

# Thermokarst lake change and lake hydrochemistry: A snapshot from the Arctic Coastal Plain of Alaska

Lydia Stolpmann<sup>1,2</sup>, Ingmar Nitze<sup>1</sup>, Ingeborg Bussmann<sup>3</sup>, Benjamin M. Jones<sup>4</sup>, Josefine Lenz<sup>1</sup>, Hanno Meyer<sup>1</sup>, Juliane Wolter<sup>1,5</sup>, and Guido Grosse<sup>1,2</sup>

<sup>1</sup>Alfred Wegener Institute Helmholtz Centre for Polar and Marine Research, Permafrost Research Section, Potsdam, Germany

<sup>2</sup>Institute of Geosciences, University of Potsdam, Germany

<sup>3</sup>Alfred Wegener Institute Helmholtz Centre for Polar and Marine Research, Section Shelf Sea System Ecology, Helgoland, Germany

<sup>4</sup>Institute of Northern Engineering, University of Alaska Fairbanks, USA

<sup>5</sup>Institute of Biochemistry and Biology, University of Potsdam, Germany

**Correspondence:** Lydia Stolpmann (lydia.stolpmann@awi.de)

**Abstract.** The rapid climate warming is affecting the Arctic which is rich in aquatic systems. As a result of permafrost thaw, thermokarst lakes and ponds are either shrinking due to lake drainage or expanding due to lake shore erosion. This process in turn mobilizes organic carbon, which is released by permafrost deposits and active layer material that slips into the lake. In this study, we combine hydrochemical measurements and remote sensing data to analyze the influence of lake change processes, especially lake growth, on lake hydrochemical parameters such as DOC, EC, pH as well as stable oxygen and hydrogen isotopes in the Arctic Coastal Plain. For our entire dataset of 97 water samples from 82 water bodies, we found significantly higher CH<sub>4</sub> concentrations in lakes with a floating-ice regime and significantly higher DOC concentrations in lakes with a bedfast-ice regime. We show significantly lower CH<sub>4</sub> concentrations in lagoons compared to lakes as a result of an effective CH<sub>4</sub> oxidation that increased with a seawater connection. For our detailed lake sampling of two thermokarst lakes, we found a significant positive correlation for lake shore erosion and DOC for one of the lakes. Our detailed lake sampling approach indicates that the generally shallow thermokarst lakes are overall well mixed and that single hydrochemical samples are representative for the entire lake. Finally, our study confirms that DOC concentrations correlates with lake size, ecoregion type and underlying deposits.

## 1 Introduction

Over the last four decades, the Arctic has been warming up to four times faster compared to the global average (Rantanen et al., 2022). This amplified and rapid warming leads to thawing and degradation of permafrost (Biskaborn et al., 2019; Smith et al., 2022), storing about 30 % of the global soil organic carbon (OC) (Hugelius et al., 2014). The mobilization of previously stored OC is driven by permafrost degradation processes such as active layer thickening or thermokarst. These processes lead to subsequent microbial mineralization of OC into greenhouse gasses (Knoblauch et al., 2018; Heslop et al., 2020) or to the export as particulate (POC) or dissolved organic carbon (DOC) (Fuchs et al., 2020; Stolpmann et al., 2021, 2022). Thermokarst lakes are generally widespread in Arctic lowlands and are highly dynamic features (Grosse et al., 2013; Jones et al., 2022) as

thermokarst processes may result in expanding or shrinking lake surface areas (Nitze et al., 2018a). Thermokarst lakes are considered an important factor of the carbon balance of permafrost regions through emission of carbon dioxide (CO<sub>2</sub>) and methane (CH<sub>4</sub>) and sequestering organic matter in lake sediments (Schneider von Deimling et al., 2015; Walter Anthony et al., 2018; In 'T Zandt et al., 2020). For some lake types, such as Yedoma lakes, it has been shown that increased shore erosion and lake expansion lead to enhanced production of greenhouse gasses from lake sediments and taliks (Walter Anthony et al., 2016). While these processes enhance the emission of CO<sub>2</sub> and CH<sub>4</sub> to the atmosphere from Yedoma lakes, it is unclear to what extent this is also the case for the diverse types of non-Yedoma lakes such as in northern Alaska. Recent studies showed that CH<sub>4</sub> concentrations in lake waters on the Alaska North Slope are relatively low and dominated by young CH<sub>4</sub> that originates mostly in upper lake sediments (Townsend-Small et al., 2017; Elder et al., 2018). Though such measurements of CH<sub>4</sub> concentrations in water samples may miss CH<sub>4</sub> ebullition as an additional important source for lake CH<sub>4</sub> (Wik et al., 2016; Walter Anthony et al., 2021), it provides a generally important insight into the aquatic bio- and hydrochemistry of permafrost region lakes.

Ice-rich continuous permafrost landscapes in northern Alaska are strongly affected by lake-driven degradation processes, including thermokarst subsidence and lake formation, growth, and drainage as well as the subsequent formation of drained lake basins (Walvoord and Striegl, 2021; Jones et al., 2022). While the Alaska North Slope belongs to the continuous permafrost zone (Jorgenson et al., 2008) and many lakes are primary thermokarst lakes, other lake types are found such as oxbow lakes or intra-dune lakes that formed primarily due to other processes but nevertheless may experience secondary thermokarst dynamics such as shore erosion and talik formation (Jorgenson and Shur, 2007; Arp and Jones, 2009). The morphometric and hydrological characteristics as well as the change dynamics of lakes there are diverse and broadly linked to surface geological and permafrost characteristics (Hinkel et al., 2012a, b; Arp et al., 2016; Jones et al., 2017; Nitze et al., 2017; Jones et al., 2020; Lara et al., 2021; Lara and Chipman, 2021; Jones et al., 2023).

The thaw of permafrost in a catchment might have direct biogeochemical consequences on lake systems (Kokelj et al., 2005, 2009; Vonk et al., 2015; Gao et al., 2020; Stolpmann et al., 2022). In Northern Alaska, this includes the alteration of water exchange and runoff dynamics (Arp et al., 2012; Liljedahl et al., 2016) and the mobilization of previously frozen carbon (Kessler et al., 2012; Vonk et al., 2015). The erosion and transportation of freshly thawed sediment material into streams and lakes generally also leads to transfer of OC, both as POC and DOC (Abbott et al., 2015; Wild et al., 2019). While POC is only partially mineralized over longer time-scales and to a large proportion undergoes re-burial in thermokarst lake sediments (Walter Anthony et al., 2014), DOC is highly labile and easily decomposed and mineralized over very short time scales (Holmes et al., 2008; Vonk et al., 2013; Drake et al., 2015; Mann et al., 2015). Thawing of permafrost often leads to increasing mobilization of DOC (Drake et al., 2015; Mann et al., 2015; Spencer et al., 2015; Mohammed et al., 2022). Several landscape properties are influencing or regulating the concentration of DOC in surface waters (Stolpmann et al., 2021). In thermokarst-dominated landscapes, the concentration of DOC in surface waters is influenced by the surface area, the hydrological connectivity and the water residence time of a water body (Evans et al., 2017). The process of thermokarst lake formation itself leads to increasing DOC mobilization (Spencer et al., 2015) and is influencing the DOC concentration. For example, Manasypov et al. (2024) found that DOC concentration decreases from thaw depressions to ponds and lakes and increases again during lake drainage or shrinking both in the discontinuous and continuous permafrost zone of Western

Siberia. In northern Alaska, the influence of lake changes, such as lake shrinking and lake expansion, on lake hydro-chemistry parameters is not yet fully investigated and the direct impact of lake shore erosion on lake hydrochemistry parameters has not been considered yet. In addition to the biogeochemical parameters DOC and CH<sub>4</sub>, other hydrochemical parameters such as stable water isotopes, anions and cations, pH, and electrical conductivity may provide useful insights to the interactions between thermokarst lakes and landscapes with their specific permafrost and geological characteristics.

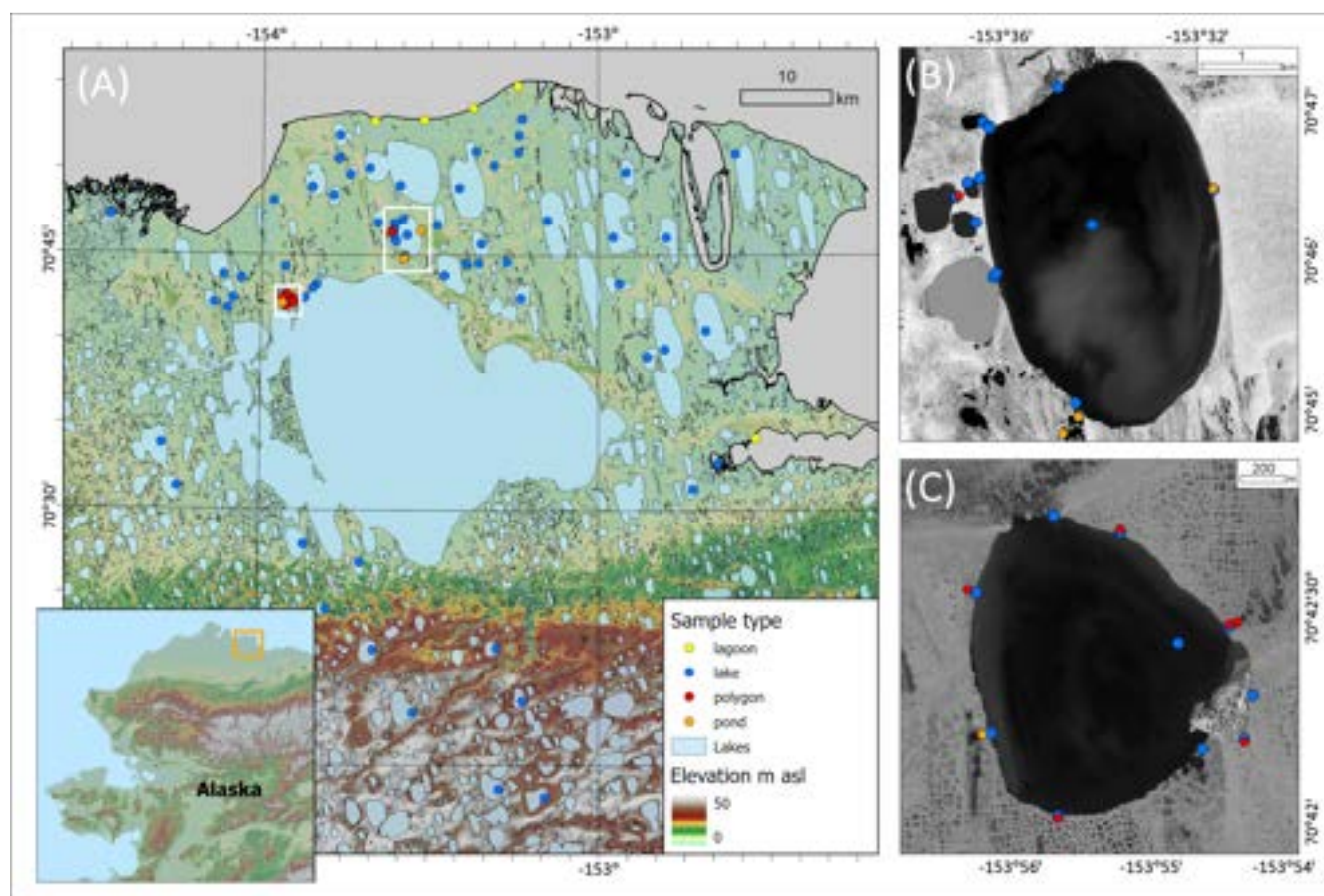
Since 20 % of the northern permafrost region are covered by areas that are rich in lakes and drained lake basins (Olefeldt et al., 2016; Jones et al., 2022), a better understanding of how hydrochemistry parameters of aquatic systems are driven by environmental factors in permafrost landscapes is key to better assess and quantify how ongoing and future permafrost thaw and lake change might impact lakes and their hydrochemical, biogeochemical, and biological roles in a warming Arctic (Vonk et al., 2015; Tank et al., 2020). Considering the large extent of the permafrost region, a combination of lake water hydrochemistry parameters with remote sensing could be useful to extrapolate field measurements to larger regions. Hence it is important to test if lake characteristics and lake dynamics such as changes in surface area or shore erosion correlate to lake water hydrochemistry such as DOC concentrations.

To investigate how a range of hydrochemical parameters, including lake DOC, might correlate with environmental data derived from remote sensing (lake size, area change, and shore erosion rates) and from ancillary datasets such as surface geology, permafrost, and ecoregion type maps we collected and analyzed hydrochemical data from a large number of thermokarst lakes, ponds, and lagoons on the Alaska North Slope. We aim at improving our understanding of the direct impacts of lake change processes on hydrochemical parameters and aquatic ecosystems in Northern Alaska, as this area is changing rapidly under current climate warming.

## 2 Study area

Our study area is located in the Arctic Coastal Plain (ACP) in northern Alaska from 70°00' to 70°55' N latitude and 152°32' to 154°27' W longitude. It covers the lowland regions surrounding Teshekpuk Lake and is part of the continuous permafrost zone with a permafrost thickness of up to 410 m (Jorgenson et al., 2008). The surface deposits are characterized by ice-rich marine and terrestrial sediments of the Late Quaternary (Hinkel et al., 2005; Jorgenson et al., 2008; Kanevskiy et al., 2013) that partially are also rich in soil OC (Fuchs et al., 2019; Bristol et al., 2021). The landscape is dominated by thermokarst lakes, drained lake basins, and lagoons with few remaining upland remnants left (Bergstedt et al., 2021). In the outer ACP north of Teshekpuk Lake, lakes cover 22.5 % and drained lake basins 61.8 % of the area (Jones and Arp, 2015). South of Teshekpuk Lake, in the inner ACP, the surface geology transitions to the Ikpikpuk Sand Sea, an area with extensive arrested sand dunes, ice-poor permafrost, and sparse tundra vegetation, but also with abundant lakes of non-thermokarst origin. Recent studies showed that some lakes in the Teshekpuk study area experience transitions from a bedfast-ice regime to a floating-ice regime due to long-term trends of lake ice thinning, marking a shift from lakes that still have frozen permafrost underneath to lakes that begin developing taliks (Arp et al., 2016; Engram et al., 2018). The opposite transition from floating-ice to bedfast-ice regime also happened for some lakes due to partial drainage (Jones and Arp, 2015; Engram et al., 2018), highlighting the

90 overall very dynamic landscape in the study area (Nitze et al., 2017).



**Figure 1.** Overview of the study sites (A) on the Alaskan North Slope (Digital Elevation Model) with sampling locations of sampled lagoons, lakes, polygons, and ponds, and sampling locations at the two focus lakes (B) TLO18\_12 and (C) TLO18\_13.

Our study area generally is influenced by an arctic climate with a mean annual air temperature of  $-12^{\circ}\text{C}$ , and cool summers and winters with mean temperatures of  $12^{\circ}\text{C}$  and  $-32^{\circ}\text{C}$  in Prudhoe Bay in July and January, respectively (Shulski and Wendler, 2007). Here, semi-arid conditions are found with a mean annual precipitation of 102 mm. The region is covered by wetland vegetation, dominated by polygonal tundra with wet graminoids and moss communities in the northern part and wet to moist sedge tussock communities in the southern part (Raynolds et al., 2005).

Apart from broad water sampling of lakes in the study area, we selected two focus lakes for more detailed field sampling around their entire shoreline in summer 2018. Focus lake TLO18\_12 is located at  $70^{\circ}34' \text{ N}$  and  $152^{\circ}32' \text{ W}$  in the northeast of Teshekpuk Lake (Fig. 1B). The lake covers an area of 1,102.5 ha and the surrounding area consists of glacio-marine deposits with peat and pebbly silt and has a maximum water depth of 2.5 m (Hinkel et al., 2016). Focus lake TLO18\_13 (informal

name: Peatball Lake) is located at 70°42' N and 153°55' W in the northwest of Teshekpuk Lake (Fig. 1C), covers an area of 114.6 ha, has a maximum water depth of also 2.5 m, is well-mixed (Lenz et al., 2016), and the wider lake area consists of old marine deposits with peat and pebbly silty sand. TLO18\_13 has previously been studied extensively for its change dynamics and depositional characteristics (Arp et al., 2011; Lenz et al., 2016; Fuchs et al., 2019) and its talik geometry (Creighton et al., 2018; Parsekian et al., 2019; Ohara et al., 2022).

