu (°C)	re		und surfa mperature (°C)			Ground emperatu at 1 m (°C	re		VWC (m <sup>3</sup> m <sup>-3</sup>	Snow depth (m)		
	Min	Mean	Max	Min	Mean	Max	Min	Mean	Max	Min	Mean	Max	Mean	Max
KAUA2	-21.65	-6.47	10.01										0.15	0.25
KLIA2	-19.10	-7.66	7.38										0.07	0.10
KUGA2	-16.74	-3.56	13.64										0.18	0.59
MITA2														
MNOA2	-18.78	-3.79	12.47										0.14	0.37
PAMA2	-18.00	-4.49	11.02										0.07	0.11
RAMA2	-17.93	-5.42	10.77											
RUGA2	-9.49	-0.53	10.45										0.50	0.83
SRTA2	-21.96	-4.69	11.77										0.06	0.16
SRWA2	-17.35	-3.15	13.89										0.34	0.68
SSIA2	-21.85	-5.86	11.27										0.02	0.06
TAHA2	-20.09	-4.48	11.58										0.09	0.20
TANA2	-13.83	-2.02	9.91										1.01	1.55
TEBA2	-17.27	-1.92	11.54										0.75	1.34
TKLA2	-18.48	-3.15	11.39	-6.93	1.63	13.17							0.15	0.25
UPRA2	-21.39	-4.91	11.36	-13.19	-1.69	12.80							0.33	0.48
WIGA2	-17.84	-1.55	13.21										0.10	0.15

Table 4. Continued.

difference ( $\Delta Amp_{norm}$ ) (i.e., Eqs. 4–6) and SND<sub>eff</sub>. Quantities Amp<sub>air</sub>, Amp<sub>gnd</sub>, and  $\Delta Amp_{norm}$  are given by

$$\operatorname{Amp}_{\operatorname{air}} = \left[\operatorname{Max}(T_{\operatorname{air}}) - \operatorname{Min}(T_{\operatorname{air}})\right]/2 \tag{4}$$

$$\operatorname{Amp}_{\text{gnd}} = \left[\operatorname{Max}(T_{\text{gnd}}) - \operatorname{Min}(T_{\text{gnd}})\right]/2$$
(5)

$$\Delta Amp_{norm} = \frac{Amp_{air} - Amp_{gnd}}{Amp_{air}}.$$
 (6)

## 3 Results

## 3.1 Overview of this dataset

Table 4 presents an overview of the data compiled in the dataset for Alaska. Our dataset comprises 41 667 data points in total. There are significant missing data (e.g., some stations do not have soil moisture sensors installed) and there are different observational periods for each sensor (e.g., air temperature sensors were installed often earlier than other sensors in some cases). Excluding the missing time series when certain instruments were not installed, the percentage of complete data is about 77 %.

Figure 4 shows an annual summary of our core variables, including mean annual air temperature, ground surface temperature, and ground temperatures at 0.25, 0.50, 0.75, and 1.00 m. Overall, mean-annual air temperatures are colder than -10 °C in the Alaskan Arctic, while in the southern mountain tundra regions they are close to freezing point (-0.5 °C at RUGA2 site). Mean-annual ground surface temperatures for 46 available sites range from -7.6 °C through

2.5 °C, which, as expected, is considerably warmer than the mean-annual air temperature. For most of the sites, ground temperatures could be determined at depths of 0.25 and 0.50 m (69 and 67 sites, respectively). Ground temperatures at depths of 0.25 and 0.50 m range roughly from -7.8 to 3.3 °C. Mean-annual ground temperature at 0.75 m varies from -7.5 to 1.2 °C over 49 available sites. Ground temperatures at 1 m could only be determined at 32 sites, most of which are located in the southern portion of the Alaskan Arctic ( $\sim 62^{\circ}$  N). Mean-annual ground temperatures at this depth range from -7.8 to 1.2 °C.

