



Model-based analysis of solute transport and potential carbon mineralization in a permafrost catchment under seasonal variability and climate change

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Abstract. Permafrost carbon, stored in frozen organic matter across vast Arctic and sub-Arctic regions, represents a substantial and increasingly vulnerable carbon reservoir. As global temperatures rise, the accelerated thawing of permafrost releases greenhouse gases, exacerbating climate change. However, freshly thawed permafrost carbon may also experience lateral transport by groundwater flow to surface water recipients such as rivers and lakes, increasing the terrestrial-to-aquatic transfer of per-

- 5 mafrost carbon. The mobilization and subsurface transport mechanisms are poorly understood and not accounted for in global climate models, leading to high uncertainties in the predictions of the permafrost carbon feedback. Here, we analyze of solute transport in the form of a non-reactive tracer representing dissolved organic carbon (DOC) using a physics-based numerical model with the objective to study governing cryotic and hydrodynamic transport mechanisms relevant for warming permafrost regions. We first analyze transport times for DOC pools at different locations within the active layer under present-day cli-
- 10 matic conditions and proceed to study susceptibility for deeper ancient carbon release in the upper permafrost due to thaw under different warming scenarios. Results suggest that DOC in the active layer near the permafrost table experiences rapid lateral transport upon thaw due to saturated conditions and lateral flow, while DOC close to the ground surface experiences slower transport due flow in unsaturated soil. Deeper permafrost carbon release exhibits vastly different transport behaviors depending on warming and thaw rate. Gradual warming leads to small fractions of DOC being mobilized every year, while
- 15 the majority moves vertically through percolation and cryosuction. Abrupt thaw resulting from a single very warm year leads to faster lateral transport times, similar to active layer DOC released in saturated conditions. Lastly, we analyze the potential susceptibility of DOC to mineralization to CO_2 prior to export due to soil moisture and temperature conditions. We find that high liquid saturation during transport coincides with very low mineralization rates and potentially inhibits mineralization into greenhouse gases before export. Overall, the results highlight the importance of subsurface hydrologic and thermal conditions
- 20 on the retention and lateral export of permafrost carbon by subsurface flow.





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1 Introduction

Permafrost stores vast amounts of soil organic carbon (SOC) currently immobilized in frozen ground (Zimov et al., 2006). This carbon stock has been built up over millennia and is not currently part of the active carbon cycle, but is subject to remobilization under climate change (Tarnocai et al., 2009). Due to climate warming and permafrost loss, the carbon gets

- 30 mobilized when thawed out (Miner et al., 2022), which may lead to the possible release of large amounts of terrestrial carbon into the atmosphere in the form of greenhouse gases (GHGs). However, the fate of the mobilized carbon is fraught with uncertainty around the question of how much of this carbon will ultimately be released to the atmosphere and how much of it experiences lateral waterborne transport. Given that permafrost soils currently contain twice the amount of carbon compared to the present atmospheric CO₂, the potential release of this vast carbon stock into the atmosphere would exert a profound impact
- 35 on global climate dynamics (e.g., Schuur et al., 2015). Apart from vertical release as GHGs through microbial mineralization, newly thawed carbon can also be dissolved in groundwater and then be transported as dissolved organic carbon (DOC, Connolly et al., 2020) and lead to a lateral export of permafrost carbon. This lateral transport increases the terrestrial-to-aquatic transfer of SOC, which affects rivers and oceans. Depending on its biogdegradability, a large part of riverine DOC will be mineralized in the river or delivered to oceans, a small part can be buried within the river sediments (Cole et al., 2007; O'Donnell et al.,
- 40 2012; Abbott et al., 2014). The fate of permafrost carbon is an essential piece of the global carbon cycle and requires a better understanding of DOC transport mechanics in groundwater (Plaza et al., 2019).

Groundwater flow in permafrost regions is for the most part restricted to sub- and supra-permafrost groundwater flow (Walvoord and Kurylyk, 2016). With permafrost acting as a largely impermeable layer between the two, they are mostly disconnected flow systems in continuous permafrost regions (e.g., Kane et al., 2013). Most of permafrost carbon in the cir-

- 45 cumpolar permafrost region (46% of SOC in the upper three meters) is stored in the uppermost meter of permafrost soils with deeper layers (1–2 m and 2–3 m depth) containing increasingly less carbon (34% and 20% of total SOC in the upper three meters, respectively Hugelius et al., 2014). Within the active layer, a higher density of carbon abundance can be observed close to the surface in the top organic layer (TOL) as well as cryoturbated material close to the active layer-permafrost boundary (Siewert et al., 2015).
- 50 Lateral transport of compounds in permafrost regions is not only important for the fate of organic carbon, but also for the transport of anthropogenic contaminants (Miner et al., 2021), mercury bound to organic material (Schuster et al., 2018), and other chemical species (Wu et al., 2022). Observing transport and groundwater flow in general is inherently difficult; field experiments in which tracers are used in permafrost landscapes (e.g., Wales et al., 2020) give an idea of the velocity of





flow as well as the dispersion of solutes but lack the possibility to obtain observations continuous in time. Numerical models allow both simulating current groundwater flow as well as associated heat and solute transport (e.g., McKenzie et al., 2007; Frampton et al., 2011; Harp et al., 2016; Lamontagne-Hallé et al., 2018; Dagenais et al., 2020; Sjöberg et al., 2021), and also enable future predictions and changes in the cryotic-hydrological system (e.g., Bense et al., 2009; Ge et al., 2011; Bense et al., 2012; Frampton et al., 2013; Frampton and Destouni, 2015; Kurylyk et al., 2016; Shojae Ghias et al., 2019; Painter et al., 2023). Therefore, modeling constitutes an important tool for investigating the ultimate fate of permafrost carbon.

- Numerical modeling of solute transport in freeze-thaw conditions is computationally challenging and requires well-optimized computer code that can solve the complex interplay between thawing, freezing, groundwater flow, and solute transport (Coon et al., 2016; Grenier et al., 2018; Jan et al., 2020; Lamontagne-Hallé et al., 2020; Gao and Coon, 2022; Huang and Rudolph, 2023). Recent modeling results have highlighted the importance of including freeze-thaw processes when modeling solute transport in permafrost regions (Mohammed et al., 2021). Jafarov et al. (2022) used the Advanced Terrestrial Simulator (ATS,
- 65 Coon et al., 2019) to show the difference between including and excluding freeze-thaw dynamics in simulations representing low centered polygons in a polygonal tundra landscape. They use a non-reactive tracer to represent dissolved constituents in the groundwater and find that in the simulations including freeze-thaw, most of the modeled tracer gets mobilized within the freeze-up period and vertical tracer movement is greatly enhanced as compared to the simulations that do not account for freeze-thaw dynamics, where lateral transport is significantly lower. They suggest that capillary forces (cryosuction) might play a substantial role in moving solutes around during freeze-up.

In this study, we quantify conservative solute transport in the active layer along an Arctic hillslope system. We analyze nonreactive advective transport by simulating waterborne transport of a tracer as a proxy for DOC (Fig. 1a), without accounting for carbon-specific reactions. We define multiple tracers that represent carbon pools in different depths in the active layer as well as within the permafrost (Fig. 1b). Carbon pools in the contemporary active layer are represented by TOL carbon close

- 75 to the surface (seasonal plant litter) and buried carbon (cryoturbated carbon) at the bottom of the active layer. We analyze the importance of these sources by comparing the difference in transport velocities, which translates to residence time in the unfrozen soil and availability for microbial mineralization that can then lead to the release of GHGs. Furthermore, we explore the effect of a warming climate on mobilization of ancient, currently frozen carbon in the upper permafrost layers. Two additional tracers in the model represent carbon sources that are presently immobilized in permafrost but susceptible to
- 80 release by active layer expansion due to warming. We hypothesize that (i) in the active layer, buried carbon will be transported faster than TOL carbon due to higher saturated soil conditions at the bottom of the active layer; and (ii) ancient permafrost carbon will be exposed to similar highly saturated late season conditions leading to rapid transport upon thaw. This insight in transport mechanisms active in permafrost landscapes contribute to the understanding of the impacts of hydrological flows on the permafrost carbon feedback in a changing climate.







Figure 1. Conceptual representation of permafrost carbon transport in the form of dissolved organic carbon in a High Arctic hillslope setting underlain by continuous permafrost. (a) Different carbon pools in the active layer (Top organic layer, TOL) carbon, blue sphere, and buried carbon, green sphere) represent present-day active layer carbon release with hypothesized differences in transport velocities indicated by the length of the arrow (short: slow, long: fast). (b) Ancient carbon (red and yellow spheres) represent carbon sources within the permafrost, currently immobilized, and their mobilization upon permafrost thaw through increasing air temperatures in the course of climate change and associated active layer deepening.

Methods 85 2

Study site 2.1

We configure our model to represent a field site in the Endalen valley on Svalbard (78°11' N, 15°44' E), about 5 km east of the main settlement of Longyearbyen. Thereby, we represent a realistic setup in terms of topography and weather conditions in a continuous permafrost landscape where observations are overall sparse, especially observations of groundwater flow. Our setup represents a sub-catchment on the north-west facing slope of the Endalen valley extending from the catchment border

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located at the border between the slope and the adjacent plateau, and a groundwater spring located close to the main river of the valley (Fig. 2).