### 3 Methods

#### 3.1 Field sampling and sampling analysis

During an Alaska North Slope summer expedition in 2018, we collected 97 water samples from 82 different water bodies. The waters samples were collected in the upper 20 cm of the water body and either from the lake center from the floatplane or from the lake shore. We classified the water bodies following the definition of lakes and ponds by Muster et al. (2017). According to this definition, ponds have a surface area below 1 ha (Rautio et al., 2011). Accordingly, we collected samples from lakes (n=79), ponds (n=3), polygonal ponds (n=7), and lagoons (n=8). Sampled lagoons were classified after Jenrich et al. (2024) into nearly-closed lagoons (n=4), limited-open lagoons (n=3), and a semi-open lagoon (n=1). For our detailed lake analysis, we collected 7 samples from lake TLO18\_12 and 10 samples from lake TLO18\_13.

For the hydrochemical analysis, water samples were collected with pre-rinsed 250 ml HDPE bottles and splitted in the field lab. For DOC measurements (n=97 samples), a part of the water sample was filtered with a 0.7 µm pore size syringe glass microfiber filter and filled in 20 ml glass headspace vials. We preserved our DOC samples with 30 % hydrochloric acid. In total, 87 samples for stable isotopes analysis were filled in 30 ml PE narrow neck bottles. EC in microsiemens per centimeter (µS cm<sup>-1</sup>) and pH value were measured for each sample in the field lab with a WTW MultiLab 540. For anions measurements of 20 samples, a part of the collected water was filtered with a 0.45 µm pore size syringe through a cellulose acetate membrane filter into 8 ml PE wide mouth bottles. For cations measurements of 19 samples, a part of the collected water was filtered with a 0.45 µm pore size syringe through a cellulose acetate membrane filter into 15 ml centrifuge tubes. Cations samples were preserved with 65 % nitric acid.

For further analysis, our samples were transported to labs of the Alfred Wegener Institute Helmholtz Centre for Polar and Marine Research in Potsdam and on Helgoland. In Potsdam, we used the Shimadzu TOC-VCPH with the non-purgeable organic carbon (NPOC) method to measure the concentration of DOC in milligrams per liter (mg L<sup>-1</sup>) in our water samples using the same approach as in Stolpmann et al. (2021). We used the Dionex DX-320 Ion Chromatography System to measure anions and the Perkin Elmer Optima 8300 DV Spectrometer to measure the cations. In the ISOLAB Facility of AWI Potsdam, we measured stable oxygen and hydrogen isotopes, given as delta values (δ<sup>18</sup>O, δD) in per mil difference to Vienna Standard Mean Ocean Water (‰ vs. V-SMOW) by using the equilibration technique with a Finnigan MAT Delta-S mass spectrometer (Meyer et al., 2000). The external error is better than ±0.1 ‰ for δ<sup>18</sup>O and ±0.8 ‰ for δD, respectively.

For a total of 44 lakes and lagoons, water samples were filled bubble free into 120 ml glass bottles, conserved with 0.2 ml of 25 % sulfuric acid and closed with butyl stoppers and aluminum crimps. In the home laboratory, a gas phase of 20 ml nitrogen



was created and the CH<sub>4</sub> content determined with a Shimadzu GC 2014 with FID (Bussmann et al., 2021). CH<sub>4</sub> concentrations  
 135 were calculated according to Magen et al. (2014) and given in nanomol per liter (nmol L<sup>-1</sup>).

### 3.2 Lake change

We used the lake change detection dataset by Nitze et al. (2018a, b) based on the methodology of Nitze et al. (2017) to extract  
 lake area in hectares (ha), net lake change (ha), net lake change in percentage (%), lake perimeter in meter (m), eccentricity  
 ratio, lake orientation in degree (°), lake solidity ratio (complexity of shoreline, measured as the ratio of pixels in the lake  
 140 to pixels of the convex hull image), and elevation in meter (m). This dataset covers a 15-year period from 1999-2014 based  
 Landsat remote sensing data. Due to the spatial coverage of Nitze et al. (2018b), this was applied for 70 water bodies of our  
 dataset. The original dataset covers large parts of northern, interior and western Alaska. As the original dataset did not include  
 annual lake shore erosion rates, we calculated this parameter in centimeter per year (cm yr<sup>-1</sup>) for the 70 samples by using net  
 lake change (ha) and lake perimeter (m) with the following equation:

$$145 \text{ erosion rate} = \frac{(\text{net lake change} \times 10,000) / \text{lake perimeter}}{(15 \text{ years} \times 100)} \quad (1)$$

where positive values mean lake expansion and negative values indicate lake shrinking. For both focus lakes TLO18\_12 and  
 TLO18\_13 with detailed lake water sampling along the lake shore line, we used georeferenced historical aerial imagery at 1  
 and 2.5 m spatial resolution from 1955 and 2002, respectively, to map their shorelines from both time steps in the ArcGIS  
 10™ desktop geographic information system. We then calculated the average annual lake shore erosion rates in meters per  
 150 year (m yr<sup>-1</sup>) for this 47-year period using the Digital Shoreline Analysis Software (DSAS) version 5 which is available as an  
 add-on tool to ArcGIS (Himmelstoss et al., 2018) following the method for thermokarst lake shore erosion mapping outlined  
 in Jones et al. (2011).

### 3.3 Additional datasets

We used additional datasets to add lake and lake surrounding properties to our analysis about the influence of lake change  
 155 processes on lake hydrochemistry.

In particular, we used the Landscape-Level Ecological Mapping of Northern Alaska and Field Site Photography datasets  
 by Jorgenson et al. (2013). Based on this GIS-ready dataset, we extracted for each lake centroid the ecoregion, physiography,  
 lithology, generalized geology, and soil landscape parameters. Mean elevation of all sampled water bodies was extracted from  
 an airborne IfSAR elevation model available for the Western ACP (Jones et al., 2012; Intermap, 2010). For 87 samples in our  
 160 dataset, we extracted information of the lake-ice regime in the winter season and classified floating or bedfast lake-ice regime  
 using the dataset by Grunblatt and Atwood (2014). The lake to ocean distance was calculated by measuring the nearest distance  
 of the shoreline to the coastline.

### 3.4 Statistical analysis

For our statistical analysis we used RStudio (version 4.3.2). We used the Kruskal-Wallis-Test to test the presence of significant differences between groups and the Dunn's Test to determine significant differences between groups. We used the Pearson's Product Moment to find significant correlations between two parameters.

## 4 Results

### 4.1 Hydrochemistry

#### 4.1.1 Electrical conductivity (EC) and pH

The EC in the sampled water bodies ranges from  $6.5 \mu\text{S cm}^{-1}$  in lakes to  $15,680 \mu\text{S cm}^{-1}$  measured in lagoons. The overall median is  $252.5 \mu\text{S cm}^{-1}$ , while the median for lakes is  $256 \mu\text{S cm}^{-1}$ , for ponds  $129.1 \mu\text{S cm}^{-1}$ , for polygonal ponds  $159.5 \mu\text{S cm}^{-1}$ , and for lagoons  $10,340 \mu\text{S cm}^{-1}$  (Table 2, Fig. A1-A). The highest EC was found in a classified limited open lagoon. Our statistical analysis resulted in significant negative correlations between EC and distance to the coast ( $p < 0.05$ ;  $\text{cor} = -0.3$ ) and significant positive correlations between EC and  $\delta^{18}\text{O}$  ( $p < 0.05$ ;  $\text{cor} = 0.3$ ) and  $\delta\text{D}$  ( $p < 0.05$ ;  $\text{cor} = 0.4$ ) (Table A1). Furthermore, differences of EC were significant among water body types with significantly higher EC in lagoons compared to lakes, polygonal ponds, and ponds ( $p < 0.05$ ; Fig. A1-A). In relationship with the surface geology, we found significantly higher EC in glacio-marine water bodies compared to water bodies located in eolian sand ( $p < 0.05$ , Fig. A1-B), significantly higher EC in water bodies located in old marine deposits compared to eolian sand deposits ( $p < 0.05$ ), and significantly higher EC in coastal waters compared to water bodies in eolian sand deposits ( $p < 0.05$ ). By analyzing EC in different ecoregion landscapes, we found significantly higher EC in water bodies of the Arctic peaty lowlands and coastal waters compared to the Arctic sandy lowlands ( $p < 0.05$ ).

The pH values range from 6.3 to 8.3 with a median of 7.9. In total, only 7 samples have slightly acidic pH values below 7 and were mainly measured in samples from polygonal ponds and ponds with documented brown water. Equal values were found in a bigger lake of 1,100 ha with a peaty shore and detected foam at the shore. Higher and more basic pH values have been measured in samples collected from lakes with clear or greenish water. Our statistical analysis resulted in a significant negative correlation between pH and DOC concentration ( $p < 0.05$ ;  $\text{cor} = -0.6$ ) and between pH and  $\delta^{18}\text{O}$  and  $\delta\text{D}$  ( $p < 0.05$ ;  $\text{cor} = -0.2$ ). We compared pH values in different water body types and found significantly higher pH values in lagoons and lakes compared to polygonal ponds ( $p < 0.05$ ).

**Table 1.** Range and median of hydrochemistry parameters by sampled lagoons, lakes, polygonal ponds, and ponds.

		<b>lagoons</b>	<b>lakes</b>	<b>polygonal ponds</b>	<b>ponds</b>
	<i>n samples/n lakes</i>	8/8	79/64	7/7	3/3
DOC [mg L <sup>-1</sup> ]	range	2.8 to 22.3	1.9 to 14.9	14.9 to 61.8	17.9 to 53.2
	median	8.2	5.2	19.5	22
EC [μS cm <sup>-1</sup> ]	range	18.7 to 15,680	6.5 to 10,380	102 to 252	115.3 to 182.4
	median	10,340	256	159.5	129.1
pH	range	7.8 to 8.1	6.9 to 8.3	6.3 to 7.7	6.6 to 7.8
	median	8	7.9	7.2	7
CH <sub>4</sub> [nmol L <sup>-1</sup> ]	range	14 to 146	11 to 1,031	NA	NA
	median	19	217	NA	NA
δ <sup>18</sup> O [‰ vs. V-SMOW]	range	-11.74 to -5.02	-14.36 to -8.84	-14.38 to -9.2	-12.22 to -11.18
	median	-10.47	-11.92	-11.23	-11.75
δD [‰ vs. V-SMOW]	range	-97.3 to -37.7	-116.4 to -83.52	-108.53 to -86.05	-100.31 to -93.4
	median	-83.6	-98	-96.9	-98.4
d excess	range	-6.2 to 2.4	-12.83 to 0.6	-12.43 to 6.5	-4.4 to 2.54
	median	-1.82	-2.2	-7.1	-3.84

## 190 4.1.2 DOC

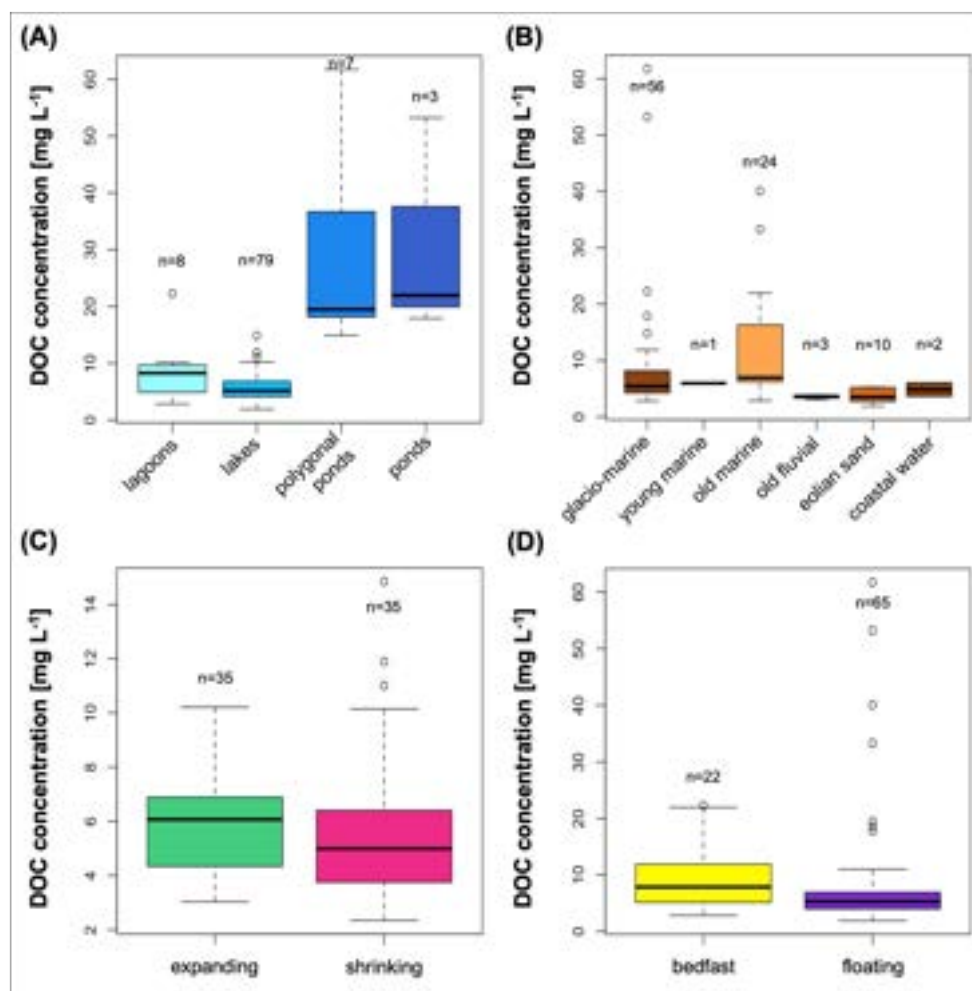
The DOC concentration of water bodies in our dataset has a median of 5.7 mg L<sup>-1</sup> and ranges from 1.9 to 61.8 mg L<sup>-1</sup>. We found the lowest DOC concentrations in Teshekpuk Lake and lakes south of it. Samples with a DOC concentration lower than 3 mg L<sup>-1</sup> have been collected from water bodies with very clear water. Samples of highest DOC concentration ranging from 14.9 to 61.8 mg L<sup>-1</sup> have been collected from polygonal ponds and ponds smaller than 1 ha in surface area nearby our two  
 195 focus lakes TLO18\_12 and TLO18\_13. One exception is a large, nearly closed lagoon with a DOC concentration of 22.3 mg L<sup>-1</sup> and a surface area of 52.2 ha.

Comparing the DOC concentration with other hydrochemical parameters, we found a significant negative correlation between DOC concentration and pH ( $p < 0.05$ ;  $\text{cor} = -0.6$ ). We also found differences according to water body type with significantly higher DOC concentration in polygonal ponds and ponds compared to lakes ( $p < 0.05$ ; Fig. 2A). Furthermore, we  
 200 detected differences in DOC concentration by geology. In particular, we found significantly higher DOC concentrations in water bodies located in glacio-marine deposits compared to eolian sand deposits ( $p < 0.05$ ), significantly higher water body DOC concentrations in old marine deposits compared to both old fluvial deposits ( $p < 0.05$ ) and eolian sand deposits ( $p < 0.05$ ; Fig. 2B). We also compared the DOC concentrations in water bodies that are characterized either by bedfast or by floating ice coverage in the winter season and found significantly higher concentrations in water bodies with bedfast ice ( $p < 0.05$ ; Fig.  
 205 2D).

