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## RESEARCH ARTICLE

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#### **Key Points:**

- Variation in hydrochemistry across tundra aquatic environments was more strongly coupled to physiographic factors than to wildfire effects
- Wildfire generally reduced dissolved organic carbon (DOC) and CO<sub>2</sub>, and enhanced ion mobility and nitrogen cycling, but effects varied
- Wildfire effects on some hydrochemical constituents persisted beyond 3 years (e.g., DOC, CO<sub>2</sub>) and were brief for others (conductivity)

#### **Supporting Information:**

Supporting Information may be found in the online version of this article.

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## Physiographic Controls and Wildfire Effects on Aquatic Biogeochemistry in Tundra of the Yukon-Kuskokwim Delta, Alaska

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**Abstract** Northern high-latitude deltas are hotspots of biogeochemical processing, terrestrial-aquatic connectivity, and, in Alaska's Yukon-Kuskokwim Delta (YKD), tundra wildfire. Yet, wildfire effects on aquatic biogeochemistry remain understudied in northern delta regions, thus limiting a more comprehensive understanding of high latitude biogeochemical cycles. In this study, we assess wildfire impacts on summertime aquatic biogeochemistry in YKD tundra using a multi-year (2015-2019) data set of water chemistry measurements (n = 406) from five aquatic environments: peat plateau ponds, fen ponds, fen channels, lakes, and streams. We aimed to (a) characterize variation in hydrochemistry among aquatic environments; (b) determine wildfire effects on hydrochemistry; and (c) assess post-fire multi-year patterns in hydrochemistry in lakes (lower terrestrial-freshwater connectivity) and fen ponds (higher connectivity). Variation in hydrochemistry among environments was more strongly associated with watershed characteristics (e.g., terrestrial-aquatic connectivity) than wildfire. However, certain hydrochemical constituents showed consistent wildfire effects. Decreases in dissolved organic carbon (DOC) and CO<sub>2</sub>, and increases in pH, specific conductance, NH<sub>4</sub><sup>+</sup>, and NO<sub>3</sub><sup>-</sup> indicate that, by combusting soil organic matter, wildfire reduces organics available for hydrologic transport and microbial respiration, and mobilizes nitrogen into freshwaters. Multi-year post-fire variation in specific conductance, DOC, and CO<sub>2</sub> in lakes and fen ponds suggest that watershed characteristics underlie ecosystem response and recovery to wildfire in the YKD. Together, these results indicate that increasing tundra wildfire occurrence at northern high latitudes could drive multi-year shifts toward stronger aquatic inorganic nutrient cycling, and that variation in terrain characteristics is likely to underlie wildfire effects on aquatic ecosystems across broader scales.

Plain Language Summary Warming at northern high latitudes is expected to increase wildfire activity, permafrost thaw, and hydrologic connectivity. Yet, contrasting evidence for wildfire effects on aquatic biogeochemistry hinders a more concrete understanding of potential future changes to northern ecosystems, especially in delta environments, where land-freshwater linkages are strong. To address this, we made ~400 measurements of hydrochemistry within the Yukon-Kuskokwim Delta, Alaska, following high wildfire activity in 2015. Variation in hydrochemistry among five aquatic environments—peat plateau ponds, fen ponds, fen channels, lakes, and streams—was more strongly associated with watershed characteristics (e.g., land-freshwater linkages) than wildfire. However, wildfire consistently affected some parameters. For instance, dissolved organic carbon and CO<sub>2</sub> were lower in burned watersheds, likely from combustion of organic matter, whereas, pH, specific conductance, and nitrogen were higher, reflecting solute release from combusted organics. Multi-year measurements (2015–2019) allowed us to assess post-fire variation in hydrochemistry among lakes and fen ponds, and indicate that ecosystem response and recovery to wildfire depend on watershed characteristics. Results indicate that increasing tundra wildfire at northern high latitudes could drive multi-year shifts toward stronger aquatic inorganic nutrient cycling. Across broader spatiotemporal scales, variation in terrain characteristics is likely to underlie wildfire effects on aquatic ecosystems.

#### 1. Introduction

Biogeochemical cycling is shaped by varied physiographic conditions across landscapes, and changes to these landscapes are reflected in aquatic chemistry (Drake et al., 2018; Toohey et al., 2016). This is particularly evident

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at northern high latitudes, where large stores of nutrients in permafrost environments (Hugelius et al., 2020) are increasingly susceptible to lateral transfer into aquatic environments due to climate warming, permafrost thaw, and wildfire (Frey & McClelland, 2009; Shogren et al., 2019). While aquatic biogeochemical cycles are strongly coupled to regional variation in physiographic factors including watershed elevation and slope (Connolly et al., 2018), vegetation productivity (Hutchins et al., 2019), and hydrology (Striegl et al., 2007), contrasting evidence for wildfire effects on aquatic biogeochemistry (Larouche et al., 2015; Rodríguez-Cardona et al., 2020) hinders a more concrete understanding of potential future changes to northern ecosystems.

As climate warming and wildfire regimes intensify at northern high latitudes (Kasischke et al., 2010; Rocha et al., 2012), changes in surface water chemistry are hypothesized to be a key indicator of aquatic and terrestrial ecosystem response to environmental change (Hutchins et al., 2020; Larouche et al., 2015; Rodríguez-Cardona et al., 2020). The interconnected nature of vegetation, soils, and hydrology allow for wildfire effects to cascade beyond the land surface because wildfire changes the composition of aboveground vegetation (Bret-Harte et al., 2013; Frost et al., 2020), deepens the active layer (Holloway et al., 2020), and alters subsurface hydrology (Ackley et al., 2021). In landscapes with strong terrestrial-aquatic connectivity, which is often the case in smaller watersheds, wildfire can decrease nutrient and organic matter in downstream environments (Abbott et al., 2021; Rodríguez-Cardona et al., 2020). Although wildfire effects are not likely to be uniform across landscapes with different physiographic conditions (e.g., hydrology, vegetation cover, land-freshwater connectivity), the relative importance of physiographic conditions versus wildfire on aquatic biogeochemistry is important to constrain for understanding potential future trajectories of northern ecosystem change.

Northern deltas are hotspots of ecological diversity, nutrient storage, and biogeochemical processing, and are characterized by strong land-freshwater linkages. The Yukon-Kuskokwim Delta (YKD) in southwestern Alaska is primarily coastal lowlands with interior tundra underlain by sporadic and discontinuous permafrost (Brown et al., 2002). Wildfire activity has greatly affected the YKD landscape, especially in recent years. In 2015 alone, wildfires burned over 420 km² in YKD uplands (AICC, 2019). Lacustrine sedimentary records indicate that intervals of more frequent and intense wildfire during the Holocene were instigated by warmer air temperatures (Sae-Lim et al., 2019). Although wildfire is certain to affect aquatic ecosystems in the YKD, the magnitude and duration of the effects are unknown and challenging to estimate solely based on findings elsewhere because of large regional variation. Additionally, multi-year post-fire effects on aquatic chemistry are seldom studied, in part due to the logistical challenge presented by the stochastic nature of wildfire occurrence (Burd et al., 2018; Hutchins et al., 2020; Koch et al., 2014; Larouche et al., 2015; Rodríguez-Cardona et al., 2020).

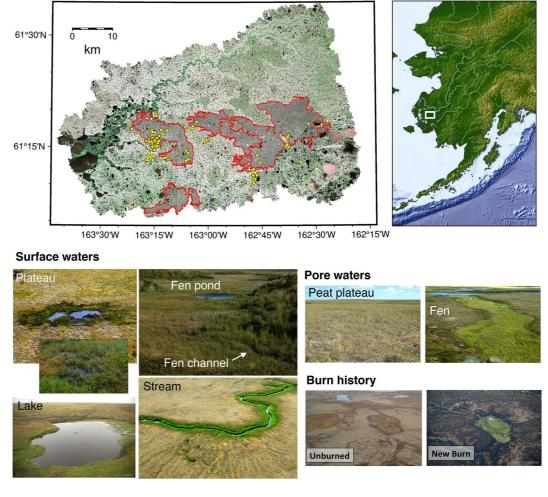
Here, we make a first assessment of physiographic controls and wildfire effects on aquatic biogeochemistry in the YKD using a multi-year (2015–2019) data set of samples ( $n \sim 400$ ) collected among five aquatic environments: peat plateau ponds, fen ponds, fen channels, lakes, and streams (Figure 1). Watersheds of these aquatic environments vary with respect to area, elevation, vegetation, and hydrology, allowing us to determine the degree to which landscape factors control hydrochemistry, and how their effects interact with recent wildfire. Using surface water and pore water chemistry data collected over 5 years following wildfire, we sought to address the question: what is the influence of recent wildfire (2015) on aquatic biogeochemistry in YKD tundra? Our objectives were to: (a) determine wildfire effects on hydrochemistry among YKD aquatic environments; (b) compare wildfire effects on carbon and nutrient cycling in aquatic environments with relatively lower connectivity (lakes) and higher connectivity (fen ponds) with the surrounding landscape; and (c) characterize multi-year post-fire patterns in aquatic biogeochemistry.