The VWC shown in Table 4 is from the upper part of the soil (i.e., depth of up to 0.25 m). The VWC measurements are mainly available from the North Slope of Alaska. Maximum VWC is important for understanding active layer dynamics during summer. Notably, the spatial variance of the maximum VWC is 3 times larger than that of the annual means. Three sites, Chandalar Shelf, Pilgrim Hot Springs, and Red Sheep Creek, were much wetter than other sites (maximum VWCs exceeding  $0.7 \text{ m}^3 \text{ m}^{-3}$ ). This is mainly because these sites are close to a water body.

Snow depth is spatially variable over Alaska, although with a general trend of increasing snow depth in the southern part of the state, according to the synthesis dataset (Fig. 5). In the Alaskan Arctic, snow cover is shallower than in the southeast region. The maximum seasonal snow depth was > 1.5 m at the Gates Glacier station (which is located near the glacier) in Wrangell St. Elias National Park. The lowest maximum snow depth occurs at West Dock near the Beaufort Sea in Prudhoe Bay, with only 0.09 m in 2010. Similar mag-

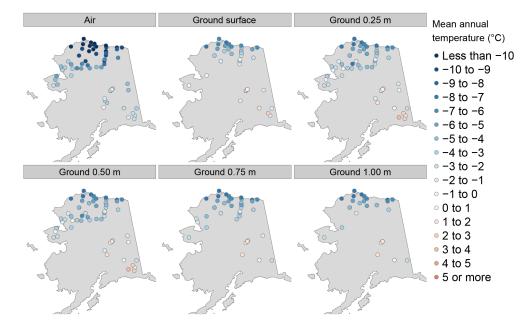


Figure 4. Overview of spatial distribution of mean annual air temperature, ground surface temperature, and ground temperatures at 0.25, 0.50, 0.75, and 1.00 m.

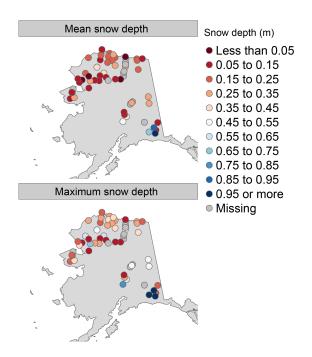


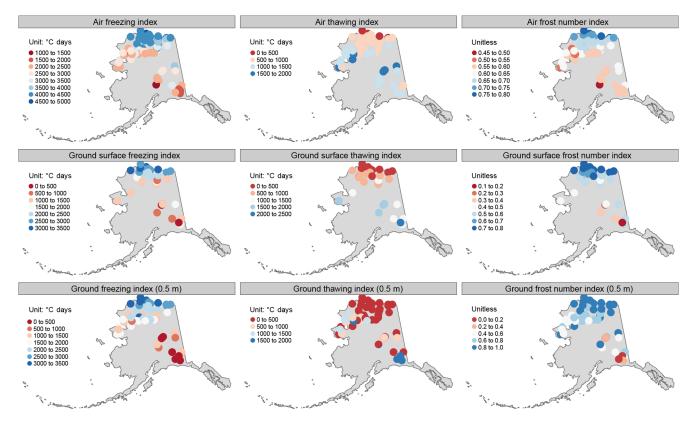
Figure 5. Overview of spatial distribution of snow depth, including annual mean snow depth and maximum snow depth.

nitudes of snow thickness were reported at West Dock during the period 1983–1993 (Zhang et al., 1997). The other two sites, Asik in Noatak National Park and Serpentine in Bering Land Bridge National Preserve, also showed a shallow snow cover in recent years. The thin snow cover is probably due to wind exposure.