The sampled lakes of this study are all located in the Arctic tundra. Dividing this area in different ecoregions, such as Arctic peaty lowland and Arctic sandy lowland, Arctic coastal water, and Arctic silty coast, we found significantly higher DOC con-



centrations in water bodies of the Arctic peaty lowlands compared to Arctic sandy lowlands ( $p < 0.05$ ; Fig. C1-A).

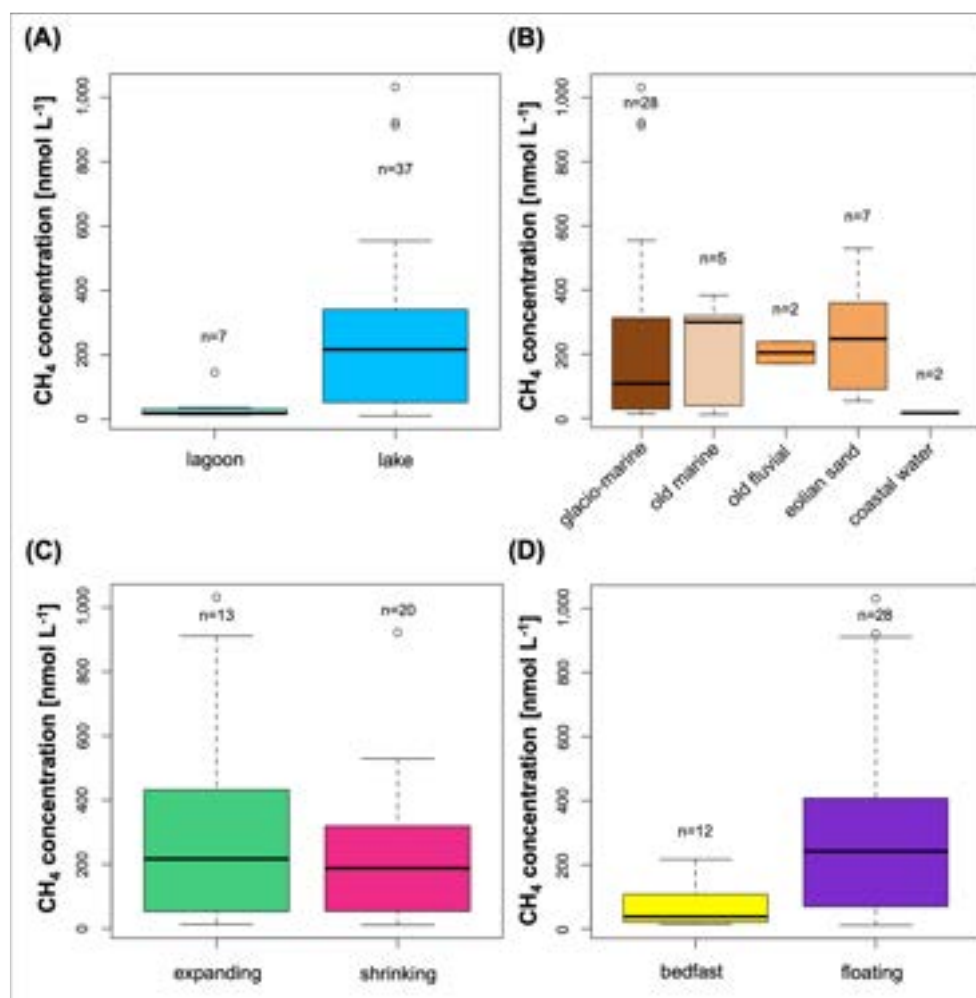


**Figure 2.** Boxplot of measured DOC concentration in collected samples according to (A) classification of surface water type, (B) surface geology after Jorgenson et al. (2013), (C) net lake change after Nitze et al. (2018a, b), and (D) lake-ice regime in the winter season after Grunblatt and Atwood (2014).

### 210 4.1.3 Methane

The measured water methane concentration ranged from 11 to 1,031 nmol L<sup>-1</sup>, with a median of 130 nmol L<sup>-1</sup>. We found the lowest concentration in samples of Teshekpuk Lake, which is also the largest lake in our dataset. Generally, we found CH<sub>4</sub> concentrations below the median of 130 nmol L<sup>-1</sup> in larger lakes with more than 1,500 ha in surface area. Three lakes with highest CH<sub>4</sub> concentrations of more than 900 nmol L<sup>-1</sup> were observed to have olive brown and partially turbid water with brown and soft mud. Our statistical analyses showed significantly higher CH<sub>4</sub> concentrations in lakes compared to lagoons ( $p < 0.05$ ; Fig.

3A). Having a closer look on the  $\text{CH}_4$  concentrations of sampled lagoons, we found the highest value in a limited open lagoon in a more inland location. We detected no significant difference in  $\text{CH}_4$  concentration based on the surface geological settings of our study area. However, we found the highest concentrations in water bodies of areas dominated by glacio-marine deposits.

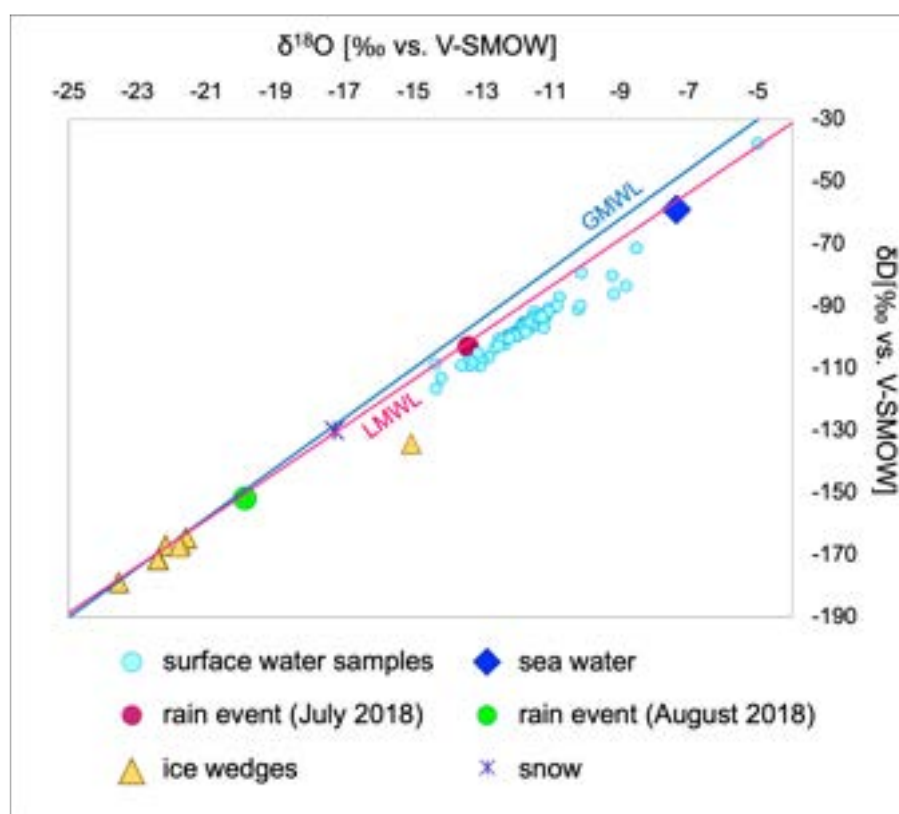


**Figure 3.** Boxplot of measured  $\text{CH}_4$  concentration in collected samples according to (A) classification of surface water type, (B) surface geology after Jorgenson et al. (2013), (C) net lake change after Nitze et al. (2018a, b), and (D) lake-ice regime in the winter season after Grunblatt and Atwood (2014).

220 Comparing the  $\text{CH}_4$  concentrations and the ice coverage in the winter season, we found significantly higher concentrations in water bodies with floating-ice regime ( $p < 0.05$ ; Fig. 3D). While we also found a higher median  $\text{CH}_4$  concentration of 217 nmol L<sup>-1</sup> in expanding lakes compared to shrinking lakes with a median of 188 nmol L<sup>-1</sup> (Fig. 3D), this difference is not statistically significant ( $p > 0.05$ ).

#### 4.1.4 Stable oxygen and hydrogen isotopes

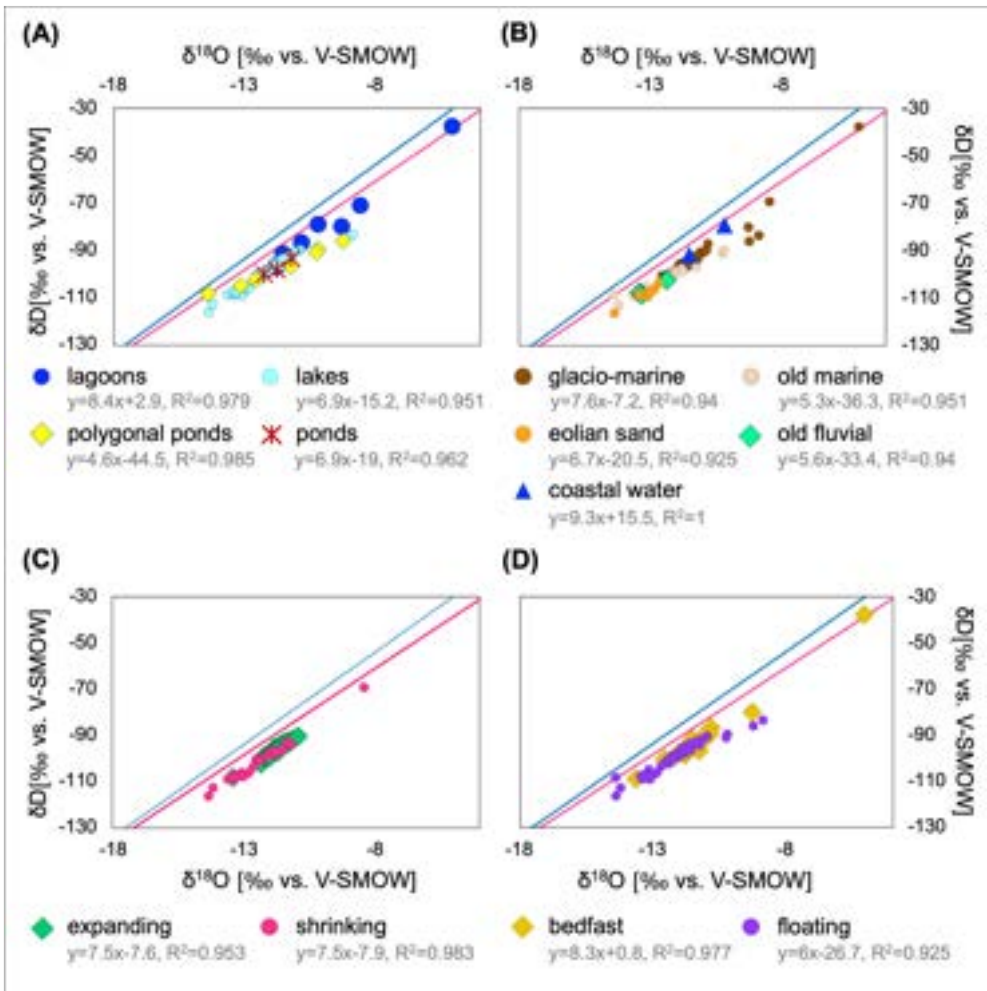
- 225 The median isotopic composition of all surface water samples is  $-11.8$  ‰ for  $\delta^{18}\text{O}$  and  $-97.3$  ‰ for  $\delta\text{D}$ . The surface water samples are characterized by a median d excess of  $-2.3$  ‰, a slope of 7.3, and an intercept of  $-10.74$  in the  $\delta^{18}\text{O}$ - $\delta\text{D}$  diagram (Fig. 4). Samples of two rain events during the expedition and one snow sample in the  $\delta^{18}\text{O}$ - $\delta\text{D}$  diagram (Fig. 4) suggest that the LMWL of Utqiagvik (Barrow) with a slope of 7.5 reflects the present conditions of the study site. Lagoon samples have the heaviest isotopic signature (Fig. 5A) reflecting similar compositions as sea water samples presented in Fig. 4.
- 230 For  $\delta\text{D}$  and  $\delta^{18}\text{O}$  we found significant negative correlations with elevation ( $p < 0.05$ ,  $\text{cor} = -0.4$ ) and distance to the coast ( $p < 0.05$ ,  $\text{cor} = -0.5$  and  $-0.4$ , respectively) as well as significant positive correlations with EC ( $p < 0.05$ ;  $\text{cor} = 0.4$  and  $0.3$ , respectively). More correlations of  $\delta^{18}\text{O}$  and  $\delta\text{D}$  with other parameter can be found in the Appendix Table A1. Comparing water body types, we found a significantly heavier isotopic signature for lagoon samples as for lake samples ( $p < 0.05$ ; Fig. 5A).



**Figure 4.**  $\delta^{18}\text{O}$ - $\delta\text{D}$  diagram for all samples of standing water of our dataset. We added ice-wedge samples, sea-water samples, a snow sample and two rain samples collected in summer 2018 on the North Slope, Alaska. GMWL is the Global Meteoric Water Line, whereas LMWL is the Local Meteoric Water Line of Utqiagvik (Barrow), Alaska (Throckmorton et al., 2016).

235 Lagoon samples have a slope of 8.4 and are close to the GMWL, whereas lake samples have a slope of 6.9, which is close  
to the LMWL but deviates from the GMWL (Fig. 5A). For the surface geology, we found a significantly heavier isotopic  
signature for water bodies in glacio-marine deposits compared to old marine, old fluvial, and eolian sand deposits ( $p < 0.05$ ;  
Fig. 5B). Surface water samples from glacio-marine deposits have a slope of 7.6 that is close to the LMWL, whereas the  
slope of surface water samples from eolian sand (slope = 6.7), old fluvial (slope = 5.6), and old marine deposits (slope = 5.3),  
240 increasingly deviate from the LMWL (Fig. 5B). We also found a significantly heavier signature in expanding water bodies  
compared to shrinking water bodies with a slope that is 7.5 and equal to the LMWL for both (Fig. 5C). Furthermore, we found  
a significantly heavier signature in water bodies with bedfast-ice regime versus floating-ice regime ( $p < 0.05$ ; Fig. 5C). The  
slope of bedfast-ice regime lakes is 8.3 and close to the GMWL, whereas the slope of floating-ice regime lakes deviates with 6  
from the LMWL.

245 For  $\delta$  excess, we found significant negative correlations with DOC as well as with  $\delta D$  ( $p < 0.05$ ;  $\text{cor} = -0.3$  and  $-0.4$ ,  
respectively; Table A1), and a significant positive correlation with pH ( $p < 0.05$ ;  $\text{cor} = 0.3$ ; Table A1).



**Figure 5.**  $\delta^{18}\text{O}$ - $\delta\text{D}$  diagrams of surface water samples of our dataset according to (A) classification of surface water type, (B) surface geology after Jorgenson et al. (2013), (C) net lake change after Nitze et al. (2018a, b), and (D) lake-ice regime in the winter season after Grunblatt and Atwood (2014). GMWL is the Global Meteoric Water Line (blue line), whereas LMWL is the Local Meteoric Water Line (pink line) of Utqiagvik (Barrow), Alaska (Throckmorton et al., 2016).

#### 4.1.5 Anions and cations

For 20 lakes of our dataset, we measured aluminum (Al), barium (Ba), calcium (Ca), iron (Fe), potassium (K), magnesium (Mg), manganese (Mn), sodium (Na), phosphorus (P), silicon (Si), and strontium (Sr) for anions. For 19 lakes of our dataset, we measured fluoride, chloride, sulfate, bromide, nitrate, and phosphate for cations. Since values for Al, P, and phosphate were below the detection limits of  $100 \mu\text{g L}^{-1}$ ,  $0.1 \text{ mg L}^{-1}$ ,  $0.1 \text{ mg L}^{-1}$ , respectively, we did not consider these parameters in the following analysis. The same applies for Mn since 18 out of 20 values were also below the detection limit of  $20 \mu\text{g L}^{-1}$ . Ranges and medians are displayed in Table 2.