#### 2. Methods

## 2.1. Study Area

Sampling occurred in the Izaviknek and Kingaglia Uplands, a 3,900 km² region situated 10–65 m above sea level and underlain by discontinuous permafrost (Frost et al., 2020). This tundra landscape is characterized by peatland plateaus and by interconnected lakes, fens, and streams. Terrestrial vegetation on unburned peat plateaus is dominated by lichen and low-lying shrubs, while vegetation in aquatic systems is typically dominated by *Sphagnum* and graminoid *spp*. (Frost et al., 2020). At the Bethel airport 75 km southeast of the study area, the mean annual and July air temperatures from 2015 to 2019 were 1.8°C and 14.7°C, respectively (NOAA, 2020). Mean annual and July precipitation were 536 and 62.1 mm, respectively. Wildfires in the YKD typically occur

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**Figure 1.** Top left: map of sampling sites (yellow points) within the study area. Red polygons outline perimeters of wildfires during 2015. Map created using Generic Mapping Tools (Wessel et al., 2019). Top right: location of study area within Alaska (white box). Terrain relief data obtained from Tozer et al. (2019). Bottom: aquatic environments within the Yukon-Kuskokwim Delta that were sampled for (a) surface waters and (b) pore waters across terrain that was (c) unburned or burned in 2015. Photographs are in true color and all were made by Chris Linder Photography.

during the thaw season (late spring through late summer), and were abundant in 2015 due to anomalously high thaw-season air temperatures and lightning strikes (Veraverbeke et al., 2017). Although YKD tundra wildfires are relatively low intensity due to limited fuel availability, they often combust the widespread surficial lichen and decrease surface organic soil layer thickness (Frost et al., 2020).

Sampling occurred at 406 sites within 50 km of  $61.263^{\circ}$ N,  $163.246^{\circ}$ W during summertime (June–September) from 2015 to 2019 (Figure 1; Table S1 in Supporting Information S1). Surface water samples were collected at 343 sites and pore water samples at 63 sites. Most (nearly 70%) of samples were collected in July in order to focus on characterizing patterns in hydrochemistry among aquatic environments, rather than revisiting specific sites multiple times during the summer to assess potential changes in hydrochemistry associated with seasonal thaw. We identified five primary aquatic and wetland environments that differ in landscape position, vegetation, hydrologic regimes, and connectivity with the landscape: peat plateau ponds (henceforth, plateau ponds) (n = 31), fen ponds (n = 21), lakes (n = 159), fen channels (n = 179), and streams (n = 16) (Figure 1). Plateau ponds were characterized by relatively small ( $\leq 10$  m diameter), shallow (< 0.5 m), and hydrologically isolated and relatively ephemeral bodies of water, some with muddy sediments or dead moss underlying the water column. Plateau ponds did not have a peripheral bank, rarely contained submerged aquatic vegetation, and were likely to dry and recede between rain events. In some cases, these surface waters formed only under wet conditions, when the active layer was saturated. Fens are thought to have a strong connection to the terrestrial environment and are

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dominated by *Sphagnum spp.*, other hydrophilic mosses, and graminoids, with large willow shrubs occasionally present. Fen ponds were generally small and connected hydrologically by fen channels. Lakes in the YKD were typically 1–3 m deep, had 1–3 m high banks, and ranged in size from 10 m to >1 km in diameter. Lakes were often relatively turbid and some had emergent aquatic vegetation. Streams had clearly defined banks and channels, riparian zones with deciduous shrubs, with varying amounts of submerged aquatic vegetation.

#### 2.2. Surface and Pore Water Sample Collection

Water sampling targeted areas that were either burned in 2015 or unburned, to assess the immediate post-fire response of tundra aquatic ecosystems to wildfire. At all surface water sampling sites, water temperature, specific conductance (henceforth, conductivity), pH, and dissolved oxygen (D.O.) were measured using a pre-calibrated Professional-Plus water quality meter (Yellow Springs Instruments). Water samples for dissolved organic carbon (DOC), total dissolved nitrogen (TDN), ammonium (NH<sub>4</sub><sup>+</sup>), nitrate (NO<sub>3</sub><sup>-</sup>), phosphate (PO<sub>4</sub><sup>3-</sup>), and optical properties of chromophoric dissolved organic matter (CDOM) were collected in sample-rinsed polypropylene syringes and filtered (0.7  $\mu$ m glass fiber filter, Whatman) into acid-washed, sample-rinsed high density polyethylene bottles. Filtrate was stored frozen until analysis in the laboratory. Water for dissolved inorganic carbon (DIC) concentration and stable isotopes ( $\delta^{13}$ C-DIC) and CH<sub>4</sub> stable isotopes ( $\delta^{13}$ C-CH<sub>4</sub>) was injected into sealed glass vials; samples for  $\delta^{13}$ C-DIC were acidified with 100  $\mu$ l of H<sub>3</sub>PO<sub>4</sub>. Water for stable isotopes of water ( $\delta^{2}$ H-H<sub>2</sub>O,  $\delta^{18}$ O-H<sub>2</sub>O) was filtered directly into glass vials without headspace or air bubbles. Samples for DIC and H<sub>2</sub>O stable isotopes were stored cool (4°C) and dark prior to analysis.

Dissolved CO<sub>2</sub> and CH<sub>4</sub> in water were collected in triplicate using the headspace equilibration method (Hesslein et al., 1991). 30 mL of water sample and 30 mL of atmosphere was shaken vigorously for 1 minute within a sealed polypropylene syringe. The equilibrated headspace gas was injected into a pre-evacuated glass vial sealed with a butyl septum to achieve positive pressure and stored dark and at ambient temperature until analysis. Water and air temperature and atmosphere pressure were recorded to correct later calculations of CO<sub>2</sub> and CH<sub>4</sub> concentration.

CO<sub>2</sub> and CH<sub>4</sub> efflux from surface waters to the atmosphere were measured as the change in gas concentration within the headspace of a stationary floating chamber. Continuous measurements of CO<sub>2</sub> and CH<sub>4</sub> concentrations within the flux chamber headspace were collected for up to 20 minutes using a portable greenhouse gas analyzer (Ultraportable Greenhouse Gas Analyzer, Los Gatos Research). Fluxes were calculated as the change in headspace gas concentrations during the sampling interval.

Pore water was collected from wells or sippers and processed in the same fashion as surface water samples. Wells made of polyvinyl chloride tubing were installed into the organic layer using a hand drill and undisturbed for 24 hr prior to sampling to minimize potential disturbance effects by installation. Pore water samples were collected using a polypropylene syringe or, when required for deeper wells, a peristaltic pump (Geopump) with silicone tubing (Masterflex). Owing to potential disturbance from pumping action on dissolved gases,  $CO_2$  and  $CH_4$  were not collected when well water samples were collected using a peristaltic pump. Sippers were installed into the organic layer and pore water was extracted at <30 mL/min via a syringe connected to tubing.

#### 2.3. Laboratory Analyses

DOC and TDN were analyzed by high-temperature oxidation followed by infrared detection of  $\mathrm{CO}_2$  and chemiluminescent detection of NO (Shimadzu TOC-V/TNM-1) at the Woodwell Climate Research Center (Woodwell) Environmental Chemistry Laboratory (ECL). DOC and TDN concentrations were calculated as the mean of three to five injections and the coefficient of variance was <2%. MilliQ DI water blanks, standard reference material, and in-house references for carbon (10 ppm, caffeine) and nitrogen (1 ppm,  $\mathrm{NH_4}^+$ ) were routinely measured as quality checks during each run.

Inorganic nutrients (NH<sub>4</sub><sup>+</sup>, NO<sub>3</sub><sup>-</sup>, PO<sub>4</sub><sup>3-</sup>) were measured on an Astoria Analyzer at the Woodwell ECL following established protocols (U.S. Environmental Protection Agency, 1984). Dissolved organic nitrogen was calculated as the difference between TDN and dissolved inorganic nitrogen (DIN =  $\Sigma$ [NH<sub>4</sub><sup>+</sup>, NO<sub>3</sub><sup>-</sup>, NO<sub>2</sub><sup>-</sup>]).

We calculated specific UV absorbance at 254 nm (SUVA $_{254}$ ) to characterize dissolved organic matter aromaticity, which is an indicator of reactivity (Weishaar et al., 2003). Optical absorbance of CDOM in the UV-visible range (200–800 nm) was measured in duplicate at 20°C using a Shimadzu dual-beam UV-1800 spectrophotometer at

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the Woodwell ECL within 4 weeks of collection. MilliQ water blanks were measured at the beginning and end of each run to monitor for instrument drift, and mean absorbance from 700 to 800 nm was used to correct each sample for offset from scattering (Stubbins et al., 2017). Corrected spectra were used to calculate SUVA<sub>254</sub> as the decadic absorption at 254 nm coefficient divided by DOC concentration (Weishaar et al., 2003). SUVA<sub>254</sub> positively correlates with dissolved organic matter aromaticity; lower values are associated with relatively more labile organic matter in northern aquatic environments (Littlefair & Tank, 2018; Wickland et al., 2012). Slope ratios ( $S_R$ ) were calculated using log-linear fits of corrected absorbance spectra from 275 to 295 and 350–400 nm (Helms et al., 2008). In northern freshwaters, higher  $S_R$  values are associated with organic matter with a lower molecular weight and therefore may be relatively more biolabile and/or photodegraded (Helms et al., 2008; Littlefair & Tank, 2018; Ward & Cory, 2016). We used SUVA<sub>254</sub> and  $S_R$  to evaluate relative organic carbon reactivity in aquatic environments.