The catchment has been surveyed by drone in summer 2022 to produce a high resolution digital elevation model (5 \times 5 cm; Schytt Mannerfelt, 2023, Supplementary text I). We delineate the photogrammetry-derived DEM using the catchment

95 delineation procedure in QGIS (version 3.22.4). The landscape in the sub-catchment defined by a groundwater spring as discharge point is characterized by gentle slopes towards the valley bottom ($\sim 12^{\circ}$) with gravely soils covered by a shallow organic layer, and a steep slope ascending towards the plateau ($\sim 37^{\circ}$) characterized by a mostly gravely and rocky subsurface. Soil profiles in the surrounding areas have shown that a large part of the SOC is stored within near-surface layers in the TOL but that solifluction and cryoturbation have lead to an increase in SOC also in deeper layers of sites in which cryoturbation





processes are active (Weiss et al., 2017). However, this is only true for soil profiles close to the lower, gentle part of the slopes 100 where at least a thin organic layer exists (Supplementary text II). The total catchment area is approximately 0.25 km^2 , and the elevation difference between the groundwater spring and the uppermost edge of the catchment boundary is 376 m.

2.2 Model

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To investigate coupled freeze-thaw dynamics with non-reactive transport, we use a physics-based cryohydrogeological numer-105 ical model, the Advanced Terrestrial Simulator (ATS v1.4.1, Coon et al., 2019). In its permafrost configuration, ATS couples the intricate interplay of freeze-thaw dynamics and both surface and subsurface energy, and hydrology (Painter et al., 2016) and has been successfully evaluated against multiple types of field observations (Jan et al., 2020; Painter et al., 2023). Additionally, solute transport is represented through the advection-dispersion equation,

$$\frac{\partial(\phi s_l C)}{\partial t} = -\nabla \cdot (qC) + \nabla \cdot (\phi s_l D_l \nabla C) + Q_s,\tag{1}$$

110 where ϕ is soil porosity (-), s_l is liquid saturation (-), C is solute concentration in the aqueous phase (mol solute mol water⁻¹), t is time, q is the Darcy flux vector (mol m⁻² s-1), D is the hydrodynamic dispersion coefficient, and Q_s is a solute source/sink term (mol m⁻³ s⁻¹) (Molins et al., 2022). In the simulations performed in this study, dispersion is intentionally omitted by setting $D_l = 0$. Thereby, the focus is on solutes advected by water flow which allows for identification and analysis of the transient and seasonally variable flow field exhibited in the active layer, as well as effects of freeze-thaw and cryosuction, wetting-drying in partially saturated soil, and of unfrozen water seepage in permafrost. For a full description of the governing equations used in 115

the permafrost configuration of ATS, please refer to Painter et al. (2016) and Atchley et al. (2015).

2.3 Mesh and boundary conditions

To capture the main topographical characteristics of the Endalen sub-catchment, we create a mesh representing the path of highest flow accumulation (Fig. 2, red line with arrow heads). The transect extends 1040 m in the x-direction from the catchment boundary (376 m relative elevation) to a groundwater spring close to the valley bottom (0 m relative elevation). We used a 120 pseudo-3D approach for the mesh, where the width of the mesh elements varies along the y-axis see Fig. 3). This method allows us to account for thermal and hydrological balances across the entire catchment area without the need for a complex and computationally intensive full 3D mesh. Our mesh setup is divided into three sections:

- 1. The upper slope (0-1000 meters in the x-direction), which primarily serves as a water source for the main area of interest (Fig. 3 green shaded area).
- 2. The main area of interest near the valley bottom (1000-1020 meters in the x-direction), where the transport experiments are conducted (Fig. 3 red shaded area).
- 3. A buffer area (1020-1040 meters in the x-direction) to prevent boundary effects (Fig. 3 grey shaded area).







Figure 2. Overview over the study area. (a) Location of the study area within the Svalbard archipelago with the red box indicating the location of the Adventdalen valley close to the settlement of Longyearbyen. (b) Overview over the Adventdalen area with the red box higlighting the location of Endalen and the sub-catchment in question (map data based on Toposvalbard (Norwegian Polar Institue)). (c) 3D representation of the sub-catchment in Endalen, forming the basis for the model setup. The blue line outlines the catchment delineated based on the high resolution digital elevation model with QGIS. The red line with arrows indicates the path of highest flow accumulation within the catchment.







Figure 3. Representation of the mesh used for model simulations based on the catchment illustrated in Fig. 2. Dimensions of mesh elements vary in x-, y- as well as in the z-direction. The green shaded area indicates the upper slope in which runoff is generated, the red area highlights the main area of interest later used in the presentation of the results, and the gray shaded area indicates the buffer zone. While the width (y-direction) increases uniformly with distance in the x-direction, column length in the x-direction is large in the upper part of the catchment (~23 m) and smaller in the last 40 m of the catchment (0.5 m between 1000 and 1020 m and 1 m between 1020 m and 1040 m). In the zdirection, cell resolution is higher (2 cm cell^{-1}) in the active layer (upper 1.2 m) and lower in the permafrost (up to 2 m cell^{-1}). The total depth of the domain is 40 m and the elevation is defined relative to the the surface at the valley bottom, which is set to 0 m elevation.

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By directing precipitation from the upper slope to the lower areas, we ensure realistic hydrological conditions with flow accumulation towards the valley bottom. This division of the mesh allows for accurate modeling of the thermal-hydrological processes in the catchment. The upper slope, due to its low SOC abundance (Weiss et al., 2017), is not considered for solute transport in this study. Each column in this mesh area is ~ 23 m along the x-direction and varies in width in the y-direction. Closer to the valley bottom where more SOC can be found (Weiss et al., 2017) and in which the modeled tracer breakthrough

is observed, the horizontal resolution is increased to 0.5 m between 1000 and 1020 m in horizontal direction. The last 20 m of

135 the transect (1020–1040 m in in horizontal direction) act as a buffer zone in which water will accumulate and seep out if the water table reaches the surface. This area is not central to the analysis of the results in this study and therefore has a slightly lower horizontal resolution of 1 m. In the y-direction, the mesh extends between 20 m at the lower end of the catchment, and 500 m width at the upper catchment boundary. In the z-direction, the mesh follows the topography profile following the path of highest flow accumulation extracted from the high-resolution DEM. The vertical depth of the mesh is 40 m, discretized into cells with variable vertical resolution such that close to the surface, the resolution is higher (2 cm) to accurately resolve active

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layer processes, while the resolution decreases within the permafrost (up to 2 m).

This approach simplifies catchment water balances and enables accumulation and flow from the upper part of the slope to the valley bottom where transport is simulated and observed. More critically, by preserving the subsurface volume representation of the catchment, energy exchanges between the atmosphere, surface, and subsurface involving soil moisture content are more





- 145 accurately accounted for. This way the model attains a natural equilibrium without artificially imposed boundary conditions, which would be needed in a 2D hillslope model with constant width, and would introduce additional uncertainties. Physical boundary conditions in this model are prescribed on all external surfaces of the model: The vertical sides of the model are assigned zero-flux boundaries for water and energy. The only place at which water and energy can leave the system laterally is at the surface of the downslope boundary. As soon as ponding occurs above the surface, surface runoff occurs.
- At the bottom horizontal boundary we specify a no-flow boundary condition with a constant prescribed temperature of -6.6 °C (in line with borehole observations in Svalbard, Christiansen et al., 2020). At the top horizontal boundary (at the surface), a surface energy balance is used as a source and sink for water and energy for the subsurface (Atchley et al., 2015). The data for the surface energy balance (hereinafter referred to as the forcing dataset) is comprised of site-specific weather data including air temperature, vapor pressure (based on relative humidity and temperature), incoming shortwave radiation, wind
- speed, and precipitation. In this study, the data is retrieved from a nearby weather station in Adventdalen (~ 3 km northeast of the study site; The University Centre in Svalbard, 2023) complemented with precipitation data from the weather station at Longyearbyen airport (~ 10 km northwest of the study site; Norwegian Climate Service Centre, 2023). The forcing datasets contain daily values for all variables. Except for precipitation, a day-of-year average for the years between 2013 and 2020 is used to describe an average yearly cycle typical of present-day weather conditions. Precipitation is first split into rain and snow
- 160 based on air temperature (rain: T > 0, snow: $T \le 0$) and is then distributed throughout the year using a probability density function to mimic the statistical characteristics of the observed rainfall (Magnússon et al., 2022). The sum of precipitation is equal to the average sum of precipitation between 2013 and 2020 (rain: 84 mm, snow: 115 mm). We distribute precipitation by using a probability density function instead of evenly distributing the sum of total precipitation over the respective rainand snowfall periods to avoid small daily precipitation rates as these would promote evaporation and reduce infiltration, which
- 165 lowers soil moisture. The resulting rainfall distribution resembles the variability of natural rainfall throughout the year. Soil physical properties are defined to resemble highly conductive material (Table 1).

 Table 1. Physical soil properties used in all model runs for the entire model domain.