## 3.2 Data evaluation

In this dataset, we derived the FN index for air and ground temperatures at various depths (Fig. 6 and Table 5). Because many stations do not have sensors at depths > 1 m, we report the DDT-DDF indices of air, ground surface, and 0.5 m below the ground surface in Fig. 6, with all available results listed in Table 5. Overall, almost all stations have an air FN above 0.5. Stations on the North Slope have both air and ground surface FNs exceeding 0.6. In interior and southern Alaska, air FNs are above 0.5, although the ground surface FNs are much lower due to the thicker snow cover in this region. In the Alaskan Arctic, DDTs at ground surface are generally lower than air according to the station observations. There are 13 stations with a zero DDT based on ground temperature data at 0.5 m. These results indicate a shallow active layer (< 0.5 m) at these sites. Another five stations have a DDT of 0.5 m ground temperature less than 10 °C days. The calculated frost number indices are consistent with the existing permafrost distribution map over Alaska (Jorgenson et al., 2008).

We examined the consistency among the trends of MAAT, MAGST, and MAGT at 1 m depth. Typically, if MAAT has a long-term positive trend, then MAGST is expected to have a positive trend, even if the rate is dampened (Romanovsky et al., 2015). Similarly, signs of trends in MAGST and MAGT at the depth of 1 m and MAAT and MAGT at 1 m depth are hypothesized to be consistent (Romanovsky et al., 2015). Here we show the annual mean temperatures at four stations, Drew Point, Fish Creek, Niguanak, and Tunalik, with 10 or more years of data (Fig. 7). Mean-annual air,



**Figure 6.** Overview of spatial distribution of freezing-thawing index from air, ground surface temperature, and ground temperature at 0.50 m. Frost number (FN) was derived from the freezing-thawing index according to Nelson and Outcalt (1987).

ground surface, and ground temperature at 1 m indicates consistent warming at rates of 0.07-0.18, 0.14-0.23, and 0.12- $0.22 \,^{\circ}\text{C}\,\text{year}^{-1}$ , respectively. A notable feature is that at Fish Creek, ground surface temperature and ground temperature at 1 m showed amplified warming rates compared to the magnitude of the air temperature increases, which can be explained by the significant increase of seasonal snow depth over the same period. There are six stations with relatively long records ( $\geq$  10 years) of air, ground surface, and ground temperature at 0.5 m for the same period. In other words, at these sites, the data used to estimate linear trends of air, ground surface, and ground temperature at 0.5 m were collected over corresponding years. Figure 8 shows that air temperature, ground surface, and ground temperature at 0.5 m have consistently positive trends. Furthermore, the trends in ground surface and 0.5 m were generally close.

There are several sites in a small area that indicated inconsistency in air temperature trends. The inconsistency is mainly due to different observational periods and the relatively short duration of records. For example, there are several Smith Lake (SL) permafrost monitoring stations which are located north of the University of Alaska Fairbanks campus and west of Smith Lake with varying environmental conditions. (SL1 is in a white spruce forest with high canopy; SL2 is in a dense diminutive black spruce forest; and SL3 is located at the edge of the forest surrounded by black spruce trees and tussock shrubs; and SL4 is characterized by hummocks of sedges (tussocks) and shrubby vegetation with sparse black spruce.) The environmental conditions at the SL3 site provide favorable conditions for permafrost existence. The SL3 site has the longest air temperature record, indicating a cooling trend over the observational period (Fig. 9a). After calculating the differences between measured data for all three sites, we applied corresponding corrections and extend the data at all three sites. The overlap period (2006–2012) showed a consistent variation with the roughly constant offset between SL2 and SL3. By using the offset, we extended the records at SL3 to 2015. Figure 9b shows that extending the time series reduces the trend magnitude and changes the negative sign of the SL3 trend to positive, demonstrating the important difference between trends derived from a complete longer time series and those derived from a sparse time series.