Dissolved  $CO_2$  and  $CH_4$  were analyzed by a gas chromatograph equipped with a flame ionization detector at the Woodwell ECL (GC-2014, Shimadzu Scientific Instruments). Stable carbon isotope values, which reflect fractionation associated with abiotic and biotic processes (Kendall et al., 2014), were used to infer potential carbon sources. Stable isotopes of DIC,  $CH_4$ , and  $H_2O$  were analyzed at the Northumbria University Cold and Paleo-Environment Group Laboratory.  $\delta^{13}C$ -DIC and  $\delta^{13}C$ -CH $_4$  were measured by isotope ratio mass-spectrometry (Thermo Delta V Advantage interfaced to a Gas Bench II) and  $\delta^{18}O$ - $H_2O$  and  $\delta^2H$ - $H_2O$  by cavity ringdown spectroscopy (IWA45-EP, Los Gatos Research). Values are reported in permil (‰) relative to Pee-Dee Belemnite (VPDB). d-excess ( $\delta^2H$ - $8 \times \delta^{18}O$ ), a metric for disequilibrium isotope effects (Jasechko, 2019), was used to quantify deviation of surface water samples from the global meteoric water line (GMWL) (Kendall et al., 2014). Deviation in d-excess from the GMWL (d-excess = 8%) reflects isotopic fractionation associated with hydroclimatic processes, providing useful inference on variation in water sources (Jasechko, 2019). For instance, lower d-excess values indicate greater effects from evaporation (Hutchins et al., 2019; Tondu et al., 2013; Turner et al., 2014).

#### 2.4. Geospatial Analyses

To assess how watershed characteristics influence patterns in hydrochemistry across our YKD study sites, we determined watershed area, terrain elevation and slope, and vegetation productivity. We used the ArcticDEM digital surface model (DSM) (Porter et al., 2018) to delineate watershed boundaries. First, sinks in the DSM were filled following (Wang & Liu, 2006) and then a flow accumulation raster was created from the filled DSM using software SAGA v2.3.1. Next, water sampling locations were snapped to the highest flow point within 50 m using the software QGIS v2.18 tool snap-points-to-grid. Snapped points were adjusted manually, as needed, to ensure the correct pour-points for each sampled waterbody. Finally, watershed boundaries were generated using the filled DSM for each sample pour-point using the SAGA algorithm *Upslope Area*. Information on vegetation productivity and water extent was derived from Sentinel-2A multispectral surface reflectance imagery (10-m resolution) obtained from Copernicus Sentinel data (European Space Agency, https://sentinel.esa.int/, last access: 01 March 2020). The modified Normalized Difference Vegetation Index (NDVI) and Normalized Difference Water Index (NDWI), metrics of vegetation productivity and canopy or soil moisture, were derived from a composite of cloud-free Sentinel-2A imagery collected from 2017 to 2019 within 2 weeks of most sample collection dates (early July). Elevation was obtained from the ArcticDEM, from which we calculated watershed slope using the algorithm ee. Terrain. slope in Google Earth Engine (GEE) (Gorelick et al., 2017). Using the elevation, slope, and Sentinel-2A, we created an image classification using Weka k-means (ee. Clustere. weka K Means in GEE) to map surface water in the region. We then calculated watershed averages of NDVI, NDWI, and slope using ee. Image.reduceRegion with ee.Reducer.mean in GEE, first using the updateMask function to mask surface waters. Geospatial data for wildfire burn areas were obtained from the Alaska Interagency Coordination Center (https:// fire.ak.blm.gov/). Watersheds with ≤10% burned area were designated as "unburned" and those with >10% were "burned".

## 2.5. Statistical Analyses

We used the non-parametric permutational analysis of variance (permANOVA) to test for (a) effects of recent wildfire on surface water quality and chemistry within each of the five aquatic environments (e.g., burned vs. unburned plateau ponds) and (b) differences in hydrochemistry among landscapes sharing the same recent burn histories (e.g., burned plateau ponds vs. burned fen pond). When results from (a) were significant or striking,

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larger sample sizes for lakes and fen ponds during 2016–2019 allowed us to assess post-fire multi-year variation in aquatic chemistry (e.g., burned vs. unburned, by year) using permANOVA (years with three or fewer observations values were excluded). permANOVA randomly permutes the variables within a data set (1,000 times in this study) to generate an empirical pseudo *F*-value distribution, relaxing the assumption that errors are normally distributed (Anderson, 2001). We implemented permANOVA using the *aovp* function in the R software package *ImPerm* (Wheeler & Torchiano, 2016). For each hydrochemical parameter, we included aquatic environment, wildfire history, and their interaction as covariates. A *post-hoc* Tukey's honest significant difference test was performed on significant results to determine differences among aquatic environments. As needed, the dependent (hydrochemistry) variable was first log-transformed to improve homogeneity in variances among treatment groups (i,e., aquatic environment and burn history). We focus on comparisons within individual aquatic environments having different burn histories (e.g., plateau burned vs. plateau unburned), and on different aquatic environments sharing a common recent burn history (e.g., lakes and plateaus in unburned watersheds). We used the same approach to investigate variation in pore water quality and chemistry among burned and unburned plateau ponds and fens.

To characterize relationships in hydrochemical parameters among landscape types, we used the multivariate principal components analysis (PCA). First, to assess geochemical differences across landscapes, we conducted a PCA on both burned and unburned surface water samples from fens (both ponds and channels), lakes, plateaus, and streams. We included hydrochemical variables for water quality (temperature, conductivity, pH, D.O. (%)), concentrations of nutrients (DOC,  $NH_4^+$ ,  $NO_3^-$ ,  $PO_4^{3-}$ ) and gasses ( $CO_2$ ,  $CH_4$ ), and carbon quality (SUVA<sub>254</sub>). We removed any missing values from the data set, standardized the variables (mean = 0, SD = 1), and then assessed the correlation matrix using euclidean distance. We used *envfit* (in the 'vegan' package) (Oksanen et al., 2018) to test for the significance of the geochemical vectors using 999 permutations, then also tested supplementary environmental variables including NDVI, slope, and watershed area, as well as year, month, burn status, and landscape type.

Second, to evaluate the effect of wildfire on multiple geochemical variables within a landscape type, we completed a PCA on the lake data set and fen data set individually. For the lake data set, we used surface water samples and followed the same approach as described above. The fen data set included both ponds and channels, and we used the same approach as above with the following changes: we included both pore water and surface water samples, removed the environmental variables of NDVI, slope, and area (due to missing data), then added water sample type (surface or pore water) as an environmental factor.

In a summary table, we present statistics (mean  $\pm$  standard error) for each of the five aquatic environments and separated by burn history (i.e., unburned, burned). In the text, we specify where means were calculated for unburned and burned sites together. Differences are reported as significant for  $p \le 0.05$  and all statistics were performed using R software v.3.4.4 (R Core Team, 2018). Field sampling was intentionally designed to investigate spatial patterns in hydrochemistry among aquatic environments, rather than to test for potential effects from seasonal thaw.

#### 3. Results

#### 3.1. Landscape Characteristics

The five aquatic environments were located along a broad landscape gradient, whereby plateau ponds and fen ponds were located within smaller watersheds and at higher elevations, lakes were intermediate in landscape position and watershed area, and fen channels and streams were lower in the landscape and drained larger areas (Figure S1 in Supporting Information S1). Watershed slope (m m<sup>-1</sup>) was lowest for plateau ponds (1.4) and similar for the other environments (1.9–2.1). Watershed NDVI was lowest for plateau ponds (0.31), highest for fen ponds (0.39), and similar among the environments (0.36).

#### 3.2. Surface Water Chemistry Across Aquatic Landscape Environments

#### 3.2.1. Conductivity, pH, and Dissolved Oxygen

Mean surface water conductivity ranged from 29.8 to 34.9  $\mu$ S cm<sup>-1</sup>, and results from the permANOVA showed that conductivity did not vary significantly among the aquatic environments (Table 1). Conductivity was,

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Table 1
Mean ± Standard Error for Surface Water Chemical Parameters in the Five Aquatic Environments