Parameter	Unit	Value	
Porosity	-	0.5	
Permeability	m ²	2×10^{-11}	
van Genuchten alpha α	Pa ⁻¹	3×10^{-4}	
van Genuchten alpha n	-	2	
Thermal conductivity (saturated, unfrozen)	W m ⁻¹ K ⁻¹	1	
Thermal conductivity (dry)	W m ⁻¹ K ⁻¹	0.29	

2.4 Model spinup and initial conditions

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To initialize the model, a 3-step spinup procedure is required (e.g., Jafarov et al., 2018; Jan et al., 2020; Hamm and Frampton, 2021). First, a single column model extending to the full depth of the final 2D mesh is used to establish a water table at target depth and subsequently freeze the column from below (with a constant temperature of -6.6 °C at the bottom of the column) so





that the permafrost table is close to the surface. Second, the column model is run with a the full forcing dataset until a cyclic steady-state is reached and year-to-year differences in e.g., daily ground temperature or evaporative flux are negligible. In the third step, the resulting column data is mapped to each of the columns in the transect, and the entire model is run again for ten years with the same forcing dataset accounting for all lateral processes such as lateral water flow and energy transport.

- 175 The resulting subsurface state presents the initial conditions for the transient simulations. In total, there are five different transient simulation scenarios. The first one represents present-day weather and active layer development conditions. Two simulations represent gradual climate warming scenarios and two further simulations that mimic an abrupt increase in active layer depth (see Sect. 2.5 for in-depth descriptions of the scenarios). We consider a total of four tracer injection points in the subsurface domain of the model: two tracers within the extent of the active layer and two within the upper permafrost. In
- 180 the active layer, we define a tracer injection point representing TOL carbon consisting of recently deposited SOC close to the surface, and cryoturbated or buried carbon that has been vertically moved towards the bottom of the active layer and upper permafrost layers. Buried carbon can especially be found in solifluction-affected hillslope system, such as Endalen (see Fig. S1 and Weiss et al. (2017)). The TOL carbon is injected close to the surface (0–2 cm below the surface) and the buried carbon is injected close to the bottom of the active layer (90–92 cm below the surface) in the first mesh column of the main area of
- 185 interest of the mesh (x = 1000–1000.5 m). Both tracers are injected during fully frozen conditions, prior to the onset of thaw, from May 16 to 17 (24 hours) at a constant injection rate of 0.0012 mol s⁻¹, so that the total injected mass is 100 mol for each tracer at each injection depth location. The maximum simulated thaw depth (max. depth where the ground temperature > 0 °C) in the present-day model runs extends to 1 m.

Additionally, we define two injection points for tracers within the permafrost (representing ancient carbon): one close to the present-day active layer thickness (ALT; at 1.15 m depth) and one slightly deeper, just below the current permafrost table (at 1.55 m depth). These tracers are injected in the same mesh column, so that they have the same x-distance to the groundwater spring, and at the same time and rate as the active layer carbon tracers, yielding a total of 100 moles each.

2.5 Model forcing

The model forcing datasets for the different model scenarios represent different climatic conditions, depicting current conditions as well as gradually warming air temperatures, and two scenarios representing an abrupt deepening of the active layer.

Present-day weather conditions

To simulate active layer carbon transport, we use present-day weather conditions to run the model (the same forcing data as used during the spinup). This simulation is run for two years. We analyze transport times by observing the tracer breakthrough curve (BTC) at multiple distances relative to the injection point (at 10 and 20 m distance). The thawing-out and mobilization of permafrost carbon is simulated in a different set of experiments described below.

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Gradual warming scenarios

We simulate gradual permafrost carbon mobilization by gradually increasing near surface air temperature over a period of 50 years based on local predictions of air temperature trends in Svalbard (Hanssen-Bauer et al., 2018). The reference temperature is based on the current day-of-year average air temperature (T_{avg}) , which is the only variable that changes over time in the respective scenarios. We increase air temperature by applying warming rates specific for Svalbard of 0.125 °C year⁻¹ to repre-205 sent an RCP8.5 scenario and a warming rate of 0.075 °C year-1 for an RCP4.5 scenario (Hanssen-Bauer et al., 2018). These warming rates are based on the predictions for air temperature increases by the end of the 21st century and are applied to each day of the year equally (season-specific warming trends are not considered here).

Abrupt active layer deepening

- 210 In two additional scenarios, we simulate abrupt active layer deepening by creating two scenarios with a single exceptionally warm year ($T_{avg} + 3 \degree C$ and $T_{avg} + 5 \degree C$, respectively). The warming is applied to each day equally. The purpose of this scenario is to create abrupt thaw of permafrost within a single summer, which represents and hyperbolizes the high interannual variation in ALT observed in Svalbard (Strand et al., 2020). The abrupt deepening simulations are run for five years; two years of average present-day conditions to assure equilibrium conditions, one year of increased air temperature, and two more years of 215 present-day conditions. The tracer in these simulations is injected in the first winter before the onset of the first thaw.

2.6 Potential mineralization rates

To further evaluate the importance of solute transport in the permafrost carbon cycle, we compute the potential for carbon mineralization to CO_2 in the active layer throughout the thawing season based on the local prevailing environmental conditions in the soil in the present day scenarios. We calculate potential DOC mineralization depending on soil temperature following a Q₁₀ formulation, and soil moisture following a threshold behavior function with an optimum liquid saturation of 0.7 (Wen 220 et al., 2020; Rawlins et al., 2021). While this formulation usually only accounts for a binary distinction between air and liquid saturation, we extended it by accounting for the presence of pore ice. For that, we multiply the function for liquid saturation by a function for air saturation, representing a threshold behavior with a maximum at 0.3 air saturation. Together, they represent soil moisture. Furthermore, since we do not work with absolute molar mass in this study, our potential for DOC mineralization 225 solely depends on soil temperature and moisture (no kinetic rate constants or sorption parameters are considered). Hence, the three-phase adjusted equation adapted from Rawlins et al. (2021) to derive mineralization rates in our model scenarios is

$$r_m = k_{decomp} f(T) f(S_l) f(S_a), \tag{2}$$

where r_m is the local potential mineralization rate (day⁻¹), k_{decomp} is the DOC mineralization rate coefficient as per Rawlins et al. (2021) (set to 0.83 \times 10⁻² day⁻¹) and f(T) and $f(S_l)$ are the temperature and moisture dependencies, respectively.





Equation Functions for temperature dependence f(T) and moisture dependence $f(S_l)$ are described using the Q₁₀ coefficient (Wen et al., 2020)

$$f(T) = Q_{10}^{|T-10|/10},\tag{3}$$

with T being local soil temperature and Q₁₀ representing the mineralization rate increase per 10°C increase in temperature (in this case set to 1.7 according to Yurova et al. (2008); Dusek et al. (2019) and the threshold behavior functions (Wen et al., 2020) for for soil liquid saturation S_l and air saturation S_a described as

$$f(S_l) = \begin{cases} (\frac{S_l}{0.7})^{1.5}, & S_l \le 0.7\\ (\frac{1-S_l}{1-0.7})^{1.5}, & S_l > 0.7 \end{cases}$$
(4)

$$f(S_a) = \begin{cases} (\frac{S_a}{0.3})^{1.5}, & S_a \le 0.3\\ (\frac{1-S_a}{1-0.3})^{1.5}, & S_a > 0.3 \end{cases}$$
(5)

A plot showing the scaling effect of soil temperature and moisture for a range of $-20-30^{\circ}$ C for temperature and 0–1 for both liquid and air saturation is given in Fig. S2. The resulting mineralization rates are representative of a mineralization rate per 240 day and is highly dependent on soil moisture. In this formulation, mineralization results in 0 at fully saturated ($S_l = 1$ and $S_a = 0$) soil conditions due to oxygen deprivation. We chose this threshold behavior for soil moisture, because a linear behavior would result in most favorable conditions for mineralization under fully saturated conditions, which is not to be expected at the site. Soil moisture and temperature conditions are extracted as a post-processing step within the present-day scenarios and do not affect the solute mass computed during the model run. Due to the large (monthly) output time-step size in the warming scenarios, we did not calculate mineralization for these scenarios. Further, because the tracer used in this model does not chemically resemble DOC, carbon mass is not included in this formulation, and actual mineralization rates cannot be obtained. However, this approximation allows for a first order estimate of the fate of the modeled DOC upon release accounting for the hydrothermal dynamics in the active layer. Lastly, this formulation does not account for the possibility of methane production as it is not expected to be the dominant mineralization mode at the hillslope site in Endalen.

250 3 Results

We evaluate solute transport by analyzing BTCs and tabulating peak as well as first and last arrival times of active layer carbon and ancient carbon, and by visualizing two-dimensional plume transport for each injected tracer. BTSc are obtained by vertically integrating a surface-subsurface column at 10 m and 20 m relative distance to the injection point for each given time step (for active layer carbon: minutes, for ancient carbon: days). The initial arrival and end of each BTC is defined by setting a





threshold value of 0.05 mol. The arrival time is defined as the first day when the concentration exceeds 0.05 mol; the falling limb 255 of the breakthrough curve is defined as the first day after the arrival time when the concentration falls below this threshold. The resulting value is a temporal snapshot of tracer mass at the given time. Hence, the BTC is a representation of tracer movement continuous in time, but explicit in space. The plume distribution, on the other hand, represents tracer movement continuous in space, but at specific moments in time. Arrival times are expressed as dates within a year that represent present-day weather 260 conditions in the study site.