With increasing net lake change (%), we found decreasing concentrations for cations (fluoride, chloride, sulfate, and bro-  
255 mide) with correlation coefficients of -0.8, -0.6, -0.7, and -0.6 ( $p < 0.05$ ; Table A1), respectively. We found increasing concen-  
trations of K, Mg, and Na with increasing gross change rate ( $\text{cm yr}^{-1}$ ) with a correlation coefficient of 0.5 for all three anions  
( $p < 0.05$ ; Table A1). Furthermore, we found increasing Ba concentrations with increasing distance to coast ( $p < 0.05$ ;  $\text{cor} =$   
0.7) and decreasing fluoride concentrations with increasing distance to the coast ( $p < 0.05$ ;  $\text{cor} = -0.7$ ).

We present more correlations of anions and cations with other measured hydrochemical parameters in Table A1 and in detail  
260 in the Appendix section ‘A1 Statistical results for anions and cations’.

**Table 2.** Overall range and median of measured anion and cation concentrations.

	range	median
<b>Anions</b>		
Barium [ $\mu\text{g L}^{-1}$ ]	31-167	69.5
Calcium [ $\text{mg L}^{-1}$ ]	10.4-36.1	23.4
Iron [ $\mu\text{g L}^{-1}$ ]	155-324	181
Potassium [ $\text{mg L}^{-1}$ ]	0.4-16.5	1.5
Magnesium [ $\text{mg L}^{-1}$ ]	1.9-42.9	6.5
Sodium [ $\text{mg L}^{-1}$ ]	4-315	23.5
Silicon [ $\text{mg L}^{-1}$ ]	0.1-0.2	0.2
Strontium [ $\mu\text{g L}^{-1}$ ]	37.5-270	64
<b>Cations</b>		
Fluoride [ $\text{mg L}^{-1}$ ]	0.05-0.1	0.07
Chloride [ $\text{mg L}^{-1}$ ]	7.8-561	44.7
Sulfate [ $\text{mg L}^{-1}$ ]	0.6-64.1	1.3
Bromide [ $\text{mg L}^{-1}$ ]	0.05-2.5	0.2
Nitrate [ $\text{mg L}^{-1}$ ]	0.27-0.42	0.3

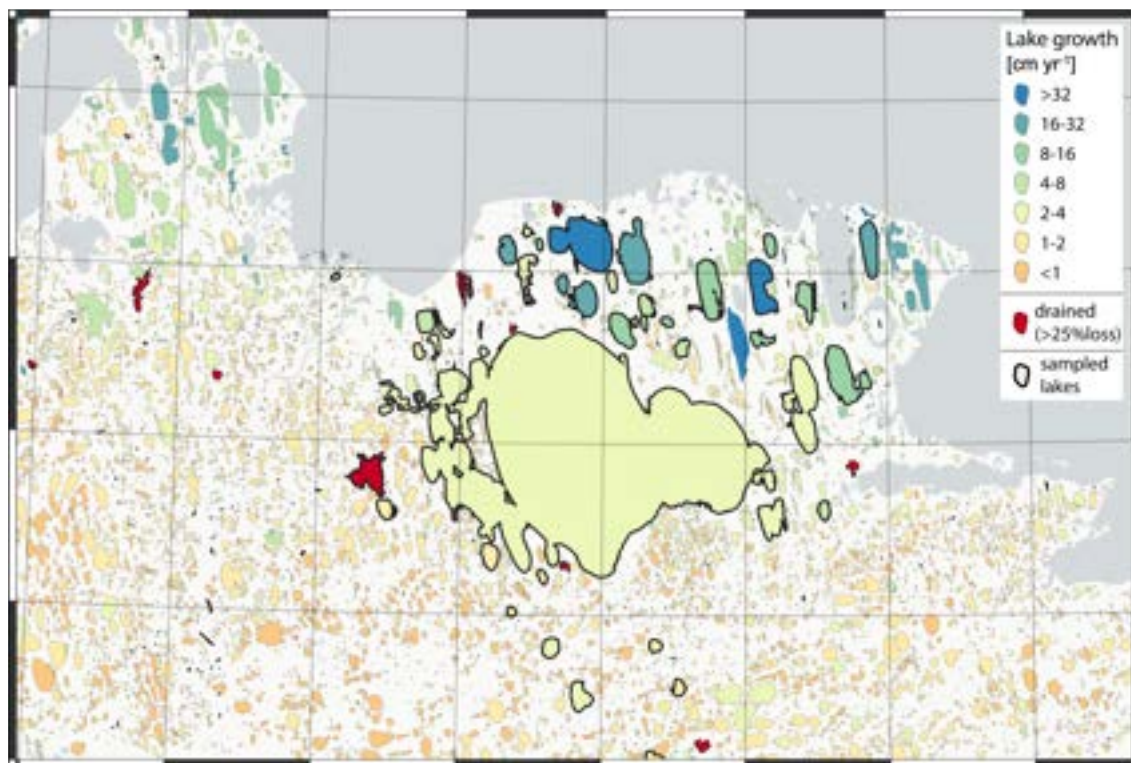
## 4.2 Lake change

### 4.2.1 Full lake change dataset

In total, 50 lakes of our dataset, including the two focus lakes, were observed in the lake change analysis by Nitze et al.  
265 (2018a, b). Of these, we found 19 expanding lakes, including the two focus lakes, and 31 shrinking lakes. We analyzed the  
relationships between lake change (net change in percentage and hectares, change rate and gross change rate) and different  
hydrochemical parameters (DOC,  $\text{CH}_4$ , EC, pH,  $\delta^{18}\text{O}$ ,  $\delta\text{D}$ , and d excess) and found significant positive correlations between  
gross change rate and d excess ( $p < 0.05$ ;  $\text{cor} = 0.4$ ; Table A1) as well as the anions K, Mg, and Na ( $p < 0.05$ ;  $\text{cor} = 0.5$ ; Table  
A1). For the other parameters such as DOC,  $\text{CH}_4$ , EC, or pH no significant correlation was found with the change rates.

270

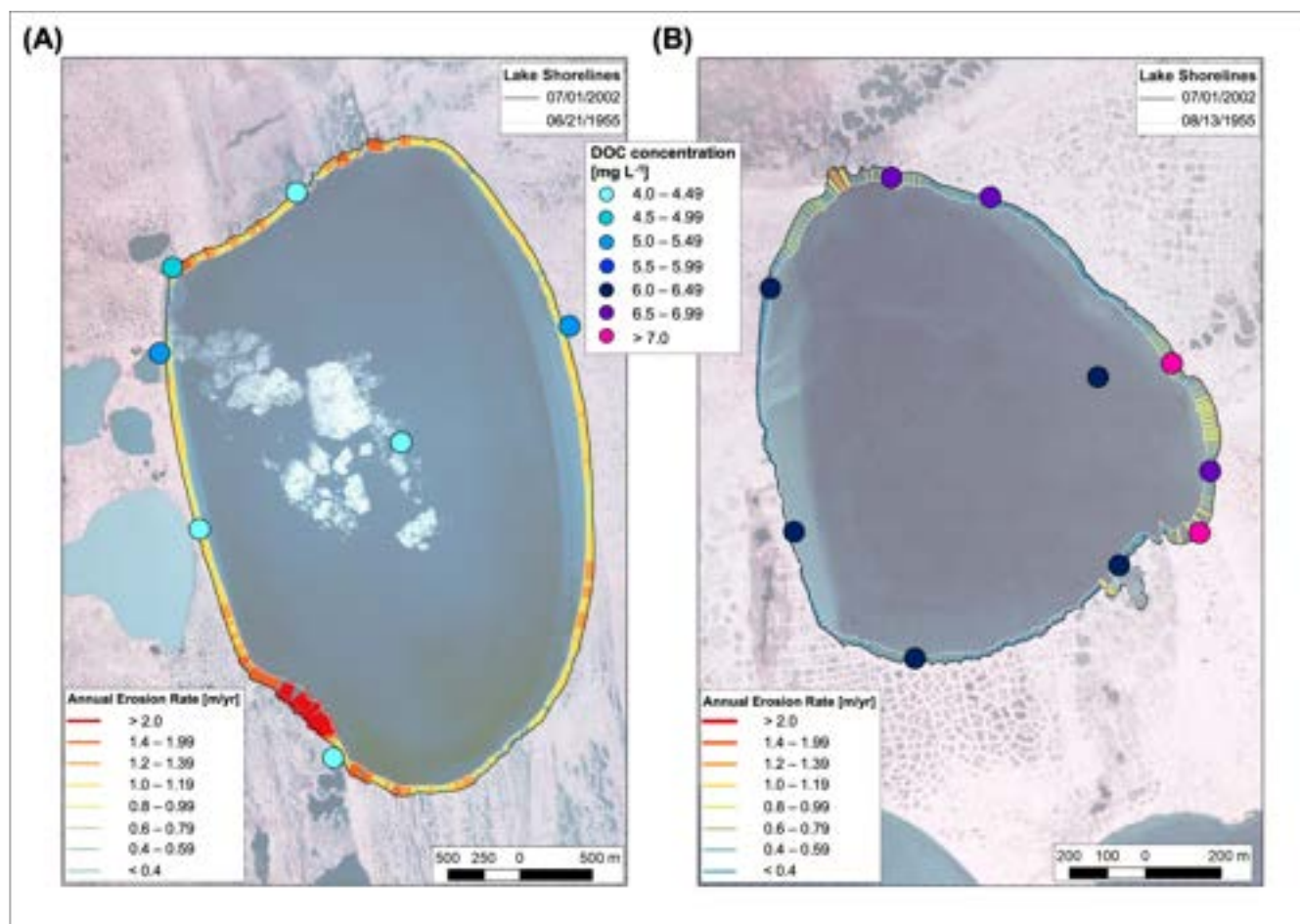




**Figure 6.** Average lake changes in the study area for the period 1999 to 2014 after Nitze et al. (2018a, b). Drained lakes (>25 % area loss) colored in red. Sampled lakes (without lagoons) emphasized by bold outline. Grid size is 90 km latitude and 150 km longitude.

#### 4.2.2 Focus lakes

For the two focus lakes, a detailed water sampling along the lake shore was conducted to understand whether hydrochemical parameters differ within these lakes depending on shore characteristics. With a lake size of 1,102.5 ha, lake TLO18\_12 is almost ten times bigger than lake TLO18\_13 with 114.6 ha and represent rather typical thermokarst lakes in the north of the Teshekpuk Lake region. Both lakes are expanding. In the period from 1999 to 2014, the bigger TLO18\_12 had a net lake change of 0.9 % and a calculated mean erosion rate of 38.5 cm yr<sup>-1</sup>, whereas the smaller TLO18\_13 had a net lake change of 0.1 % and a calculated erosion rate of 2.5 cm yr<sup>-1</sup>. The surrounding geology of TLO18\_12 and TLO18\_13 consists of glacio-marine and old marine deposits, respectively. Figure 7 shows detailed annual shore erosion rates from 1955 to 2002 of TLO18\_12 and TLO18\_13, respectively, and shows that shore erosion occurs in different areas of both lakes. For TLO18\_12, annual erosion for the 1955-2002 period is strongest in the southwest corner and on the northern shoreline where maximum annual rates locally exceed 200 cm yr<sup>-1</sup>. For TLO18\_13, annual erosion for the 1955-2002 period is strongest in the north and on the eastern shoreline, but maximum annual rates reach 120 cm yr<sup>-1</sup> locally only.



**Figure 7.** DOC concentration from lake samples from 2018 and annual lake shore erosion rates for focus lakes (A) TLO18\_12 and (B) TLO18\_13 from 1955 to 2002. Note different map scales for A and B.

We collected 7 water samples from lake TLO18\_12 and 10 water samples from lake TLO18\_13. We found significantly higher DOC concentrations and EC, and a significantly lighter isotopic composition in TLO18\_13 ( $p < 0.05$ ). The DOC concentration in lake TLO18\_12 ranges from 4.1 to 5.2 mg L<sup>-1</sup>, and in lake TLO18\_13 from 6.1 to 7.5 mg L<sup>-1</sup>. Comparing the DOC concentrations along the shore line of both lakes, we generally found no large variations (Fig. 7; Table B1). The same applies for pH, EC, and the stable hydrogen and oxygen isotopes (Table B1). However, we found a statistically significant but small positive correlation between DOC concentration and annual lake change rate from 1955 to 2002 ( $p < 0.05$ ;  $cor = 0.7$ ; Table 3B) with higher DOC concentration in areas with a higher change rate for lake TLO18\_13 (Fig. 7B). Furthermore, we found a statistically significant but small negative correlation between pH value and annual lake change rate from 1955 to 2002 ( $p < 0.05$ ;  $cor = -0.7$ ; Table 3B) with lower, more acid pH values in areas with a higher change rate.

**Table 3.** Correlation matrices for samples of the focus lakes (A) TLO18\_12 (n=7) and (B) TLO18\_13 (n=10) by using the Pearson's Product Moment correlation coefficient between DOC in  $\text{mg L}^{-1}$ , EC in  $\mu\text{S cm}^{-1}$ , pH,  $\delta^{18}\text{O}$  and  $\delta\text{D}$  in ‰ vs. V-SMOW, d excess, rate for detailed annual lake shore erosion rates in  $\text{m yr}^{-1}$  (from 1955 to 2002), and distance for distance to the coast in km. Significance levels of  $p < 0.05$  (in bold) are indicated.

(A)								(B)							
	EC	pH	$\delta^{18}\text{O}$	$\delta\text{D}$	d excess	rate	distance		EC	pH	$\delta^{18}\text{O}$	$\delta\text{D}$	d excess	rate	distance
DOC	-0.3	<b>-0.9</b>	-0.4	-0.2	0.5	0.4	-0.3		-0.2	<b>-0.8</b>	-0.2	-0.5	-0.2	<b>0.7</b>	0.1
EC		0.03	0.5	0.7	0.2	0.6	0.6			-0.1	-0.2	0.02	0.2	-0.06	0.6
pH			0.1	-0.02	-0.3	-0.2	0.3				0.3	0.5	0.06	<b>-0.7</b>	-0.2
$\delta^{18}\text{O}$				<b>0.8</b>	-0.5	-0.1	-0.2					0.2	<b>-0.7</b>	0.05	-0.4
$\delta\text{D}$					0.02	0.2	0.1						0.5	-0.1	-0.3
d excess						0.6	0.4							-0.1	0.1
rate							-0.3								-0.3

## 5 Discussion

### 295 5.1 Lake DOC correlates with lake size, ecoregion types, and geology

Compared with previous Arctic lake studies, the DOC concentrations of our dataset are slightly higher than in lake samples presented in Stolpmann et al. (2021) but with a median of  $5.7 \text{ mg L}^{-1}$  generally low. Similar to Shirokova et al. (2013), who investigated DOC in discontinuous permafrost of West Siberia, and the pan-Arctic overview of Stolpmann et al. (2021), our dataset shows increasing DOC concentrations with decreasing lake size. The negative correlation of DOC concentration and lake size is caused by e.g. degradation of vegetation inundated around thermokarst lake margins, low water depth causing lake bottom abrasion by ice coverage in winter, and increased lake sediment respiration of peaty deposits (Shirokova et al., 2013). Analysis of stable hydrogen and oxygen isotopes in our surface water samples show that they are mostly below the LMWL, being influenced by evaporation. The smallest sampled water bodies have the largest deviation below the LMWL, which can be interpreted as a result of higher impacts of evaporation on smaller water bodies. Our results show significantly higher DOC concentrations in lake samples of the Arctic peaty lowlands than in the Arctic sandy lowlands, which likely can be attributed to a generally higher carbon content in the peaty lowland soils (Hugelius et al., 2014). The results of the two investigated focus lakes suggest that single surface water sampling in thermokarst lakes, which are typically shallow (Grosse et al., 2013) and therefore well-mixed, delivers representative values for hydrochemical parameters of the sampled lake. According to our investigations for 2 lakes, we infer that one sample per lake results in representative data for the specific sample day. To reinforce this conclusion, more detailed sampling of lakes in the Arctic is necessary. Seasonal changes however, which we did not investigate in this study, have been shown to be important factors for overall DOC concentrations in thermokarst lakes in particular with the spring freshet and the deepening of the active layer over the course of the summer, both influencing DOC inputs (Manasypov et al., 2015, 2020; Gandois et al., 2021).

