# Not accounting for Ignoring carbon emissions from thermokarst ponds leads to results in overestimation of tundra carbon uptake

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**Abstract.** Arctic permafrost landscapes have functioned as a global carbon sink for millennia. These landscapes are very heterogeneous, and the omnipresent water bodies are within them act as a carbon sourcewithin them. Yet, only a few studies focus few studies have focused on the impact of these water bodies on the landscape carbon budget. We deepen our understanding of carbon emissions from thermokarst ponds and constrain their impact by comparing carbon dioxide and methane fluxes from these ponds to fluxes from the surrounding tundra. We use eddy covariance measurements from a tower located at the border between a large pond and semi-terrestrial tundra.

When taking we take the open-water areas of thermokarst ponds into account, the carbon dioxide sink strength of the landscape is reduced by our results show that the estimated summer carbon uptake of the polygonal tundra is 11%. Open-water % lower. Further, the data show that open-water methane emissions are of similar magnitude as polygonal tundra emissions. However, some parts of the pond's shoreline exhibit much higher emissions. This finding underlines the high spatial variability of methane emissions. We conclude that gas fluxes from thermokarst ponds can contribute significantly to the carbon budget of arctic tundra landscapes. Consequently, changes in arctic hydrology and the concomitant changes in the the water body distribution of tundra landscapes due to permafrost degradation may substantially impact the overall carbon budget of the Arctic.

#### 1 Introduction

Water bodies make up a significant part of the arctic lowlands with an areal coverage of about 17 % (Muster et al., 2017), and act as an important carbon source in a landscape that is otherwise a an overall carbon sink (Kuhn et al., 2018). Permafrost thaw caused by Intensified permafrost thaw in the warming Arctic will change the distribution of waterbodies (Andresen and Lougheed, 2015; Brand thus also their contribution to the landscape-carbon budget (Kuhn et al., 2018) water bodies, and thereby change their contribution (Andresen and Lougheed, 2015; Bring et al., 2016) to the landscape carbon budget (Kuhn et al., 2018) of tundra

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landscapes. However, data on greenhouse-gas-greenhouse gas emissions from arctic water bodies are still sparsein space and time, especially data with a high temporal resolution and from non-Yedoma regions (Vonk et al., 2015).

Our study site in the Lena River Delta, Siberia, is located on an island mostly eovered characterized by non-Yedoma polygonal tundra (Fig. 1). This landscape features many ponds, which are defined here by an area  $< 8 \cdot 10^4$ ; we define ponds as water bodies with an area of less than  $8 \cdot 10^4$  m<sup>2</sup>, Ramsar Convention Secretariat (2016); Rehder et al. (2021). In following Ramsar Convention Secretariat (2016); Rehder et al. (2021). Within our area of interest, ponds cover about as much the same area as lakes (Abnizova et al., 2012; Muster et al., 2012). The ponds in this polygonal tundra on Samoyloy Island have formed almost exclusively through thermokarst processes: The ground soil has a high ice content, so when the ice melts. the ground subsides, and thermokarst ponds form (Ellis et al., 2008). These thermokarst ponds are often only as big large as one polygon, but when (polygonal ponds). When several polygons are inundated, larger shallow water bodies this can cause larger shallow thermokarst ponds to form, which we eall term merged polygonal ponds (Rehder et al., 2021). Ponds Holgerson and Raymond (2016) as well as Wik et al. (2016) report that ponds emit more greenhouse gases per unit area than lakes (Holgerson and Raymond, 2016; Wik et al., 2016), defined here as water bodies with an area larger than  $8 \cdot 10^4$  m<sup>2</sup>. Thus, in our study area, they have a higher greater potential than lakes to counterbalance the carbon sink function uptake of the surrounding tundra (McGuire et al., 2012; Jammet et al., 2017; Kuhn et al., 2018). To better understand the impact of thermokarst ponds on the landscape carbon flux, we compare carbon dioxide (CO<sub>2</sub>) and methane (CH<sub>4</sub>) fluxes from the open-water area of thermokarst ponds to fluxes from the semi-terrestrial tundra, which we define as. The semi-terrestrial tundra consists of wet and dry tundra, and overgrown water, which are the terrestrial land-surface types used by Muster et al. (2012) to classify Samoylov Island.

The main driving geophysical and biochemical processes differ between  $CO_2$  and that drive  $CH_4$  emissions. On the one hand, fluxes are different to the ones that drive  $CO_2$  fluxes. The microbial decomposition of dissolved organic carbon, which is introduced laterally into the aquatic system through rain and meltwater (Neff and Asner, 2001), dominates aquatic  $CO_2$  production. When supersaturated with dissolved  $CO_2$ , ponds emit  $CO_2$  to into the atmosphere through diffusion. While photosynthetic  $CO_2$  uptake has been observed in some clear arctic water bodies (Squires and Lesack, 2003), most arctic water bodies are net  $CO_2$  sources (Kuhn et al., 2018). Estimates range from emissions of  $CO_2$  emissions range from close to zero (0.028 g m<sup>2</sup> d<sup>-1</sup> by Treat et al. (2018), or and 0.059 g m<sup>2</sup> d<sup>-1</sup> by Jammet et al. (2017)) to substantial  $CO_2$ -C emissions (1.4–2.2–2.2 g m<sup>2</sup> d<sup>-1</sup> by Abnizova et al. (2012)).

On the other handWithin just one site, CH<sub>4</sub> emissions vary even more, sometimes from a water body can vary by up to five orders of magnitudewithin just one site: 0.5–6432–6432 mg m<sup>2</sup> d<sup>-1</sup>, Bouchard et al. (2015). (Bouchard et al., 2015). The CH<sub>4</sub> that ponds emit is mostly produced in sub-aquatic soils and anoxic bottom waters (Conrad, 1999; Hedderich and Whitman, 2006; Borrel et al., 2011). Additionally, CH<sub>4</sub> ean might also be produced in the oxic water column (Bogard et al., 2014; Donis et al., 2017), though this pathway only becomes location of methanogenesis is only significant in large water bodies (Günthel et al., 2020)and is still under debate (Encinas Fernández et al., 2016; Peeters et al., 2019). Note that during methanogenesis, Moreover, there is still ongoing debate as to whether methanogenesis occurs in oxic waters at all (Encinas Fernández et al., 2016; Peeters et al., 2019). CO<sub>2</sub> is also formed as a byproduct (Hedderich and Whitman, 2006)

-of the methanogensis process (Hedderich and Whitman, 2006). Water bodies emit CH<sub>4</sub> is then emitted from water bodies produced in their benthic zone through diffusion, ebullition (sudden release of bubbles), and or plant-mediated transport. These three The varying contributions of these three local methane emissions pathways lead to high spatial variability between water bodies and within one a single water body (Sepulveda-Jauregui et al., 2015; Jansen et al., 2019). Especially In particular, local seep ebullition causes high spatial variance of CH<sub>4</sub> emissions within one water body when it occurs (Walter et al., 2006). Variability in the coverage and composition of vascular plants within the shallow parts of plant communities in a water body can also increase CH<sub>4</sub> variability because each plant species has its specific efficiency in transporting CH<sub>4</sub> transport efficiency can be species-specific (Knoblauch et al., 2015; Andresen et al., 2017).

To study spatial and temporal patterns , we analyze of carbon emissions from thermokarst ponds, we analyzed land-atmosphere CO<sub>2</sub> and CH<sub>4</sub> flux observations from an eddy-covariance eddy covariance (EC) tower on Samoylov Island, Lena River Delta, Russia. We set up the EC tower up within the polygonal tundra and next to a landscape at the border between a large merged polygonal pond and the surrounding semi-terrestrial tundra for two months in summer 2019. The polygonal structures are were still clearly visible along the shore and underwater, and the pond is mostly-most of the pond was shallow (Rehder et al., 2021). Due to the tower's position, fluxes from the merged polygonal pond are were the dominant source of the observed EC fluxes under easterly winds. The From other wind directions, the observed EC fluxes are were dominated by semi-terrestrial polygonal tundra with only a low influence from small thermokarst pondsfrom the other wind directions. We aim to deepen our polygonal ponds. This paper aims to deepen the understanding of carbon emissions from thermokarst ponds and constrain their impact on the landscape carbon balance. To this end, we We (1) compare the water body and tundra fluxes focusing on examine the temporal and spatial patterns, and we of NEE and the spatial pattern of CH<sub>4</sub> flux from semi-terrestrial tundra and thermokarst ponds, and (2) investigate the influence of the merged polygonal pond thermokarst ponds on the landscape carbon balance NEE of CO<sub>2</sub> during the months June to September 2019. To this end, we use a footprint model and model net ecosystem exchange (NEE) of CO<sub>2</sub> using the footprint weights of semi-terrestrial tundra and thermokarst ponds.

## 2 Methods

## 2.1 Study site

Samoylov Island (72°22'N, 126°28'E) lies is located in the southern part of the Lena River Delta (Fig. 1, b). It has a size of about is approximately five km² large and consists of two geomorphologically different units components. The western part of the island (~2 km²) is a floodplain annually flooded in, which is flooded annually during the spring. The eastern part of the island (~3 km²), a late-Holocene river terrace, is characterized by polygonal tundra. The partially degraded polygonal tundra at this study site features a high spatial heterogeneity within a few meters on a scale of a few meters in several aspects, including vegetation, water table height, and soil properties. Dry and wet vegetated parts of the semi-terrestrial tundra are interspersed with small and large thermokarst ponds (<1 m² - 1 -> 10000 10,000 m²) and with large thermokarst larger lakes (up to 0.05 km², Boike et al. (2015a); Kartoziia (2019)). The island is surrounded by the Lena River and sandy floodplains, creating more additional spatial heterogeneity on a larger scale.