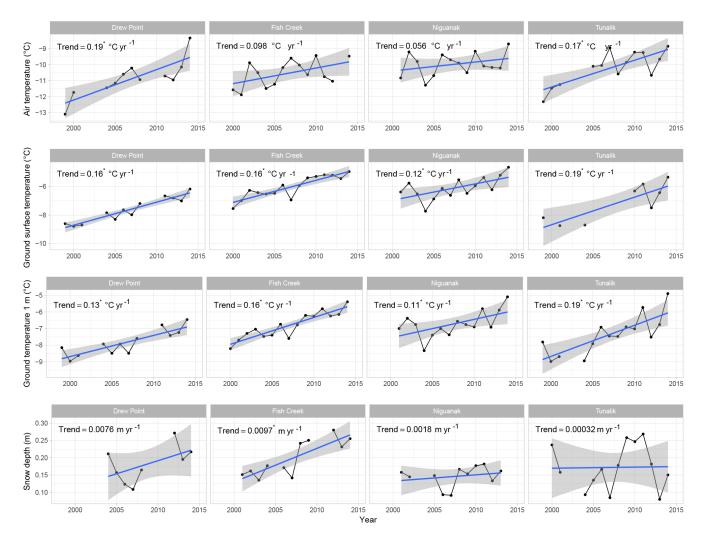
Finally, we examined the physical relations among air temperature, snow cover, and ground thermal state (Fig. 10). Across stations, effective snow depth was generally less than 0.4 m. The normalized temperature amplitude difference ( $\Delta Amp_{norm}$ ) that calculates the temperature difference between air and ground surface shows a positive linear relationship with effective snow depth. This correlation, the

**Table 5.** Summary of freezing index (DDF, °C days), thawing index (DDT, °C days), and frost number (FN, unitless) of air and ground temperatures over the entire observation period.