## 5.2 Thermokarst lake shore erosion influences lake hydrochemistry

315 With permafrost degradation, especially abrupt thaw processes such as thermokarst and thermo-erosion, a rapid release of permafrost C is observed (Walter Anthony et al., 2018; Turetsky et al., 2020) and more DOC is being mobilized from a deeper active layer (Wickland et al., 2018). Previous studies suggested that permafrost degradation processes will influence water storage, hydrochemistry, and connectivity of water bodies (Kokelj et al., 2005; Bense et al., 2012). As thermokarst lakes are growing due to erosion of lake shores, surrounding soil and sediment, including from permafrost and the active layer, as well as organic matter slip into the lake. The transport of organic material into the lake can lead to changes in the lake hydrochemistry, e.g. increasing DOC and particulate OC (POC). Even though, we found only small variations in measured hydrochemical parameters in both focus lakes the results of our detailed analysis of focus lake TLO18\_13 confirm a positive correlation with significantly higher DOC concentration directly at the shore in areas of higher detailed annual lake shore erosion rates (Fig. 7; Table 3B; Table B1). In contrast to these results, we found no significant correlation for detailed annual lake shore erosion rates for focus lake TLO18\_12, which is bigger in lake surface area and has generally lower DOC concentrations. Investigations of Textor et al. (2019) in the discontinuous permafrost zone in Central Alaska revealed highly biodegradable DOC in the organic rich active layer. In the continuous permafrost zone, DOC is also highly biodegradable and is especially available for mineralization by microbial activity (Kawahigashi et al., 2004). As DOC is highly biodegradable, this might lead specifically in larger lakes with larger water volumes to the finding that a correlation between DOC concentration with annual lake change rate cannot be measured anymore. For our entire dataset, we found no big differences between expanding and shrinking lakes in the analyzed hydrochemical parameters. Although we would have expected hydrochemical differences due to the input of permafrost material and meltwater as well as effects of different surface geologies and the role of water evaporation (MacDonald et al., 2021; Wilcox et al., 2023), for example the isotopic composition in our lakes shows very similar values for expanding versus shrinking lakes, except for 3 outliers (Fig. 5C). These outliers are from samples of one lagoon with typically heavier isotopic composition and two lakes with lighter isotopic composition and have no specific similarities.

## 5.3 DOC and CH<sub>4</sub> in bedfast-ice and floating-ice regime lakes

Whereas shallow bedfast-ice regime lakes characteristically freeze to the lake bottom in the winter period, floating-ice regime lakes don't and are characterized by year-round liquid water under the ice (Sellmann et al., 1975). Floating-ice regime lakes are prone to talik development (Ling and Zhang, 2003). These taliks are perennially thawed sediments allowing microbial activity year-round and are prime environments for CH<sub>4</sub> production and release from carbon that was previously frozen in the permafrost (Walter et al., 2007; Heslop et al., 2015). Our results show significantly higher CH<sub>4</sub> concentrations in lakes with floating-ice regimes compared to lakes with a bedfast-ice regime (Fig. 3D), which could confirm that taliks underneath floating-ice lakes contribute to higher CH<sub>4</sub> concentrations in their water. In northern Alaska on the Arctic coastal plain, Arp et al. (2012) observed a shift from bedfast-ice regime lakes to floating-ice regime lakes since the 1980s. Similar findings were reported by Surdu et al. (2014) who observed a decreasing number of lakes with a bedfast-ice regime in a subregion of the ACP in Alaska from 1991 to 2011. This lake transformation is critical since it leads to a shift in the water balance and temperature

regime, causing increasing permafrost thaw and degradation beneath lakes (Romanovsky et al., 2010) with floating-ice regime (Arp et al., 2016). The associated talik formation and release of greenhouse gasses is causing a positive feedback (Walter et al., 2006; Shaposhnikova et al., 2023). Considering the rapid climate warming in the Arctic, we can assume an increased release of greenhouse gasses in these lake-rich areas in the upcoming decades if floating ice-lakes become more abundant. In contrast, we found significantly higher DOC concentrations in lakes with bedfast-ice regime compared to lakes with floating-ice regime, which might be caused by limited water availability for microorganisms in bedfast-ice regime lakes and therefore no or reduced decomposition of DOC occurs (Kurek et al., 2022). Similar results were detected by Bartsch et al. (2017) using a satellite data approach. We found that the stable oxygen and hydrogen isotopes for bedfast-ice and floating-ice regime lakes did not differ much, except for a few extreme values.

#### 5.4 CH<sub>4</sub> in lakes and lagoons

We found a high range in CH<sub>4</sub> concentration from 11 to 1031 nmol L<sup>-1</sup> and a median of 158 nmol L<sup>-1</sup> in our dataset. Our range is similar to findings from Sasaki et al. (2016) who investigated in total 30 lakes along a transect in Alaska, from tundra to mountain and boreal regions. Eleven of their northernmost samples close to Deadhorse ( $\geq 69^\circ$  N) ranged from 123 to 1,071 nmol L<sup>-1</sup>. However, their median CH<sub>4</sub> concentration of 644 nmol L<sup>-1</sup> in 2008 and 500 nmol L<sup>-1</sup> in 2012 is much higher. A study from Samoylov Island in the Lena River Delta (Russia) presented lake CH<sub>4</sub> concentrations ranging from 205 to 22,974 nmol L<sup>-1</sup> and discussed the influence of flooding during the annual spring flood, which transports a large amount of organic material and also carbon, leading to higher CH<sub>4</sub> concentrations in their study site (Osudar et al., 2016). A similar effect can be observed in CH<sub>4</sub> concentrations from lakes of the Mackenzie River Delta (Canada). Here, Cunada et al. (2018) presented CH<sub>4</sub> concentrations, which are around ten-times higher in samples collected in the end of July and August compared to CH<sub>4</sub> concentrations from our dataset. For our study site, the effect of a spring flood does not apply.

The lowest CH<sub>4</sub> concentration in our dataset can be assigned to a water sample from Teshekpuk Lake, which is the largest lake in the study area with a surface area of 847.3 km<sup>2</sup> (Nitze et al., 2018b). The large size of this thermokarst lake is causing unfavorable conditions for CH<sub>4</sub> production. Shirokova et al. (2013) concluded that optimal oxygen supply and missing phytoplankton debris are causing these conditions in large thermokarst lakes. We also show that production of CH<sub>4</sub> might be influenced by erosion processes due to permafrost degradation, resulting in CH<sub>4</sub> release and higher CH<sub>4</sub> concentrations in expanding lakes (Fig. 3), confirming prior findings of such relationships (Walter et al., 2006; Walter Anthony et al., 2016). Similar to prior findings from the Bykovsky Peninsula in Siberia (Yang et al., 2023), our statistical analysis showed significantly lower CH<sub>4</sub> concentrations in thermokarst lagoons (former lakes breached by the sea) compared to thermokarst lakes that have a median CH<sub>4</sub> concentration more than 11-times higher than in lagoons. For lake and lagoon ice core samples from Bykovsky Peninsula, Spangenberg et al. (2021) found similar conditions with a mean CH<sub>4</sub> concentration that is 11-times higher in a thermokarst lake than in a neighboring thermokarst lagoon. Lower CH<sub>4</sub> concentrations in thermokarst lagoons are a result of lower CH<sub>4</sub> production rates and an effective CH<sub>4</sub> oxidation, which increases due to the connection with seawater and the introduction of other microbial communities (Yang et al., 2023, 2024). On the other hand, larger lakes would support a greater



380 loss of CH<sub>4</sub> by increased water turbulence and subsequent increased diffusive flux out of the lake, as well as increased CH<sub>4</sub>  
oxidation rates by a better oxygenation of the water (Manasypov et al., 2024).

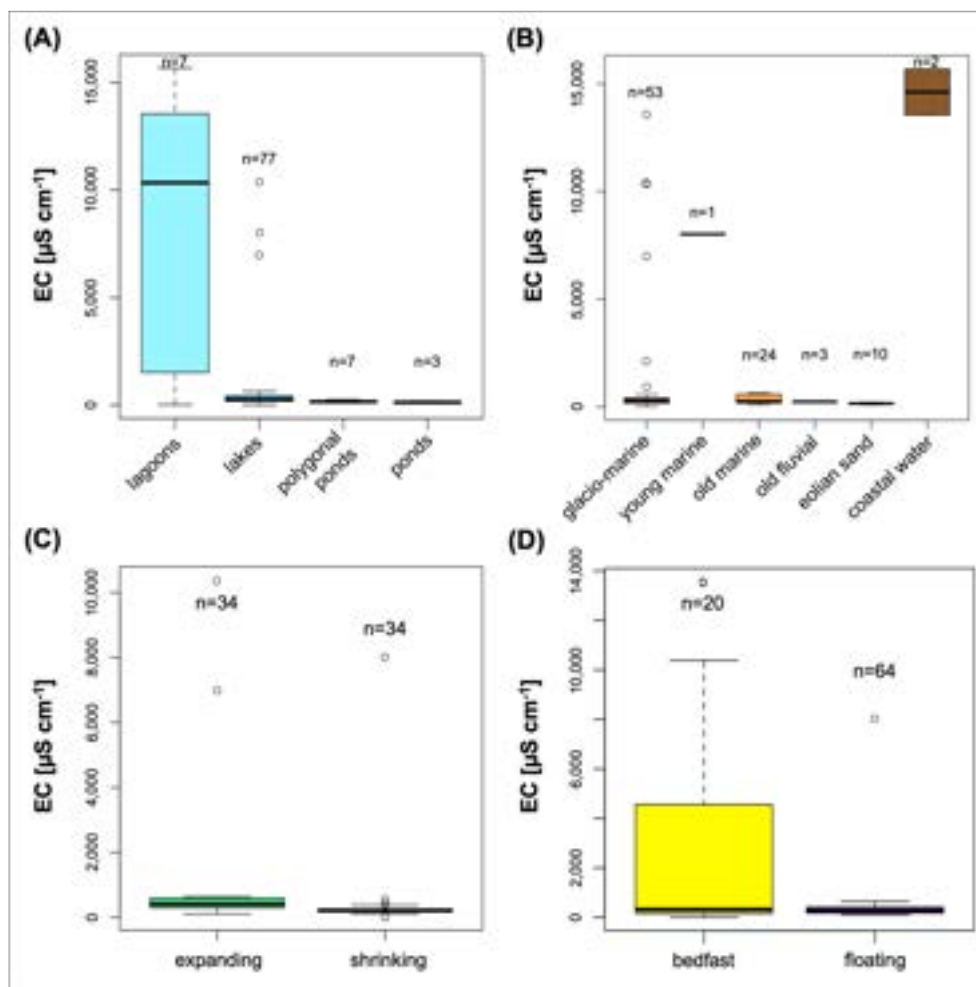
## 6 Conclusions

Thermokarst lake change caused by permafrost thaw is contributing to the greenhouse effect as part of the global C cycle. In this study, we investigate hydrochemical parameters – such as DOC and CH<sub>4</sub> which are relevant for the emission of the greenhouse  
385 gasses – from a large set of 97 water samples from 82 sampled lagoons, lakes, ponds and polygonal ponds in combination with remote sensing data for lake change detection, surface geology, permafrost, ecoregion type, and lake ice regimes in the ACP. For this area around Theshekpuk Lake on the Alaska North Slope, we show that lake shore erosion has an influence on lake hydrochemical parameters, especially DOC and pH, by releasing organic material from the active layer and permafrost deposits into the lake. We also show that water bodies that freeze to the bottom in the winter have higher DOC concentrations,  
390 whereas water bodies with a floating-ice regime have significantly higher CH<sub>4</sub> concentrations. The latter is especially critical since previous studies found decreasing lake ice thickness and an increasing abundance in floating ice lakes in many regions due to rapid winter warming in the Arctic. Comparing lakes and lagoons, we found significantly lower CH<sub>4</sub> concentrations in lagoons. Our detailed sampling of two very different focus thermokarst lakes also suggest that water sampling with a single sample in thermokarst lakes, which are typically shallow, can deliver spatially representative values for these lakes. We did not  
395 investigate temporal changes in the hydrochemical parameters. Finally, our investigations in the ACP confirm that ecoregion type as well as geology is influencing the DOC concentration in lake water bodies. Our study improves the understanding of the direct impacts of lake change processes on hydrochemical parameters and aquatic ecosystems in an area that is changing rapidly under current climate warming.

*Data availability.* All data from field, remote sensing, and lab measurements from this study can be found in the open-access archive  
400 PANGAEA soon



## Appendix A



**Figure A1.** Boxplot of measured EC in collected samples according to (A) classification of surface water type, (B) surface geology after Jorgenson et al. (2013), (C) net lake change after Nitze et al. (2018a, b), and (D) lake-ice regime in the winter season after Grunblatt and Atwood (2014).