Parameter	Burn history	Plateau pond	Fen pond	Lake	Fen channel	Stream	Aquatic env. p
Temperature	Unburned	$12.1 \pm 0.9$	$11.5 \pm 0.8$	$16.5 \pm 0.5$	10.7 ± 1.1	$9.6 \pm 2.9$	<0.001
(°C)	Burned	$11.0 \pm 1.0$	$12.2 \pm 0.6$	$15.5 \pm 0.4$	$12.8 \pm 0.8$	11.7 ± 1.1	
Conductivity	Unburned	$29.4 \pm 3.2$	$31.5 \pm 5.0$	$29.1 \pm 1.2$	$23.4 \pm 3.1$	$21.6 \pm 7.3$	ns
$(\mu S \text{ cm}^{-1})$	Burned	$30.1 \pm 3.3$	$36.2 \pm 3.6$	$39.0 \pm 3.2$	$40.0 \pm 4.7$	$35.5 \pm 4.1$	
pH	Unburned	$5.22 \pm 0.17$	$4.88 \pm 0.11$	$6.06 \pm 0.06$	$5.88 \pm 0.2$	$5.6 \pm 0.3$	< 0.001
(pH units)	Burned	$5.40 \pm 0.09$	$5.38 \pm 0.06$	$6.24 \pm 0.06$	$6.06 \pm 0.10$	$6.24 \pm 0.08$	
D.O.	Unburned	$44.2 \pm 6.2$	$48.0 \pm 7.2$	$79.2 \pm 3.0$	$62.8 \pm 5.1$	$57.8 \pm 10.1$	< 0.001
(% saturation)	Burned	$53.3 \pm 6.9$	$32.9 \pm 4.1$	$92.4 \pm 1.8$	$61.9 \pm 6.3$	$73.8 \pm 3.8$	
DOC	Unburned	$1,576 \pm 249$	$1,915 \pm 207$	$1,091 \pm 46$	1,201 ± 132	1,412 ± 347	< 0.001
$(\mu M)$	Burned	$1,292 \pm 205$	$1,275 \pm 78$	$1,096 \pm 39$	$1,407 \pm 120$	$1,244 \pm 101$	
NH <sub>4</sub> <sup>+</sup>	Unburned	$1.14 \pm 0.37$	$0.88 \pm 0.24$	$2.76\pm0.28$	$2.62 \pm 1.12$	$2.51 \pm 2.30$	< 0.01
$(\mu M)$	Burned	$2.83 \pm 1.72$	$1.90\pm0.26$	$3.11 \pm 1.22$	$7.73 \pm 4.49$	$4.05 \pm 1.09$	
NO <sub>3</sub> -	Unburned	$1.51 \pm 0.23$	$1.03 \pm 0.13$	$1.76 \pm 0.28$	$1.23 \pm 0.19$	$0.55 \pm 0.31$	< 0.001
$(\mu M)$	Burned	$2.46 \pm 0.95$	$0.74 \pm 0.08$	$2.12 \pm 0.66$	$3.47 \pm 0.87$	$7.32 \pm 2.28$	
PO <sub>4</sub> <sup>3-</sup>	Unburned	$0.19 \pm 0.02$	$0.22 \pm 0.03$	$0.16 \pm 0.01$	$0.18 \pm 0.03$	$0.17 \pm 0.09$	< 0.001
$(\mu M)$	Burned	$0.23 \pm 0.02$	$0.15 \pm 0.01$	$0.17 \pm 0.01$	$0.24 \pm 0.02$	$0.28 \pm 0.04$	
CO <sub>2</sub>	Unburned	$381 \pm 86$	$418 \pm 111$	$64 \pm 4$	$272 \pm 44$	473.43	< 0.001
$(\mu M)$	Burned	$371 \pm 151$	$174 \pm 28$	$47 \pm 8$	$474 \pm 109$	$172 \pm 20$	
$\mathrm{CH_4}$	Unburned	$32.5 \pm 14.8$	$9.3 \pm 2.9$	$2.7\pm0.3$	$2.8 \pm 0.8$	$0.5 \pm 0.5$	< 0.01
$(\mu M)$	Burned	$9.7 \pm 5.3$	$7.2 \pm 1.5$	$2.8 \pm 0.7$	$17.0 \pm 5.4$	$5.4 \pm 1.4$	
SUVA <sub>254</sub>	Unburned	$4.65 \pm 0.2$	$4.43 \pm 0.3$	$5.15 \pm 0.25$	$5.15 \pm 1.27$	3.24	ns
$(L \ mgC^{-1} \ m^{-1})$	Burned	$4.38 \pm 0.4$	$4.28 \pm 0.2$	$4.58 \pm 0.25$	$4.48\pm0.28$	$6.04 \pm 1.83$	
$\delta^{13}\text{C-DIC}$	Unburned	$-14.7 \pm 1.0$	$-16.7 \pm 1.3$	$-11.1 \pm 0.5$	$-16.4 \pm 0.7$	-21.5	< 0.001
(%eVPDB)	Burned	$-16.7 \pm 1.5$	$-16.5 \pm 0.4$	$-9.1 \pm 0.5$	$-16.2 \pm 1.2$	$-12.1 \pm 0.7$	
$\delta^{13}\text{C-CH}_4$	Unburned	$-50.9 \pm 2.6$	$-45.0 \pm 2.1$	$-42.8 \pm 0.7$	$-48.8 \pm 3.5$	-38.8	0.01
(%eVPDB)	Burned	$-46.0 \pm 2.3$	$-45.3 \pm 1.3$	$-45.8\pm0.8$	$-51.2 \pm 1.0$	$-49.2 \pm 1.8$	
d-excess	Unburned	$8.3 \pm 1.7$	$3.5 \pm 1.3$	$-4.0\pm0.7$	$2.1 \pm 2.1$	$5.8 \pm 1.6$	< 0.001
(% VSMOW)	Burned	$4.6 \pm 2.4$	$3.2 \pm 0.6$	$-6.0 \pm 0.6$	$2.5 \pm 1.0$	$2.5 \pm 1.5$	

Note. D.O., dissolved oxygen; DOC, dissolved organic carbon; SUVA<sub>254</sub>, specific UV absorbance at 254 nm. Permutational analysis of variance (permANOVA) was used to test for wildfire effects on hydrochemistry in each of the five aquatic environments (e.g., unburned vs. burned plateau ponds) (Section 2.5). Results are reported as **significant** ( $p \le 0.05$ ), marginally significant (0.05 ), or non-significant (<math>p > 0.1). permANOVA was also used to test for differences in hydrochemistry among aquatic environments sharing the same recent burn histories (e.g., lakes and plateau ponds in unburned watersheds). For significant results (column "Aquatic env. p"), pairwise comparisons between aquatic environments were determined from a post-hoc Tukey honest significant difference and are illustrated graphically for select parameters in Figure 2. ns = not significant.

however, generally (i.e., not always significantly) higher in aquatic environments within burned watersheds. Broadly, aquatic environments with lower pH and D.O. generally had smaller watersheds and were positioned higher in the landscape (Table 1, Figure S1 in Supporting Information S1). Considering burned and unburned watersheds together, pH was, on average, higher in lakes (6.16), streams (6.12), and fen channels (6.0) than in plateau ponds (5.31) and fen ponds (5.23). pH was significantly higher in burned fen ponds, on average, higher in aquatic environments within burned watersheds (Figure 2a). D.O. (%) was highest in lakes (86.9), intermediate for streams (70.8) and fen channels (62.2), and lower in plateau ponds (49.0) and fen ponds (37.4). Similar to pH, D.O. was generally higher within burned watersheds, except for fen ponds. Wildfire effects on D.O. were

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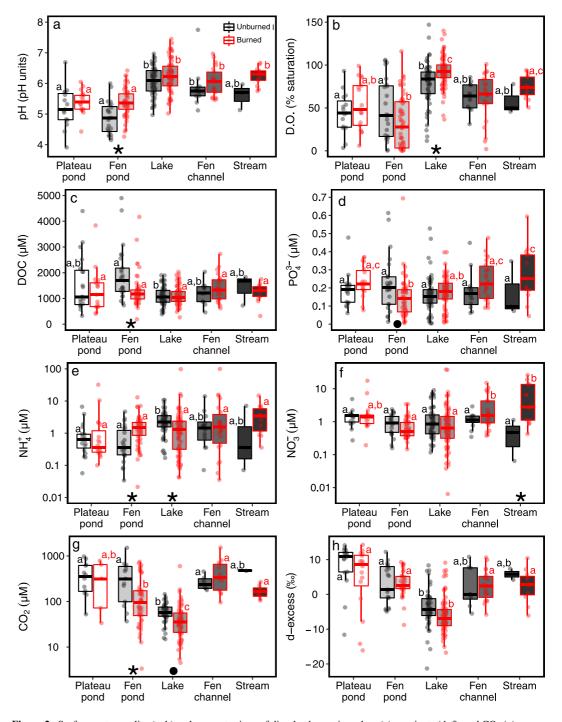


Figure 2. Surface water quality (a−b) and concentrations of dissolved organic carbon (c), nutrients (d−f), and  $CO_2$  (g), and d-excess (h) in the five aquatic environments. Each site type is shaded differently, to help visualize and differentiate. Considering aquatic environments within unburned and burned watersheds separately, boxes with different letters reflect significantly different mean values (e.g., pH in fen ponds and lakes within burned watersheds), as determined by permANOVA (Section 2.5). Note: Letters above boxes are color-coded by burn history. Along the x-axis, \* and • reflect statistically significant (p < 0.05) and marginal (0.5 < p ≤ 0.1) differences between unburned and burned sites within the corresponding aquatic environment (e.g., D.O.% within burned vs. unburned lakes). Horizontal line within each box represents the median. Horizontal lines below and above the median represent the first and third quantiles, respectively. Lower and upper whiskers extend from the first or third quantile to the smallest or greatest value, respectively, to no more than 1.5 times the inter-quantile range. All values, including outliers beyond the whiskers, are shown as individual points.

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significant only for lakes (Figure 2b). These results also show wildfire in the YKD was associated with more oxygenated and buffered aquatic environments (elevated pH and conductivity).

#### 3.2.2. Carbon and Inorganic Nutrient Concentrations

Mean concentrations of DOC,  $NH_4^+$ ,  $NO_3^-$ , and  $PO_4^{3-}$  and the effects of wildfire varied significantly among aquatic environments (Table 1). Among landscape types (not accounting for burn history), mean DOC (μM) was highest in fen ponds (1466) and plateau ponds (1442), intermediate in fen channels (1336) and streams (1276), and lowest in lakes (1094). Wildfire was associated with lower DOC in plateau ponds, fen ponds, and streams; no strong effect in lakes; and increased DOC in fen channels (Table 1). Only fen ponds showed a significant difference in DOC associated with burn history. Among aquatic environments, mean  $NH_4^+$  ranged from 1.6 to 5.9 μM and was highest in fen channels and lowest in fen ponds. For all aquatic environments,  $NH_4^+$  was higher in burned watersheds (Table 1, Figure 2d), but only significantly higher in burned lakes and fen ponds. Mean  $NO_3^-$  (μM) was highest in streams (6.1), intermediate in plateaus, fen channels, and lakes (2.0–2.7), and lowest in fen ponds (0.8) (Table 1, Figure 2e).  $NO_3^-$  was higher in burned environments, except for fen ponds. Mean  $PO_4^{3-}$  ranged from 0.17 to 0.26 μM and was higher in burned environments except for fen ponds (Figure 2f). Together, these results show that wildfire generally decreased concentrations of DOC and increased  $NH_4^+$ ,  $NO_3^-$ , and  $PO_4^{3-}$ .