3.1 Active layer carbon

Tracers injected at different depths in the active layer exhibit different breakthrough behaviors (Fig. 4). Most noticeable, tracer breakthrough for both active layer sources occurs at different times throughout the warm season (June to October). Initial mobilization of TOL carbon starts on 3 June during early active layer development and gets released from the initial point of 265 injection quickly (Fig. 5a and Table 2). During the early warm season, the active layer is shallow (thaw depth <10 cm) but snowmelt infiltration as well as rain infiltration cause the thawed soil to be highly water saturated until mid-June. This leads to ponded water on the surface from a horizontal distance of 1011 m onward allowing for rapid surface runoff and transport (see Fig. 7). Surface transport is therefore responsible for 100% of the tracer mass passing through both observation points in the early thaw-season, but for different periods of time (Fig. 4a and b). While the surface breakthrough at the 10 m observation point lasts for only 1 day (Table 2), surface transport is the dominant mode of transport at the 20 m observation point until mid-June, indicating water is accumulating on the surface. However, from mid-June onward, most of the surface water at the

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20 m observation point infiltrates, reducing surface transport to essentially 0%.

Table 2. Initial mobilization, first, last, and peak arrival of both active layer carbon tracers, including breakthrough times for tracer transported in the subsurface and the surface. Note that a threshold value of 0.05 mol was applied to determine onset and end of the breakthrough curve. This threshold value was set to 0.002 mol for the buried tracer transported in the surface due to the small values. The arrival times are not directly comparable to the above arrival times and are hence written in italics.

carbon source	initial mobilization	first arrival		peak arrival		last arrival		breakthrough time	
		10 m	20 m	10 m	20 m	10 m	20 m	10 m	20 m
TOL subsurface	3 Jun	4 Jun	2 Aug	6 Jun	13 Aug	14 Jul	13 Aug	39 days	10 days
TOL surface	3 Jun	4 Jun	4 Jun	4 Jun	4 Jun	4 Jun	13 Jun	I day	9 days
buried subsurface	17 Aug	25 Aug	26 Aug	1 Sep	5 Sep	6 Sep	11 Sep	11 days	16 days
buried surface	17 Aug	27 Aug	27 Aug	30 Aug	31 Aug	31 Aug	4 Sep	4 days	7 days

The remaining tracer mass that has not been transported by surface runoff is transported with groundwater flow or seepage, which starts at both observation points after mid-June, when all runoff is occurring in the subsurface. At the 10 m observation point (Fig. 4c) peak arrival of the subsurface pulse can be detected on 6 June. With active layer deepening throughout the 275 warm season, the near surface layers become progressively less saturated as groundwater is restricted to deeper layers in the subsurface. This leads to unsaturated flow and transport in the vicinity of the TOL tracer, slowly moving the tracer from the







Figure 4. Tracer breakthrough curves (BTC) for **top organic layer (TOL)** carbon (blue line) and **buried** (green line) carbon tracer mass transported in surface runoff observed at (**a**) 10 and (**b**) 20 m relative distance to the injection point, and the tracer mass transported in the subsurface flow at (**c**) 10 and (**d**) 20 m distance. The blue and green shaded areas (representing the blue and green spheres in Fig. 1) indicate the ratio (0-1) of transport on the surface as compared to the subsurface (0 = subsurface transport only, 1 = surface transport only). Note that the left y-axis scale varies between the four subplots to better visualize small amounts of transported mass.

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10 m to the 20 m observation point. An initial subsurface pulse peak at 20 m can be seen just after the shift from surfaceto subsurface dominated transport on 14 June. A second, less pronounced peak at the 20 m observation point on 13 August indicates the arrival of the remaining mass mobilized in this warm season, suggesting long travel times in the subsurface upon initial release. The full range of breakthrough times from first arrival at 10 m (4 June) to last arrival at 20 m (13 Aug) amounts to a total of 70 days. Although the initial breakthrough is rapid and dominated by surface transport, the tail of the BTC is prolonged due to the residual mass having experiencing unsaturated subsurface transport.

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With a substantial amount of tracer mass transported during fully saturated conditions in the early active layer development, potential microbial mineralization rates are simultaneously low or even entirely absent (Fig. S3, 4 June to 8 June). With an increasing and drying active layer in late June and throughout July, mineralization rates are increasing close to the surface to a maximum of 2.8×10^{-5} day⁻¹. However, given the specific solute transport patterns in this model, the modeled solute is mostly located in the highly saturated zone, where mineralization is very low or absent (e.g., on 12 June, Fig. 6). This suggests that the majority of carbon in the TOL may experience transport before mineralization becomes significant enough to degrade it.







Figure 5. Mass release at the injection point of top organic layer (TOL) (a) and buried (b) carbon over time. Grey dashed lines indicate the timing of initial mobilization, which occurs when the thaw front reaches the solute injection depth (tracer mass < 99.9 mol, 3 June and 17 August for TOL and buried, respectively).

290 Later in the season, when TOL carbon transport is slowed down due to unsaturated conditions in the topsoil, mineralization will likely have an effect on the remaining solute mass and reduce the amount of potentially exported DOC.

Buried active layer carbon mobilization only starts on 17 August, when thaw depth development has progressed and almost reached its maximum extent (Fig. 5b and Table 2). Due to its location close to the base of the maximum active layer thickness, the dominant mode of transport is almost exclusively through subsurface flow. Initial arrival at the 10 m and 20 m observation

- 295 point is observed on 25 August and 26 August, respectively. The full range of breakthrough times compared to the TOL carbon transport is significantly faster (11 and 16 days at the 10 m and 20 m point, respectively, Fig. 4c and d; Table 2). Liquid saturation at the bottom of the active layer is high throughout the year, leading to saturated and therefore faster subsurface transport compared to unsaturated conditions. A small fraction of buried carbon tracer (tracer mass < 0.005 mol) experiences surface transport (also visible in Fig. 8) as it gets vertically transported upwards by groundwater up-welling due to terrain
- 300 unevenness and downslope water accumulation. Arrival and breakthrough times for buried carbon transported in surface runoff in Table 2 are therefore based on a separate threshold value of 0.002 mol. The fully saturated conditions throughout the active layer further lead to an absence of mineralization during transport in the model setup presented here (Fig. S4).





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Figure 6. Temporal snapshot of potential normalized mineralization rate and component mass plume of TOL carbon spreading throughout the transect on 12 Jun. Blue areas mark comparably low potential mineralization rates, yellow areas indicate the highest potential for mineralization. Component mass for the selected date (12 Jun) is added as a white to red overlay. Note that the tracer mass is restricted to the uppermost subsurface cell in this snapshot and is difficult to visualize in this illustration. A shade of red can be seen between 1010 and 1012 m.

In summary, the timing of initial mobilization due to the depth of each of the carbon pool tracers, and liquid saturation in the soil greatly determines the shape of the BTC and its potential for mineralization for each of the active layer carbon tracers. Unsaturated subsurface conditions lead to a prolonged tail in subsurface TOL tracer breakthrough and non-zero mineralization rates, while saturated conditions lead to a rapid, mostly symmetrical breakthrough of the buried carbon tracer and no potential for mineralization.

The spatial distribution and spreading of the tracers within the transect are analyzed by visualizing temporal snapshots of the plume in 2D subsurface cross plots. Solute movement of the TOL carbon tracer is strongly limited to the surface and the

- 310 uppermost soil layers (up to 10 cm below the surface) and does not significantly spread into deeper soil layers even after deeper active layer development (Fig. 7). The proportion of tracer in this visualization is limited to the mass that gets transported in the subsurface. Hence, the subsurface plume spreads slowly and has not reached the 20 m observation point by the last temporal snapshot shown here (20 June). This highlights the significantly slower rate of unsaturated transport as compared to saturated transport, which is predominantly responsible for the rapid transport of buried carbon (Fig. 7). Here, the plume movement is
- 315 largely uniform in the subsurface. Due to the unevenness of the terrain, some tracer mass is moved upwards towards the surface (e.g., at 1005 m on 30 August and 1 September in Fig. 8), but the amount of buried carbon tracer being transported on surface is negligible (max. 12% on 13 August, Fig. 4b and d, green shaded area).







Figure 7. 2D representation of the top organic layer (TOL) carbon plume dispersion between the point of tracer injection (x = 1000 m) and the last observation point (x = 1020 m) for selected dates during summer after tracer injection. Elevation is given in relative elevation to the conceptual valley bottom (surface of the valley bottom = 0 m). Tracer mass is given in mol and is masked to only represent values > 0.05 mol.

3.2 Ancient carbon

Gradual warming scenario

move tracer mass out of the initial column of injection.

320 Carbon mobilization as simulated in the gradual warming scenarios RCP4.5 and RCP8.5 exhibit distinctly different transport patterns from active layer carbon transport. Within the first year and in both gradual warming simulations, before air temperature warming has even affected the ALT, vertical mass movement of the upper ancient carbon tracer (ancient C at 1.15 m depth) can be observed. A substantial fraction of the initially injected tracer mass (~40%) moves vertically (both upwards and downwards) within the same mesh column in which it was injected (see Fig. 9a and d and Fig. 10). This way, carbon gets vertically distributed over the first four years, before the active layer has deepened sufficiently to allow for lateral transport to

From the fourth year onward, a small fraction (0.02–0.08 mol in the RCP4.5, Fig.9b and c, and 0.025–0.125 mol in RCP8.5, Fig.9e and f, respectively) of the ancient carbon source injected at 1.15 m depth arrives at the 10 and 20 m distance observation







Figure 8. 2D representation of the buried carbon plume dispersion between the point of tracer injection (x = 1000 m) and the last observation point (x = 1020 m) for selected dates during summer after tracer injection. Elevation is given in relative elevation to the conceptual valley bottom (surface of the valley bottom = 0 m). Tracer mass is given in mol and is masked to only represent values > 0.05 mol

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points. At the 10 m observation point, annually recurring breakthrough curves are lasting for a short amount of time (component mass > 0.01 mol from mid-September to mid-October) with all the mass that has been released from the source during the respective summer arriving at 10 m and leaving the observation point within this time.

