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# Regional atmospheric cooling and wetting effect of permafrost thaw-induced boreal forest loss

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#### **Abstract**

In the sporadic permafrost zone of North America, thaw-induced boreal forest loss is leading to permafrost-free wetland expansion. These land cover changes alter landscape-scale surface properties with potentially large, however, still unknown impacts on regional climates. In this study, we combine nested eddy covariance flux tower measurements with satellite remote sensing to characterize the impacts of boreal forest loss on albedo, eco-physiological and aerodynamic surface properties, and turbulent energy fluxes of a lowland boreal forest region in the Northwest Territories, Canada. Planetary boundary layer modelling is used to estimate the potential forest loss impact on regional air temperature and atmospheric moisture. We show that thaw-induced conversion of forests to wetlands increases albedo, bulk surface conductance for water vapour and aerodynamic surface temperature. At the same time, heat transfer efficiency is reduced. These shifts in land surface properties increase latent at the expense of sensible heat fluxes, thus, drastically reducing Bowen ratios. Due to the lower albedo of forests and their masking effect of highly reflective snow, available energy is lower in wetlands, especially in late winter. Modelling results demonstrate that a conversion of a present-day boreal forest-wetland to a hypothetical homogeneous wetland landscape could induce a near-surface cooling effect on regional air temperatures of up to 3-4 °C in late winter and 1-2 °C in summer. An atmospheric wetting effect in summer is indicated by a maximum increase in water vapour mixing ratios of 2 mmol mol<sup>-1</sup>. At the same time, maximum boundary layer heights are reduced by about a third of the original height. In fall, simulated air temperature and atmospheric moisture between the two scenarios do not differ. Therefore, permafrost thaw-induced boreal forest loss may modify regional precipitation patterns and slow down regional warming trends.

Keywords: boreal forest, climate change, eddy covariance, energy flux, evapotranspiration, land cover change, permafrost, wetland

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# Introduction

A large proportion of North America's high-latitude landscapes contain permafrost, perennially cryotic ground, spanning from the tundra in the north, over subarctic woodlands, to the boreal forests further south (Strong *et al.*, 1989). About 60% of North America's boreal forests lie in the zones of discontinuous permafrost (50% to <90% of the land surface contains permafrost) and sporadic permafrost (10% to <50%) (e.g. Olson *et al.*, 2001; van Everdingen, 2005; Gruber, 2012; Helbig *et al.*, 2016). Across the circumpolar permafrost zone, rapid rates of climate warming are already occurring and are projected to intensify in the near future (Hartmann *et al.*, 2013).

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Climate change is expected to alter the composition and structure of boreal forest and wetland ecosystems inducing strong biophysical and biogeochemical feedbacks to global and regional climates through altered land-atmosphere interactions (e.g. Chapin et al., 2000, 2005; Meissner et al., 2003; Bonan, 2008; Alkama & Cescatti, 2016). At high latitudes, biophysical feedbacks to regional climates mainly imply changes in the surface fluxes of sensible and latent heat (Bonan, 2008). Vegetation composition and structure strongly determine physical and biological land surface properties such as albedo, surface temperature, and bulk aerodynamic and surface conductance (Eugster et al., 2000; Kasurinen et al., 2014). Thus, vegetation changes alter surface properties and consequently also turbulent energy flux regimes (e.g. Snyder et al., 2004; Davin & de Noblet-Ducoudré, 2010; Baldocchi & Ma, 2013; Luyssaert et al.,

2014; Alkama & Cescatti, 2016). For example, a shift from deciduous to coniferous forests decreases surface conductance and increases the Bowen ratio, the ratio of sensible to latent heat flux (Eugster *et al.*, 2000). The modified diurnal heat input to the regional planetary boundary layer (PBL) leads to altered diurnal PBL growth dynamics affecting its effective heat capacity, entrainment of dry air from the free atmosphere, and, consequently, feedbacks to regional air temperatures and convective rainfall (e.g. Baldocchi *et al.*, 2000; Juang *et al.*, 2007a; Esau *et al.*, 2012). In addition, boreal forests exert a strong biophysical influence on regional air temperatures even at latitudes far outside their zone of distribution due to its effect on the general circulation of the atmosphere (Bonan *et al.*, 1992; Snyder *et al.*, 2004).