## 3.2.3. CO<sub>2</sub> and CH<sub>4</sub> Concentrations and Fluxes

 $CO_2$  concentrations and fluxes were significantly different among aquatic environments (Table 1). Regardless of burn status,  $CO_2$  concentrations ( $\mu$ M) were highest in fen channels (410) and plateau ponds (378), intermediate in fen ponds (223) and streams (205), and lowest in lakes (53).  $CO_2$  concentrations and instantaneous  $CO_2$  fluxes followed similar patterns among environments.  $CO_2$  fluxes ( $\mu$ mol m<sup>-2</sup> s<sup>-1</sup>) were highest in fen channels (1.78), intermediate in fen ponds (0.97) and plateau ponds (0.95), and lowest in streams (0.42) and lakes (0.15). Wildfire was generally associated with lower  $CO_2$  concentrations in all environments with the exception of fen channels (Table 1). Differences associated with burn status were only significant for fen ponds (Figure 2g). Only fen channels had higher  $CO_2$  concentrations in burned sites than in unburned sites (474 vs. 272  $\mu$ M). Although  $CO_2$  fluxes were generally lower in burned watersheds, the difference was not significant for any aquatic environments (Table S2 in Supporting Information S1). These results show a strong coupling between  $CO_2$  concentrations and fluxes across watershed types, higher  $CO_2$  concentrations in upland aquatic environments with smaller watershed areas, and a general reduction in  $CO_2$  associated with wildfire.

 ${\rm CH_4}$  concentrations ( $\mu{\rm M}$ ) were also significantly different among aquatic environments.  ${\rm CH_4}$  was highest in plateau ponds (23.0), intermediate in fen channels (12.3), and lower in fen ponds, streams, and lakes (2.7–7.7). Compared to  ${\rm CO_2}$ ,  ${\rm CH_4}$  fluxes did not appear as strongly correlated with  ${\rm CH_4}$  concentrations and  ${\rm CH_4}$  fluxes overall showed greater variability (higher variability relative to the mean) (Table 1).  ${\rm CH_4}$  fluxes (nmol m $^{-2}$  s $^{-1}$ ) were highest from fen channels (80.8), intermediate from fen ponds (49.0), lakes (40.0) and plateau ponds (37.9), and lowest from streams (15.0). There were no clear trends in  ${\rm CH_4}$  concentrations or fluxes between unburned and burned sites (Table S2 in Supporting Information S1). Broadly, these results show that  ${\rm CH_4}$  concentrations and fluxes were not as strongly coupled or as clearly affected by wildfire as  ${\rm CO_2}$ , yet  ${\rm CH_4}$  concentrations followed a similar pattern among landscape types and were generally higher in upland aquatic environments within smaller watersheds, and highest in pore waters.

#### 3.2.4. Indices of the Composition of DOC, DIC, CH<sub>4</sub>, and H<sub>2</sub>O

SUVA<sub>254</sub> was generally higher in unburned watersheds, but did not vary significantly across aquatic environment type or wildfire history (Table 1). The stable isotopic compositions of DIC, CH<sub>4</sub>, and H<sub>2</sub>O showed greater variation.  $\delta^{13}$ C-DIC values (‰) were generally lower in plateaus, fen ponds, and fen channels (–15.2 to –16.6) than in streams (–13.3), and lakes (–9.8) (Figure 3).  $\delta^{13}$ C-DIC values were generally higher in lakes and streams within burned watersheds, except for plateau ponds. Mean  $\delta^{13}$ C-CH<sub>4</sub> values (‰) among the aquatic environments ranged from –44.9 in lakes to –50.4 in fen channels. Compared to  $\delta^{13}$ C-DIC,  $\delta^{13}$ C-CH<sub>4</sub> varied more modestly among aquatic environments and did not reflect consistent effects from wildfire (Table 1, Figure 4). The stable isotopic composition of H<sub>2</sub>O in surface waters deviated from the GMWL to a varying degree for each aquatic environment (Figure S2 in Supporting Information S1). d-excess (‰) was highest

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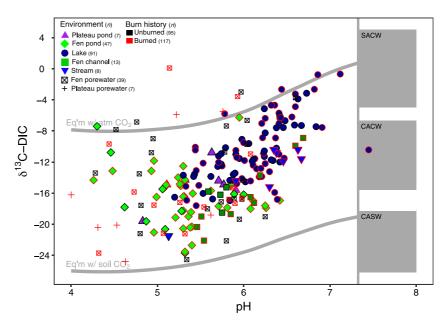


Figure 3. pH and the composition of stable dissolved inorganic carbon isotopes ( $\delta^{13}$ C-DIC) in aquatic environments within the Yukon Kuskokwim Delta (five surface water, two pore water). Reference lines depict theoretical end-member values for equilibrium reactions with atmospheric and biotic CO<sub>2</sub>, which—up to pH ~ 7.3 for these samples—have a greater effect on  $\delta^{13}$ C-DIC values compared with kinetic isotope fractionation effects from mineral weathering reactions. Proximity to gray areas (pH > 7.3) reflects greater contributions to DIC from H<sub>2</sub>SO<sub>4</sub> carbonate weathering (SACW), H<sub>2</sub>CO<sub>3</sub> carbonate weathering (CACW), or H<sub>2</sub>CO<sub>3</sub> silicate weathering (CASW) (Section 2.3).

for plateau ponds (6.4), intermediate for fen ponds (3.3), streams (3.0), and fen channels (2.4), and lowest for lakes (-5.2), and lower in burned environments except fen channels (Table 1, Figure 2h). In summary,  $\delta^{13}$ C-DIC results broadly span a gradient of stronger soil-water linkages in fen surface waters and pore waters and stronger water-atmosphere exchange in lakes (irrespective of burn history), while  $\delta^{13}$ C-CH<sub>4</sub> results suggest

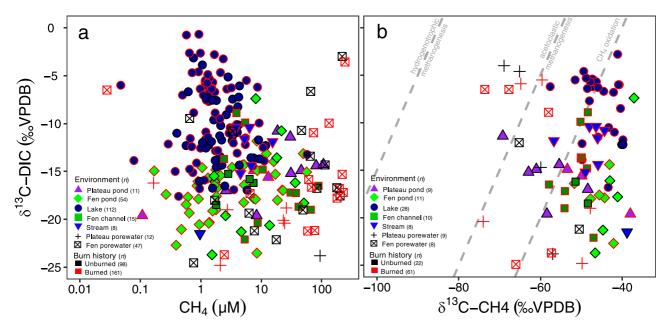


Figure 4. Stable isotopic composition of dissolved inorganic carbon ( $\delta^{13}$ C-DIC) as a function of (a) CH<sub>4</sub> concentration and (b) the stable isotopic composition of CH<sub>4</sub> ( $\delta^{13}$ C-CH<sub>4</sub>) in surface and pore waters of the Yukon-Kuskokwim Delta. Burn history depicts sites associated with wildfire. Equilibrium fractionation end-members (dotted lines) for methanogenic pathways and methanotrophy after Campeau et al. (2018).

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Table 2

Mean ± Standard Error for Pore Water Chemical Parameters in Plateau Ponds and Fens

Parameter	Burn history	Plateau ponds	Fen	p
Temperature	Unburned	10.6 ± 1.5	15.4 ± 1.1	<0.01
(°C)	Burned	$9.1 \pm 1.2$	$14.0 \pm 1.2$	
Conductivity	Unburned	$54.5 \pm 18.4$	$121.7 \pm 16.1$	0.06
$(\mu S \text{ cm}^{-1})$	Burned	$83.1 \pm 24.2$	$190.6 \pm 56.8$	
pН	Unburned	-	$5.43 \pm 0.14$	0.04
(pH units)	Burned	$4.87 \pm 0.26$	$5.33 \pm 0.14$	
D.O.	Unburned	$37.3 \pm 14.3$	$24.0 \pm 3.7$	ns
(% saturation)	Burned	$12.1 \pm 6.9$	$29.5 \pm 4.4$	
DOC	Unburned	$1,413 \pm 245$	$2,690 \pm 256$	0.04
$(\mu M)$	Burned	$2,539 \pm 677$	$3,661 \pm 543$	
NH <sub>4</sub> <sup>+</sup>	Unburned	$0.31 \pm 0.1$	$153.8 \pm 48.2$	< 0.001
$(\mu M)$	Burned	$1.52 \pm 0.6$	$134.8 \pm 47.1$	
NO <sub>3</sub> -	Unburned	$6.9 \pm 3.2$	$1.3 \pm 0.4$	0.05
$(\mu M)$	Burned	$68.9 \pm 66.2$	$50.7 \pm 39.8$	
PO <sub>4</sub> <sup>3-</sup>	Unburned	$0.22 \pm 0.1$	$0.82 \pm 0.2$	< 0.01
$(\mu M)$	Burned	$0.26 \pm 0.1$	$4.06 \pm 2.4$	
$CO_2$	Unburned	$2,546 \pm 424$	$2,135 \pm 231$	ns
$(\mu M)$	Burned	$2,187 \pm 899$	$2,999 \pm 381$	
$\mathrm{CH_4}$	Unburned	$356 \pm 93$	$188 \pm 37$	ns
$(\mu M)$	Burned	$151 \pm 91$	$230 \pm 44$	
SUVA <sub>254</sub>	Unburned	$3.93 \pm 0.74$	$3.96 \pm 0.48$	ns
$(L \ mgC^{-1} \ m^{-1})$	Burned	$4.00 \pm 0.56$	$3.87 \pm 0.33$	
$\delta^{13}$ C-DIC	Unburned	$-11.8 \pm 4.7$	$-13.1 \pm 1.1$	ns
(%eVPDB)	Burned	$-16.3 \pm 2.5$	$-14.1 \pm 1.4$	
$\delta^{13}\text{C-CH}_4$	Unburned	$-64.3 \pm 2.6$	$-57.9 \pm 7.4$	ns
(%eVPDB)	Burned	$-59.2 \pm 4.8$	$-62.1 \pm 3.5$	
d-excess	Unburned	$4.5 \pm 2.6$	$8.4 \pm 1.0$	ns
(% VSMOW)	Burned	$8.8 \pm 1.8$	$10.0 \pm 1.0$	