At 20 m, first tracer arrival starts within the same time after the beginning of the simulation as at the 10 m observation point, but instead of being flushed through the observation column, this tracer accumulates within the observation column with short periods of release (less than 2 weeks) during the late autumn (mid September to mid October) and becomes immobilized upon freeze-up until it thaws out in the following season.

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All mass (transported molar mass \geq 95%) of the ancient carbon pool at 1.15 m has been laterally transported from the injection column after 34 years in the RCP8.5 scenario. In the RCP4.5 scenario, 50 years of gradual warming have lead to a release of 93.5% of the ancient carbon tracer mass (Fig. 9a and d). Tracer arrival at the observation points is relatively even throughout this period indicating no abrupt release as a result of gradual warming.

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A similar behavior can be observed for the ancient carbon pool at 1.55 m depth. Mobilization and lateral transport of this carbon pool (mass in injection column < 99%) starts after 33 years in the RCP8.5 scenario and after 48 years in the RCP4.5





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Figure 9. Ancient carbon mobilization upon gradual warming in the RCP4.5 (**a-d**) and RCP8.5 (**d-f**) scenario simulations. Tracer injection mass (**a** and **d**) indicate when the tracer gets mobilized at the initial injection point in the respective cell (dashed line) and integrated vertically over the entire injection column (solid line). Red and orange lines represent ancient carbon in 1.15 m and 1.55 m depth, respectively. When molar mass reaches 0, all tracer has been laterally transported away from the injection point. Tracer BTCs at 10 m (**b** and **e**) and 20 m (**c** and **f**) show the arrival times of tracer mass released at the injection column. The visual increase in mass above 100 mol in the injection columns in (**a**) and (**d**) is not a physical phenomenon but a result of aggregating and rounding errors during post-processing of the model output.

scenario. By the end of the 50 year period, 85% of the mass in the injection column has been released in the RCP8.5 scenario. Towards the end of the simulation time, an abrupt release of the carbon pool tracer at 1.55 m can be seen. This is caused by the coarser mesh resolution in greater depths beyond the present-day active layer extent. Due to differences in energy
requirement to thaw a greater cell volume in depths with lower z-resolution, more tracer can be released once this cell thaws. This observation highlights the importance of mesh resolution in lateral transport simulations. The associated spikes in the BTC (Fig. 9e and f) indicate a more rapid release due to a greater volume of tracer mobilized within a single summer.

In the RCP4.5 scenario, only 1% of the tracer mass at 1.55 m depth has been released by the end of the simulation. Due to the post-processing procedure of the model output in which we integrate molar mass vertically throughout the injection column, rounding errors cause the total molar mass in the injection column to slightly exceed the initial mass of 100 mol. This does

not represent a physical increase in mass. It can therefore not conclusively be determined when exactly lateral movement of the tracer in 1.55 m depth was initiated. However, vertical mobilization of this tracer can be observed starting after 27 years, causing a vertical redistribution of 65% of the initially injected mass by the end of the simulation period. In summary, these results suggest that gradual warming leads to gradual release of ancient carbon pools with significant redistribution in the vertical directions.







Figure 10. Representation of the vertical redistribution of tracer from the initial injection cell (red cross) throughout the depth profile of the injection column. (**a-c**) indicate the distribution throughout a full freeze-thaw cycle, (**d-f**) represent vertical redistribution from the third to the fourth freeze-up including the mid-winter vertical movement of the second freeze-up, and (**g-i**) represent vertical distribution by the end of the first modeled decade. Mass is depicted in molar mass.

Abrupt active layer deepening

In the case of the abrupt active layer deepening scenarios, tracer mobilization of ancient carbon is more similar to the behavior of buried active layer carbon released by seasonal thaw (Section 3.1). In the year of abrupt active layer deepening, ALT reaches 1.35 m (+35 cm compared to present-day ALT) and 1.6 m (+60 cm compared to present-day ALT) in the +3 and +5 °C scenarios, respectively, causing a complete BTC of the ancient carbon tracer at 1.15 m depth within the same year and partial release of the tracer at 1.55 m in the +5 °C scenario (Fig. 11). Tracer molar mass of 0.05 mol (ancient C at 1.15 m depth) is exceeded on 13 August and falls below 0.05 mol on 27 August (duration: 14 days) at both the 10 and 20 m observation points in the +5 °C scenario, these dates are 24 August and 14 September (duration: 21 days). For the ancient carbon tracer at 1.55 m depth, a small breakthrough of max 0.07 mol at the 10 m observation point and max 0.04 mol at the 20 m observation point can be observed in the +5 °C scenario. In the +3 °C scenario. In the +3 °C scenario.

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deepening.

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Figure 11. Mobilization of ancient carbon upon abrupt active layer deepening. The injected tracer mass (**a** and **b**) indicates when the tracer gets mobilized at the initial injection point in the respective vertically integrated injection column. Solid and dashed lines represent injection mass mobilization under the +5 °C and the +3 °C scenario, respectively. Tracer BTCs at 10 (**c**) and 20 m (**d**) indicate when and how fast the tracer passes through the observation column. Red and orange lines represent the tracer representing ancient carbon at 1.15 m and 1.55 m depth, respectively. The visual increase in mass above 100 mol in the injection column in (**b**) is not a physical phenomenon but a result of aggregating and rounding errors during post-processing of the model output.

Observations of molar mass in the injection points in both simulations show that all mass of the ancient carbon at 1.15 m depth is released from both the injection column within year two. In the +5 °C scenario, the ancient carbon at 1.55 m depth indicates partial lateral release of $\sim 8\%$ of the injected mass by the end of year two. After full freeze-up in year three, the mass stays constant throughout the following two summers, indicating no further release of tracer after the isolated abrupt active layer deepening event.

4 Discussion

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Through our model experiments, we identified different transport patterns for different carbon pool representations within the active layer and in the permafrost. We find that TOL carbon pools may experience fast initial transport during early active layer 375 development, but also show prolonged residence times due to unsaturated conditions in the subsurface. Buried active layer carbon, on the other hand, moves fast upon release in the saturated part of the active layer (confirming hypothesis (i)). Slower transport indicates longer residence time in the unfrozen soil upon thaw, while fast transport decreases the residence time.

The transport patterns observed in the buried carbon tracer do not carry over to the ancient permafrost carbon that is initially frozen and only gets mobilized upon ALT increase through gradual air temperature warming (confounding hypothesis (ii)).

380 Instead of being flushed out when exposed to groundwater flow, the tracers that represent ancient carbon experience gradual release at increasing rates with increasing permafrost degradation. With rising temperatures near the thaw front, a small fraction

in permafrost affected landscapes.





of unfrozen water gets mobilized at sub-zero soil temperatures, enabling minor vertically downward migration in the soil profile without experiencing significant lateral movement. During annual freeze-up, cryosuction (capillary forces causing water to be drawn to the freezing front) causes some fraction of the water and the tracer in it to be vertically migrated upward, moving 385 it closer to the depth of maximum ALT. Here, it is more likely to get thawed out during the next summer, contributing to the small, but recurring, annual releases. Cryosuction has previously been observed to be of importance in a polygonal tundra model with analysis of solute transport (Jafarov et al., 2022), and our results here suggest the importance of cryosuction not only applies to predominantly flat terrain with microtopography, but also within hillslope systems where the thaw front progressively increases. This indicates the potential for cryosyction-induced dispersion of solutes, highlighting the importance of representing this process in climate warming scenarios.

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Under the assumption of an abrupt increase in ALT due to one very warm year (Tavg +3, +5), ancient carbon tracer transport is more similar to the transport of buried carbon. Due to the short-term but significant increase in ground temperatures, the entire injected tracer mass is mobilized as soon as the active layer thaw front reaches the depth of the carbon source. The rapid export of this carbon source suggests that the residence time is short leading to decreased potential for microbial mineralization.

A thought experiment in which we calculated potential microbial mineralization as part of the post-processing of environ-395 mental soil temperature and moisture shows that the high liquid saturation associated with rapid transport also leads to reduced or absent mineralization throughout most of the active layer. Under generally or future drier conditions (Painter et al., 2023), mineralization rates in the active layer may be higher, especially in the upper part, where fully saturated conditions appear mostly in the beginning of the season. Translating this result to the transport patterns in the gradual and abrupt warming scenarios, this may imply that permafrost carbon can experience export in the form of DOC before it gets a chance to be min-400 eralized into CO₂. However, these results rely on a threshold assumption for the effect of soil moisture on mineralization (Wen et al., 2020), which is uncertain and requires increased attention in future research to better constrain microbial mineralization

The simulations conducted in this study are based on environmental and general soil physical conditions observed in the Endalen valley, Svalbard. However, the model is limited by the availability of observational data for e.g., soil properties and 405 subsurface conditions such as preferential flow paths. Furthermore, it does not account for a full 3D representation of the area as there is no additional discretization in the transverse direction. We partly address this by representing a converging slope model setup, where the cell width in transverse direction varies depending on the distance in longitudinal direction. This way, the surface area of the catchment is preserved, and it is possible to accurately represent water and energy balances as well

as infiltration and evaporation rates throughout the catchment. This approach has previously been applied by Gao and Coon 410 (2022). The subsurface material used in our simulations represents a highly conductive soil that allows for fast groundwater seepage from up- to downhill. At the field site, this is a realistic assumption as the ground is dominated by gravely soil overlain by a thin organic layer, but may be different for hillslope systems with finer material such as silts and clays.