At the southern limit of the permafrost zone in Canada and Alaska, warming air temperatures cause widespread thaw. In recent decades, thaw-induced disappearance of forested permafrost plateaus has led to a conversion of boreal forests to wetlands (e.g. Camill & Clark, 1998; Camill, 1999a; Jorgenson et al., 2001; Quinton et al., 2011; Helbig et al., 2016; Lara et al., 2016). Permafrost plateaus dominated by coniferous tree species rooted in raised, thick organic soils, and treeless, seasonally frozen wetlands are the two predominant land cover types of the lowland boreal landscapes in the discontinuous and sporadic permafrost zones of north-western Canada (Zoltai & Tarnocai, 1975; Tarnocai, 2006). The proportional coverage of forests and wetlands is affected by the degree of permafrost thaw (Quinton et al., 2011). Forested permafrost plateaus and wetlands differ in their soil moisture and temperature regimes with wetlands being substantially wetter and warmer (Chasmer et al., 2011a; Quinton & Baltzer, 2013; Baltzer et al., 2014; Fig. S1). In wetlands, root inundation and mortality inhibits tree growth, resulting in sharp forest-wetland transitions of vegetation composition and structure (e.g. Camill, 1999b; Baltzer et al., 2014).

Despite the importance of boreal forests in the permafrost zone for the global and regional climates (Chapin *et al.*, 2000), local- to regional-scale responses of land–atmosphere interactions to thaw-induced land cover change are still poorly understood. It remains unclear as to how such vegetation shifts may affect turbulent energy fluxes and how these might modify regional trends in air temperature and atmospheric

moisture. The biophysical consequences of permafrost thaw-induced boreal forest loss and ultimately disappearance have received little attention compared with deforestation in the temperate and tropical zones and wildfires in the boreal zone (e.g. Liu *et al.*, 2005; Randerson *et al.*, 2006). The impacts of disappearing permafrost on regional turbulent energy flux regimes need to be better constrained to project the trends of air temperature and atmospheric moisture in the boreal zone (Chapin *et al.*, 2000) and to evaluate the performance of current land surface schemes and terrestrial biosphere models (Fisher *et al.*, 2014). In this study, we aim to:

- 1 quantify the impact of permafrost disappearance and concurrent tree cover loss on turbulent energy fluxes,
- 2 identify the landscape-scale (~1 km²) changes in land surface properties causing turbulent energy flux changes,
- 3 quantify boreal tree cover controls on land surface properties on a regional scale (~4000 km²) and
- 4 estimate potential effects of thaw-induced shifts in land cover on regional air temperature and atmospheric moisture.