Note. D.O., dissolved oxygen; DOC, dissolved organic carbon; SUVA<sub>254</sub>, specific UV absorbance at 254 nm. Permutational analysis of variance (permANOVA) was used to test for wildfire effects on hydrochemistry in each landscape category (e.g., unburned vs. burned plateau ponds) (Section 2.5). Results are reported as **significant** ( $p \le 0.05$ ), marginally significant (0.05 ), or non-significant (<math>p > 0.1). permANOVA was also used to test for differences in hydrochemistry between plateau ponds and fens sharing the same recent burn histories (e.g., plateau ponds and fends in unburned watersheds). For significant results (column "p"), pairwise comparisons between plateau ponds and fen were determined from a post-hoc Tukey honest significant difference. ns = not significant.

that methane concentrations at most sites were controlled by oxidation (see Section 4.1).

#### 3.3. Pore Water Chemistry in Plateau Ponds and Fens

Compared with plateau ponds and fen surface water, pore water generally had higher conductivity, DOC, TDN,  $PO_4^{\ 3-}$ ,  $CO_2$ , and  $CH_4$ , and lower pH, D.O., and  $SUVA_{254}$  (Tables 1 and 2). Wildfire was generally associated with higher concentrations of pore water DOC, inorganic nutrients ( $NH_4^+$ ,  $NO_3^-$ ,  $PO_4^{\ 3-}$ ),  $CO_2$ , and more positive d-excess values in plateau ponds and fens (Table 2). Similar to plateau ponds and fen surface waters, relatively lower  $\delta^{13}$ C-DIC and  $\delta^{13}$ C-CH<sub>4</sub> values indicated that carbon cycling in pore waters was more strongly associated with biotic processes in soils, with some influence from abiotic processes (e.g.,  $CO_2$  exchange with the atmosphere) (Figures 3 and 4).

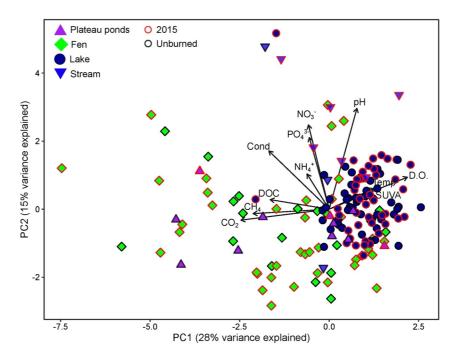
## 3.4. Wildfire, Terrestrial-Aquatic Connectivity, and Carbon and Nutrient Cycling

The PCA (Figure 5) demonstrated that variation in surface water chemistry was more strongly associated with landscape type than with wildfire effects (Table 1). The first principal component (PC1) explained 28% of the variance, and separated surface waters in lakes and streams from fens and plateaus. Across PC1, lakes showed a strong positive correlation with D.O., temperature, and SUVA<sub>254</sub>, a moderate positive correlation with pH, and a negative correlation with concentrations of DOC, CO<sub>2</sub>, and CH<sub>4</sub>. In contrast to lakes, fens and some plateau ponds were positively correlated with DOC, CO<sub>2</sub>, CH<sub>4</sub>, and conductivity. These trends in PC1 indicate that plateau ponds and fens (ponds and channels together) were more strongly correlated with organic carbon processing. The second principal component (PC2) accounted for 15% of the variance, separating streams from the other landscape types. Across PC2, streams showed a positive correlation with concentrations of NH<sub>4</sub>+, NO<sub>3</sub>-, and PO<sub>4</sub><sup>3-</sup>, indicating a relatively strong association with inorganic nutrient cycling. The envfit test found that watershed area, year and landscape type were statistically significant (p < 0.05). We further explore multi-year post-fire variation in Section 3.5.

The PCAs of the individual lake and fen datasets, which had more samples, elucidate wildfire effects on hydrochemistry within these two landscape types. In the lake PCA, the burned and unburned samples showed moderate separation across both principal component axes (Figure 6a). Across PC1, unburned sites were generally correlated with higher concentrations of DOC, CO<sub>2</sub>, and CH<sub>4</sub>, while burned sites were correlated with higher D.O. (%). Across PC2, some burned samples showed strong positive correlations with conductivity, pH, NO<sub>3</sub><sup>-</sup>, and PO<sub>4</sub><sup>3-</sup>. The *envfit* test found that NDVI, sample year and burn status were statistically significant (p < 0.05). In the fen PCA, PC scores showed general overlap of burned and unburned samples from surface waters (Figure 6b). However, there was modest separation between surface water and pore water. Across PC1, pore water

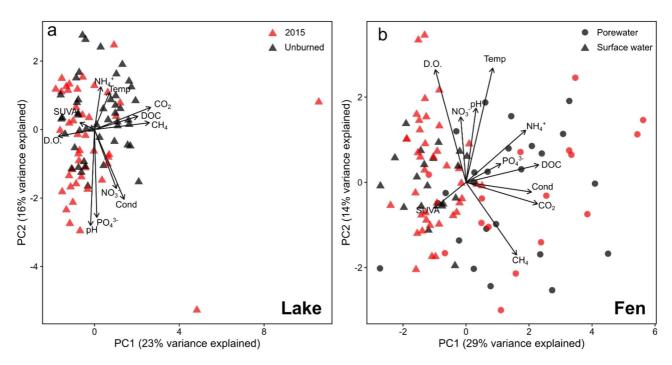
samples were more strongly correlated with DOC,  $CO_2$ , conductivity,  $CH_4$ , and to a lesser extent,  $PO_4^{3-}$  and temperature. Conversely, surface water samples were correlated with  $SUVA_{254}$  and D.O., and to a lesser extent,  $NO_3^-$ . There was strong overlap of burned, unburned, pore water and surface water samples across PC2. The *envfit* test found that both the year of sample collection and the water sample type (pore water or surface

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**Figure 5.** Principal component analysis of surface water geochemical variables for all landscape types. The shapes distinguish between plateau ponds, lakes, fens, and streams, while the border color represents control or burned in 2015. All vectors were multiplied by 5 to improve visibility.

water) were found to be statistically significant (p < 0.05). The lake and fen measurements show that variation in surface water chemistry appeared more strongly associated with environmental conditions (Table 1) and provide evidence that landscape type has a greater influence than wildfire on most surface water hydrochemical constituents.



**Figure 6.** Principal component analysis of geochemical variables for (a) surface water samples from lakes and (b) both surface water and pore water samples from fens. Colors denote burn status (a and b) while shape distinguishes between pore water and surface water samples (b only). All vectors were multiplied by 5 to improve visibility.

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#### 3.5. Multi-Year Post-Fire Variation in Lake and Fen Pond Water Chemistry

Strong differences in thaw-season hydrochemistry between unburned and burned lakes (conductivity, D.O.,  $NH_4^+$ ,  $CO_2$ ) and fen ponds (pH, DOC,  $NH_4^+$ ,  $CO_2$ ) (Section 3.2) were, in part, associated with post-fire multi-year variation in these constituents. Lakes within burned watersheds had elevated conductivity compared to unburned sites in the 2 years immediately following wildfire, which tapered in later years (Figure 7a). Dissolved oxygen varied among years and was higher in burned watersheds in 2018 (Figure 7b). Post-fire  $NH_4^+$  varied and was not significantly different between burned and unburned sites for any individual year, despite being significantly higher in burned sites when considering all years together (Table 1) (Figure 7c). Concentrations of  $CO_2$  were consistently lower in lakes within burned watersheds for 3 years post-fire, but differences between burned and unburned sites in each year were not significant due to lower n when considering years separately rather than together (Section 3.2) (Figure 7d).

In fen ponds, wildfire was associated with significantly higher pH during the following two summers (Figure 7e). DOC in fen ponds was consistently, but not significantly, lower within burned watersheds for 3 years following wildfire (Figure 7f), whereas NH<sub>4</sub><sup>+</sup> varied (Figure 7g). Fen pond CO<sub>2</sub> was generally lower within burned watersheds in the years following fire and, in 2018, was significantly lower in burned watersheds than in unburned (Figure 7h).