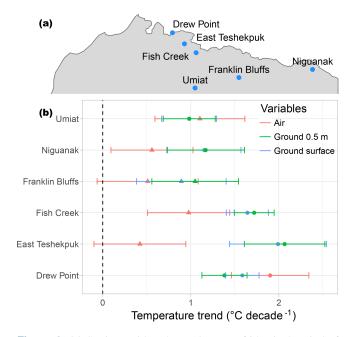
Site		Air		Gro	und surf	ace	Gro	ound 0.25	5 m	Gro	ound 0.5	0 m	Ground 0.75 m			Ground 1.00 m		
	DDF	DDT	FN	DDF	DDT	FN	DDF	DDT	FN	DDF	DDT	FN	DDF	DDT	FN	DDF	DDT	FN
Awuna1	4217	769	0.70	1750	196	0.75	1862	10	0.93	1878	0	1.00	1880	0	1.00	1880	0	1.00
Awuna2	4417	975	0.68	1740	807	0.59	1939	233	0.74	2086	7	0.95	2121	0	1.00	2095	0	1.00
Camden Bay	4493	482	0.75				2684	100	0.84	2858	0	1.00	2873	0	1.00	2860	0	1.00
Drew Point	4521	400	0.77	3221	327	0.76	3291	46	0.89	3280	0	1.00	3248	0	1.00	3231	0	1.00
East Teshekpuk	4298	576	0.73	2815	279	0.76	2964	18	0.93	2982	0	1.00	2951	0	1.00	2939	0	1.00
Fish Creek	4376	677	0.72	2582	328	0.74	2813	12	0.94	2821	0	1.00	2804	0	1.00	2789	0	1.00
Ikpikpuk	4356	718	0.71	2712	434	0.71	2685	225	0.78									
Inigok	4404	858	0.69	2268	708	0.64	2454	60	0.86	2491	0	1.00	2449	0	1.00	2423	0	1.00
Koluktak	4337	984	0.68	2034	856	0.61	2242	618	0.66	2309	325	0.73	2340	153	0.80	2355	54	0.87
Lake145Shore	4430	522	0.74															
Marsh Creek	3836	860	0.68	2526	408	0.71	2831	159	0.81	2863	20	0.92	2801	0	1.00	2776	0	1.00
Niguanak	4179	654	0.72	2798	339	0.74	2952	54	0.88	2960	1	0.98	2934	0	1.00	2900	0	1.00
Piksiksak	4263	886	0.69	2594	506	0.69	2700	66	0.86	2707	0	1.00	2657	0	1.00	2611	0	1.00
Red Sheep Creek	3249	1230	0.62	1208	989	0.52	1637	324	0.69	1715	58	0.84	1710	0	1.00	1667	0	1.00
South Meade	4477	727	0.71	3006	447	0.72	3186	45	0.89	3214	0	1.00	3187	0	1.00	3078	0	1.00
Tunalik	4213	725	0.71	3230	535	0.71	3258	138	0.83	3225	8	0.95	3160	0	1.00	3120	0	1.00
Umiat	4138	948	0.68	2114	374	0.70	2306	14	0.93	2271	0	1.00	2216	0	1.00	2189	0	1.00
Barrow 2	4241	325	0.78	2925	398	0.73	2996	85	0.86	3072	0	1.00	3049	0	1.00	3112	0	1.00
Boza Creek 1	3270	1634	0.59	959	1646	0.43	676	581	0.52	832	81	0.76	917	1	0.97	888	0	1.00
Boza Creek 2	3036	1704	0.57	278	1808	0.28	224	839	0.34	166	550	0.35	103	308	0.37			
Chandalar Shelf	3285	1049	0.64	1184	855	0.54	1352	55	0.83	1302	0	1.00	1388	0	1.00			
Deadhorse	4236	628	0.72	2070	654	0.64	2106	261	0.74	2144	101	0.82	2236	3	0.96			
Fox	3441	1618	0.72		0.54	0.04	192	442	0.40	2144	21	0.82	191	0	1.00			
Franklin Bluffs	4420	879	0.69	1964	820	0.61	2096	237	0.75	2114	61	0.85	2289	1	0.98			
Franklin Bluffs boil	4420	019	0.09	2339	1234	0.58	2293	792	0.63	2114	414	0.69	2018	193	0.76			
Franklin Bluffs				2339	1234	0.58	2293	192	0.03	2117	414	0.09	2018	193	0.70			
nterior boil				2192	1145	0.58	2132	498	0.67	2166	288	0.73	2073	111	0.81			
	4142	007	0.69	1873					0.67	1734					0.81			
Franklin Bluffs wet	4142	907	0.68		1100	0.57	1733	635			689	0.61	1702	68				
Galbraith Lake	4190	895	0.68	1875	955	0.58	2050	167	0.78	2110	14	0.92	2123	0	1.00			
Happy Valley	4293	1061	0.67	1167	781	0.55	1245	211	0.71	1337	36	0.86	1404	0	1.00			
Imnaviat	3212	954	0.65	994	1005	0.50	1017	460	0.60	1053	218	0.69	1086	93	0.77			
lvotuk 3	4332	948	0.68	1273	729	0.57	1134	127	0.75	1312	3	0.95	1312	0	1.00			
Ivotuk 4	4209	948	0.68	1105	933	0.52	1142	579	0.58	1248	120	0.76	1290	6	0.94	1038	0	1.00
Pilgrim Hot Springs	2025	1632	0.53	1346	1631	0.48	1723	168	0.76	1583	18	0.90	1465	1	0.97	1427	0	1.00
Sag1 MNT (moist																	_	
nonacidic tundra)	3840	912	0.67	2313	914	0.61	2209	521	0.67	2227	202	0.77	2259	36	0.89	2425	5	0.96
Sag2 MAT (moist																		
acidic tundra)				2012	900	0.60	2207	186	0.78	2287	44	0.88	2281	12	0.93	2098	3	0.96
Selawik Village	2556	1579	0.56	1266	1452	0.48	1626	148	0.77	1695	0	1.00	1608	0	1.00	1542	0	1.00
Smith Lake 1	3086	1659	0.58	1273	1581	0.47	488	70	0.73	469	1	0.96	429	0	1.00	415	0	1.00
Smith Lake 2	3254	1624	0.59	712	1723	0.39	779	392	0.59	810	120	0.72	781	13	0.89	748	1	0.96
Smith Lake 3	3510	1482	0.61	275	1739	0.28	227	773	0.35	114	514	0.32	60	324	0.30	36	137	0.34
Smith Lake 4	3384	1934	0.57	2084	966	0.59	1815	353	0.69	2064	39	0.88	2082	0	1.00	1996	0	1.00
UAF Farm	2779	1773	0.56	1216	1599	0.47	499	1043	0.41	279	959	0.35	135	949	0.27	51	891	0.19
West Dock	4491	475	0.75	3108	400	0.74	3181	22	0.92	3186	0	1.00	3121	0	1.00			
Gakona 1	3068	1361	0.60	483	1573	0.36	434	303	0.54	443	35	0.78	437	0	1.00	336	0	1.00
Gakona 2	3046	1402	0.60	564	1311	0.40	428	578	0.46	261	294	0.49	160	233	0.45	139	145	0.49
ASIA2	1861	1339	0.54				1657	1150	0.55	1617	1030	0.56						
CCLA2	3656	1559	0.60				1430	551	0.62	1162	23	0.88	1113	3	0.95			
CHMA2	2104	981	0.59				2222	936	0.61	1837	478	0.66	1537	358	0.67			
CREA2	2248	817	0.62	1481	1274	0.52	1412	725	0.58	1267	396	0.60	1131	129	0.07	1046	15	0.89
													1151	129	0.75	1040	15	0.05
CTUA2	1880	868	0.60	1510	1438	0.51	1434	870	0.56	1310	751	0.57	100	1000	0.20	201	007	0.24
DKLA2	2264	1084	0.59				725	1350	0.42	566	1216	0.41	428	1098	0.38	321	997	0.36
DVLA2	3031	1010	0.63				1742	360	0.69	1724	143	0.78						
ELLA2	2298	975	0.61		0000	0.1.5	1545	1030	0.55	1530	760	0.59						
GGLA2	1753	953	0.58	79	2028	0.16	17	1824	0.09	4	1642	0.05						
HOWA2	3292	901	0.66				3295	678	0.69	3111	516	0.71						
IMYA2	2038	880	0.60				1849	995	0.58	1887	547	0.65						
KAUA2	3027	904	0.65				1764	623	0.63	1674	452	0.66						
KLIA2	2763	624	0.68				2201	366	0.71	2257	208	0.77						
KUGA2	2057	1491	0.54				1255	1418	0.48	1245	1066	0.52						
MITA2										-			1					