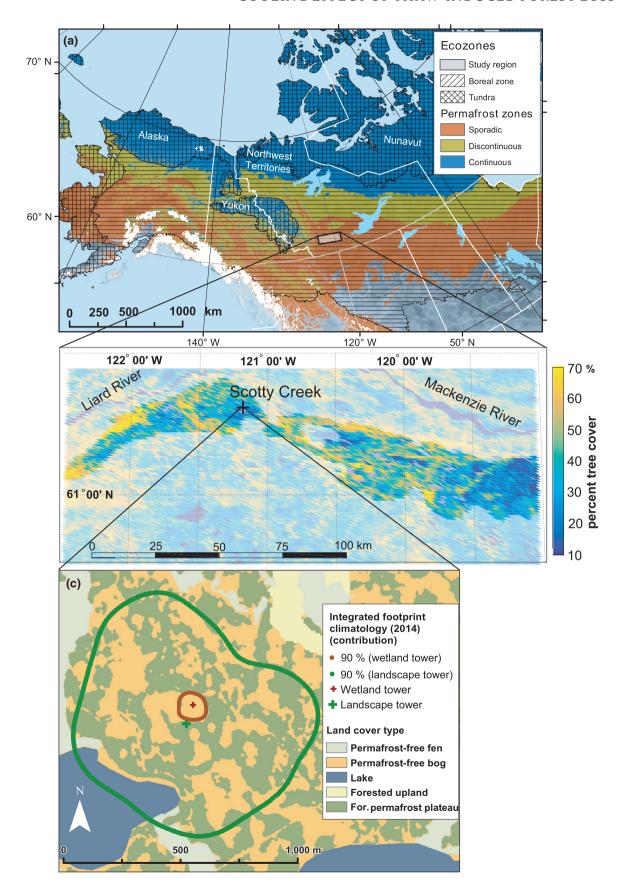
#### Materials and methods

Study site

Scotty Creek (61°18'N; 121°18'W, NT, Canada) is a 152-km<sup>2</sup> watershed located in the southern Taiga Plains and is situated in the zone of sporadic permafrost (Fig. 1a). The southern part of the watershed is characterized by rapidly thawing permafrost resulting in a mosaic of forested permafrost plateaus, wetlands, forested uplands and shallow thaw lakes (Chasmer et al., 2014). Permafrost-free wetlands occur as collapse-scar bogs that receive some lateral inflow of water from the surrounding forests, and as channel fens that route water towards the watershed outlet (National Wetlands Working Group, 1997; Quinton et al., 2009). Organic soils are widespread in the region with peat thickness ranging from 0.6 to 5 m (Aylsworth et al., 1993). Black spruce (Picea mariana) is the dominant tree species on the forested permafrost plateaus. Understorey and ground cover on the permafrost plateaus mainly consist of Labrador tea (Rhododendron groenlandicum), ground lichen (Cladonia spp.), and Sphagnum fuscum and capillifolium. Sphagnum balticum and magellanicum and ericaceous shrubs mainly populate the collapse-scar bogs (Garon-Labrecque et al., 2015).

The mean annual air temperature (1981–2010) in Fort Simpson, ca. 60 km north of Scotty Creek, is -2.8 °C with a mean

Fig. 1 (a) Location of the Scotty Creek watershed (surface elevation ~285 m a.s.l.), zones of sporadic (10% to <50% areal permafrost coverage), discontinuous (50% to <90%), and continuous ( $\ge90\%$ ) permafrost (data from Gruber, 2012), and areal extent of the boreal and tundra zones (data from Olson *et al.*, 2001). (b) Per cent tree cover in 2010 in the southern Taiga Plains. Pixels with surface elevations <250 m a.s.l. and >300 m a.s.l. are shaded. (c) Land cover types in the vicinity of the two flux towers (Chasmer *et al.*, 2014) and their flux footprint climatologies for the period April to November 2014.



January air temperature of  $-24.2~^{\circ}\text{C}$  and a mean July air temperature of 17.4  $^{\circ}\text{C}$ . The long-term mean total annual precipitation (1981–2010) is 388 mm. Snowfall accounts for about 50% of the total annual precipitation. During the study period, from May to November 2013 and April to November 2014, mean air temperature was 2.1 and 0.2  $^{\circ}\text{C}$  warmer and total precipitation was 73 mm (26%) and 87 mm (29%) lower than the long-term average, respectively (Environment Canada, 2014).

## Eddy covariance measurements

Turbulent momentum and energy fluxes were measured at Scotty Creek using the eddy covariance technique at two nested micrometeorological towers (Baldocchi, 2014). One eddy covariance system was mounted on top of a 15-m tower with flux footprints originating from a boreal forest—wetland landscape (hereafter referred to as 'landscape tower', measurement period: 11 May 2013 to 07 November 2014). A second system was installed on a 2-m tower in a wetland just north of the landscape tower at 1.9 m above the ground surface (hereafter referred to as 'wetland tower', measurement period: 12 April 2014 to 07 November 2014). Its flux footprints originated mainly from the wetland and were within the landscape tower flux footprint (Fig. 1c).