We focus This study focuses on a merged polygonal pond (Fig. 1, d, and A1) in on the eastern part of the island. This merged polygonal pond has a size of 0.024 km<sup>2</sup> with a maximum depth of 3.4 meters and a mean depth of 1.2 meters (Rehder et al., 2021; Boike et al., 2015a). On In an aerial image of the pond, the polygonal structures are still clearly visible under the water's surface (Boike et al., 2015c). The vegetated shoreline of this merged polygonal pond is dominated by *Carex aquatilis* interspersed with, but it also features *Carex chordorrhiza*, *Potentilla palustris*, and *Aulacomnium spp*. These plants grow in the water close to near the shore while the deeper parts of the merged polygonal pond are vegetation-free.

#### 2.2 Instruments

We measured gas fluxes using an eddy covariance (EC) tower between July 11 and September 10, 2019. The EC tower is was located on the eastern part of Samoylov Island, directly at the western shore of the merged polygonal pond (Fig. 1, d). The EC instruments are were mounted on a tripod at the a height of 2.25 meters (Fig. A1). The tower is was equipped with an enclosed-path CO<sub>2</sub>/H<sub>2</sub>O sensor (LI-7200, LI-COR Biosciences, USA), an open-path CH<sub>4</sub> sensor (LI-7700, LI-COR Biosciences, USA), and a 3D-ultrasonic anemometer (R3-50, Gill Instruments Limited, UK). All instruments have had a sampling rate of 20 Hz. We also install installed radiation-shielded temperature and humidity sensors at the EC tower (HMP 155, Vaisala, Finland) and use used data from a photosynthetically active radiation (PAR) sensor mounted at on a tower approximately 500 meters to the west of the EC tower (SKP 215, Skye Instruments, UK). Additional meteorological data for Samoyloy Island is was provided by Boike et al. (2019).

## 2.3 Data processing

## We perform

We performed the raw data processing and computation of half-hourly fluxes for open-path and enclosed-path fluxes (CO<sub>2</sub>, CH<sub>4</sub> and H<sub>2</sub>O) using *EddyPro* 7.0.6 (LI-COR, 2019). The convention of this software is that positive fluxes are fluxes from the surface to the atmosphere, while negative fluxes indicate a flux from the atmosphere downwards. Raw data screening includes included spike detection and removal according to Vickers and Mahrt (1997) (1 % maximum accepted spikes and a maximum of three consecutive outliners). Additionally, we apply applied statistical tests for raw data screening, including tests for amplitude resolution, skewness and kurtosis, discontinuities, angle of attack, and horizontal winds steadiness. All parameters of these testsare parameters were set to *EddyPro* default values. We rotate rotated the wind-speed axis to a zero-mean vertical wind speed using the Kaimal and Finnigan's (1994) "double rotation" method by Kaimal and Finnigan (1994). We apply method. Further, we applied linear de-trending following Gash and Culf (1996) to the raw data before following Gash and Culf (1996) before performing flux calculations. We compensate time lags by automatic time lag compensated time lags via automatic time lag optimization using a time-lag-assessment time lag assessment file from a previous EddyPro run. In this previous time-lag time lag assessment, the time lags for all gases are detected by were detected using covariance maximization (Fan et al., 1990), resulting in time lags between 0 – 0.4 0 – 0.4 s for CO<sub>2</sub> and -0.5 – 0.5 s for CH<sub>4</sub>. For H<sub>2</sub>O, the time lag is-was humidity-dependent and is calculated for ten was calculated for 10 humidity classes. We compensate compensated for air-density fluctuations due to thermal expansion /and contraction and varying water-vapor concentrations, following Webb et al.

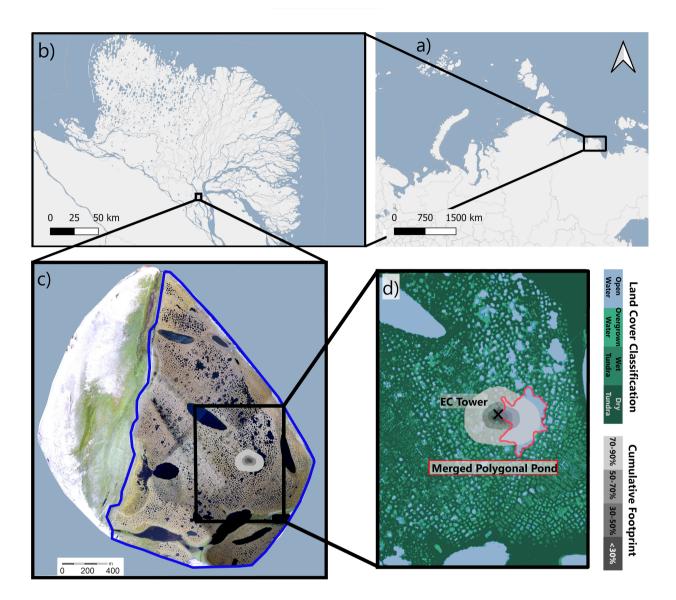


Figure 1. Study site with an overview The location of the study site in Russia is shown in (a) and the location of Samoylov Island within the Lena River Delta is shown in (b). Samoylov Island with is shown in (c); the surrounding Lena River appears in light blue(e), and a close-up look at the study site (d). The EC tower is marked as a black cross with the cumulative footprint (see section 2.4.2) in gray shades surrounding the EC tower. The outline of the land cover river-terrace land-cover classification from section (Sect. 2.4.1) is shown in a indicated by the blue line. We focus on the polygonal tundra, however, large lakes are excluded (ecircled in yellow). In (d), the detailed land cover land-cover classification is shown drawn in blue (open water) and green shades (dark green: dry tundra, medium green: wet tundra, and light green: overgrown water). The merged polygonal pond studied here is outlined in red. The location of the EC tower is marked by a black cross. The cumulative footprint (see Sect. 2.4.2) is shown in gray shades. 30 % of the flux likely originated from within the dark gray area, 50 % from within the medium-dark gray area, 70 % from within the medium-light gray area and 90 % from within the light gray area. Map data from © OpenStreetMap contributors 2020, distributed under the Open Data Commons Open Database License (ODbL) v1.0 (a & b) and modified after based on Boike et al. (2012) (c & d).

(1980). This correction depends on accurate measurements of the latent and sensible heat flux and is was applied to the openpath data of the LI-7700. Especially for For the LI-7700 in particular, the correction term can be larger than the flux itself, but the correction is was derived from the underlying physical equations. By using Because we used well-calibrated instruments as well as EddyPro, which uses an up-to-date implementation of the correction, and by using well-calibrated instruments, we are eertain to receive we were confident that the LI-7700 would provide accurate CH<sub>4</sub> flux estimations from the LI-7700 estimates. For enclosed-path data, we performed a sample-by-sample conversion into mixing ratios to account for air-density-air density fluctuations (Ibrom et al., 2007b; Burba et al., 2012). Flux losses occur-occurred in the low- and high-frequency-high frequency spectral range due to different filtering effects. In the low-frequency range, we compensate flux losses following. We compensated flux losses in the low-frequeny range in accordance with Moncrieff et al. (2004) and in the high-frequency range following in accordance with Fratini et al. (2012). For applying the latter the high-frequency range compensation method, a spectral assessment file is created using the methodby Ibrom et al. (2007a) was created using Ibrom et al.'s (2007a) method. The spectral assessment results resulted in cut-off frequencies of 3.05 Hz and 1.67 Hz for CO<sub>2</sub> and CH<sub>4</sub>, respectively. For H<sub>2</sub>O<sub>2</sub> we find-found a humidity-dependent cut-off frequency between 1.25 Hz (RH <del>5-45</del>5-45 %) and 0.21 Hz (RH <del>75-95</del>75-95%). We perform performed a quality check on each half-hourly flux following the 0-1-2 system proposed by Mauder and Foken (2004). In this quality check, flux intervals with the lowest quality receive received the flag "2" and are were excluded from further analysis.

## 2.4 Data analysis

## 2.4.1 Land cover Land-cover classification

The land cover land-cover classification covers the late-Holocene river terrace of Samoylov Island .-(3.0 km², area within the blue line in Fig. 1, c). It is based on high-resolution near-infrared (NIR) orthomosaic aerial imagery obtained in the summer of 2008 (Boike et al., 2015b). We use used a subset of the existing classification by Muster et al. (2012) Muster et al.'s (2012) existing classification as a training dataset to perform a semi-supervised land-cover classification using the maximum likelihood algorithm in ArcMap Version 10.8 (ESRI Inc, USA). We then apply applied the ArcMap majority filter tool to the new classification. The land-cover classification has a resolution of 0.17 m x 0.17 m,it. It is projected onto WGS 1984 UTM Zone 52N and the land-cover classes include open water (15.7%), overgrown water (7.0%), dry tundra (65.1%), and wet tundra (12.1%), as defined by Muster et al. (2012). We summarize the classes overgrown water, dry tundra, and wet tundra in the land-cover type, semi-terrestrial tundra. The river terrace consists of this semi-terrestrial tundra, large lakes, and thermokarst ponds. Since small ponds are an integral part of the polygonal tundra, we use the term "polygonal tundra" to refer to the area of the river terrace covered by semi-terrestrial tundra and by thermokarst ponds.