## A1 Statistical results for anions and cations

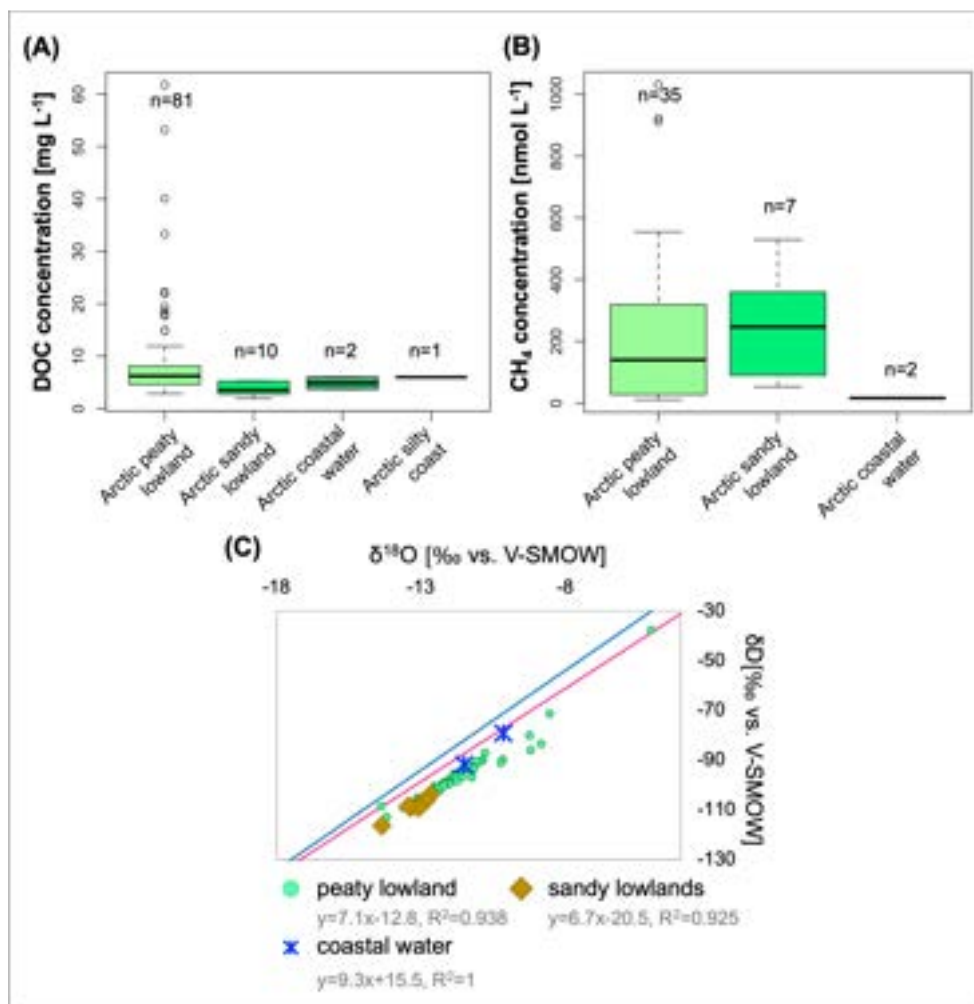
For Ba, we found significant positive correlations with pH ( $p < 0.05$ ;  $\text{cor} = 0.7$ ; Table A1) as well as significant negative correlations with DOC ( $p < 0.05$ ;  $\text{cor} = -0.5$ ) and  $\text{CH}_4$  ( $p < 0.05$ ;  $\text{cor} = -0.6$ ). For Ca, we found a significant positive correlation with pH ( $p < 0.05$ ;  $\text{cor} = 0.7$ ; Table A1), and significant negative correlations with  $\delta^{18}\text{O}$  ( $p < 0.05$ ;  $\text{cor} = -0.5$ ) and  $\delta\text{D}$  ( $p < 0.05$ ;  $\text{cor} = -0.5$ ). For K, we found significant positive correlations with DOC ( $p < 0.05$ ;  $\text{cor} = 0.5$ ) and EC ( $p < 0.05$ ;  $\text{cor} = 0.8$ ; Table A1). For Mg, we found significant positive correlations with DOC ( $p < 0.05$ ;  $\text{cor} = 0.6$ ) and EC ( $p < 0.05$ ;  $\text{cor} = 0.9$ ). For Na, we found significant positive correlations with DOC ( $p < 0.05$ ;  $\text{cor} = 0.6$ ) and EC ( $p < 0.05$ ;  $\text{cor} = 0.9$ ). For Si, we found a significant negative correlation with  $\text{CH}_4$  ( $p < 0.05$ ;  $\text{cor} = -0.8$ ). For Sr, we found significant positive correlations with DOC ( $p < 0.05$ ;  $\text{cor} = 0.5$ ) and EC ( $p < 0.05$ ;  $\text{cor} = 0.9$ ). For fluoride, we found significant positive correlations with DOC ( $p < 0.05$ ;  $\text{cor} = 0.6$ ),  $\delta^{18}\text{O}$  ( $p < 0.05$ ;  $\text{cor} = 0.8$ ), and  $\delta\text{D}$  ( $p < 0.05$ ;  $\text{cor} = 0.7$ ). Furthermore, we found significant negative correlations with elevation. For chloride, we found significant positive correlations with DOC ( $p < 0.05$ ;  $\text{cor} = 0.7$ ), EC ( $p < 0.05$ ;  $\text{cor} = 0.5$ ),  $\delta^{18}\text{O}$  ( $p < 0.05$ ;  $\text{cor} = 0.7$ ), and  $\delta\text{D}$  ( $p < 0.05$ ;  $\text{cor} = 0.7$ ). For sulfate, we found significant positive correlations with DOC ( $p < 0.05$ ;  $\text{cor} = 0.6$ ), EC ( $p < 0.05$ ;  $\text{cor} = 0.5$ ),  $\delta^{18}\text{O}$  ( $p < 0.05$ ;  $\text{cor} = 0.7$ ), and  $\delta\text{D}$  ( $p < 0.05$ ;  $\text{cor} = 0.7$ ). For bromide, we found significant positive correlations with DOC ( $p < 0.05$ ;  $\text{cor} = 0.7$ ), EC ( $p < 0.05$ ;  $\text{cor} = 0.5$ ),  $\delta^{18}\text{O}$  ( $p < 0.05$ ;  $\text{cor} = 0.7$ ), and  $\delta\text{D}$  ( $p < 0.05$ ;  $\text{cor} = 0.7$ ). Furthermore, we found significant negative correlations with d excess ( $p < 0.05$ ;  $\text{cor} = -0.4$ ). Correlations within anions and cations are shown in Table A1.

**Table A1.** Correlation matrix of entire dataset using the Pearson's Product Moment correlation coefficient between DOC (mg L<sup>-1</sup>), CH<sub>4</sub> (nmol L<sup>-1</sup>), EC (μS cm<sup>-1</sup>), pH, δ<sup>18</sup>O (‰ vs. V-SMOW), δD (‰ vs. V-SMOW), d excess, barium (μg L<sup>-1</sup>), calcium (mg L<sup>-1</sup>), iron (μg L<sup>-1</sup>), potassium (mg L<sup>-1</sup>), magnesium (mg L<sup>-1</sup>), sodium (mg L<sup>-1</sup>), silicon (mg L<sup>-1</sup>), strontium (μg L<sup>-1</sup>), fluoride (mg L<sup>-1</sup>), chloride (mg L<sup>-1</sup>), sulfate (mg L<sup>-1</sup>), bromide (mg L<sup>-1</sup>), nitrate (mg L<sup>-1</sup>), area (ha) for lake surface area, net lake change (%), net lake change (ha), elevation (m), calculated change rate (cm yr<sup>-1</sup>), and gross change rate (cm yr<sup>-1</sup>) for lakes with measured anion and cation values (n=20). Significance levels of  $p < .05$  (in bold) are indicated.

	CH <sub>4</sub>	EC	pH	δ <sup>18</sup> O	δD	d excess	Ba	Ca	Fe	K	Mg	Na	Si	Sr	Fluoride	Chloride	Sulfate	Bromide	Nitrate	area	change in %	change in ha	elevation	change rate	change rate gross	distance to coast
DOC	-.01	-.002	-.6	.15	.08	-.3	-.5	-.1	.6	.5	.6	.6	-.2	.5	.6	.7	.6	.7	.8	-.09	-.2	.2	-.2	.09	-.1	-.1
CH <sub>4</sub>		-.2	-.4	.08	.05	-.3	-.6	-.3	-.7	-.1	-.1	-.1	-.8	-.2	-.4	-.1	-.2	-.1	0.2	-.3	-.02	.1	.05	.05	-.3	.06
EC			.2	.3	.4	.1	.1	.4	.2	.8	.9	.9	.2	.9	.5	.5	.5	.5	-.5	-.001	.08	.08	-.2	.1	.06	-.3
pH				-.2	-.2	.3	.7	.7	.4	.01	.04	.04	.6	.2	.2	.03	.01	.02	-.9	.07	-.03	-.01	.2	-.01	-.1	.1
δ <sup>18</sup> O					.98	-.4	-.2	-.5	-.7	.3	.4	.3	-.1	.2	.8	.7	.7	.7	.7	-.1	-.1	.2	-.4	.2	.2	-.4
δD						-.1	-.2	-.5	-.7	.3	.4	.3	-.1	.2	.7	.7	.7	.7	.8	-.1	-.1	.2	-.4	.2	.3	-.5
d excess							-.1	.2	.4	-.1	-.1	-.1	.5	-.1	-.4	-.5	-.4	-.4	-.1	.1	.03	-.05	-.04	-.03	.4	-.05
Ba								.5	.6	-.04	-.03	-.02	.6	.01	.01	-.1	-.02	-.01	-.4	.03	-.1	-.3	.2	-.2	.3	.7
Ca									.6	.3	.3	.3	.5	.5	.6	.3	.3	.3	-.3	.1	-.3	-.3	.2	-.3	.1	.4
Fe										.4	.3	.4	-.06	.5	.5	.3	.3	.3	NA	-.3	.5	.96	-.2	.4	.1	-.1
K											.98	.99	-.002	.96	.8	.99	.98	.99	.5	-.1	.4	.3	-.3	.4	.5	-.2
Mg												.98	.2	.95	.9	.99	.9	.98	.7	-.1	.3	.3	-.4	.3	.5	-.3
Na													-.1	.96	.8	.99	.96	.99	.1	-.1	.4	.3	-.3	.3	.5	-.2
Si														.2	.6	.04	.1	.04	NA	.3	.3	-.4	.04	.1	.6	.04
Sr															.9	.96	.9	.96	.3	-.1	.1	.02	-.3	.06	.5	-.1
Fluoride																.8	.8	.8	.6	-.3	-.8	-.02	-.6	-.3	.2	-.7
Chloride																	.99	.99	.4	-.1	-.6	.02	-.2	-.1	-.02	-.3
Sulfate																		.99	.7	-.1	-.7	.01	-.2	-.1	-.04	-.3
Bromide																			.3	-.1	-.6	.02	-.2	-.1	-.02	-.3
Nitrate																				-.5	.6	.2	-.8	.9	.7	-.7
area																					.04	-.2	-.04	-.003	-.004	-.02
change in %																						.7	.06	.8	.2	.04
change in ha																							.05	.9	.2	-.1
elevation																								.02	-.3	.7
change rate																									.2	-.1
change rate gross																										-.2

**Table B1.** Mean values and standard deviation (SD) for samples collected from the focus lake.

	TLO18_12		TLO18_13	
	<i>n</i> = 7		<i>n</i> = 10	
	mean	SD	mean	SD
DOC [mg L <sup>-1</sup> ]	4.6	0.5	6.6	0.5
pH	7.9	0.2	8	0.1
EC [μS cm <sup>-1</sup> ]	401	6.7	591.5	21.1
δ <sup>18</sup> O [‰ vs. V-SMOW]	−11.8	0.2	−12.1	0.06
δD [‰ vs. V-SMOW]	−96.8	1.3	−99.2	0.4
d excess	−2	0.8	−2.3	0.6



**Figure C1.** Boxplot of (A) measured DOC concentration, (B) CH<sub>4</sub> concentrations, and (C)  $\delta^{18}\text{O}$ - $\delta\text{D}$  diagram of surface water samples of our dataset according to ecoregion types. GMWL is the Global Meteoric Water Line, whereas LMWL is the Local Meteoric Water Line of Barrow, Alaska (Throckmorton et al., 2016).

*Author contributions.* LS and GG conceptualized the study. JL, JW, BMJ, and GG conducted the field sampling, field measurements, and field lab sample processing. LS, JL, JW, and IB coordinated and conducted biogeochemical and hydrochemical lab sample processing. HM  
420 led the stable isotope sample processing. IN and GG conducted the remote sensing-based lake change analysis. LS led the data analysis and manuscript writing with input from all co-authors.

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

*Acknowledgements.* We thank the AWI logistics staff for general expedition support and AWI lab staff A. Eulenburg and M. Weiner for help with lab sample processing. We thank S. Schäffler and S. Laboor for their support with GIS and map creation, and M. Angelopoulos for help  
425 in the field. We are thankful for the support by the Teshekpuk Lake Observatory which we used as a base camp during the field campaign. We acknowledge the invaluable support for field logistics and sampling for this study by our late floatplane pilot Jim Webster from Webster's Flying Service.

*Financial support.* LS was funded by a PhD stipend of the Potsdam Graduate School and the Koordinationsbüro für Chancengleichheit of the University of Potsdam, the ERC PETA-CARB project (338335), and the Alfred Wegener Institute Helmholtz Centre for Polar and  
430 Marine Research. Field work was funded by AWI base funds and ERC PETA-CARB. JW was funded by the German Research Foundation project QUIC-DRAIN (DFG Research Grant No. WO 2420/2-1). BMJ was supported through U.S. National Science Foundation awards OPP-1806213 and OPP-2336164.

The article processing charges for this open-access publication were covered by the Alfred Wegener Institute, Helmholtz Centre for Polar  
435 and Marine Research (AWI).



## References

- Abbott, B., Jones, J., Godsey, S., Larouche, J., and Bowden, W.: Patterns and persistence of hydrologic carbon and nutrient export from collapsing upland permafrost, *Biogeosciences*, 12, 3725–3740, <https://doi.org/10.5194/bg-12-3725-2015>, 2015.
- 440 Arp, C. and Jones, B.: Geography of Alaska lake districts: identification, description, and analysis of lake-rich regions of a diverse and dynamic state, resreport, U.S. Geological Survey Scientific Investigations Report 2008–5215, 2009.
- Arp, C., Jones, B., Urban, F., and Grosse, G.: Hydrogeomorphic processes of thermokarst lakes with grounded-ice and floating-ice regimes on the Arctic coastal plain, Alaska, *Hydrological Processes*, 25, 2422–2438, <https://doi.org/10.1002/hyp.8019>, 2011.
- Arp, C., Jones, B., Lu, Z., and Whitman, M.: Shifting balance of thermokarst lake ice regimes across the Arctic Coastal Plain of northern  
 445 Alaska, *Geophysical Research Letters*, 39, <https://doi.org/10.1029/2012GL052518>, 2012.
- Arp, C., Jones, B., Grosse, G., Bondurant, A., Romanovsky, V., Hinkel, K., and Parsekian, A.: Threshold sensitivity of shallow Arctic lakes and sublake permafrost to changing winter climate, *Geophysical Research Letters*, 43, 6358–6365, <https://doi.org/10.1002/2016GL068506>, 2016.
- Bartsch, A., Pointner, G., Leibman, M., Dvornikov, Y., Khomutov, A., and Trofaier, A.: Circumpolar Mapping of Ground-Fast Lake Ice,  
 450 *Frontiers in Earth Science*, 5, 1–12, <https://doi.org/10.3389/feart.2017.00012>, 2017.
- Bense, V., Kooi, H., Ferguson, G., and Read, T.: Permafrost degradation as a control on hydrogeological regime shifts in a warming climate, *Journal of Geophysical Research: Earth Surface*, 117, 2011JF002143, <https://doi.org/10.1029/2011JF002143>, 2012.
- Bergstedt, H., Jones, B., Hinkel, K., Farquharson, L., Gaglioti, B., Parsekian, A., Kanevskiy, M., Ohara, N., Breen, A., Rangel, R., and  
 others: Remote Sensing-Based Statistical Approach for Defining Drained Lake Basins in a Continuous Permafrost Region, North Slope  
 455 of Alaska, *Remote Sensing*, 13, 2539, <https://doi.org/10.3390/rs13132539>, 2021.
- Biskaborn, B., Smith, S., Noetzel, J., Matthes, H., Vieira, G., Streletskiy, D., Schoeneich, P., Romanovsky, V., Lewkowicz, A., Abramov, A.,  
 and others: Permafrost is warming at a global scale, *Nature Communications*, 10, 264, <https://doi.org/10.1038/s41467-018-08240-4>, 2019.
- Bristol, E., Connolly, C., Lorenson, T., Richmond, B., Ilgen, A., Choens, R., Bull, D., Kanevskiy, M., Iwahana, G., Jones, B., and others:  
 Geochemistry of Coastal Permafrost and Erosion-Driven Organic Matter Fluxes to the Beaufort Sea Near Drew Point, Alaska, *Frontiers  
 460 in Earth Science*, 8, <https://doi.org/10.3389/feart.2020.598933>, 2021.
- Busmann, I., Fedorova, I., Juhls, B., Overduin, P., and Winkel, M.: Methane dynamics in three different Siberian water bodies under winter and summer conditions, *Biogeosciences*, 18, 2047–2061, <https://doi.org/10.5194/bg-18-2047-2021>, 2021.
- Creighton, A., Parsekian, A., Angelopoulos, M., Jones, B., Bondurant, A., Engram, M., Lenz, J., Overduin, P., Grosse, G., Babcock, E., and  
 others: Transient Electromagnetic Surveys for the Determination of Talik Depth and Geometry Beneath Thermokarst Lakes, *Journal of  
 465 Geophysical Research: Solid Earth*, 123, 9310–9323, <https://doi.org/10.1029/2018JB016121>, 2018.
- Cunada, C., Lesack, L., and Tank, S.: Seasonal Dynamics of Dissolved Methane in Lakes of the Mackenzie Delta and the Role of Carbon Substrate Quality, *Journal of Geophysical Research: Biogeosciences*, 123, 591–609, <https://doi.org/10.1002/2017JG004047>, 2018.
- Drake, T., Wickland, K., Spencer, R., McKnight, D., and Striegl, R.: Ancient low-molecular-weight organic acids in permafrost fuel rapid carbon dioxide production upon thaw, *Proceedings of the National Academy of Sciences*, 112, 13946–13951,  
 470 <https://doi.org/10.1073/pnas.1511705112>, 2015.
- Elder, C., Xu, X., Walker, J., Schnell, J., Hinkel, K., Townsend-Small, A., Arp, C., Pohlman, J., Gaglioti, B., and Czimczik, C.: Greenhouse gas emissions from diverse Arctic Alaskan lakes are dominated by young carbon, *Nature Climate Change*, 8, 166–171, <https://doi.org/10.1038/s41558-017-0066-9>, 2018.