The eddy covariance instrumentation, identical at both towers, included a sonic anemometer (CSAT3A; Campbell Scientific Inc., Logan, UT, USA) and a CO<sub>2</sub>/H<sub>2</sub>O open-path infrared gas analyser (EC150; Campbell Scientific Inc.), both operating at 10-Hz frequencies. Friction velocity ( $u_*$ ; m s<sup>-1</sup>), sensible (H, W m<sup>-2</sup>) and latent heat fluxes (LE, W m<sup>-2</sup>) were computed using the EddyPro software (version 5.2, LI-COR Biosciences, Lincoln, NE, USA). For the landscape tower, a planar fit method was deployed to rotate the coordinate system of the sonic anemometer into the mean streamlines of the wind field (Wilczak et al., 2001). To account for small seasonal changes in the orientation of the sonic anemometer due to potential variations of the wetland surface, a double rotation method was applied for the wetland tower, so that the halfhourly mean vertical wind velocity equalled zero. Further corrections were applied to take into account spikes in the highfrequency time series (Vickers & Mahrt, 1997), humidity effects on sonic temperature (Van Dijk et al., 2004), block averaging of half-hour time series, time lag detection, spectral attenuation (Moncrieff et al., 1997, 2004), and air density fluctuations for water vapour fluxes (Webb et al., 1980).

## Supporting measurements

Four-component net radiometers (CNR4, Kipp & Zonen, Delft, The Netherlands) at the landscape (at a height of 13.4 m) and the wetland (2.1 m) tower measured incoming and outgoing short- and long-wave radiation fluxes. Following Schmid (1997), the radiometric footprint (80% contour) at the landscape tower contained 77% forest with the remaining 23% being wetland. The radiometric footprint at the wetland tower consisted only of wetland. Therefore, the radiation fluxes at the landscape and the wetland tower were considered to

represent forest and wetland surfaces, respectively. Air temperature and relative humidity probes (HC2-S3; Rotronic AG, Bassersdorf, Switzerland) were installed at 15 m and at 2.6 m at the landscape and the wetland tower, respectively. Soil heat flux at 8 cm below the moss surface at the forest and at the wetland was measured in a hummock and hollow using two ground heat flux plates (HFT3, Hukseflux, Delft, The Netherlands) at each site. To calculate soil heat storage between the heat flux plates and the moss surface, half-hourly changes in soil temperatures at 2, 4 and 8 cm below the surface (TCAV; Campbell Scientific Inc. and Type 'T'; Omega Engineering, Stamford, CT, USA) were used assuming a constant heat capacity of the peat above the heat flux plate of 2 MJ m<sup>-3</sup> K<sup>-1</sup> (Hayashi et al., 2007). Snow depth was measured in the forest and in the wetland using an ultrasonic distance sensor (SR50; Campbell Scientific Inc.). Snow density was measured on 10 days during late winter 2014 between 25 March and 22 April using a snow tube. Half-hour changes in snow depth, mean snow density and the latent heat of fusion of water were used to calculate the forest and wetland snow melt energy flux.

# Footprint modelling

To resolve the spatial heterogeneity within the flux tower footprints, we ran the 2D footprint parameterization of Kljun et al. (2015) for both towers providing not only the extent but also the width of footprints. Similar to the model of Kljun et al. (2004), this parameterization is based on the Lagrangian particle dispersion footprint model of Kljun et al. (2002) and is valid for convective to stable boundary layer conditions. The footprint model was used to calculate the half-hourly per-grid cell flux contributions for a discretized study area. Roughness lengths for momentum ( $z_{0m}$ ; m) and zero-plane displacement heights ( $d_0$ ; m) for each half-hour were derived from high-frequency sonic anemometer data to account for the spatial heterogeneity in canopy height and geometry (see A1 and Supplementary material). The relative half-hourly flux contributions of each land cover type to the total flux were calculated as the weighted sum of the respective per-grid cell flux contributions. The 90% flux footprints of the landscape tower mainly contained a mix of wetlands and forests, while the wetland tower predominantly contained surfaces from one ecosystem, the wetland (Fig. 1c).