#### 2.4.2 Footprint model

The towerIn deploying an EC measurement tower, the tower's location and sensor height are crucial parameters in deploying an EC measurement tower. A lower measurement height results in a smaller footprint. The tower's footprint describes the

source area of the flux from within the surrounding landscape. With our sensors installed at the As we installed sensors at a height of 2.25 m next to the merged polygonal pond, we expect expected to observe substantial flux signals from the adjacent water body as well as from the surrounding polygonal semi-terrestrial tundra. Each land cover land-cover type's contribution to the flux signal depends depended on the wind direction and turbulence in the atmospheric boundary layer. We implement characteristics. We implemented the analytical footprint model proposed by Kormann and Meixner (2001) in Matlab 2019b (MATLAB, 2019). We combine combined the footprint model with land cover land-cover classification data described in section Sect. 2.4.1 to estimate the contribution of each land cover land-cover type to each flux signal half-hourly flux (from now on referred to as the weighted footprint fraction). The model accounts accounted for the stratification of the atmospheric boundary layer and requires required a height-independent crosswind distribution and horizontal homogeneity of the surface. The input data requires required stationarity of atmospheric conditions during the flux intervals of 30 minutes. We derive

We derived the vertical power-law profiles for the eddy diffusivity and the wind speed for each 30-minute flux depending on the atmospheric stratification (equation-see Eq. 6 in Kormann and Meixner (2001)). We use used an analytical approach to find the closest Monin-Obukhov (M-O) similarity profile (equation-see Eq. 36 in Kormann and Meixner (2001)). Next, we ealculate calculated a two-dimensional probability density function of the source area for each flux (from equations Eq. 9 and 21 in Kormann and Meixner (2001)). We combine combined each probability density function with the land-cover classification of the river terrace of Samoylov Island, land-cover classification of Samoylov Island's river terrace with its four land-cover types (see section Sect. 2.4.1). The resolution of the footprint model is was set to the land-cover land-cover classification resolution of 0.17 m x 0.17 m. Hence, we can were able to estimate how much a given grid cell contributes contributed to each 30-min flux. We also know knew each grid cell's dominant land-cover land-cover type from the land-cover classification. We combine both combined both pieces of information for each grid cell and calculated the sum of the fraction fluxes within the source area for each of the four land-cover types (dry tundra, wet tundra, overgrown water, and open water) and obtain determined the contribution of each land-cover type to land-cover type in respect of each 30-minute flux (a<sub>dry tundra</sub>, a<sub>wet tundra</sub>, a<sub>overgrown water</sub>, and a<sub>open water</sub>). We refer to this contribution of each land-cover land-cover type as the weighted footprint fraction.

We also sum-summed all 30-min two-dimensional probability density functions over the whole entire deployment time. This sum is referred to as the cumulative footprint (gray shaded area in Fig. 1, c–d). The light gray area's outer boundary represents the 90% isoline, and the light gray area's inner boundary is the 70% isoline of the cumulative footprint. The 90% isoline means that it is likely that 10% of each observed flux signal originates from outside of the light gray area. Medium gray represents 50-70%, medium-dark gray 30-50%, and dark gray indicates a probability of less than 30% that each observed flux signal originates from within the marked area.

## 2.4.3 Gap-filling the CO<sub>2</sub> flux

To gap-fill the net-ecosystem exchange (NEE) fluxes of CO<sub>2</sub>, we use used the *bulk-NEE model* proposed by Runkle et al. (2013). The model uses the total ecosystem respiration (TER) and the gross primary production (GPP) to gap-fill NEE, our target variable. The model is specifically designed to model NEE in arctic regions: It takes impacts of the polar day into account

. We estimate all model parameters for running 5-day periods to capture changing plant physiology during the measurement period. NEE is partitioned into two components (equation 1): TER(by allowing both respiration and photosynthesis to occur simultaneously throughout the day. The *bulk-NEE model* uses the sum of total ecosystem respiration (TER) and gross primary production (GPP) to describe NEE, our target variable:

$$NEE = \text{TER} + \text{GPP} \tag{1}$$

where TER and GPP have the unit  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup>, equation 2) and GPP (mol m<sup>-2</sup> s<sup>-1</sup>, equation 3). Parameters of both components are fit simultaneously. TER is approximated as an exponential function of air temperature  $T_{air}$ :

$$TER = R_{base} \cdot Q_{10}^{\frac{T_{air} - T_{ref}}{\gamma}}$$
 (2)

where  $T_{ref}=15~^{\circ}\mathrm{C}$  and  $\gamma=10~^{\circ}\mathrm{C}$  are constant, independent parameters.  $R_{base}$  (µmol m $^{-2}$  s $^{-1}$ ) describes the basal respiration at the reference temperature  $T_{ref}$  and  $Q_{10}$  (dimensionless) describes the sensitivity of ecosystem respiration to air temperature changes.

GPP is  $\frac{\text{modeled}}{\text{described}}$  as a rectangular hyperbolic function of PAR (µmol m<sup>-2</sup> s<sup>-1</sup>):

$$GPP = -\frac{P_{max} \cdot \alpha \cdot PAR}{P_{max} + \alpha \cdot PAR}$$
(3)

where  $\alpha$  (µmol µmol<sup>-1</sup>) is the initial canopy quantum use efficiency (slope of the fitted curve at PAR= 0) and  $P_{max}$  (µmol m<sup>-2</sup> s<sup>-1</sup>) is the maximum canopy photosynthetic potential for PAR  $\rightarrow \infty$ .

We sum both components to estimate the modeled NEE  $F_{CO_2,mod}$ :

## $F_{CO_2,mod} = \text{TER} + \text{GPP}.$

The parameters  $R_{base}$ ,  $Q_{10}$ ,  $P_{max}$ , and  $\alpha$  were fitted simultaneously. To account for seasonal changes in plant physiology, we fitted the parameters for running five-day windows as proposed in Holl et al. (2019).

We split the datasets into a-training (70 %) and a-validation (30 %) data set-sets to test model performance. In 38 5-day fitting periods, we find an  $R^2$  above 0.9 between the model output and the validation set. Eighteen times, we get an  $R^2$  between 0.8 – 0.9 and six times an  $R^2$  below 0.7. The model performance indicates that the model works well overall. In the model input, we exclude  $CO_2$  fluxes with an absolute value of more than 4 g m<sup>-2</sup> d<sup>-1</sup>. We additionally exclude  $CO_2$  fluxes from the wind direction (WD) of the merged polygonal pond (30°< WD <150°) from the training dataset to obtain a dataset consisting of as much semi-terrestrial tundra as possible. We perform this step since we expect little to no photosynthetic activity in the open-water part of the merged polygonal pond. We implement the *bulk model* in We implemented the *bulk-NEE model* in Matlab 2019b (MATLAB, 2019) using the *fit* function with the fitting method of *NonLinearLeastSquares*. We use *NonLinearLeastSquares* fitting method. We used the *coeffvalues*-function to estimate the four parameters and ( $R_{base}$ ,  $Q_{10}$ ,  $P_{max}$ , and Q) and the *confint*-function to estimate their 95 % confidence bounds. All partitioned fluxes are were converted into  $CO_2$ -C fluxes in the unit g m<sup>-2</sup> d<sup>-1</sup> before the data analysis.

## 2.4.4 The open-water-Separating CO<sub>2</sub> fluxfluxes from semi-terrestrial tundra and water bodies

We want wanted to extract fluxes from thermokarst ponds and semi-terrestrial tundra to analyze the influence of ponds on the carbon balance of a polygonal tundra landscape. However, due to the strong heterogeneity of the landscape and the relatively small size of the merged polygonal pond compared to the EC footprint, we measure measured a mixed signal from all wind directions. In other words, each flux that was measured with the EC method contains contained information from different land cover types. Since we are interested in average tundra fluxes, we combine the landcover classes dry tundra, wet tundra, and overgrown water under the term semi-terrestrial tundra. In this way, we can compare two landcover classes, land-cover types. We divided the footprint into two classes – semi-terrestrial tundra and the open water from thermokarst ponds – to assess the impact of thermokarst ponds on the carbon balance.

Similar approaches of analyzing heterogeneous eddy covariance fluxes in arctic environments have been conducted for CO<sub>2</sub> and CH<sub>4</sub> (e.g. Rößger et al., 2019a,b; Tuovinen et al., 2019). Rößger et al. (2019a,b) extracted CO<sub>2</sub> and CH<sub>4</sub> fluxes from two different land cover land-cover classes on a floodplain, and while Tuovinen et al. (2019) separated CH<sub>4</sub> fluxes from nine individual land cover land-cover classes, including water, and combined them into four source classes (with no separate class for water). All three studies have in common that they differentiate differentiate between fluxes from different vegetation types. However, our Our method is dedicated to distinguishing between fluxes from semi-terrestrial tundra and water bodies.

To estimate the CO<sub>2</sub> flux fluxes from the merged polygonal pond ( $F_{pond}$ ), we first fit the fitted the bulk-NEE model to data-training data, excluding fluxes from the direction of the merged polygonal pond (thus exclude fluxes from 30° < WD < 150°, as described in section 2.4.3). With this bulk model, we gap-fill the CO<sub>2</sub> flux, and the ). We obtained a dataset consisting of information about as much semi-terrestrial tundra as possible. We performed this step since we expected little to no photosynthetic activity in the open-water part of the merged polygonal pond. This gap-filled CO<sub>2</sub> flux (hereinafter  $F_{modeled,mix}$ ) represents the semi-terrestrial polygonal tundra surrounding the EC tower, including small ponds to the meaning the flux is dominated by semi-terrestrial tundra, but also includes polygonal ponds from wind directions of north, west, and south. Second, we assume In the model input, we excluded 30-minute CO<sub>2</sub> fluxes with an absolute value of more than 4 g m<sup>-2</sup> d<sup>-1</sup>. In 38 five-day windows, we found an R<sup>2</sup> above 0.9 between the model output and the validation set. In 18 cases, we obtained an R<sup>2</sup> between 0.8–0.9; in six instances, we obtained an R<sup>2</sup> below 0.7. The final RMSE between the model input and the gap-filled NEE had a value of 0.29 g m<sup>-2</sup> d<sup>-1</sup>.