Enhancing our understanding about potential lateral export of carbon is crucial for reducing the uncertainty surrounding the permafrost carbon feedback and the fate of permafrost carbon (Intergovernmental Panel On Climate Change (IPCC), 415 2022). Advances in research on the permafrost carbon feedback have been made by simulating production, transport, and





transformation of carbon in the contemporary carbon cycle across landscapes using land surface models (Bowring et al., 2019, 2020) or by characterizing fluvial derived organic carbon in rivers through radio carbon dating (Wild et al., 2019). However, a mechanistic representation of in-situ mobilization of permafrost carbon in models is generally lacking, and have
only begun to be developed (Rawlins et al., 2021; Mohammed et al., 2022). In this study, we address this process by simulating the thaw out and mobilization of permafrost carbon with a 2D hillslope model, only accounting for non-reactive transport of a generic tracer. While our model gives us valuable insight into the mechanisms causing transport to be slower or faster, a full depiction of carbon is not included since representing carbon specifically would require extensive in-situ soil carbon characterization, and representation of biogeochemical reactions and processes such as microbial mineralization, which are

425 currently not part of the model setup.

Increasing the terrestrial-to-aquatic transport of permafrost carbon can influence the further processing of such carbon and its effects on the oceans. Generally, at least half of the carbon input from terrestrial sources into the aquatic systems is expected to be released to the atmosphere within the riverine system (Cole et al., 2007). However, field sampling of dissolved organic matter (DOM) in Alaska has shown that the organic matter available for export may have low biolability (Mutschlecner et al.,

430 2018). This suggests that the more stable ancient permafrost carbon may indeed experience export into rivers and the ocean

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without getting entirely mineralized beforehand.

While this study mostly focuses on the potential of carbon transport, the results can also provide valuable insights into contaminant transport, in order to evaluate the importance of hydrology in contaminated sites in permafrost regions and how contaminants may move within the subsurface. Contaminated sites with toxic substances are likely to impact livelihoods and ecosystems in the Arctic and require increased attention (Langer et al., 2023). The modeling approach presented here offers a

basis for further development for both carbon transport as well as contaminant transport.

To address these problems more comprehensively, the use of a reactive transport model will help to disentangle the aforementioned complex interactions (e.g. Mohammed et al., 2022). For example, biogeochemical carbon dynamics can be incorporated into the model by assigning chemical properties to the tracer as well as describing microbial mineralization processes based

440 on environmental variables such as soil moisture and temperature. However, the complexity of these processes alone adds significantly to the existing complexity of representing freeze-thaw dynamics in permafrost regions and poses a considerable computational challenge.

Permafrost carbon stock databases such as the one by Hugelius et al. (2014) can further be used to model site-specific conditions based on the presence of permafrost carbon in different depths. In the same way, chemical properties can be assigned

to contaminant species. Integrating transport as well as biogeochemical reactions of the dissolved compounds in permafrost hydrological models will then help to further constrain global climate models and reduce the uncertainty surrounding the permafrost carbon feedback.



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5 Conclusions

The fate of permafrost carbon in a changing climate is an essential part of the permafrost carbon feedback loop. Considerable uncertainty in predicting the effects of permafrost thaw evolve around the uncertainty in how much of the carbon currently immobilized in permafrost gets released vertically to the atmosphere as GHGs and which fraction of it might get transported laterally towards surface water and eventually to the ocean. In this study, we addressed the mechanical transport component of this question. For solute transport in the seasonal active layer, we find that:

- 1. A tracer representing active layer carbon experiences different transport velocities depending on its location within the active layer.
- 2. Active layer carbon close to the surface experiences both rapid surface transport but also prolonged subsurface transport due to unsaturated conditions close to the ground surface as the thaw front propagates deeper in the ground.
- 3. Active layer carbon close to the bottom of the active layer experiences faster subsurface transport and no surface transport due to saturated conditions at the depth of ALT.
- 460 4. Carbon released near the base of the active layer may experience limited mineralization prior to export due to the combination of relatively rapid transport with groundwater and limited microbial mineralization rates due to saturated conditions.

In a warming climate, solutes such as carbon released from the permafrost, are likely to experience different transport patterns. Our main findings for simulations of a warming climate are:

- 1. Under the simulated environmental and soil physical conditions in this study, a gradual warming of air temperature with climate change may lead to a gradual release of currently frozen carbon pools. While moving vertically downward over time, small amounts of carbon can get released laterally every year, but a rapid release of large amounts of carbon at once are not expected. This may favor the the in-situ mineralization of the carbon prior to export.
 - 2. Abrupt active layer deepening, on the other hand, may lead to the rapid release and transport of SOC in the form of DOC, leaving little time for microbial mineralization when the soil is unfrozen.
 - 3. Seasonal thaw and freeze-up enhances vertical dispersion of solutes by cryosuction, which can enable an earlier than expected onset of release near the permafrost table.

Code and data availability. The Advanced Terrestrial Simulator (ATS) (https://doi.org/10.11578/DC.20190911.1; Coon et al., 2019) is open source under the BSD 3-clause license and is publicly available at https://github.com/amanzi/ats (last access: May 2023) (Coon et al., 2016). Simulations were conducted using version 1.4. Forcing datasets and input files are available at

https://github.com/a-hamm/hamm-et-al-2024-permafrost-transport. Weather data to create the forcing dataset were downloaded from https:





//www.unis.no/resources/weather-stations/ (The University Centre in Svalbard, 2023) and from https://seklima.met.no/observations/ (Norwegian Climate Service Centre, 2023). The drone survey images for the sub-catchment in Endalen is available at https://doi.org/10.5281/ zenodo.8279263 (Schytt Mannerfelt, 2023).

480 *Author contributions.* AH designed the study with help from AF, AAM, SLP, and EC. ESM surveyed the study site by drone and processed the digital elevation model. AH performed the model runs and analysis with help from AF, SLP, and EC. AH and AAM performed the post-processing of the model results to evaluate potential microbial mineralization rates. AH wrote the manuscript with contribution from all co-authors.

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

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References

- Abbott, B. W., Larouche, J. R., Jones, J. B., Bowden, W. B., and Balser, A. W.: Elevated dissolved organic carbon biodegradability from thawing and collapsing permafrost, Journal of Geophysical Research: Biogeosciences, 119, 2049–2063, https://doi.org/10.1002/2014JG002678, 2014.
- 495 Atchley, A. L., Painter, S. L., Harp, D. R., Coon, E. T., Wilson, C. J., Liljedahl, A. K., and Romanovsky, V. E.: Using field observations to inform thermal hydrology models of permafrost dynamics with ATS (v0.83), Geoscientific Model Development, 8, 2701–2722, https://doi.org/10.5194/gmd-8-2701-2015, 2015.
 - Bense, V. F., Ferguson, G., and Kooi, H.: Evolution of shallow groundwater flow systems in areas of degrading permafrost, Geophysical Research Letters, 36, L22 401, https://doi.org/10.1029/2009GL039225, 2009.
- 500 Bense, V. F., Kooi, H., Ferguson, G., and Read, T.: Permafrost degradation as a control on hydrogeological regime shifts in a warming climate, Journal of Geophysical Research: Earth Surface, 117, 2011JF002143, https://doi.org/10.1029/2011JF002143, 2012.
 - Bowring, S. P. K., Lauerwald, R., Guenet, B., Zhu, D., Guimberteau, M., Tootchi, A., Ducharne, A., and Ciais, P.: ORCHIDEE MICT-LEAK (r5459), a global model for the production, transport, and transformation of dissolved organic carbon from Arctic permafrost regions Part 1: Rationale, model description, and simulation protocol, Geoscientific Model Development, 12, 3503–3521, https://doi.org/10.5194/gmd-
- 505 12-3503-2019, 2019.
- Bowring, S. P. K., Lauerwald, R., Guenet, B., Zhu, D., Guimberteau, M., Regnier, P., Tootchi, A., Ducharne, A., and Ciais, P.: OR-CHIDEE MICT-LEAK (r5459), a global model for the production, transport, and transformation of dissolved organic carbon from Arctic permafrost regions – Part 2: Model evaluation over the Lena River basin, Geoscientific Model Development, 13, 507–520, https://doi.org/10.5194/gmd-13-507-2020, 2020.
- 510 Christiansen, H. H., Gilbert, G. L., Demidov, N., Guglielmin, M., Isaksen, K., and Boike, J.: 10 Permafrost temperatures and active layer thickness in Svalbard during 2017/2018, https://doi.org/10.5281/zenodo.4777728, 2020.
 - Cole, J. J., Prairie, Y. T., Caraco, N. F., McDowell, W. H., Tranvik, L. J., Striegl, R. G., Duarte, C. M., Kortelainen, P., Downing, J. A., Middelburg, J. J., and Melack, J.: Plumbing the Global Carbon Cycle: Integrating Inland Waters into the Terrestrial Carbon Budget, Ecosystems, 10, 172–185, https://doi.org/10.1007/s10021-006-9013-8, 2007.
- 515 Connolly, C. T., Cardenas, M. B., Burkart, G. A., Spencer, R. G. M., and McClelland, J. W.: Groundwater as a major source of dissolved organic matter to Arctic coastal waters, Nature Communications, 11, 1479, https://doi.org/10.1038/s41467-020-15250-8, 2020.
 - Coon, E., Svyatsky, D., Jan, A., Kikinzon, E., Berndt, M., Atchley, A., Harp, D., Manzini, G., Shelef, E., Lipnikov, K., Garimella, R., Xu, C., Moulton, D., Karra, S., Painter, S., Jafarov, E., and Molins, S.: Advanced Terrestrial Simulator, https://doi.org/10.11578/DC.20190911.1, 2019.
- 520 Coon, E. T., David Moulton, J., and Painter, S. L.: Managing complexity in simulations of land surface and near-surface processes, Environmental Modelling & Software, 78, 134–149, https://doi.org/10.1016/j.envsoft.2015.12.017, 2016.
 - Dagenais, S., Molson, J., Lemieux, J.-M., Fortier, R., and Therrien, R.: Coupled cryo-hydrogeological modelling of permafrost dynamics near Umiujaq (Nunavik, Canada), Hydrogeology Journal, 28, 887–904, https://doi.org/10.1007/s10040-020-02111-3, 2020.
- Dusek, J., Dohnal, M., Vogel, T., Marx, A., and Barth, J. A.: Modelling multiseasonal preferential transport of dissolved organic carbon
 in a shallow forest soil: Equilibrium versus kinetic sorption, Hydrological Processes, 33, 2898–2917, https://doi.org/10.1002/hyp.13536,
- 2019.
 - Norwegian Polar Institue: Topsvalbard, https://toposvalbard.npolar.no/.