# Postprocessing of eddy covariance measurements

A three-class quality flag system (Mauder & Foken, 2011) was used to remove half-hourly periods that do not meet steady-state conditions or when turbulence was not fully developed. Remaining outliers were filtered using a spike detection algorithm (Papale *et al.*, 2006). To ensure the comparability between flux measurements at the landscape and the wetland tower, we assessed their energy balance closures (EBC). The EBC was 0.79 and 0.78 for the landscape and the wetland tower, respectively, after removing wetland tower fluxes with <95% wetland contribution and applying a u\*-threshold filter ( $u^* = 0.2 \text{ m s}^{-1}$ ). (see A2). These EBC values are in good

agreement with Stoy et al. (2013) who reported a mean EBC of  $0.76\,\pm\,0.13$  and of  $0.88\,\pm\,0.23$  for seven wetlands and 47 evergreen needle-leaf forest sites, respectively.

Experimental errors in eddy covariance measurements are a combination of systematic and random errors (Moncrieff et al., 1996). The potential systematic error derived from the EBC analysis (~20%) does not hamper the comparability of H and LE between the two towers, assuming that the EBC residuals are similarly attributed to H and LE for the landscape and the wetland tower. Maximum instrument-specific systematic errors in LE are estimated to be  $\pm 8\%$  based on an intercomparison study of the open-path EC150 with closed-path infrared gas analysers (M. Helbig, K. Wischnewski, G. H. Gosselin, S. C. Biraud, I. Bogoev, W. S. Chan, E. S. Euskirchen, A. J. Glenn, P. M. Marsh, W. L. Quinton, O. Sonnentag, unpublished results).

Random half-hourly errors in H and LE were estimated as the standard deviation of H and LE for similar meteorological conditions and flux footprints within a time window of  $\pm 7$  days (Lasslop et al., 2008). These random errors were used in regression analyses after York et al. (2004), accounting for errors in both the dependent and the independent variables. Mean random errors were 16.3 and 9.1 W m<sup>-2</sup> in H, and 12.2 and  $14.5~\mathrm{W}~\mathrm{m}^{-2}$  in LE for the landscape and the wetland tower, respectively, and increased with the magnitude of both fluxes (Fig. S5).

## Landscape-scale surface properties

Albedo and radiometric surface temperature represent two surface properties that are sensitive to changes in ecosystem structure and composition (e.g. Betts & Ball, 1997; Juang et al., 2007b; Lee et al., 2011), thus strongly affecting land-atmosphere interactions (e.g. Betts et al., 2001). Tower-based radiation measurements over the wetland (2014) and over the forest (2013 and 2014) were used to assess the effects of thawinduced forest loss on landscape-scale albedo and radiometric surface temperature. Aerodynamic surface properties, such as bulk aerodynamic conductance for heat and water vapour  $(g_H; m s^{-1}; see Supplementary material)$  and bulk surface conductance for water vapour (g<sub>s</sub>; m s<sup>-1</sup>), were derived using Monin-Obukhov similarity theory (Garratt, 1994; Betts et al., 1999). We derived aerodynamic surface temperature ( $T_{as}$ ; K) of the flux footprints from measured H and modelled  $g_H$  using the following bulk transfer relationship:

$$H = \rho C_{\rm p} g_{\rm H} (T_{\rm as} - T_{\rm a}) \tag{1}$$

where  $\rho$  is air density [kg m<sup>-3</sup>],  $C_p$  is the heat capacity of air [J kg<sup>-1</sup> K<sup>-1</sup>], and  $T_a$  is air temperature [K].

Aerodynamic surface temperature directly controls the turbulent heat exchange between land surface and overlying atmosphere. Thus,  $T_{as}$  differs from radiometric surface temperature, which represents a weighted soil and canopy temperature as function of viewing angle of the thermal-infrared radiometer mounted on tower platforms (Detto et al., 2006; Kustas et al., 2006) or satellite platforms (Wan, 2014).

Similarly, we obtained a bulk formulation for LE by assuming the same bulk aerodynamic conductance as for sensible heat  $(g_H)$  and by adding a bulk surface conductance term,  $g_s$ (Betts et al., 1999):

$$LE = \lambda \left(\frac{g_{\rm H}g_{\rm s}}{g_{\rm H} + g_{\rm s}}\right) [q_{\rm s}(T_{\rm as}) - q_{\rm a}] \tag{2}$$

where  $\lambda$  is the latent heat of vapourization [J kg<sup>-1</sup>],  $q_s$  is the saturated specific humidity of air at  $T_{as}$  [kg kg<sup>-1</sup>], and  $q_a$  is the specific humidity of air at measurement height [kg kg<sup>-1</sup>].