We assumed that the total observed flux is—was a linear combination of the fluxes from the land cover land-cover types weighted by their respective contribution to the footprint. Thus, we postulated that the observed  $CO_2$  flux  $(F_{obs,mix}, not gap-filled)$  is—was the sum of the individual land-cover land-cover type fluxes  $(F_{modeled,mix})$  and the merged polygonal pond  $F_{pond}$ ) each multiplied with their weighted footprint fraction  $(a_{tundra}, a_{mix})$  and  $a_{pond}$ , with  $a_{open \ water} = a_{pond}$ ,

 $a_{tundra} = a_{sum} - a_{pond}$   $a_{mix} = a_{sum} - a_{pond}$ , and  $a_{sum}$  is being the sum over all land cover classes: land-cover classes:

$$F_{obs,mix} = a_{pond} \cdot F_{pond} + a_{\underline{tundra\,mix}} \cdot F_{modeled,mix}$$

$$\Leftrightarrow F_{pond} = \frac{F_{obs,mix} - a_{tundra} \cdot F_{modeled,mix}}{a_{pond}} \frac{F_{obs,mix} - a_{mix} \cdot F_{modeled,mix}}{a_{pond}}$$

$$(4)$$

To improve data quality, we excluded 30-min fluxes of  $F_{pond}$  when  $a_{pond} < 50$  %. Then, we use used the median of  $F_{pond}$  for further calculations, and we assume that all open water assumed that all thermokarst ponds in the EC footprint emits emitted the same amount of  $CO_2$ .

As mentioned above, the observed  $CO_2$  flux from the wind direction of north, west, and south  $(F_{obs,mix})$  is still influenced by small thermokarst ponds. To analyze in detail the was influenced by polygonal ponds to a small degree. Since our aim was to assess the impact of thermokarst ponds (both polygonal ponds and merged polygonal ponds) on NEE, we needed to eliminate the influence of polygonal ponds from our NEE estimate. To extract uncontaminated  $CO_2$  flux data from the semi-terrestrial tundra  $(F_{modeled,tundra})$ , we subtracted the previously estimated pond- $CO_2$  flux  $F_{pond}$  from the observed  $CO_2$  flux  $F_{obs,mix}$ :

$$F_{modeled,tundra} = \frac{F_{obs,mix} - a_{pond} \cdot F_{pond}}{a_{tundra}} \frac{F_{obs,mix} - a_{pond} \cdot F_{pond}}{a_{mix}}$$

$$(5)$$

We then use used this estimated  $CO_2$  flux from the semi-terrestrial tundra  $F_{modeled,tundra}$  as the input regressand variable for the bulk-NEE model to receive obtain a gap-filled dataset of regarding  $CO_2$  flux from the semi-terrestrial tundra. This gap-filling modeling of  $CO_2$ -C flux had an RSME of 0.31 g m<sup>-2</sup> d<sup>-1</sup>.

To evaluate the impact of ponds on the thermokarst ponds on landscape  $CO_2$  flux, we estimate a polygonal tundra estimated a polygonal tundra landscape- $CO_2$  flux from the late-Holocene river terrace of Samoylov Island ( $F_{landscape}$ ) by linearly combining thermokarst ponds and semi-terrestrial tundra linearly:

$$F_{landscape} = A_{pond} \cdot F_{pond} + A_{tundra} \cdot F_{modeled,tundra}$$

where  $F_{pond}$  describes the CO<sub>2</sub> emission emissions from the open-water areas of ponds (equation thermokarst ponds (Eq. 4),  $F_{modeled,tundra}$  describes the modeled CO<sub>2</sub> flux from the semi-terrestrial tundra (equation Eq. 5),  $A_{pond} = 0.07$  is the fraction of the coverage of open pond water on the whole river terrace river terrace area of Samoylov Island that is covered by thermokarst ponds (from the land cover classification, see Sect. 2.4.1) and  $A_{tundra} = 1 - 0.07$  the coverage of other land cover types. We do is the fraction of other land-cover to the entire river terrace area. We did not account for (larger, deeper) thermokarst larger or deeper lakes in this up-scaling approach, as we expect expected different greenhouse gas emissions emission dynamics from these lakes and there are were no lakes in our footprint, and therefore not within our observation range. Thus, we scale scaled the above numbers to  $A_{tundra} + A_{pond} = 1$ , which results in  $A_{pond} = 0.076$  and  $A_{tundra} = 0.924$ .

## 2.4.5 CH<sub>4</sub> flux partitioning

Since we do not have a simple The data show that the CH<sub>4</sub> emissions from the heterogeneous landscape around the tower were less spatially uniform than the CO<sub>2</sub> emissions. Therefore, we could not use a gap-filling model at hand for CH<sub>4</sub> emissions from the tundra, and since CH<sub>4</sub> emissions are much more variable than that was similar to the bulk model we used for CO<sub>2</sub> emissions, we treat, so we investigated CH<sub>4</sub> differently. We focus on emissions in a different way. Based on preliminary results from our analysis and the aerial image of the study site, we focused on four wind sectors instead of extracting the fluxes from the landcover types. We divide fluxes into the following wind sectors land-cover types:

- tundra: At least half of the footprint consists consisted of dry tundra, and the wind direction is was larger than 170°.
- shore<sub>50°</sub>: Less than 40%% of the footprint consists consisted of dry tundra and water contributed to the footprint with at comprised least 30%% of the footprint. The wind direction lies was between 30° < WD < 65°.
- pond: At least half of the footprint consists consisted of open water, and the wind direction lies was between 65° < WD</li>
   110°.
- $shore_{120^\circ}$ : Less than 40%% of the footprint consists consisted of dry tundra and water contributed to the footprint with comprised at least 30%% of the footprint. The wind direction lies was between  $110^\circ < \text{WD} < 130^\circ$ .

## 2.4.6 CH<sub>4</sub> permutation test

To evaluate whether the differences in flux medians between the four wind sectors are were significant, we apply applied a permutation test (Edgington and Onghena, 2007). In this test, we randomly assign assigned each 30-min flux to one of two groups and ealculate calculated both groups' median and their differences. Using the four wind sectors, we do the differences between the group's medians. We conducted six tests in total, using all possible combinations of pairs with the four wind sectors. After repeating this step 10000 times, we plot plotted the resulting differences in medians in a histogram and perform performed a one-sample t-test to evaluate whether the observed difference in medians differs significantly (p < differed significantly (p < 0.01) from the randomly generated differences.

## 3 Results

#### 3.1 Meteorological conditions

During the measurement period between 11 July and 10 September July 11 and September 10, 2019, half-hourly air temperatures range from -0.5 °C to 27.6 °C with a mean temperature of 8.7 °C (Fig. A2, a). The maximum wind speed measured on at the EC tower at a height of 2.25 m height is 8.9 m s<sup>-1</sup> (Fig. A2, b). Photosynthetically active radiation (PAR) PAR reaches values of up to 1419  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup> with decreasing maximum values during the measurement period (Fig. A2, c). Throughout the measurement period, there are 28 cloudy daysare visible as determined by identifying days with low PAR-values (maximum values below ~500  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup>)throughout the measurement period.

## 3.2 CO<sub>2</sub> fluxes

When inspecting the relation between observed CO<sub>2</sub> fluxes and wind direction (Fig. 2), we find that the CO<sub>2</sub> flux exhibits and fluxes exhibit high temporal variability between positive and negative CO<sub>2</sub> fluxes from most wind directions. In the wind sector between 60°—120–120°, the flux source area is dominated by the merged polygonal pond. The CO<sub>2</sub>-C fluxes from this pond sector show a smaller variability (mean of 0.06 smaller absolute variability (0.09 0.38 g m<sup>-2</sup> d<sup>-1</sup> with a standard deviation of 0.28 g m<sup>-2</sup> d<sup>-1</sup> Median 5% Percentile) than the fluxes from all other wind directions (mean of -0.17 0.08 0.87 g m<sup>-2</sup> d<sup>-1</sup> with a standard deviation of 0.77 g m<sup>-2</sup> d<sup>-1</sup> Median 5% Percentile). Additionally, we observe a lower respiration rate from the merged polygonal pond than from the semi-terrestrial tundra. Fig. 3 shows the observed night-time CO<sub>2</sub> fluxes plotted against the respective weighted footprint fraction of open water. We define nighttime as PAR<20 µmol m<sup>-2</sup> s<sup>-1</sup> and expect only respiration and no photosynthesisduring these times; we expect that there would only be respiration, no photosynthesis, during the night-times. We find that the fluxes decrease with an increasing open-water contribution as the pond area contribution increases. Thus, the strength of CO<sub>2</sub> respiration shows a dependence on the open-water contribution contribution of open-water. We also find that low air temperatures are mostly associated with low respiration rates.

Another part of the aspect of  $CO_2$  flux variability stems from the diurnal cycle. We compare the diurnal cycle of the  $CO_2$  fluxes from the merged polygonal pond (estimated following equation in accordance with Eq. 4) and the semi-terrestrial tundra (Eq. 5, Fig. 4), and we see. The results show a less pronounced diurnal  $CO_2$  cycle from the direction of the merged polygonal pond (blue) compared to the diurnal  $CO_2$  cycle from the semi-terrestrial tundra (green). All We combine all data from the merged polygonal pond combined ( $F_{pond}$  in Eq. 4)result, which results in a  $CO_2$ -C flux of 0.13  $_{0.00}^{0.24}$  g m<sup>-2</sup> d<sup>-1</sup> (Median 75% Percentile Median 75% Percentile).

## 3.3 CH<sub>4</sub> fluxes

When plotting We plot the observed CH<sub>4</sub> fluxes against wind direction (Fig. 5), we see. The results show that the CH<sub>4</sub> emissions peak at  $\sim 120^{\circ}$ , where fluxes from one shoreline of the merged polygonal pond contribute to the observed flux (Fig. 1 d, from now on  $shore_{120^{\circ}}$ ). We do not observe a similar peak of CH<sub>4</sub> emissions in the direction of the second shoreline towards  $\sim 50^{\circ}$  ( $shore_{50^{\circ}}$ ). These peaks did not correlate with any of the four a specifically large contribution of one of the land-cover classes to the footprint.