- Engram, M., Arp, C., Jones, B., Ajadi, O., and Meyer, F.: Analyzing floating and bedfast lake ice regimes across Arctic Alaska using 25 years of space-borne SAR imagery, *Remote Sensing of Environment*, 209, 660–676, <https://doi.org/10.1016/j.rse.2018.02.022>, 2018.
- Evans, C., Futter, M., Moldan, F., Valinia, S., Frogbrook, Z., and Kothawala, D.: Variability in organic carbon reactivity across lake residence time and trophic gradients, *Nature Geoscience*, 10, 832–835, <https://doi.org/10.1038/ngeo3051>, 2017.
- Fuchs, M., Lenz, J., Jock, S., Nitze, I., Jones, B., Strauss, J., Günther, F., and Grosse, G.: Organic Carbon and Nitrogen Stocks Along a Thermokarst Lake Sequence in Arctic Alaska, *Journal of Geophysical Research: Biogeosciences*, 124, 1230–1247, <https://doi.org/10.1029/2018JG004591>, 2019.
- Fuchs, M., Nitze, I., Strauss, J., Günther, F., Wetterich, S., Kizyakov, A., Fritz, M., Opel, T., Grigoriev, M., Maksimov, G., and others: Rapid Fluvio-Thermal Erosion of a Yedoma Permafrost Cliff in the Lena River Delta, *Frontiers in Earth Science*, 8, 336, <https://doi.org/10.3389/feart.2020.00336>, 2020.
- Gandois, L., Tananaev, N., Prokushkin, A., Solnyshkin, I., and Teisserenc, R.: Seasonality of DOC Export From a Russian Subarctic Catchment Underlain by Discontinuous Permafrost, Highlighted by High-Frequency Monitoring, *Journal of Geophysical Research: Biogeosciences*, 126, e2020JG006152, 2021.
- Gao, Z., Niu, F., and Lin, Z.: Effects of permafrost degradation on thermokarst lake hydrochemistry in the Qinghai-Tibet Plateau, China, *Hydrological Processes*, 34, 5659–5673, <https://doi.org/10.1002/hyp.13987>, 2020.
- Grosse, G., Jones, B., and Arp, C.: 8.21 Thermokarst Lakes, Drainage, and Drained Basins, in: *Treatise on Geomorphology*, edited by Shroder, J., pp. 325–353, Elsevier, ISBN 978-0-08-088522-3, doi: 10.1016/B978-0-12-374739-6.00216-5, 2013.
- Grunblatt, J. and Atwood, D.: Mapping lakes for winter liquid water availability using SAR on the North Slope of Alaska, *International Journal of Applied Earth Observation and Geoinformation*, 27, 63–69, <https://doi.org/10.1016/j.jag.2013.05.006>, 2014.
- Heslop, J., Walter Anthony, K., Sepulveda-Jauregui, A., Martinez-Cruz, K., Bondurant, A., Grosse, G., and Jones, M.: Thermokarst lake methanogenesis along a complete talik profile, *Biogeosciences*, 12, 4317–4331, <https://doi.org/10.5194/bg-12-4317-2015>, 2015.
- Heslop, J., Walter Anthony, K., Winkel, M., Sepulveda-Jauregui, A., Martinez-Cruz, K., Bondurant, A., Grosse, G., and Liebner, S.: A synthesis of methane dynamics in thermokarst lake environments, *Earth-Science Reviews*, 210, 103365, <https://doi.org/10.1016/j.earscirev.2020.103365>, 2020.
- Himmelstoss, E., Henderson, R., Farris, A., Kratzmann, M., Bartlett, M., Ergul, A., McAndrews, J., Cibaj, R., Zichichi, J., and Thiel, R.: Digital Shoreline Analysis System (version 5), doi: 10.5066/P13WIZ8M, 2018.
- Hinkel, K., Frohn, R., Nelson, F., Eisner, W., and Beck, R.: Morphometric and spatial analysis of thaw lakes and drained thaw lake basins in the western Arctic Coastal Plain, Alaska, *Permafrost and Periglacial Processes*, 16, 327–341, <https://doi.org/10.1002/ppp.532>, 2005.
- Hinkel, K., Lenters, J., Sheng, Y., Lyons, E., Beck, R., Eisner, W., Maurer, E., Wang, J., and Potter, B.: Thermokarst Lakes on the Arctic Coastal Plain of Alaska: Spatial and Temporal Variability in Summer Water Temperature, *Permafrost and Periglacial Processes*, 23, 207–217, <https://doi.org/10.1002/ppp.1743>, 2012a.
- Hinkel, K., Sheng, Y., Lenters, J., Lyons, E., Beck, R., Eisner, W., and Wang, J.: Thermokarst Lakes on the Arctic Coastal Plain of Alaska: Geomorphic Controls on Bathymetry, *Permafrost and Periglacial Processes*, 23, 218–230, <https://doi.org/10.1002/ppp.1744>, 2012b.
- Hinkel, K., Arp, C., Townsend-Small, A., and Frey, K.: Can Deep Groundwater Influx be Detected from the Geochemistry of Thermokarst Lakes in Arctic Alaska?, *Permafrost and Periglacial Processes*, 28, 552–557, <https://doi.org/10.1002/ppp.1895>, 2016.
- Holmes, R., McClelland, J., Raymond, P., Frazer, B., Peterson, B., and Stieglitz, M.: Lability of DOC transported by Alaskan rivers to the Arctic Ocean, *Geophysical Research Letters*, 35, L03402, <https://doi.org/10.1029/2007GL032837>, 2008.

- Hugelius, G., Strauss, J., Zubrzycki, S., Harden, J., Schuur, E., Ping, C.-L., Schirrmeister, L., Grosse, G., Michaelson, G., Koven, C., and others: Estimated stocks of circumpolar permafrost carbon with quantified uncertainty ranges and identified data gaps, *Biogeosciences*, 11, 6573–6593, <https://doi.org/10.5194/bg-11-6573-2014>, 2014.
- In 'T Zandt, M., Liebner, S., and Welte, C.: Roles of Thermokarst Lakes in a Warming World, *Trends in Microbiology*, 28, 769–779, <https://doi.org/10.1016/j.tim.2020.04.002>, 2020.
- Intermap: Intermap, 2010. Product Handbook and Quick Start Guide, Standard Edition. Intermap, p. v 4.4., 2010.
- Jenrich, M., Proding, M., Nitze, I., Grosse, G., and Strauss, J.: Pan-Arctic thermokarst lagoon distribution, area and classification, <https://doi.org/10.1594/PANGAEA.968886>, 2024.
- Jones, B. and Arp, C.: Observing a Catastrophic Thermokarst Lake Drainage in Northern Alaska, *Permafrost and Periglacial Processes*, 26, 119–128, <https://doi.org/10.1002/ppp.1842>, 2015.
- Jones, B., Grosse, G., Arp, C., Jones, M., Walter Anthony, K., and Romanovsky, V.: Modern thermokarst lake dynamics in the continuous permafrost zone, northern Seward Peninsula, Alaska, *Journal of Geophysical Research*, 116, G00M03, <https://doi.org/10.1029/2011JG001666>, 2011.
- Jones, B., Grosse, G., Hinkel, K., Arp, C., Walker, S., Beck, R., and Galloway, J.: Assessment of pingo distribution and morphometry using an IfSAR derived digital surface model, western Arctic Coastal Plain, Northern Alaska, *Geomorphology*, 138, 1–14, <https://doi.org/10.1016/j.geomorph.2011.08.007>, 2012.
- Jones, B., Arp, C., Whitman, M., Nigro, D., Nitze, I., Beaver, J., Gädeke, A., Zuck, C., Liljedahl, A., Daanen, R., and others: A lake-centric geospatial database to guide research and inform management decisions in an Arctic watershed in northern Alaska experiencing climate and land-use changes, *Ambio*, 46, 769–786, <https://doi.org/10.1007/s13280-017-0915-9>, 2017.
- Jones, B., Arp, C., Grosse, G., Nitze, I., Lara, M., Whitman, M., Farquharson, L., Kanevskiy, M., Parsekian, A., Breen, A., and others: Identifying historical and future potential lake drainage events on the western Arctic coastal plain of Alaska, *Permafrost and Periglacial Processes*, 31, 110–127, <https://doi.org/10.1002/ppp.2038>, 2020.
- Jones, B., Grosse, G., Farquharson, L., Roy-Léveillé, P., Veremeeva, A., Kanevskiy, M., Gaglioti, B., Breen, A., Parsekian, A., Ulrich, M., and others: Lake and drained lake basin systems in lowland permafrost regions, *Nature Reviews Earth & Environment*, 3, 85–98, <https://doi.org/10.1038/s43017-021-00238-9>, 2022.
- Jones, B., Kanevskiy, M., Parsekian, A., Bergstedt, H., Ward Jones, M., Rangel, R., Hinkel, K., and Shur, Y.: Rapid Saline Permafrost Thaw Below a Shallow Thermokarst Lake in Arctic Alaska, *Geophysical Research Letters*, 50, e2023GL105552, <https://doi.org/10.1029/2023GL105552>, 2023.
- Jorgenson, M. and Shur, Y.: Evolution of lakes and basins in northern Alaska and discussion of the thaw lake cycle, *Journal of Geophysical Research: Earth Surface*, 112, 2006JF000531, <https://doi.org/10.1029/2006JF000531>, 2007.
- Jorgenson, M., Yoshikawa, K., Kanevskiy, M., Shur, Y., Romanovsky, V., Marchenko, S., Grosse, G., Brown, J., and Jones, B.: Permafrost characteristics of Alaska, University of Alaska, Fairbanks, vol. 3, pp. 121–122, 2008.
- Jorgenson, M., Harden, J., Kanevskiy, M., O'Donnell, J., Wickland, K., Ewing, S., Manies, K., Zhuang, Q., Shur, Y., Striegl, R., and Koch, J.: Reorganization of vegetation, hydrology and soil carbon after permafrost degradation across heterogeneous boreal landscapes, *Environmental Research Letters*, 8, 035017, <https://doi.org/10.1088/1748-9326/8/3/035017>, 2013.
- Kanevskiy, M., Shur, Y., Jorgenson, M., Ping, C.-L., Michaelson, G., Fortier, D., Stephani, E., Dillon, M., and Tumskey, V.: Ground ice in the upper permafrost of the Beaufort Sea coast of Alaska, *Cold Regions Science and Technology*, 85, 56–70, <https://doi.org/10.1016/j.coldregions.2012.08.002>, 2013.

- Kawahigashi, M., Kaiser, K., Kalbitz, K., Rodionov, A., and Guggenberger, G.: Dissolved organic matter in small streams along a gradient from discontinuous to continuous permafrost, *Global Change Biology*, 10, 1576–1586, <https://doi.org/10.1111/j.1365-2486.2004.00827.x>, 2004.
- Kessler, M., Plug, L., and Walter Anthony, K.: Simulating the decadal- to millennial-scale dynamics of morphology and sequestered carbon mobilization of two thermokarst lakes in NW Alaska, *Journal of Geophysical Research: Biogeosciences*, 117, G00M06, <https://doi.org/10.1029/2011JG001796>, 2012.
- Knoblauch, C., Beer, C., Liebner, S., Grigoriev, M., and Pfeiffer, E.-M.: Methane production as key to the greenhouse gas budget of thawing permafrost, *Nature Climate Change*, 8, 309–312, <https://doi.org/10.1038/s41558-018-0095-z>, 2018.
- Kokelj, S., Jenkins, R., Milburn, D., Burn, C., and Snow, N.: The influence of thermokarst disturbance on the water quality of small upland lakes, Mackenzie Delta region, Northwest Territories, Canada, *Permafrost and Periglacial Processes*, 16, 343–353, <https://doi.org/10.1002/ppp.536>, 2005.
- Kokelj, S., Zajdlík, B., and Thompson, M.: The impacts of thawing permafrost on the chemistry of lakes across the subarctic boreal-tundra transition, Mackenzie Delta region, Canada, *Permafrost and Periglacial Processes*, 20, 185–199, <https://doi.org/10.1002/ppp.641>, 2009.
- Kurek, M., Frey, K., Guillemette, F., Podgorski, D., Townsend-Small, A., Arp, C., Kellerman, A., and Spencer, R.: Trapped Under Ice: Spatial and Seasonal Dynamics of Dissolved Organic Matter Composition in Tundra Lakes, *Journal of Geophysical Research: Biogeosciences*, 127, e2021JG006578, <https://doi.org/10.1029/2021JG006578>, 2022.
- Lara, M. and Chipman, M.: Periglacial Lake Origin Influences the Likelihood of Lake Drainage in Northern Alaska, *Remote Sensing*, 13, 852, <https://doi.org/10.3390/rs13050852>, 2021.
- Lara, M., Chen, Y., and Jones, B.: Recent warming reverses forty-year decline in catastrophic lake drainage and hastens gradual lake drainage across northern Alaska, *Environmental Research Letters*, 16, 124 019, <https://doi.org/10.1088/1748-9326/ac3602>, 2021.
- Lenz, J., Jones, B., Wetterich, S., Tjallingii, R., Fritz, M., Arp, C., Rudaya, N., and Grosse, G.: Impacts of shore expansion and catchment characteristics on lacustrine thermokarst records in permafrost lowlands, Alaska Arctic Coastal Plain, *arktos*, 2, 25, <https://doi.org/10.1007/s41063-016-0025-0>, 2016.
- Liljedahl, A., Boike, J., Daanen, R., Fedorov, A., Frost, G., Grosse, G., Hinzman, L., Iijma, Y., Jorgenson, J., Matveyeva, N., and others: Pan-Arctic ice-wedge degradation in warming permafrost and its influence on tundra hydrology, *Nature Geoscience*, 9, 312–318, <https://doi.org/10.1038/ngeo2674>, 2016.
- Ling, F. and Zhang, T.: Numerical simulation of permafrost thermal regime and talik development under shallow thaw lakes on the Alaskan Arctic Coastal Plain, *Journal of Geophysical Research: Atmospheres*, 108, 2002JD003 014, <https://doi.org/10.1029/2002JD003014>, 2003.
- MacDonald, L., Turner, K., McDonald, I., Kay, M., Hall, R., and Wolfe, B.: Isotopic evidence of increasing water abundance and lake hydrological change in Old Crow Flats, Yukon, Canada, *Environmental Research Letters*, 16, 124 024, <https://doi.org/10.1088/1748-9326/ac3533>, 2021.
- Magen, C., Lapham, L., Pohlman, J., Marshall, K., Bosman, S., Casso, M., and Chanton, J.: A simple headspace equilibration method for measuring dissolved methane, *Limnology and Oceanography: Methods*, 12, 637–650, <https://doi.org/10.4319/lom.2014.12.637>, 2014.
- Manasypov, R., Vorobyev, S., Loiko, S., Kritzkov, I., Shirokova, L., Shevchenko, V., Kirpotin, S., Kulizhsky, S., Kolesnichenko, L., Zemtzov, V., and others: Seasonal dynamics of organic carbon and metals in thermokarst lakes from the discontinuous permafrost zone of western Siberia, *Biogeosciences*, 12, 3009–3028, <https://doi.org/10.5194/bg-12-3009-2015>, 2015.