Increasing wetland coverage in the boreal forest-wetland landscape may affect the response of  $g_s$  to variations in vapour pressure deficit (VPD; kPa) and incoming short-wave radiation (SW<sub>in</sub>; W m<sup>-2</sup>). We applied a boundary line analysis by fitting nonlinear VPD and SW<sub>in</sub> models to the upper boundary of half-hourly g<sub>s</sub> for three flux footprint classes of increasing wetland contribution (e.g. Grelle et al., 1999; Igarashi et al., 2015): a 'low wetland class' with footprint contributions from wetlands <63%, a 'medium wetland class' with contributions from wetlands between 63% and 95%, and a 'high wetland class' with contributions from wetlands >95% (i.e. from the wetland tower). Only the maximum g<sub>s</sub> in each VPD and SW<sub>in</sub> bin  $(G_{s\_bound}; m s^{-1})$  were selected to minimize reductions in  $g_s$  due to other environmental drivers (see A3).

# Regional-scale patterns of albedo and radiometric surface temperature

To assess regional effects of permafrost thaw-induced tree cover loss on albedo and radiometric surface temperature ( $T_{rs}$ ; K), we analysed several MODIS satellite products for a ~4000-km<sup>2</sup> area of interest in the southern Taiga Plains (Fig. 1b). These products included per cent tree cover from the annual MOD44B Vegetation Continuous Field product, white-sky albedo from the 16day MCD43B3 Albedo product, and daytime and night-time  $T_{rs}$ from the 8-day MOD11A2 Land Surface Temperature/Emissivity product for the years 2000-2015. White-sky albedo does not account for the direct radiative component and is therefore not a function of solar angle and atmospheric conditions, making it suitable for the assessment of albedo variations due to changes in surface characteristics (Schaepman-Strub et al., 2006; Jin et al.,

Surface elevation from the MODIS Geolocation product (MOD03) was used to mask pixels with elevations below 250 m a.s.l. and above 300 m a.s.l. to minimize altitudinal effects on Trs (e.g. Li et al., 2015). Scotty Creek is located at 285 m a.s.l. Pixels classified as open water bodies by the MODIS Land Water Mask (MOD44W) were discarded from the analysis. We only analysed white-sky albedo and  $T_{\rm rs}$ pixels with good-quality flags and with error flags indicating an average  $T_{\rm rs}$  error  $\leq 3$  K. To remove thermal anomalies in  $T_{\rm rs}$ due to wildfires, we masked all pixels identified as active fires by the MODIS Thermal Anomalies & Fire product (MOD14A1). All data sets were resampled to a spatial resolution of 1 km<sup>2</sup>.

# Planetary boundary layer modelling

The potential impact of a conversion of the present-day heterogeneous boreal forest-wetland to a hypothetical