To further investigate the peak at  $shore_{120^{\circ}}$ , we compare the CH<sub>4</sub> emissions from the different wind sectors ( $shore_{120^{\circ}}$ ,  $shore_{50^{\circ}}$ , pond and tundra,  $\frac{24.47}{14.26}$  mg m<sup>-2</sup> d<sup>-1</sup> ( $shore_{120^{\circ}}$ ),  $12.96_{10.34}^{15.11}$  mg m<sup>-2</sup> d<sup>-1</sup> ( $shore_{50^{\circ}}$ ),  $13.90_{11.02}^{18.46}$  mg m<sup>-2</sup> d<sup>-1</sup> (pond), and  $12.55_{9.65}^{16.07}$  mg m<sup>-2</sup> d<sup>-1</sup> (tundra,  $\frac{Median_{25\%}^{75\%}Percentile}{25\%}Percentile}$ . Fluxes from  $shore_{120^{\circ}}$  have a higher median than fluxes from the other three wind sectors (Fig. 6).

We investigated the impact of wind speed and air temperature on the  $CH_4$  fluxes by excluding flux intervals with high wind speed (larger greater than 5 m s<sup>-1</sup>) and high air temperature (larger warmer than 12 °C). In the The randomization test (section 2.4.6), we find evidence for Sect. 2.4.6) provided evidence of a significant difference between the  $CH_4$  emission emissions

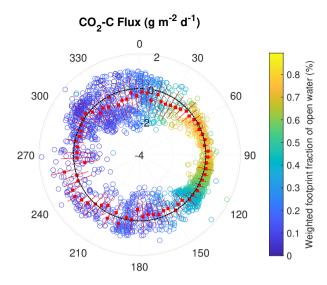


Figure 2. Polar plot of observed  $\frac{30\text{-min}}{30\text{-minute}}$  CO<sub>2</sub>-C  $\frac{100\text{-minute}}{100\text{-minute}}$  with respect to the wind direction  $\frac{100\text{-minute}}{100\text{-minute}}$  Negative values (inside of the  $\frac{100\text{-minute}}{100\text{-minute}}$  Solid black line) represent CO<sub>2</sub> uptake, while positive values (outside of the dotted black line) represent CO<sub>2</sub> emission  $\frac{100\text{-minute}}{100\text{-minute}}$  The values -4, -2, 0, and 2 indicate the magnitude of the CO<sub>2</sub>-C flux in g m<sup>-2</sup> d<sup>-1</sup>. The color of each point on the plot represents the percentage the point comprises of the total open water weighted footprint fraction in each 30-minute flux. The red boxes indicate the mean CO<sub>2</sub> flux of  $\frac{100\text{-minute}}{100\text{-minute}}$  wind direction intervals during the  $\frac{100\text{-minute}}{100\text{-minute}}$  values (outside of the dotted black line) represent CO<sub>2</sub> emission  $\frac{100\text{-minute}}{100\text{-minute}}$  while positive values (outside of the dotted black line) represent CO<sub>2</sub> emission  $\frac{100\text{-minute}}{100\text{-minute}}$  and  $\frac{100\text{-minute}}{100\text{-minute}}$  with respect to the wind direction  $\frac{100\text{-minute}}{100\text{-minute}}$  and  $\frac{100\text{-minute}}{100\text{-minute}}$  and  $\frac{100\text{-minute}}{100\text{-minute}}$  and  $\frac{100\text{-minute}}{100\text{-minute}}$  with respect to the wind direction  $\frac{100\text{-minute}}{100\text{-minute}}$  and  $\frac{100\text{-minute}}{1$ 

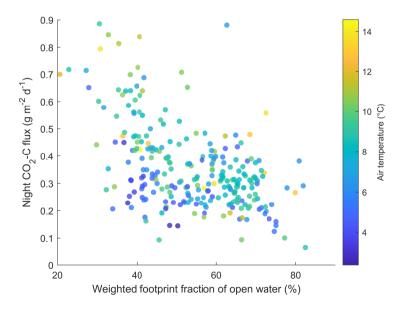
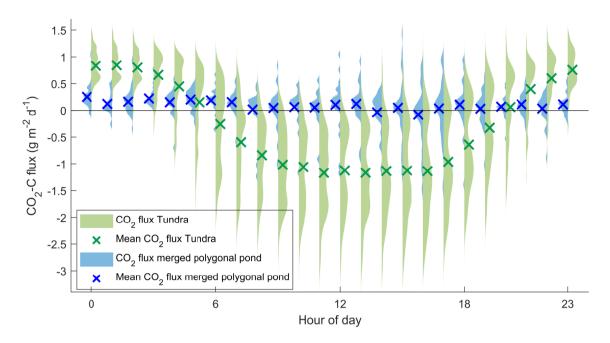


Figure 3. Scatter plot of observed  $CO_2$  fluxes against the weighted footprint fraction of open water induring each 30-minute flux with. The air temperature as is represented through color. Only fluxes observed at nighttime (PAR<20  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup>) are shown.



**Figure 4.** Diurnal cycle of modeled CO<sub>2</sub>-C based on observations flux from the merged polygonal pond (blue, eq. 4) and the semi-terrestrial tundra (green, eq. 5) as violin plots for each half-hour flux. Blue and green crosses mark the mean CO<sub>2</sub>-C flux during each half-hour flux. A violin plot shows the distribution of measurements along the y-axis – the width of the curves expresses the density of data points at each indicates how frequently a certain y-value occurred.

from  $shore_{120^{\circ}}$  and the other three wind sector classes at low wind speeds (top row in Fig. A4) and no significant difference between the CH<sub>4</sub> emission from the classes pond - tundra and  $shore_{50^{\circ}} - tundra$ . The difference between the classes pond and  $shore_{50^{\circ}}$  is significant, however, however, it is much smaller than the previously described differences (see center graph in Fig. A4). Note that the CH<sub>4</sub> emissions from the pond and the tundra pond and tundra have a similar magnitude under moderate wind speed conditions. The results are very similar for moderate temperatures: We find evidence for of a significant difference between the CH<sub>4</sub> emission emissions from  $shore_{120^{\circ}}$  to the other three and the CH<sub>4</sub> emissions from the other three wind sector classes (top row in Fig. A5). The differences in medians between the pond and  $shore_{50^{\circ}}$  and between the pond and pond are significant. However, this difference is much smaller (second row in Fig. A5). In summary, we find that neither high wind speed nor high temperatures act as a driver for the high CH<sub>4</sub> emission from  $shore_{120^{\circ}}$ . In contrast, the peak at  $180^{\circ} - -190^{\circ}$  can be explained reasonably well using air temperature and friction velocity in a multiple linear regression ( $R^2 = 0.44$ ). Using the same predictors results in an  $R^2$  of 0.20 for the peak at  $shore_{120^{\circ}}$ .

The ratio of  $CO_2$ -C to  $CH_4$ -C emissions at night (PAR<20  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup>) has a value of  $CH_4/CO_2 = 0.060^{0.076}_{0.049}$  for fluxes with an open-water weighted footprint fraction of more than 60 %, whereas the ratio amounts to  $(CH_4/CO_2 = 0.020^{0.024}_{0.015}$ ;  $(CH_4/CO_2 = 0.020^{0.024}_{0.015})$  for fluxes with an open-water weighted footprint fraction of less than 20 %.

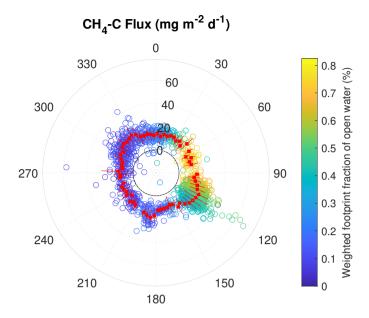
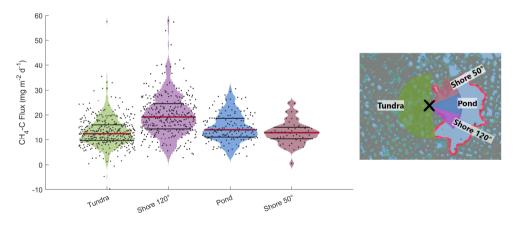


Figure 5. Polar plot of 30-minute observed CH<sub>4</sub>-C flux with respect to the wind direction at the EC tower. Positive values outside the dotted solid black line represent CH<sub>4</sub> emissionemissions, while values and inside the line  $\frac{1}{2}$ -represent CH<sub>4</sub> uptake during one half-hour period. The values 0, 20, 40, and 60 indicate the magnitude of the CH<sub>4</sub>-C flux in mg m<sup>-2</sup> d<sup>-1</sup>. The color of each point on the plot represents the percentage the point comprises of the total open water weighted footprint fraction in each 30-minute flux. The red boxes indicate the mean CH<sub>4</sub> flux of 5° wind direction intervals during the 2-months-two-months observation period (red lines indicate the first standard deviation).



**Figure 6.** Violin plots of observed CH<sub>4</sub> emissions at the EC tower separated into four different wind direction sector classes. A violin plot shows the distribution of measurements along the y-axis - the width of the curves expresses the density of data points at each indicates how frequently a certain y-value occurred. Medians of CH<sub>4</sub> emission distributions are shown as red lines, and 75<sup>th</sup> & and 25<sup>th</sup> percentile are shown as black lines. On the right, the wind sectors with the eddy covariance tower in the center (black cross) are shown.