#### 4. Discussion

#### 4.1. Patterns in Hydrochemistry Among Varied Aquatic Environments in a Northern Delta

In the YKD, patterns in surface water hydrochemistry across aquatic environments reveal how landscape factors underlie variation in biogeochemical cycling, irrespective of burn history. Smaller watersheds at higher elevations harbored plateau ponds and fen ponds, where relatively acidic, low-oxygen, and high-DOC and CO<sub>2</sub> surface and pore waters reflect intensified organic carbon cycling driven by strong terrestrial-aquatic linkages and potentially higher soil carbon stocks. In such environments, anoxic, organic-rich conditions may promote CH<sub>4</sub> production in the absence of terminal electron acceptors that are known to inhibit methanogenesis (e.g., NO<sub>3</sub><sup>-</sup>, SO<sub>4</sub><sup>2-</sup>) (Stanley et al., 2016), which may explain why  $\delta^{13}$ C-CH<sub>4</sub> indicated relatively stronger effects from methanogenesis in porewaters (Figure 4). Yet, this effect appeared modest and without relation to wildfire history, and our measurements of  $\delta^{13}$ C-CH<sub>4</sub> indicated stronger effects on CH<sub>4</sub> from oxidation than methanogenesis, for all sites and in both pore and surface waters. While obtained from local observations, these findings suggest that microbial oxidation of CH<sub>4</sub> is likely prevalent in similar environments across the YKD and thus emphasizes the utility of in-situ hydrochemical and isotopic measurements for constraining sources and magnitudes of CO<sub>2</sub> and CH<sub>4</sub> emissions at regional scales (Elder et al., 2020). Compared with the other aquatic environments, water isotopes in plateau ponds and fen ponds more closely resembled precipitation (d-excess, Table 1). This agreed with our field observations that rainfall enlarges plateau ponds and suggests that precipitation promotes land-freshwater linkages and the biotic processes that drive organic carbon cycling and relatively high rates of CO<sub>2</sub> and CH<sub>4</sub> efflux in these upland environments of the YKD. While plateau ponds and fen ponds may currently span only a fractional area of the watershed surface, their contributions to net ecosystem exchange may be important, especially if nutrient cycling in these environments is enhanced due to increased rainfall in southwestern Alaska in the coming decades (Lader et al., 2017).

In contrast to fens and plateau ponds, the hydrochemistry of lakes indicated biogeochemical cycles driven by a different suite of processes. Relatively high D.O. and  $\delta^{13}$ C-DIC values, which more closely resembled the stable isotopic composition of atmospheric CO<sub>2</sub> (-8%) than biogenic CO<sub>2</sub> ( $\sim$ -22%) (Kendall et al., 2014), indicated stronger effects on dissolved gases from mixing between lake waters and the atmosphere than from inputs of soil CO<sub>2</sub> from DOC-rich pore waters. Low d-excess values indicate greater effects from evaporation on lake waters (Jasechko, 2019) and perhaps also longer water residence times compared with the relatively more ephemeral plateau ponds and fen ponds. The intermediate hydrochemistry of fen channels and streams, which connect to fen ponds and lakes, respectively, indicated additional hydrologic inputs to these fluvial components of the aquatic network. For instance, streams were more strongly associated with inorganic nutrients, especially NO<sub>3</sub><sup>-</sup>, perhaps associated with nitrogen fixation by riparian alders and its subsequent nitrification and hydrologic export into streams (McCaully et al., 2021).

#### 4.2. Wildfire Effects on Hydrochemistry

Superimposed on the variation in hydrochemistry among aquatic environments (Section 4.1), certain water quality and chemistry parameters within individual aquatic environments showed differences associated with recent

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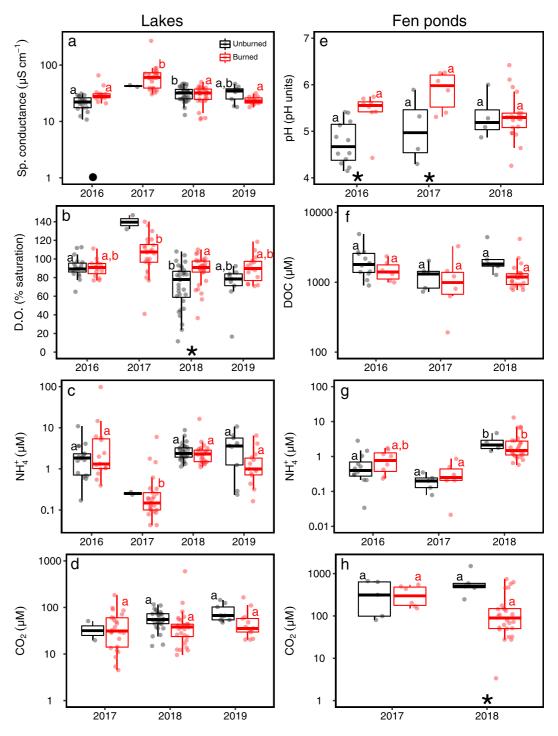


Figure 7. Surface water chemistry in lakes (a–d) and fen ponds (e–h). Considering sampling year within unburned and burned watersheds separately, boxes with different letters reflect significantly different mean values (e.g., specific conductance lakes within burned watersheds during 2017 vs. other years), as determined by permANOVA (Section 2.5). Note: Letters above boxes are color-coded by burn history. Along the x-axis, \* and • reflect statistically significant (p < 0.05) and marginal (0.5 <  $p \le 0.1$ ) differences between unburned and burned sites within the corresponding aquatic environment (e.g., pH within burned vs. unburned fen ponds in 2016 and 2017). Horizontal line within each box represents the median. Horizontal lines below and above the median represent the first and third quantiles, respectively. Lower and upper whiskers extend from the first or third quantile to the smallest or greatest value, respectively, to no more than 1.5 times the inter-quantile range. All values, including outliers beyond the whiskers, are shown as individual points.

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burn history. Wildfire did not appear to drive variation in hydrochemistry among landscape types, even when considering results for the more intensively-sampled lake and fen environments (Figure 6). Rather, wildfire was associated with general increases in conductivity, pH, D.O., NH<sub>4</sub>+, NO<sub>3</sub>-, PO<sub>4</sub><sup>3-</sup>, and decreases in DOC and CO<sub>2</sub>. These results suggest that wildfire in YKD tundra may have three important ecological functions. First, combustion of organic matter decreases soil organic carbon stocks and soil heterotrophic respiration, thereby reducing DOC and CO<sub>2</sub> inputs to surface waters (Ludwig et al., 2022). Second, wildfire increases the mobilization of cations from soils, evidenced by consistently higher conductivity and pH among all aquatic environments (Table 1). This may be attributed to the release of exchangeable cations following combustion of soil organic matter, where acidity from mobilized anions associated with organics (e.g.,  $SO_4^{2-}$ ) does not counterbalance increased pH (Granath et al., 2021), and/or to thaw-induced deepening of hydrologic flowpaths into solute-rich layers at the freezing front or within permafrost (Lehn et al., 2017; Reyes & Lougheed, 2015). Third, wildfire enhances nitrogen cycling, as indicated by increased NH<sub>4</sub><sup>+</sup> and NO<sub>3</sub><sup>-</sup>, perhaps due to biotic processing and hydrologic export of thawed permafrost nitrogen (Abbott et al., 2021). These trends were generally consistent among aquatic environments and the lack of statistical significance in our relatively large data set is taken to reflect variation in the resilience of YKD aquatic environments to the effects of wildfire, as observed in tundra environments elsewhere (Larouche et al., 2015).

Our findings from YKD upland tundra in southwest Alaska help to bolster the narrative of wildfire effects on northern ecosystems, which is growing in both scope and complexity. Similar to this study, physiographic variation was a particularly important driver of variation in lake hydrochemistry among boreal watersheds with contrasting wildfire histories (Lewis et al., 2014; Robinne et al., 2020). Hydrology is an important component of this physiographic variation and is certain to influence patterns in wildfire effects on aquatic biogeochemistry across spatial scales. For instance, lakes in the boreal plains of Alaska are thought to be fed by groundwater, which may circumvent interacting with burned surface soils and thus limit wildfire effects on lake DOC concentrations (Robinne et al., 2020). In contrast, discontinuous permafrost across our study sites in the YKD may favor runoff over groundwater inputs to lakes, except where permafrost is absent (Dabrowski et al., 2020). Pre-fire ecosystem characteristics are also important to predicting the degree to which wildfire may affect aquatic biogeochemical cycles. For instance, in boreal Canada, saturated conditions and relatively lower fuel loads in fens muted the effects of wildfire on aquatic biogeochemistry (Bourgeau-Chavez et al., 2020). In boreal ecosystems with relatively more intense nutrient cycling, post-fire effects on aquatic nutrient concentrations and cycling may be minimal (Lewis et al., 2014). We observed an increase in carbon and nutrient concentrations in pore water samples from fens and plateau ponds, which is similar to the increase in solutes and dissolved organic matter in pore waters following a low-severity fire in a discontinuous peat plateau-wetland complex in the Northwest Territories, Canada (Ackley et al., 2021). Our results for the YKD and observations elsewhere (e.g., Central Siberian Plateau) indicate increased post-fire inorganic nitrogen concentrations (Rodríguez-Cardona et al., 2020). Together, these results highlight that physiographic variation underlies complex spatial and temporal trends in wildfire effects on northern aquatic biogeochemistry.