- Frampton, A. and Destouni, G.: Impact of degrading permafrost on subsurface solute transport pathways and travel times, Water Resources Research, 51, 7680–7701, https://doi.org/10.1002/2014WR016689, 2015.
- 530 Frampton, A., Painter, S., Lyon, S. W., and Destouni, G.: Non-isothermal, three-phase simulations of near-surface flows in a model permafrost system under seasonal variability and climate change, Journal of Hydrology, 403, 352–359, https://doi.org/10.1016/j.jhydrol.2011.04.010, 2011.
 - Frampton, A., Painter, S. L., and Destouni, G.: Permafrost degradation and subsurface-flow changes caused by surface warming trends, Hydrogeology Journal, 21, 271–280, https://doi.org/10.1007/s10040-012-0938-z, 2013.
- 535 Gao, B. and Coon, E. T.: Evaluating simplifications of subsurface process representations for field-scale permafrost hydrology models, The Cryosphere, 16, 4141–4162, https://doi.org/10.5194/tc-16-4141-2022, 2022.
 - Ge, S., McKenzie, J., Voss, C., and Wu, Q.: Exchange of groundwater and surface-water mediated by permafrost response to seasonal and long term air temperature variation: GROUNDWATER AND PERMAFROST, Geophysical Research Letters, 38, n/a–n/a, https://doi.org/10.1029/2011GL047911, 2011.
- 540 Grenier, C., Anbergen, H., Bense, V., Chanzy, Q., Coon, E., Collier, N., Costard, F., Ferry, M., Frampton, A., Frederick, J., Gonçalvès, J., Holmén, J., Jost, A., Kokh, S., Kurylyk, B., McKenzie, J., Molson, J., Mouche, E., Orgogozo, L., Pannetier, R., Rivière, A., Roux, N., Rühaak, W., Scheidegger, J., Selroos, J.-O., Therrien, R., Vidstrand, P., and Voss, C.: Groundwater flow and heat transport for systems undergoing freeze-thaw: Intercomparison of numerical simulators for 2D test cases, Advances in Water Resources, 114, 196–218, https://doi.org/10.1016/j.advwatres.2018.02.001, 2018.
- 545 Hamm, A. and Frampton, A.: Impact of lateral groundwater flow on hydrothermal conditions of the active layer in a high arctic hillslope setting, The Cryosphere, 15, 4853–4871, https://doi.org/10.5194/tc-2021-60, 2021.
 - Hanssen-Bauer, I., Førland, E., Hisdal, H., Mayer, S., Sandø, A., and Sorteberg, A.: Climate in Svalbard 2100 a knowledge base for climate adaptation, Tech. Rep. 1/2019, Norwegian Centre for Climate Services, 2018.
- Harp, D. R., Atchley, A. L., Painter, S. L., Coon, E. T., Wilson, C. J., Romanovsky, V. E., and Rowland, J. C.: Effect of soil property uncertainties on permafrost thaw projections: a calibration-constrained analysis, The Cryosphere, 10, 341–358, https://doi.org/10.5194/tc-10-341-2016, 2016.
 - Huang, X. and Rudolph, D. L.: Numerical Study of Coupled Water and Vapor Flow, Heat Transfer, and Solute Transport in Variably-Saturated Deformable Soil During Freeze-Thaw Cycles, Water Resources Research, 59, e2022WR032146, https://doi.org/10.1029/2022WR032146, 2023.
- 555 Hugelius, G., Strauss, J., Zubrzycki, S., Harden, J. W., Schuur, E. A. G., Ping, C.-L., Schirrmeister, L., Grosse, G., Michaelson, G. J., Koven, C. D., O'Donnell, J. A., Elberling, B., Mishra, U., Camill, P., Yu, Z., Palmtag, J., and Kuhry, P.: Estimated stocks of circumpolar permafrost carbon with quantified uncertainty ranges and identified data gaps, Biogeosciences, 11, 6573–6593, https://doi.org/10.5194/bg-11-6573-2014, 2014.
 - Intergovernmental Panel On Climate Change (IPCC): The Ocean and Cryosphere in a Changing Climate: Special Report of the
- 560 Intergovernmental Panel on Climate Change, Cambridge University Press, 1 edn., ISBN 978-1-00-915796-4 978-1-00-915797-1, https://doi.org/10.1017/9781009157964, 2022.
 - Jafarov, E. E., Coon, E. T., Harp, D. R., Wilson, C. J., Painter, S. L., Atchley, A. L., and Romanovsky, V. E.: Modeling the role of preferential snow accumulation in through talik development and hillslope groundwater flow in a transitional permafrost landscape, Environmental Research Letters, 13, 105 006, https://doi.org/10.1088/1748-9326/aadd30, 2018.





- 565 Jafarov, E. E., Svyatsky, D., Newman, B., Harp, D., Moulton, D., and Wilson, C.: The importance of freeze-thaw cycles for lateral tracer transport in ice-wedge polygons, The Cryosphere, 16, 851–862, https://doi.org/10.5194/tc-16-851-2022, 2022.
 - Jan, A., Coon, E. T., and Painter, S. L.: Evaluating integrated surface/subsurface permafrost thermal hydrology models in ATS (v0.88) against observations from a polygonal tundra site, Geoscientific Model Development, 13, 2259–2276, https://doi.org/10.5194/gmd-13-2259-2020, 2020.
- 570 Kane, D. L., Yoshikawa, K., and McNamara, J. P.: Regional groundwater flow in an area mapped as continuous permafrost, NE Alaska (USA), Hydrogeology Journal, 21, 41–52, https://doi.org/10.1007/s10040-012-0937-0, 2013.
 - Kurylyk, B. L., Hayashi, M., Quinton, W. L., McKenzie, J. M., and Voss, C. I.: Influence of vertical and lateral heat transfer on permafrost thaw, peatland landscape transition, and groundwater flow: Permafrost thaw, landscape change and groundwater flow, Water Resources Research, 52, 1286–1305, https://doi.org/10.1002/2015WR018057, 2016.
- 575 Lamontagne-Hallé, P., McKenzie, J. M., Kurylyk, B. L., and Zipper, S. C.: Changing groundwater discharge dynamics in permafrost regions, Environmental Research Letters, 13, 084 017, https://doi.org/10.1088/1748-9326/aad404, 2018.
 - Lamontagne-Hallé, P., McKenzie, J. M., Kurylyk, B. L., Molson, J., and Lyon, L. N.: Guidelines for cold-regions groundwater numerical modeling, WIREs Water, https://doi.org/10.1002/wat2.1467, 2020.
 - Langer, M., von Deimling, T. S., Westermann, S., Rolph, R., Rutte, R., Antonova, S., Rachold, V., Schultz, M., Oehme, A., and Grosse, G.:
- 580 Thawing permafrost poses environmental threat to thousands of sites with legacy industrial contamination, Nature Communications, 14, 1721, https://doi.org/10.1038/s41467-023-37276-4, 2023.
 - Magnússon, R. Í., Hamm, A., Karsanaev, S. V., Limpens, J., Kleijn, D., Frampton, A., Maximov, T. C., and Heijmans, M. M. P. D.: Extremely wet summer events enhance permafrost thaw for multiple years in Siberian tundra, Nature Communications, 13, 1556, https://doi.org/10.1038/s41467-022-29248-x, 2022.
- 585 McKenzie, J. M., Voss, C. I., and Siegel, D. I.: Groundwater flow with energy transport and water-ice phase change: Numerical simulations, benchmarks, and application to freezing in peat bogs, Advances in Water Resources, 30, 966–983, https://doi.org/10.1016/j.advwatres.2006.08.008, 2007.
 - Miner, K. R., D'Andrilli, J., Mackelprang, R., Edwards, A., Malaska, M. J., Waldrop, M. P., and Miller, C. E.: Emergent biogeochemical risks from Arctic permafrost degradation, Nature Climate Change, 11, 809–819, https://doi.org/10.1038/s41558-021-01162-y, 2021.
- 590 Miner, K. R., Turetsky, M. R., Malina, E., Bartsch, A., Tamminen, J., McGuire, A. D., Fix, A., Sweeney, C., Elder, C. D., and Miller, C. E.: Permafrost carbon emissions in a changing Arctic, Nature Reviews Earth & Environment, 3, 55–67, https://doi.org/10.1038/s43017-021-00230-3, 2022.
 - Mohammed, A. A., Bense, V. F., Kurylyk, B. L., Jamieson, R. C., Johnston, L. H., and Jackson, A. J.: Modeling Reactive Solute Transport in Permafrost-Affected Groundwater Systems, Water Resources Research, 57, https://doi.org/10.1029/2020WR028771, 2021.
- 595 Mohammed, A. A., Guimond, J., Bense, V., Jamieson, R., McKenzie, J. M., and Kurylyk, B.: Mobilization of subsurface carbon pools driven by permafrost thaw and reactivation of groundwater flow: a virtual experiment, Environmental Research Letters, https://doi.org/10.1088/1748-9326/aca701, 2022.
 - Molins, S., Svyatsky, D., Xu, Z., Coon, E. T., and Moulton, J. D.: A multicomponent reactive transport model for integrated surfacesubsurface hydrology problems, Water Resources Research, 58, https://doi.org/10.1029/2022WR032074, 2022.
- 600 Mutschlecner, A. E., Guerard, J. J., Jones, J. B., and Harms, T. K.: Regional and intra-annual stability of dissolved organic matter composition and biolability in high-latitude Alaskan rivers, Limnology and Oceanography, 63, 1605–1621, https://doi.org/10.1002/lno.10795, 2018. Norwegian Climate Service Centre: Longyearbyen airport weather data, https://klimaservicesenter.no/, last access: July 2022, 2023.