## 3.4 Upscaled CO<sub>2</sub> flux

We use the estimated open-water  $CO_2$  flux from the merged polygonal pond and the modeled  $CO_2$  flux from the semi-terrestrial tundra to linearly up-scale the  $CO_2$  flux for the polygonal tundra of Samoylov Island (excluding larger thermokarst-lakes, the method described in section Sect. 2.4.4). As we have no not obtained estimates for the  $CH_4$  fluxes from the landcover types tundra and pond land-cover types, we only upscale  $CO_2$ .

We estimate that the landscape when one includes the  $CO_2$  uptake is  $\sim 11\%$  lower when including the flux from thermokarst ponds, the river terrace landscape's  $CO_2$  flux from ponds compared to a uptake is  $\sim 11\%$  lower than the uptake of semi-terrestrial tundra without ponds. The modeled  $CO_2$ -C flux from the semi-terrestrial tundra (without consideration of thermokarst pond fluxes) accumulated to  $-16.29 \pm 0.43$  g m $^{-2}$  during the observation period (60.5 days). Separated If separated into months, it the modeled  $CO_2$ -C flux from the semi-terrestrial tundra amounts to  $-15.01 \pm 0.26$ ,  $-3.56 \pm 0.33$  and  $+2.35 \pm 0.11$  g m $^{-2}$  in July (19.8 days), August (31 days), and September (9.7 days), respectively. When including one includes the  $CO_2$  flux from the merged polygonal pond as representative for all to represent all thermokarst ponds on Samoylov islandIsland, the resulting estimate of the landscape  $CO_2$  flux amounts to  $-14.47 \pm 0.40$  g m $^{-2}$  (60.5 days)and, with monthly fluxes of  $-13.75 \pm 0.24$ ,  $-2.99 \pm 0.31$ , and  $+2.27 \pm 0.10$  g m $^{-2}$  in July (19.8 days), August (31 days), and September (9.7 days), respectively. Thus, the results show that thermokarst ponds have the largest impact on the landscape's  $CO_2$  flux in August. In September, accounting for thermokarst ponds leads to a 3.5 % lower landscape estimate of landscape  $CO_2$  emissions.

## 4 Discussion

## 4.1 CO<sub>2</sub> flux

Only a limited number of EC CO<sub>2</sub>-flux studies from permafrost-affected ponds and lakes are available (studies with "EC" in Tab. 1). Estimates of open-water EC CO<sub>2</sub>-C flux range from 0.059 g m<sup>-2</sup> d<sup>-1</sup> (Jammet et al., 2017)over, to 0.11 g m<sup>-2</sup> d<sup>-1</sup> (Eugster et al., 2003), to 0.22 g m<sup>-2</sup> d<sup>-1</sup> (Jonsson et al., 2008). Our estimate of 0.12  $_{0.0014}^{0.24}$  g m<sup>-2</sup> d<sup>-1</sup> is, therefore, well within the range of open-water CO<sub>2</sub>-C fluxes observed with the EC method. Other studies using different methods report a wider range of open-water CO<sub>2</sub> fluxes in arctic regions. These fluxes range from a minor CO<sub>2</sub>-C uptake (-0.14 g m<sup>-2</sup> d<sup>-1</sup>, Bouchard et al. (2015)) to substantial emissions of CO<sub>2</sub>-C (up to 2.2 g m<sup>-2</sup> d<sup>-1</sup>, Abnizova et al. (2012)). A modeling study involving multiple lakes in north-eastern-Northeast European Russia found close to that they produce almost zero emissions (0.028 g m<sup>-2</sup> d<sup>-1</sup>, Treat et al. (2018)). Our perhaps most striking finding is that

Strikingly, our estimates of open-water CO<sub>2</sub> emissions are approx. 12-18 approximately 12-18 times smaller than those that have been previously reported for open-water CO<sub>2</sub> emissions at the same study site (Abnizova et al., 2012). One reason for the divergent results might be the different methods used. In Abnizova et al. (2012), the thin boundary layer model (TBL)after Liss and Slater (1974), following Liss and Slater (1974), was applied to estimate CO<sub>2</sub> emissions from CO<sub>2</sub> concentrations measured in water samples. However, one other study found good agreement between the EC method and the TBL (Eugster et al., 2003). Abnizova et al. (2012) measured smaller thermokarst ponds, as opposed In addition, in contrast to the larger

Table 1. Daily mean water-atmosphere CO2 & CH4 fluxes from different study sites. TBL is the abbreviation for thin boundary layer model, EC for eddy covariance, CH for chamber measurement, MOD for modelled fluxes, STO for storage fluxes, and NEW for the method used in this study. All fluxes are given  $\pm$  standard deviation, except of fluxes from this study are given as Median 25% Percentile

					CO <sub>2</sub> -C flux	CH4-C flux
Study	Location	Period/Time	Study Site	Method	$(g m^{-2} d^{-1})$	$({\rm mg}\ {\rm m}^{-2}\ {\rm d}^{-1})$
This study	Lena Delta,	11.07	merged polygonal pond	EC/NEW	$0.13  {}^{0.24}_{0.00}$	$14.10_{\ 11.23}^{\ 18.67}$
	Northern Siberia	10.09.2019	merged polygonal pond shore	EC	1	$12.96_{\ 10.34}^{\ 15.11} - 19.18_{\ 14.26}^{\ 24.47}$
Abnizova	Lena Delta,	01.08. –	Samoylov Pond	TBL	1.50 - 2.20	I
et al. (2012)	Northern Siberia	21.09.2008	Samoylov Lake	TBL	1.40 - 2.10	I
Jammet et al.	Northern Sweden	2012 - 2013	Lake Villasjön	EC	0.059	$13.42 \pm 1.64$
(2017)						
Jonsson et al.	Northern Sweden	17.06. –	Lake Merasjärvi	EC	$0.22 \pm 0.002$	I
(2008)		15.10.2005		TBL	$0.30\pm0.01$	
Eugster et al.	Alaska	27.07 –	Toolik Lake	EC	$0.11 \pm 0.033$	I
(2003)		31.07.1995		TBL	$0.13 \pm 0.003$	
				СН	$0.37 \pm 0.060$	
Jansen et al.	Northern Sweden	Year round, 2010 -	Villasjön	СН	$0.22 \pm 0.047$	$14.04 \pm 2.25$
(2019)		2017	Inre Harrsjön		$0.25 \pm 0.05$	$10.39 \pm 1.40$
			Mellersta Harrsjön		$0.73 \pm 0.067$	$13.76 \pm 2.81$
Bouchard	NE Canada	July 2013 & 2014	Bylot Island, Polygon ponds	TBL	-0.14 - 0.74	0.50 - 6432
et al. (2015)			Lakes		-0.085 - 0.062	0.70 - 74.5
Sepulveda-	Alaska	June – July	8 Lakes, Yedoma	TBL & STO	$0.60 \pm 0.58$	$92.86 \pm 35.72$
Jauregui et al.		2011 & 2012	32 Lakes, Non-Yedoma		$0.10\pm0.10$	$16.80 \pm 8.61$
(2015)						
Treat et al.	Northeast European	2006 - 2015	Multiple Lakes	MOD	$0.028 \pm 0.00011$	$0.84\pm0.0$
(2018)	Russia					
Sieczko et al.	Northern Sweden	July – August 2017	Lake Ljusvatterntjärn	СН	I	$2.95 \pm 0.75$
(2020)						
Ducharme-	North-East Canada	Summer 2008	15 lakes	TBL	$0.20 \pm 0.093$	I
Riel et al.						
(2015)						
Repo et al.	Western Siberia	03.07. –	MTlake	TBL	$0.14 \pm 0.11$	I
(2007)		06.09.2005	FTlake	TBL	$0.41 \pm 0.25$	
			MTpond	TBL	$0.44\pm0.25$	
Lundin et al.	Northern Sweden	2009 (only ice-free sea-	27 lakes	TBL	$0.18\pm0.11$	I
(2013)		(uos				
Kling et al.	Alaska	1975 - 1989	25 lakes	TBL	$0.25\pm0.040$	$5.16\pm0.96$
(1992)						

merged polygonal pond we focus on. While this might explain the deviations, there are also thermokarst ponds highly similar to the ones in Abnizova et al. (2012) in the footprint of the EC tower in this study. If those ponds, Abnizova et al. (2012) measured two polygonal ponds (they took 46 water samples in August and September 2008). These two ponds might have had exceptionally high CO<sub>2</sub> concentrations and might not be representative of polygonal ponds in our study area. If the polygonal ponds in the footprint of our EC measurements emitted CO<sub>2</sub> in the quantities suggested by Abnizova et al. (2012), we would expect to see their signal more clearly in our measurements. Thus, we cannot conclusively resolve the differences.

Our approach of combining a footprint model with a land-cover classification to extract fluxes from different land-cover classes allows us to determine the thermokarst pond CO<sub>2</sub> flux. We report an uncertainty range of the in respect of the thermokarst pond CO<sub>2</sub> flux; however, we cannot identify identifying the full uncertainty of this flux in is not possible using this approach due to the unknown uncertainty of the footprint analysis footprint analysis' unknown degree of uncertainty. Still, the results in respect of the thermokarst pond CO<sub>2</sub> flux results are plausible and in the correct expected order of magnitude for two reasons. First, a reduced diurnal variability has been is observed when the merged polygonal pond influences the flux signal (Fig. 4). This reduction indicates that the respiration rate from the merged polygonal pond is lower than the respiration rate from the semi-terrestrial tundra, where ample oxygen is available in the upper soil layer. Additionally, there is less photosynthesis since the since the thermokarst ponds have a lower vegetation density than the tundra, there is less photosynthesis. Second, when focusing on night-time fluxes, when only respiration occurs , and (i.e. no carbon is taken up), there is a decrease in CO<sub>2</sub> emission emissions with an increasing weighted footprint fraction of open water (Fig. 3), also indicating; this also indicates that there was reduced decomposition in the merged polygonal pond. Overall, the lower emissions from the pond compared to the based on the data, the findings that thermokarst ponds have lower CO<sub>2</sub> emissions than the semi-terrestrial tundra are reasonable.