## 4.3. Multi-Year Effects of Wildfire on Aquatic Biogeochemistry

In addition to physiographic controls underlying wildfire effects on aquatic biogeochemistry in the YKD, more intensive sampling campaigns in lakes and fen ponds allowed us to evaluate and compare multi-year wildfire effects in two environments characterized by relatively distinct modes of nutrient cycling (Sections 4.1 and 4.2). Our multi-year results for lakes and fen ponds suggest that organic matter combustion by wildfire reduces organic carbon mobilization into the dissolved phase and associated microbial production of  $CO_2$  for at least several years (Figure 7). This is in contrast to other studies in Canadian boreal environments, which found no effect of wildfire on lake DOC (Olefeldt et al., 2013). Among the most striking effects of wildfire on hydrochemistry were increased conductivity in lakes and pH in fen ponds during the summer following wildfire (2016). These patterns may reflect the mobilization of ions from combusted soils (Ludwig et al., 2018), from greater interaction between surface runoff and deeper mineral soils due to active layer thickening, and/or from enhanced groundwater inputs associated with permafrost degradation (Dabrowski et al., 2020). Preliminary results from a study on post-fire primary production in YKD lakes found that  $PO_4^{\,3-}$  was limiting to phytoplankton (Bradley et al., 2019), suggesting that primary production stimulated by increased  $PO_4^{\,3-}$  in wildfire-affected YKD lakes (Table 1) may reduce  $PO_4^{\,3-}$  the varied multi-year patterns in  $PO_4^{\,3-}$  in wildfire-affected YKD lakes (Table 1) may reduce  $PO_4^{\,3-}$  the varied multi-year patterns in  $PO_4^{\,3-}$  in wildfire-affected YKD lakes (Table 1) may reduce  $PO_4^{\,3-}$  the varied multi-year patterns in  $PO_4^{\,3-}$  in wildfire-affected YKD lakes (Table 1) may reduce  $PO_4^{\,3-}$  the varied multi-year patterns in  $PO_4^{\,3-}$  that interannual variability in climate and hydrologic

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conditions more strongly influences the response of inorganic nutrients to wildfire, despite our observations that, overall, wildfires in the YKD appear to increase  $NH_4^+$  and  $NO_3^-$  in freshwaters.

Overall, multi-year patterns in lake and fen pond hydrochemistry reveal relatively striking post-fire effects on some ecosystem processes, and that aquatic ecosystem response to wildfire disturbance is coupled to effects on connected terrestrial ecosystems. Similar conclusions were made for wildfire-affected boreal and tundra environments elsewhere in North America, where watershed characteristics were key in determining ecosystem response to wildfire (Abbott et al., 2021; Larouche et al., 2015; Robinne et al., 2020). Together, these findings emphasize that wildfire effects on ecosystem nutrient dynamics can propagate across the terrestrial–aquatic continuum. As wildfire activity intensifies at northern high latitudes (Young et al., 2017; Yue et al., 2015) there is strong potential for cascading effects on aquatic ecosystems. Future research in varied physiographic regions across the circumpolar north is needed to refine understanding of potential consequences for northern high latitude biogeochemical cycles.

#### 5. Conclusion

In this study, we analyzed surface and pore water samples from five aquatic environments in tundra of the YKD, Alaska, to assess recent wildfire effects on biogeochemistry. Patterns in hydrochemistry revealed physiographic controls underlying variation among aquatic environments in the YKD: higher-elevation environments in smaller watersheds (plateau ponds, fen ponds) reflected stronger organic carbon cycling and terrestrial-freshwater linkages, whereas lakes were influenced by mixing with the atmosphere, and riparian corridors enhanced inorganic nitrogen export via streams. Wildfire effects varied in strength and among aquatic environments, but broadly influenced aquatic ecosystems by reducing DOC and CO<sub>2</sub> inputs to surface waters, increasing chemical weathering, and enhancing nitrogen cycling. This study is among the first to test for multi-year effects on tundra aquatic biogeochemistry in the year immediately following wildfire, and suggests that wildfire effects on some hydrochemical constituents may persist beyond three to 4 years (DOC, CO<sub>2</sub>), while others appear to return to baseline conditions within several years (e.g., conductivity). Climate change is projected to increase the severity and frequency of northern high latitude fires, and the post-fire response of biogeochemical cycles will depend on terrestrial-aquatic connectivity of affected environments and, at broader spatial scales, regional variation in physiographic conditions.

#### **Conflict of Interest**

The authors declare no conflicts of interest relevant to this study.

#### **Data Availability Statement**

Data used in this study are publicly accessible via the Arctic Data Center (Zolkos et al., 2022). Code is available at https://zenodo.org/badge/latestdoi/235470761.

#### Acknowledgments References

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## Supporting Information for

# Physiographic Controls and Wildfire Effects on Aquatic Biogeochemistry in Tundra of the Yukon-Kuskokwim Delta, Alaska

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Figure S2

## Additional Supporting Information (Files uploaded separately)

Not applicable

## Introduction

This document contains information on sample numbers in Table S1 (n by year and month for each aquatic environment); mean  $\pm$  standard error for surface water CO<sub>2</sub> and CH<sub>4</sub> fluxes in Table S2; watershed elevation and area by landscape type in Figure S1; the stable isotopic composition of surface waters among the five aquatic environments in Figure S2 ( $\delta^2$ H-H<sub>2</sub>O vs.  $\delta^{18}$ O-H<sub>2</sub>O in surface waters).

**Table S1.** Surface water sample n by year and month for each aquatic environment. Pore water n for plateau ponds and fens provided in brackets.

Year	Month	Plateau pond	Lake	Fen pond	Fen channel	Stream
2015	September	_	_	4	4	3
2016	June	20	17	13	9	1
2016	September	8	17	7	5	4
2017	July	9 (10)	28	11 (8)	11	8
2018	June	_	8	3 (1)	1	_
2018	July	2 (2)	58	28 (13)	5	_
2019	June	_	4	1 (1)	_	_
2019	July	-(1)	20	2 (27)	_	_

**Table S2.** Mean  $\pm$  standard error for surface water CO<sub>2</sub> and CH<sub>4</sub> fluxes. Permutational analysis of variance (permANOVA) was used to test for wildfire effects on hydrochemistry in each landscape category (e.g., unburned vs. burned plateau ponds) (Sec. 2.5). Results are reported as **significant** ( $p \le 0.05$ ), marginally significant ( $p \le 0.05$ ), or non-significant ( $p \ge 0.05$ ), permANOVA was also used to test for differences between aquatic environments sharing the same recent burn histories (e.g., plateau ponds and fends in unburned watersheds). For significant results (column "p"), pairwise comparisons between plateau ponds and fen were determined from a post-hoc Tukey HSD. ns = not significant.

Parameter	Burn history	Plateau pond	Fen pond	Lake	Fen channel	Stream	Aquatic env. <i>p</i>
$CO_2$	Unburned	$1.03\pm0.58$	$1.08 \pm 0.30$	$0.18 \pm 0.05$	$0.66 \pm 0.052$	_	< 0.001
(µmol m <sup>-2</sup> s <sup>-1</sup> )	Burned	$0.82 \pm 0.20$	$0.89 \pm 0.30$	$0.14 \pm 0.09$	$2.23\pm0.87$	0.42	
CH <sub>4</sub>	Unburned	$32.9 \pm 11.3$	$85.8 \pm 55.4$	$61.2 \pm 22.5$	$8.0 \pm 2.4$	_	ns
(nmol m <sup>-2</sup> s <sup>-1</sup> )	Burned	$45.5 \pm 15.0$	$25.3 \pm 8.2$	$29.4 \pm 13.9$	$110.0 \pm 30.3$	15.0	

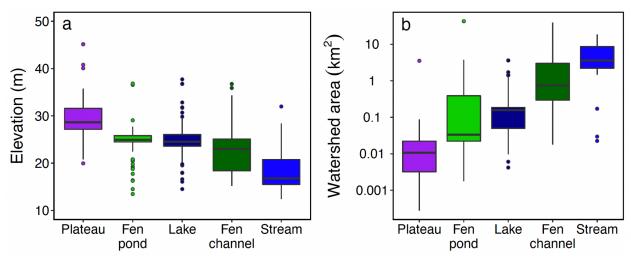
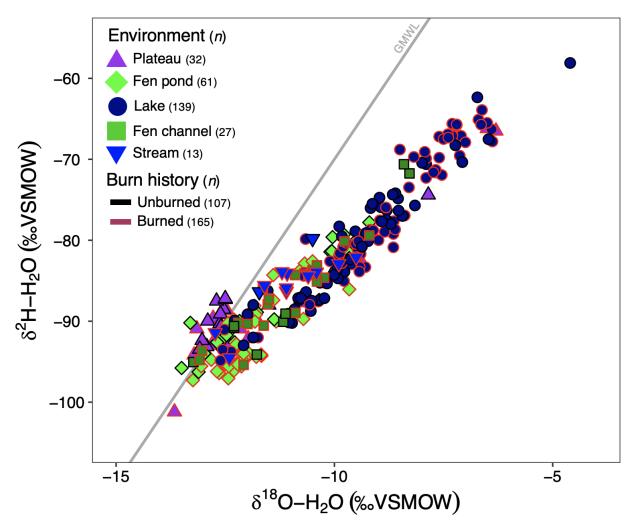


Figure S1. Distributions of watershed elevation and area by aquatic environment type.



**Figure S2.** The stable isotopic composition of surface waters among the five aquatic environments in the Yukon-Kuskokwim Delta. GMWL = global meteoric water line.