O'Donnell, J. A., Aiken, G. R., Walvoord, M. A., and Butler, K. D.: Dissolved organic matter composition of winter flow in the Yukon River basin: Implications of permafrost thaw and increased groundwater discharge, Global Biogeochemical Cycles, 26, 2012GB004341, https://doi.org/10.1029/2012GB004341, 2012.

605

- Painter, S. L., Coon, E. T., Atchley, A. L., Berndt, M., Garimella, R., Moulton, J. D., Svyatskiy, D., and Wilson, C. J.: Integrated surface/subsurface permafrost thermal hydrology: Model formulation and proof-of-concept simulations, Water Resources Research, 52, 6062–6077, https://doi.org/10.1002/2015WR018427, 2016.
- Painter, S. L., Coon, E. T., Khattak, A. J., and Jastrow, J. D.: Drying of tundra landscapes will limit subsidence-induced acceleration of 610 permafrost thaw, Proceedings of the National Academy of Sciences, 120, e2212171 120, https://doi.org/10.1073/pnas.2212171120, 2023.
- Plaza, C., Pegoraro, E., Bracho, R., Celis, G., Crummer, K. G., Hutchings, J. A., Hicks Pries, C. E., Mauritz, M., Natali, S. M., Salmon, V. G., Schädel, C., Webb, E. E., and Schuur, E. A. G.: Direct observation of permafrost degradation and rapid soil carbon loss in tundra, Nature Geoscience, 12, 627-631, https://doi.org/10.1038/s41561-019-0387-6, 2019.
- Rawlins, M. A., Connolly, C. T., and McClelland, J. W.: Modeling Terrestrial Dissolved Organic Carbon Loading to Western Arctic Rivers, 615 Journal of Geophysical Research: Biogeosciences, 126, e2021JG006 420, https://doi.org/10.1029/2021JG006420, 2021.
- Schuster, P. F., Schaefer, K. M., Aiken, G. R., Antweiler, R. C., Dewild, J. F., Gryziec, J. D., Gusmeroli, A., Hugelius, G., Jafarov, E., Krabbenhoft, D. P., Liu, L., Herman-Mercer, N., Mu, C., Roth, D. A., Schaefer, T., Striegl, R. G., Wickland, K. P., and Zhang, T.: Permafrost Stores a Globally Significant Amount of Mercury, Geophysical Research Letters, 45, 1463–1471, https://doi.org/10.1002/2017GL075571, 2018.
- Schuur, E. A. G., McGuire, A. D., Schädel, C., Grosse, G., Harden, J. W., Hayes, D. J., Hugelius, G., Koven, C. D., Kuhry, P., Lawrence,
- 620 D. M., Natali, S. M., Olefeldt, D., Romanovsky, V. E., Schaefer, K., Turetsky, M. R., Treat, C. C., and Vonk, J. E.: Climate change and the permafrost carbon feedback, Nature, 520, 171-179, https://doi.org/10.1038/nature14338, 2015.

Schytt Mannerfelt, E.: UAV survey images of the eastern Endalen slope, Svalbard, https://doi.org/10.5281/zenodo.8279263, 2023.

Shojae Ghias, M., Therrien, R., Molson, J., and Lemieux, J.-M.: Numerical simulations of shallow groundwater flow and heat transport in continuous permafrost setting under impact of climate warming, Canadian Geotechnical Journal, 56, 436-448, https://doi.org/10.1139/cgj-2017-0182, 2019.

- 625
 - Siewert, M. B., Hanisch, J., Weiss, N., Kuhry, P., Maximov, T. C., and Hugelius, G.: Comparing carbon storage of Siberian tundra and taiga permafrost ecosystems at very high spatial resolution, Journal of Geophysical Research: Biogeosciences, 120, 1973–1994, https://doi.org/10.1002/2015JG002999, 2015.
- Sjöberg, Y., Jan, A., Painter, S. L., Coon, E. T., Carey, M. P., O'Donnell, J. A., and Koch, J. C.: Permafrost Promotes Shallow Groundwater 630 Flow and Warmer Headwater Streams, Water Resources Research, 57, https://doi.org/10.1029/2020WR027463, 2021.
- Strand, S. M., Christiansen, H. H., Johansson, M., Åkerman, J., and Humlum, O.: Active layer thickening and controls on interannual variability in the Nordic Arctic compared to the circum-Arctic, Permafrost and Periglacial Processes, p. ppp.2088, https://doi.org/10.1002/ppp.2088, 2020.
- Tarnocai, C., Canadell, J. G., Schuur, E. A. G., Kuhry, P., Mazhitova, G., and Zimov, S.: Soil organic carbon pools in the northern circumpolar permafrost region, Global Biogeochemical Cycles, 23, n/a-n/a, https://doi.org/10.1029/2008GB003327, 2009. 635
 - The University Centre in Svalbard: Adventdalen weather data, https://www.unis.no/facilities/weather-stations/, last access: July 2022, 2023. Wales, N. A., Gomez-Velez, J. D., Newman, B. D., Wilson, C. J., Dafflon, B., Kneafsey, T. J., Soom, F., and Wullschleger, S. D.: Understanding the relative importance of vertical and horizontal flow in ice-wedge polygons, Hydrology and Earth System Sciences, 24, 1109–1129,

https://doi.org/10.5194/hess-24-1109-2020, 2020.



655



- 640 Walvoord, M. A. and Kurylyk, B. L.: Hydrologic Impacts of Thawing Permafrost—A Review, Vadose Zone Journal, 15, 0, https://doi.org/10.2136/vzj2016.01.0010, 2016.
 - Weiss, N., Faucherre, S., Lampiris, N., and Wojcik, R.: Elevation-based upscaling of organic carbon stocks in High-Arctic permafrost terrain: a storage and distribution assessment for Spitsbergen, Svalbard, Polar Research, 36, 1400363, https://doi.org/10.1080/17518369.2017.1400363, 2017.
- 645 Wen, H., Perdrial, J., Abbott, B. W., Bernal, S., Dupas, R., Godsey, S. E., Harpold, A., Rizzo, D., Underwood, K., Adler, T., Sterle, G., and Li, L.: Temperature controls production but hydrology regulates export of dissolved organic carbon at the catchment scale, Hydrology and Earth System Sciences, 24, 945–966, https://doi.org/10.5194/hess-24-945-2020, 2020.
 - Wild, B., Andersson, A., Bröder, L., Vonk, J., Hugelius, G., McClelland, J. W., Song, W., Raymond, P. A., and Gustafsson, Ö.: Rivers across the Siberian Arctic unearth the patterns of carbon release from thawing permafrost, Proceedings of the National Academy of Sciences,
- 650 116, 10 280–10 285, https://doi.org/10.1073/pnas.1811797116, 2019.
 - Wu, R., Trubl, G., Taş, N., and Jansson, J. K.: Permafrost as a potential pathogen reservoir, One Earth, 5, 351–360, https://doi.org/10.1016/j.oneear.2022.03.010, 2022.

Yurova, A., Sirin, A., Buffam, I., Bishop, K., and Laudon, H.: Modeling the dissolved organic carbon output from a boreal mire using the convection-dispersion equation: Importance of representing sorption: MODELING DOC OUTPUT FROM A BOREAL MIRE, Water Resources Research, 44, https://doi.org/10.1029/2007WR006523, 2008.

Zimov, S. A., Schuur, E. A. G., and Chapin, F. S.: Permafrost and the Global Carbon Budget, Science, 312, 1612–1613, https://doi.org/10.1126/science.1128908, 2006.