## 4.2 CH<sub>4</sub> flux

We observe large differences in CH<sub>4</sub> emission from different emissions from the four wind sectors. CH<sub>4</sub> emissions from  $shore_{120^{\circ}}$  are significantly higher than from  $shore_{50^{\circ}}$ , ponder, and tundra (section Sect. 3.3). Notably, we tested the dependence of these higher fluxes on wind speed and air temperature. We expect high wind speeds to enhance turbulent mixing of the water column and diffusive CH<sub>4</sub> outgassing at the water-atmosphere interface. High wind speeds are also associated with pressure pumping, which potentially fosters the ebullition of CH<sub>4</sub>. On the other hand, peak temperatures can lead to peak CH<sub>4</sub> production and emissions due to enhanced biological activity. However, the high emissions from  $shore_{120^{\circ}}$  do not coincide with meteorological conditions of either of two key meteorological conditions, high wind speeds or and high temperatures, which would especially favor high emissions. Thus, the difference in methane flux dynamics between  $shore_{120^{\circ}}$  and  $shore_{50^{\circ}}$  is astounding since the shorelines share many characteristics. Both other characteristics.

Both shorelines extend radially (in a fairly straight line) from the EC tower (Fig. 1), thus contributing similarly to the EC flux. The underwater topography does not vary much significantly between the two shorelines. Both Meters away from the shore, both shorelines have a water depth between of a few centimeters and a few decimeters within meters away from the shore (see data from Boike et al. (2015a)). As previously described in section 2.1, both shorelines are dominated by *Carex aquatilis*, and

from visual inspection, we cannot find could not identify differences in shoot density. We, therefore, assume that the vegetation type does characteristics of the emergent vegetation do not play a major role in explaining the differences between the CH<sub>4</sub> emissions from *shore*<sub>120°</sub> and *shore*<sub>50°</sub>. We also examine the evolution of the shorelines at the merged polygonal pond to check whether erosion along the shoreline could drive cause the high CH<sub>4</sub> emissions. We compare a coarse an image from 1965 (U.S. Geological Survey, EROS Center, 1965) with the current (2019) shoreline, yet we cannot identify signs of recent erosion. Also Furthermore, high-resolution aerial images of the this pond from 2008 (Boike et al. (2015b), resolution > 0.33 m) and 2015 (Boike et al. (2015c), resolution > 0.33 m) show no signs of erosion. Thus, we exclude erosion as a driving factor of high We therefore assume that past erosion is unlikely is unlikely to have been a factor that caused the high levels of CH<sub>4</sub> emissions - we observed in 2019.

We also consider the possibility that local Local ebullition of the merged polygonal pond could lead to high CH<sub>4</sub> emissions from *shore*<sub>120°</sub>. We apply applied the method proposed by Iwata et al. (2018) to check for signs of ebullition events. This method uses the 20 Hz raw concentration of CH<sub>4</sub> concentration data to detect short-term peaks in CH<sub>4</sub> that originate from ebullition events. However, we cannot detect ebullition events in the 20 Hz raw data.

In summary, many causes, such as meteorological conditions (wind speed or and temperature), vegetation typecharacteristics of emergent vegetation, coastal erosion, and intense ebullition events, can be excluded as driving factors. Therefore, the most likely cause of the are unlikely to be the main driving factors of the increased CH<sub>4</sub> emissions we observed. Another possible driver of higher CH<sub>4</sub> emissions from *shore*<sub>120°</sub> might be is a small but steady seep ebullition hot spot close to this shoreline (such as ebullition class *Kotenok* in Walter et al. (2006)). Seep ebullition hot spots have been reported to occur heterogeneously in clusters in Alaskan lakes (Walter Anthony and Anthony, 2013). So, a future Unfortunately, seep ebullition has not previously been reported in water bodies in our study area, so we did not include measurements targeting this process in our measurement campaign. In future studies, visual inspection of trapped CH<sub>4</sub> bubbles in the ice column during wintertime, as proposed in by Vonk et al. (2015), could reveal more information about the cause of the higher CH<sub>4</sub> emission from the emissions from *shore*<sub>120°</sub>, as could funnel or chamber measurements with high spatial coverage.

The results show that the merged polygonal pond emits CH<sub>4</sub> with a similar magnitude as the of CH<sub>4</sub> as the polygonal tundra surface under similar meteorological conditions and when excluding the high emissions from *shore*<sub>120°</sub>. However, substrate availability and temperature dynamics differ substantially. Additionally, in dense soils, methane diffuses through upper soil layers and can oxidize slowly enough through soil layers containing oxygen that the methane can be oxidized before reaching the surface. In contrast, methane emitted in ponds can reach the surface quickly through ebullition or higher plant-mediated transport in addition to diffusion. Therefore, we expect bigger differences between to see larger differences between the CH<sub>4</sub> emissions from the merged polygonal pond and the polygonal tundra, more like the differences akin to the differences that have been detected in a subarctic lake and fen (Jammet et al., 2017). Yetby Jammet et al. (2017). However, we see no significant difference in the CH<sub>4</sub> emission emissions from the open-water areas of the merged polygonal pond and the polygonal tundra surface (Fig. 6 & A4).

Since many other ponds thermokarst ponds in our study area are smaller than the merged polygonal pond (making them unsuitable for studying with to study using the EC method), and since smaller ponds tend to be stronger emitters greater

emitters of methane (Holgerson and Raymond, 2016; Wik et al., 2016), our measurements might provide a lower limit of overall pond-CHthermokarst pond CH<sub>4</sub> emissions.

We estimate a CH<sub>4</sub>-C flux of 13.38  $^{15.92}_{10.55}$  mg m<sup>-2</sup> d<sup>-1</sup> ( $\frac{Median}{25\%Percentile}$  Median  $\frac{75\%Percentile}{25\%Percentile}$ ) from the merged polygonal pond and  $12.96_{\ 10.34}^{\ 15.11}$  –  $19.18_{\ 14.26}^{\ 24.47}$  mg m $^{-2}$  d $^{-1}$  from the shores of this pond. This is higher than the fluxes measured by Jammet et al. (2017) from a sub-arctic lake (Tab. 1). The authors report a mean annual  $CH_4$ -C flux of  $13.42 \pm 1.64$  mg m $^{-2}$  d $^{-1}$ and a mean ice-free season CH<sub>4</sub>-C flux of  $7.58 \pm 0.69$  mg m<sup>-2</sup> d<sup>-1</sup>. A study focusing on 32 non-Yedoma thermokarst lakes in Alaska found CH<sub>4</sub>-C emissions similar to our results (16.80  $\pm$  8.61 mg m<sup>-2</sup> d<sup>-1</sup>, Sepulveda-Jauregui et al. (2015)). Also, a synthesis of 149 thermokarst water bodies north of  $\sim 50^{\circ}$  reports CH<sub>4</sub>-C emissions in the same order of magnitude (27.57 ± 14.77 mg m<sup>-2</sup> d<sup>-1</sup>, Wik et al. (2016)). However, there is also a recent study reporting other recent studies have reported considerably lower CH<sub>4</sub>-C emissions of  $2.95 \pm 0.75$  mg m<sup>-2</sup> d<sup>-1</sup> in Northern Sweden (Sieczko et al., 2020) and, in contrast, a study finding CH<sub>4</sub>-C emissions of up to 6432 6,432 mg m<sup>-2</sup> d<sup>-1</sup> in North-East Northeast Canada (Bouchard et al., 2015). The wide range of water-body methane emissions cautions us to be careful-militates in favor of caution when generalizing our results, even for Samovlov Island, especially since the emissions within the pond are already merged polygonal pond have been shown to be heterogeneous. Instead, after finding a hotspot in CH<sub>4</sub> emission at the pond shore, we would like to highlight the need for spatially representative observation and mapping of that the gathering of additional measurements – for example employing funnel traps or counting bubbles in ice – will help to better constrain thermokarst pond CH<sub>4</sub> fluxes to understand the variability of pond-CH dynamics in their full complexity. Nevertheless, our measurements provide a robust lower limit of thermokarst pond CH<sub>4</sub> emissionsbetter.

## 4.3 Upscaling the CO<sub>2</sub> flux

We upscale the CO<sub>2</sub> emissions for the river terrace of Samoylov, the area where on Samoylov, an area for which we have access to the a high-resolution land-cover classification. We find that not accounting for pond CO<sub>2</sub> emission leads to an overestimating the polygonal tundra landscape's sink function we overestimate the carbon-dioxide uptake of the polygonal tundra by 11 % when we do not account for the thermokarst ponds' CO<sub>2</sub> emissions. A similar approach by Abnizova et al. (2012) found a potential increase of 35–62 35–62 % in the estimate of CO<sub>2</sub> emission from the Lena River Delta when including small ponds and lakes into in the landscape CO<sub>2</sub> emission calculation. If we follow the upscaling approach by Abnizova et al. (2012) and consider overgrown water as part of the ponds, we even find a thermokarst ponds, the estimate of the landscape CO<sub>2</sub> emission reduction of uptake would decrease by 19 %. Kuhn et al. (2018) also found water bodies in arctic regions to be an important source of carbon, which could outbalance the tundra's sink function carbon dioxide uptake of the semi-terrestrial tundra in a future climate. In summary, our results demonstrate that open-water CO<sub>2</sub> emissions can substantially influence the summer carbon balance of the polygonal tundraduring the growing season. When looking at the night-time. With respect to the night time emissions, we find that per gram CO<sub>2</sub>-C thermokarst ponds emit 0.06 g CH<sub>4</sub>-C are emitted from ponds and only whereas the semi-terrestrial tundra only emits 0.02 g CH<sub>4</sub>-Cfrom the semi-terrestrial tundra. This finding underlines again , that that, especially when considering thermokarst ponds, CH<sub>4</sub> emissions are of high-significant interest. Even though mean CH<sub>4</sub> emissions from the semi-terrestrial tundra and open water are of similar magnitude, we expect that the impact

of thermokarst ponds on the carbon balance would be even bigger greater when accounting for CH<sub>4</sub> due to the locally high emissions.