#### Table 5. Continued.

Site		Air		Gro	und surf	ace	Gro	ound 0.2	5 m	Ground 0.50 m			Gro	ound 0.75	5 m	Ground 1.00 m		
	DDF	DDT	FN	DDF	DDT	FN	DDF	DDT	FN	DDF	DDT	FN	DDF	DDT	FN	DDF	DDT	FN
MNOA2	2447	1295	0.58				963	1050	0.49	1144	959	0.52	1059	704	0.55			
PAMA2	2374	1101	0.59				2135	611	0.65	2117	409	0.69						
RAMA2	2373	1066	0.60				1916	952	0.59	1854	1036	0.57						
RUGA2	1075	1250	0.48															
SRTA2	2998	1138	0.62				1192	1147	0.50	1063	1122	0.49						
SRWA2	2142	1510	0.54				928	1826	0.42	786	1516	0.42						
SSIA2	2993	1062	0.63				2234	771	0.63	2165	608	0.65	1789	526	0.65			
TAHA2	2702	1149	0.61				1590	1175	0.54	1565	1027	0.55	1399	631	0.60			
TANA2	1770	1053	0.56				171	1850	0.23	106	1505	0.21						
TEBA2	2237	1191	0.58				66	1985	0.15	28	1757	0.11						
TKLA2	2446	1151	0.59	669	1809	0.38												
UPRA2	2913	1083	0.62	1552	1481	0.51	1084	1142	0.49	884	832	0.51						
WIGA2	2246	1402	0.56				1053	289	0.66	1120	59	0.81						



**Figure 7.** Examples of time series of mean-annual air, ground surface, ground temperature at 1 m below ground surface, and snow depth. The black line shows the data time series, while the blue line is the estimated linear trend. Shading shows the standard error of the linear regression estimates. An asterisk indicates that the trend has a p value < 0.05.