- 585 Manasypov, R., Lim, A., Krikov, I., Shirokova, L., Vorobyev, S., Kirpotin, S., and Pokrovsky, O.: Spatial and Seasonal Variations of C, Nutrient, and Metal Concentration in Thermokarst Lakes of Western Siberia Across a Permafrost Gradient, *Water*, 12, 1830, <https://doi.org/10.3390/w12061830>, 2020.
- Manasypov, R., Fan, L., Lim, A., Krickov, I., Pokrovsky, O., Kuzyakov, Y., and Dorodnikov, M.: Size matters: Aerobic methane oxidation in sediments of shallow thermokarst lakes, *Global Change Biology*, 30, e17 120, <https://doi.org/10.1111/gcb.17120>, 2024.
- 590 Mann, P., Eglinton, T., McIntyre, C., Zimov, N., Davydova, A., Vonk, J., Holmes, R., and Spencer, R.: Utilization of ancient permafrost carbon in headwaters of Arctic fluvial networks, *Nature Communications*, 6, 7856, <https://doi.org/10.1038/ncomms8856>, 2015.
- Meyer, H., Schönicke, L., Wand, U., Hubberten, H.-W., and Friedrichsen, H.: Isotope Studies of Hydrogen and Oxygen in Ground Ice - Experiences with the Equilibration Technique, *Isotopes in Environmental and Health Studies*, 36, 133–149, <https://doi.org/10.1080/10256010008032939>, 2000.
- 595 Mohammed, A., Guimond, J., Bense, V., Jamieson, R., McKenzie, J., and Kurylyk, B.: Mobilization of subsurface carbon pools driven by permafrost thaw and reactivation of groundwater flow: a virtual experiment, *Environmental Research Letters*, 17, 124 036, <https://doi.org/10.1088/1748-9326/aca701>, 2022.
- Muster, S., Roth, K., Langer, M., Lange, S., Cresto Aleina, F., Bartsch, A., Morgenstern, A., Grosse, G., Jones, B., Sannel, A., and others: PeRL: a circum-Arctic Permafrost Region Pond and Lake database, *Earth System Science Data*, 9, 317–348, <https://doi.org/10.5194/essd-9-317-2017>, 2017.
- 600 Nitze, I., Grosse, G., Jones, B., Arp, C., Ulrich, M., Fedorov, A., and Veremeeva, A.: Landsat-Based Trend Analysis of Lake Dynamics across Northern Permafrost Regions, *Remote Sensing*, 9, 640, <https://doi.org/10.3390/rs9070640>, 2017.
- Nitze, I., Grosse, G., Jones, B., Romanovsky, V., and Boike, J.: Remote sensing quantifies widespread abundance of permafrost region disturbances across the Arctic and Subarctic, *Nature Communications*, 9, 5423, <https://doi.org/10.1038/s41467-018-07663-3>, 2018a.
- 605 Nitze, I., Grosse, G., Jones, B., Romanovsky, V., and Boike, J.: Remote sensing quantifies widespread abundance of permafrost region disturbances across the Arctic and Subarctic, *Datasets*, <https://doi.org/10.1594/PANGAEA.894755>, 2018b.
- Ohara, N., Jones, B., Parsekian, A., Hinkel, K., Yamatani, K., Kanevskiy, M., Rangel, R., Breen, A., and Bergstedt, H.: A new Stefan equation to characterize the evolution of thermokarst lake and talik geometry, *The Cryosphere*, 16, 1247–1264, <https://doi.org/10.5194/tc-16-1247-2022>, 2022.
- 610 Olefeldt, D., Goswami, S., Grosse, G., Hayes, D., Hugelius, G., Kuhry, P., McGuire, A., Romanovsky, V., Sannel, A., Schuur, E., and others: Circumpolar distribution and carbon storage of thermokarst landscapes, *Nature Communications*, 7, 13 043, <https://doi.org/10.1038/ncomms13043>, 2016.
- Osudar, R., Liebner, S., Alawi, M., Yang, S., Bussmann, I., and Wagner, D.: Methane turnover and methanotrophic communities in arctic aquatic ecosystems of the Lena Delta, Northeast Siberia, *FEMS Microbiology Ecology*, 92, fiw116, <https://doi.org/10.1093/femsec/fiw116>, 2016.
- 615 Parsekian, A., Creighton, A., Jones, B., and Arp, C.: Surface nuclear magnetic resonance observations of permafrost thaw below floating, bedfast, and transitional ice lakes, *GEOPHYSICS*, 84, EN33–EN45, <https://doi.org/10.1190/geo2018-0563.1>, 2019.
- Rantanen, M., Karpechko, A., Lipponen, A., Nordling, K., Hyvärinen, O., Ruosteenoja, K., Vihma, T., and Laaksonen, A.: The Arctic has warmed nearly four times faster than the globe since 1979, *Communications Earth & Environment*, 3, 168, <https://doi.org/10.1038/s43247-022-00498-3>, 2022.
- 620 Rautio, M., Dufresne, F., Laurion, I., Bonilla, S., Vincent, W., and Christoffersen, K.: Shallow freshwater ecosystems of the circumpolar Arctic, *Écoscience*, 18, 204–222, <https://doi.org/10.2980/18-3-3463>, 2011.

- Raynolds, M., Walker, D., and Maier, H.: Plant community-level mapping of arctic Alaska based on the Circumpolar Arctic Vegetation Map, *Phytocoenologia*, 35, 821–848, <https://doi.org/10.1127/0340-269X/2005/0035-0821>, 2005.
- 625 Romanovsky, V., Drozdov, D., Oberman, N., Malkova, G., Kholodov, A. L., Marchenko, S., Moskalenko, N., Sergeev, D., Ukrainskaya, N., Abramov, A., and others: Thermal state of permafrost in Russia, *Permafrost and Periglacial Processes*, 21, 136–155, <https://doi.org/10.1002/ppp.683>, 2010.
- Sasaki, M., Kim, Y.-W., Uchida, M., and Utsumi, M.: Diffusive summer methane flux from lakes to the atmosphere in the Alaskan arctic zone, *Polar Science*, 10, 303–311, <https://doi.org/10.1016/j.polar.2016.06.010>, 2016.
- 630 Schneider von Deimling, T., Grosse, G., Strauss, J., Schirrmeister, L., Morgenstern, A., Schaphoff, S., Meinshausen, M., and Boike, J.: Observation-based modelling of permafrost carbon fluxes with accounting for deep carbon deposits and thermokarst activity, *Biogeosciences*, 12, 3469–3488, <https://doi.org/10.5194/bg-12-3469-2015>, 2015.
- Sellmann, P., Brown, J., Lewelen, R., McKim, H., and Merry, C.: The classification and geomorphic implications of thaw lakes on the Aerctic Coastal Plain, Alaska, Special Report 344, Cold Regions Observatory, Hanover, New Hampshire, 1975.
- 635 Shaposhnikova, M., Duguay, C., and Roy-Léveillé, P.: Bedfast and floating-ice dynamics of thermokarst lakes using a temporal deep-learning mapping approach: case study of the Old Crow Flats, Yukon, Canada, *The Cryosphere*, 17, 1697–1721, <https://doi.org/10.5194/tc-17-1697-2023>, 2023.
- Shirokova, L., Pokrovsky, O., Kirpotin, S., Desmukh, C., Pokrovsky, B., Audry, S., and Viers, J.: Biogeochemistry of organic carbon, CO<sub>2</sub>, CH<sub>4</sub>, and trace elements in thermokarst water bodies in discontinuous permafrost zones of Western Siberia, *Biogeochemistry*, 113, 573–593, <https://doi.org/10.1007/s10533-012-9790-4>, 2013.
- 640 Shulski, M. and Wendler, G.: *The Climate of Alaska*, University of Alaska Press, Fairbanks, AK, 2007.
- Smith, S., O'Neill, H., Isaksen, K., Noetzli, J., and Romanovsky, V.: The changing thermal state of permafrost, *Nature Reviews Earth & Environment*, 3, 10–23, <https://doi.org/10.1038/s43017-021-00240-1>, 2022.
- Spangenberg, I., Overduin, P., Damm, E., Bussmann, I., Meyer, H., Liebner, S., Angelopoulos, M., Biskaborn, B., Grigoriev, M., and Grosse, G.: Methane pathways in winter ice of a thermokarst lake–lagoon–coastal water transect in north Siberia, *The Cryosphere*, 15, 1607–1625, <https://doi.org/10.5194/tc-15-1607-2021>, 2021.
- 645 Spencer, R., Mann, P., Dittmar, T., Eglinton, T., McIntyre, C., Holmes, R., Zimov, N., and Stubbins, A.: Detecting the signature of permafrost thaw in Arctic rivers, *Geophysical Research Letters*, 42, 2830–2835, <https://doi.org/10.1002/2015GL063498>, 2015.
- Stolpmann, L., Coch, C., Morgenstern, A., Boike, J., Fritz, M., Herzsuh, U., Stoof-Leichsenring, K., Dvornikov, Y., Heim, B., Lenz, J., and others: First pan-Arctic assessment of dissolved organic carbon in lakes of the permafrost region, *Biogeosciences*, 18, 3917–3936, <https://doi.org/10.5194/bg-18-3917-2021>, 2021.
- 650 Stolpmann, L., Mollenhauer, G., Morgenstern, A., Hammes, J., Boike, J., Overduin, P., and Grosse, G.: Origin and Pathways of Dissolved Organic Carbon in a Small Catchment in the Lena River Delta, *Frontiers in Earth Science*, 9, 759085, <https://doi.org/10.3389/feart.2021.759085>, 2022.
- 655 Surdu, C., Duguay, C., Brown, L., and Fernández Prieto, D.: Response of ice cover on shallow lakes of the North Slope of Alaska to contemporary climate conditions (1950–2011): radar remote-sensing and numerical modeling data analysis, *The Cryosphere*, 8, 167–180, <https://doi.org/10.5194/tc-8-167-2014>, 2014.
- Tank, S., Vonk, J., Walvoord, M., McClelland, J., Laurion, I., and Abbott, B.: Landscape matters: Predicting the biogeochemical effects of permafrost thaw on aquatic networks with a state factor approach, *Permafrost and Periglacial Processes*, 31, 358–370, <https://doi.org/10.1002/ppp.2057>, 2020.
- 660



- Textor, S., Wickland, K., Podgorski, D., Johnston, S., and Spencer, R.: Dissolved Organic Carbon Turnover in Permafrost-Influenced Watersheds of Interior Alaska: Molecular Insights and the Priming Effect, *Frontiers in Earth Science*, 7, 275, <https://doi.org/10.3389/feart.2019.00275>, 2019.
- Throckmorton, H., Newman, B., Heikoop, J., Perkins, G., Feng, X., Graham, D., O'Malley, D., Vesselinov, V., Young, J., Wulfschleger, S., and others: Active layer hydrology in an arctic tundra ecosystem: quantifying water sources and cycling using water stable isotopes, *Hydrological Processes*, 30, 4972–4986, <https://doi.org/10.1002/hyp.10883>, 2016.
- Townsend-Small, A., Åkerström, F., Arp, C., and Hinkel, K.: Spatial and Temporal Variation in Methane Concentrations, Fluxes, and Sources in Lakes in Arctic Alaska, *Journal of Geophysical Research: Biogeosciences*, 122, 2966–2981, <https://doi.org/10.1002/2017JG004002>, 2017.
- Turetsky, M., Abbott, B., Jones, M., Walter Anthony, K., Olefeldt, D., Schuur, E., Grosse, G., Kuhry, P., Hugelius, G., Koven, C., and others: Carbon release through abrupt permafrost thaw, *Nature Geoscience*, 13, 138–143, <https://doi.org/10.1038/s41561-019-0526-0>, 2020.
- Vonk, J., Mann, P., Davydov, S., Davydova, A., Spencer, R., Schade, J., Sobczak, W., Zimov, N., Zimov, S., Bulygina, E., and others: High biolability of ancient permafrost carbon upon thaw, *Geophysical Research Letters*, 40, 2689–2693, <https://doi.org/10.1002/grl.50348>, 2013.
- Vonk, J., Tank, S., Bowden, W., Laurion, I., Vincent, W., Alekseychik, P., Amyot, M., Billet, M., Canário, J., Cory, R., and others: Reviews and syntheses: Effects of permafrost thaw on Arctic aquatic ecosystems, *Biogeosciences*, 12, 7129–7167, <https://doi.org/10.5194/bg-12-7129-2015>, 2015.
- Walter, K., Zimov, S., Chanton, J., Verbyla, D., and Chapin, F.: Methane bubbling from Siberian thaw lakes as a positive feedback to climate warming, *Nature*, 443, 71–75, <https://doi.org/10.1038/nature05040>, 2006.
- Walter, K., Smith, L., and Stuart Chapin, F.: Methane bubbling from northern lakes: present and future contributions to the global methane budget, *Philosophical Transactions of the Royal Society A: Mathematical, Physical and Engineering Sciences*, 365, 1657–1676, <https://doi.org/10.1098/rsta.2007.2036>, 2007.
- Walter Anthony, K., Zimov, S., Grosse, G., Jones, M., Anthony, P., Chapin III., F., Finlay, J., Mack, M., Davydov, S., Frenzel, P., and others: A shift of thermokarst lakes from carbon sources to sinks during the Holocene epoch, *Nature*, 511, 452–456, <https://doi.org/10.1038/nature13560>, 2014.
- Walter Anthony, K., Daanen, R., Anthony, P., Schneider Von Deimling, T., Ping, C.-L., Chanton, J., and Grosse, G.: Methane emissions proportional to permafrost carbon thawed in Arctic lakes since the 1950s, *Nature Geoscience*, 9, 679–682, <https://doi.org/10.1038/ngeo2795>, 2016.
- Walter Anthony, K., Schneider Von Deimling, T., Nitze, I., Frolking, S., Emond, A., Daanen, R., Anthony, P., Lindgren, P., Jones, B., and Grosse, G.: 21st-century modeled permafrost carbon emissions accelerated by abrupt thaw beneath lakes, *Nature Communications*, 9, 3262, <https://doi.org/10.1038/s41467-018-05738-9>, 2018.
- Walter Anthony, K., Lindgren, P., Hanke, P., Engram, M., Anthony, P., Daanen, R., Bondurant, A., Liljedahl, A., Lenz, J., Grosse, G., and others: Decadal-scale hotspot methane ebullition within lakes following abrupt permafrost thaw, *Environmental Research Letters*, 16, 035 010, <https://doi.org/10.1088/1748-9326/abc848>, 2021.
- Walvoord, M. and Striegl, R.: Complex Vulnerabilities of the Water and Aquatic Carbon Cycles to Permafrost Thaw, *Frontiers in Climate*, 3, 730 402, 2021.

- Wickland, K., Waldrop, M., Aiken, G., Koch, J., Jorgenson, M., and Striegl, R.: Dissolved organic carbon and nitrogen release from boreal Holocene permafrost and seasonally frozen soils of Alaska, *Environmental Research Letters*, 13, 065 011, <https://doi.org/10.1088/1748-9326/aac4ad>, 2018.
- 700 Wik, M., Thornton, B., Bastviken, D., Uhlbäck, J., and Crill, P.: Biased sampling of methane release from northern lakes: A problem for extrapolation, *Geophysical Research Letters*, 43, 1256–1262, <https://doi.org/10.1002/2015GL066501>, 2016.
- Wilcox, E., Wolfe, B., and Marsh, P.: Hydrological, meteorological, and watershed controls on the water balance of thermokarst lakes between Inuvik and Tuktoyaktuk, Northwest Territories, Canada, *Hydrology and Earth System Sciences*, 27, 2173–2188, <https://doi.org/10.5194/hess-27-2173-2023>, 2023.
- 705 Wild, B., Andersson, A., Bröder, L., Vonk, J., Hugelius, G., McClelland, J., Song, W., Raymond, P., and Gustafsson, O.: Rivers across the Siberian Arctic unearth the patterns of carbon release from thawing permafrost, *Proceedings of the National Academy of Sciences*, 116, 10 280–10 285, <https://doi.org/10.1073/pnas.1811797116>, 2019.
- Yang, S., Anthony, S., Jenrich, M., in 't Zandt, M., Strauss, J., Overduin, P., Grosse, G., Angelopoulos, M., Biskaborn, B., Grigoriev, M., and others: Microbial methane cycling in sediments of Arctic thermokarst lagoons, *Global Change Biology*, 29, 2714–2731, <https://doi.org/10.1111/gcb.16649>, 2023.
- 710 Yang, S., Wen, X., Wagner, D., Strauss, J., Kallmeyer, J., Anthony, S., and Liebner, S.: Microbial assemblages in Arctic coastal thermokarst lakes and lagoons, *FEMS Microbiology Ecology*, 100, fae014, <https://doi.org/10.1093/femsec/fae014>, 2024.