Our results indicate suggest that future studies aiming that aim to capture a representative landscape flux should pay extra attention to the water bodies in their footprint. The CO<sub>2</sub> flux from thermokarst ponds has the opposite sign to the tundra (CO<sub>2</sub> emission) as the semi-terrestrial tundra (CO<sub>2</sub> uptake) during the observation period. Consequently, thermokarst ponds should cover about as much area in the footprint measurement as they do in the landscape area of interest. In this way, the chances of capturing CH<sub>4</sub> hotspotsare also higher, which can then be investigated more closely, are also greater.

## 5 Conclusions

We find that thermokarst ponds are a carbon source. At the same time, the surrounding tundra is semi-terrestrial tundra in our study area acts as a carbon sink during the period July – September summer period (July–September), which is in agreement with prior studies (Abnizova et al., 2012; Jammet et al., 2017), even if despite that we observe much lower open-water CO<sub>2</sub> fluxes compared to previous work at the same study site (Abnizova et al., 2012). Using our approach to disentangle the EC fluxes from different land-cover land-cover classes, we gauge posit that during the measurement period, not accounting for ponds leads to overestimating the landscape CO<sub>2</sub> sink we would overestimate the carbon-dioxide uptake of the polygonal tundra by 11 %% if we had not accounted for thermokarst ponds. We expect lakes to have a similar effect on the carbon budget, though a smaller one, since lakes (a) cover a similar area as amount of surface area as the thermokarst ponds in our study site (Abnizova et al., 2012; Muster et al., 2012) and (b) are weaker emitters of greenhouse gases than ponds (Holgerson and Raymond, 2016; Wik et al., 2016).

In contrast to the spatially more homogeneous CO<sub>2</sub> emissions, which are spatially more homogeneous, small-scale heterogeneity in CH<sub>4</sub> emissions makes it difficult to find drivers of CH<sub>4</sub> emissions. We cannot pinpoint the drivers behind the high emissions at along parts of the coastline, which we surmise were potentially caused by seep ebullition. Thus, we cannot estimate the impact of this heterogeneity on the landscape scale and, therefore, refrain from upscaling CH<sub>4</sub> emissions. Additionally, the open-water fluxes presented in this paper originate from a single merged polygonal pond since the other polygonal ponds surrounding the EC tower are too small to extract their fluxes with using the footprint method applied here. SoThus, we do not account for the spatial variability of CH<sub>4</sub> emissions between thermokarst ponds, which can be substantial (Rehder et al., 2021; Wik et al., 2016). However, we note that open-water fluxes were of a similar magnitude as the polygonal tundra fluxes. Consequently, the main impact of ponds that thermokarst ponds have on the landscape CH<sub>4</sub> budget might be occur through plant-mediated transport and local ebullition.

While being ill-suited for the study of smaller ponds, we want to underline that the EC method is appropriate for observing greenhouse-gas fluxes from ponds with an area thermokarst ponds as small as  $0.024 \text{ km}^2$ . The EC method has a higher temporal resolution than the TBL method. It does not disturb the exchange processes like the chamber-flux method, eliminating chamber flux method, which eliminates the wind at the water surface. Especially when combining the an EC footprint with a land cover

elassification, we can distinguish land-cover classification, one can distinguish between the contribution of different land cover classes well and land-cover classes effectively and also study the fluxes from thermokarst ponds.

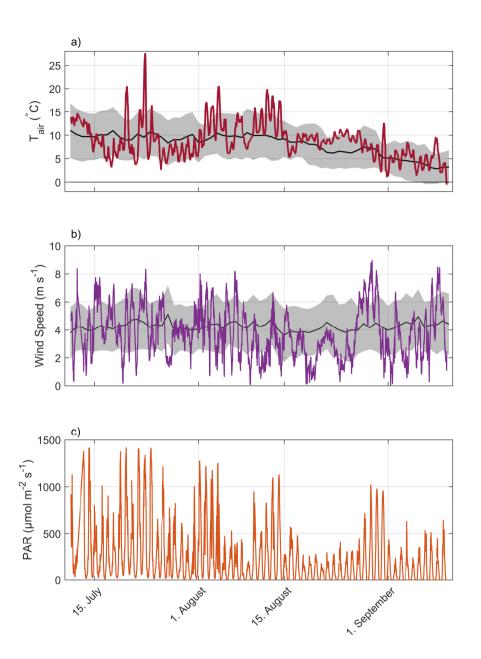
We conclude that thermokarst ponds contribute significantly to the landscape carbon budget. Changes in the Arctic arctic hydrology and the concomitant changes in the water-body distribution may impact the overall carbon budget of the Arctic and flip a landscape from being an overall carbon sink to becoming an overall carbon sourcein permafrost landscapes may cause these landscapes to change from being overall carbon sinks to overall carbon sources.

Code and data availability. The data has been published at Pangaea (https://doi.org/10.1594/PANGAEA.937594). Code can be requested from the authors.

Appendix A: Additional figures



**Figure A1.** Picture of the eddy covariance tower with the merged polygonal pond in the background. Picture taken on 11 July 2019 by Zoé Rehder.



**Figure A2.** Timeline of observed meteorological conditions during the observation period with air temperature in 2 meters height (a), wind speed in 3 meters height (b) and photosynthetically active radiation (PAR) (c). Mean values and standard deviation of observations during the past 16 years are plotted as black lines and gray areas.

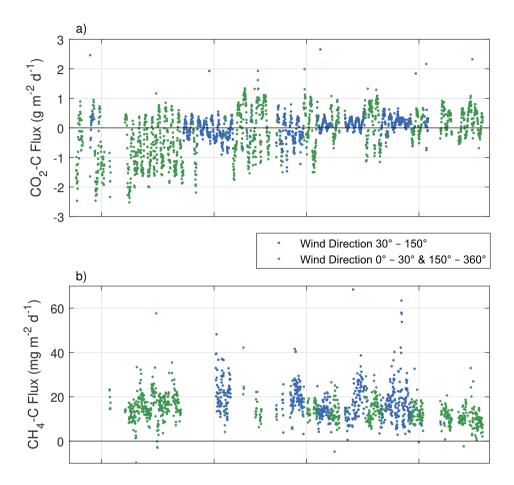
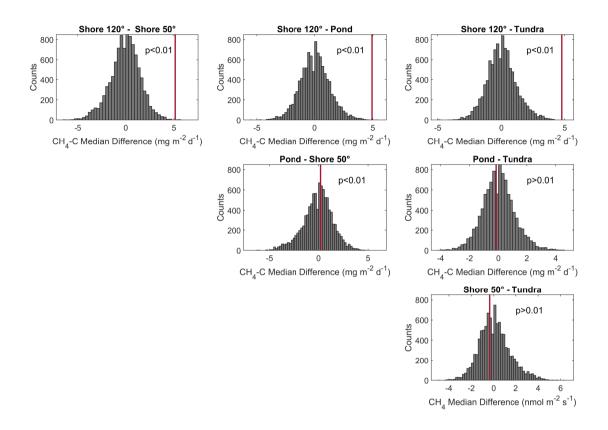
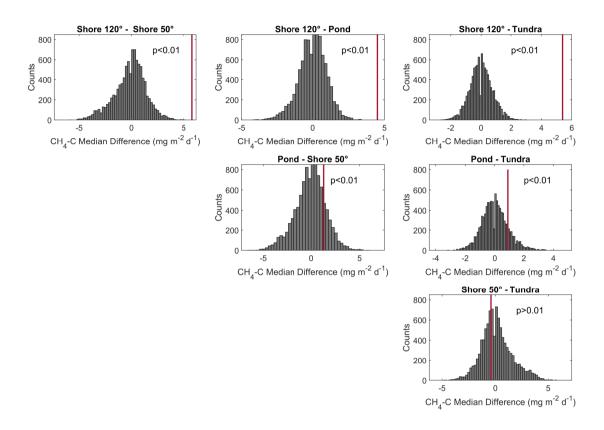


Figure A3. Time series of 30-minute observed  $CO_2$ -C flux intervals (a) and  $CH_4$ -C flux with a quality flag of 0 or 1. The blue color represents fluxes originating from the wind direction of the lake merged polygonal pond  $(30^{\circ} - 150^{\circ})$  wind direction, mostly mixed signals from semi-terrestrial tundra and the lake surface of the merged polygonal pond) and the green color represents fluxes originating from all other wind directions.



**Figure A4.** Histogram of permutation tests between the medians of CH<sub>4</sub> emissions from different wind direction classes in figure 6. All medians from flux observations during moderate wind speed conditions. The observed differences in medians between the different wind direction classes are shown in red vertical bars in each plot.



**Figure A5.** Histogram of permutation tests between the medians of CH<sub>4</sub> emissions from different wind direction classes in figure 6. All medians from flux observations during moderate air temperature conditions. The observed differences in medians between the different wind direction classes are shown in red vertical bars in each plot.

Author contributions. ZR and LK designed the experiments, ZR and LB carried out the fieldwork. ZR, LB, and LK developed the idea for the analysis, and CW and LB prepared the data. The formal analysis and data visualization were performed by LB and ZR with supervision by DH and LK. Resources (land-cover classification) have been provided by CM. LB and ZR prepared the manuscript with contributions from all co-authors.

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

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