**Figure 8.** (a) Stations with at least 10 years of identical period of air, ground surface, and ground temperature at 0.5 m. (b) Trend comparison of air temperature, ground surface temperature, and ground temperature at 0.5 m over 1997–2016. Trends were only estimated for those stations consisting of at least 10 years of data. Error bars represent standard errors from the linear regression analysis. Circles indicate trends with a *p* value  $\leq 0.05$ ; triangles indicate trends with a *p* value > 0.05.

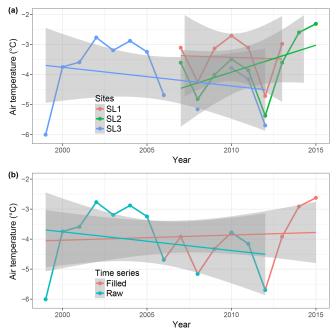
so-called SHTM (Slater et al., 2017), implies that snow insulation effects increase with effective snow depth, which is consistent with previous studies (Burn and Smith, 1988; Demezhko and Shchapov, 2001; Zhang, 2005; Morse et al., 2012; Slater et al., 2017). In addition, while snow is considered an important factor in winter ground temperature, vegetation can also affect the amplitude through its influence on summer temperature.

## 4 Data availability

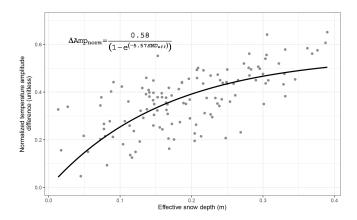
The latest compiled dataset is available at the Arctic Data Center (https://doi.org/10.18739/A2KG55, Wang et al., 2018).

## 5 Conclusions

Changes in near-surface ground temperatures over time are important indicators of a changing climate because they provide vital information on the response of the permafrost to climate change. In this paper, we synthesize data of 72 monitoring stations in Alaska, spanning a large range of latitudes from 60.9 to 71.3° N and elevations from near sea level to 1327 m in tundra and boreal forest regions. This dataset consists of monthly ground temperatures at 0.25 m depth inter-



**Figure 9.** Comparison between trends calculated using measured data at SL1, SL2, and SL3 (**a**). Panel (**b**) shows merged data series and corrected trends at SL3. Shading shows the standard error of the linear regression estimates.



**Figure 10.** Correlation between effective snow depth and normalized temperature amplitude difference between air and ground surface. The mathematical function of fit line follows the correlation showed in Slater et al. (2017).

vals up to 1 m, volumetric soil water content, snow depth, and air temperature during 1997–2016. The remoteness of the sites and the harsh environmental conditions inevitably result in missing data; our presented dataset is 77 % complete and consists of 41 667 data points. We describe the data compilation process, listing the workflow and the challenges associated with preparing the synthesis permafrost dataset for Alaska. These data were quality controlled during the data collection and processing stages. We also implemented a data harmonization evaluation for this compiled dataset. The PF-

AK v0.1 can be easily integrated into model–data intercomparison tools such as the International Land Model Benchmarking (ILAMB) tool (Luo et al., 2012). Standard unified protocols developed nationally and internationally to monitor near-surface permafrost thermal conditions could significantly improve and simplify the development of permafrost benchmark datasets such as that presented in this paper and reduce the amount of time and effort required for data processing. This dataset should be a valuable permafrost dataset that is worth maintaining in the future. It also provides a prototype of basic data collection and management for other permafrost regions.

Author contributions. KW, EJ, and IO designed this study. KW compiled this dataset and wrote the draft. VR, WC, and AK provided the data and technical description from the UAF-GI monitoring network. GC and FU provided support for the USGS monitoring network. PS, ML, and KH supplied data from NPS network. All authors discussed the results and contributed to the final paper.

**Competing interests.** The authors declare that they have no conflict of interest.

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