homogeneous permafrost-free, treeless wetland landscape on potential air temperature ( $\theta_m$ ; K) and water vapour mixing ratio ( $q_m$ ; mol mol<sup>-1</sup>) in the PBL was assessed with a clear-sky PBL model (McNaughton & Spriggs, 1986; Baldocchi & Ma, 2013; see A4). We ran the PBL model using  $u_*$ , H and LE from the landscape (representing a present-day heterogeneous landscape with permafrost) and the wetland tower (as a proxy for a hypothetical homogeneous permafrost-free landscape) and compared the diurnal  $\theta_{\rm m}$  and  $q_{\rm m}$  dynamics. The model inputs H and LE were corrected for the observed lack of EBC maintaining the Bowen ratio (Twine et al., 2000). To illustrate diurnal  $\theta_{\rm m}$  and  $q_{\rm m}$  dynamics for the two scenarios, we analysed modelled  $\theta_{\rm m}$  and  $q_{\rm m}$  for one clear-sky day in the summer with no gaps in the model input time series (22 June 2014: 0800 - 2100 Mountain Standard Time (MST)). The mean footprint contributions for the landscape tower fluxes on that day were 40% from wetlands, 56% from forested peat plateaus and 4% from the lake. These contributions are representative for the present-day landscape in the southern part of the Scotty Creek watershed that consisted of  $57 \pm 8\%$  and  $52 \pm 9\%$  forested permafrost plateaus in 2000 and 2010, respectively (Baltzer et al., 2014). Additionally, we ran the PBL model for a total of 49 days between 15 May 2014 and 08 October 2014 and derived daily  $\theta_{\rm m}$  and  $q_{\rm m}$  differences between the two landscape scenarios at 1800 MST (see A4 for selection criteria for modelled days). We compared PBL dynamics as observed over the present-day boreal forestwetland landscape to a hypothetical permafrost-free wetland landscape. However, complete disappearance of permafrost likely enhances large-scale drainage conditions (e.g. Connon et al., 2014). The current conditions at the studied wetland site may therefore not be directly representative of a future, potentially drier, permafrost-free boreal landscape. Hence, the modelled absolute changes in  $\theta_{\rm m}$  and  $q_{\rm m}$  should be seen as an upper limit.

#### **Results**

# Changes in turbulent energy fluxes

At the end of winter in May 2014, a frost layer with a maximum depth of about 80 cm was observed in the wetland (Fig. S1). The mean water table between April and November 2014 was 15 cm below the moss surface. In contrast, a maximum thawed layer of 40 cm overlaid cryotic soil between May and September 2014 in the forest and the decrease in water table level closely followed thaw depth during the summer. In 2014, the snow melt at the forest and the wetland occurred at the end of April and the ground was snow-covered again in October (Fig. S1). During the snow cover period in late winter, half-hourly H at the wetland tower ( $H_{WET}$ ) was negative most of the time, while H at the landscape tower (H<sub>LAND</sub>) already reached maximum values of 200 W m<sup>-2</sup> (Fig. 2a). At the same time, the largest mean midday (1200 - 1500 MST) Bowen ratio was observed for the landscape tower with 7.6  $\pm$  0.8 ( $\pm$ 95% CI of mean), while the mean midday Bowen ratio at the wetland tower was the lowest with  $-0.3 \pm 0.3$  (Fig. 2c). Between May and November 2014,  $H_{WET}$  amounted to about 50% of  $H_{LAND}$  and the ratio of the two fluxes approached unity with higher contributions of

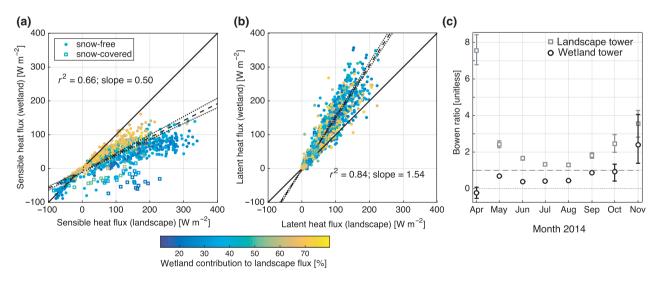


Fig. 2 (a) Turbulent sensible and (b) latent heat fluxes at the landscape (over a boreal forest–wetland landscape) and at the wetland tower (over a permafrost-free wetland) between 12 April and 07 November 2014. Colours of dots indicate relative contributions of wetlands to landscape tower fluxes. Best-fit lines with errors in both variables (York *et al.*, 2004) for the snow-free period are indicated as black dashed lines and slopes were significant at  $\alpha = 0.001$ . Dotted black lines indicate 95% confidence intervals (CI) of the regression as derived from 1000 bootstrap simulations of the data. (c) Monthly mean midday (1200–1500 MST) Bowen ratio (sensible heat flux/ latent heat flux) for the landscape and the wetland tower. Error bars indicate the 95% CI of the means.

wetlands in the landscape tower footprints (Fig. 2a, slope of  $H_{LAND}$  against  $H_{WET}$  increased significantly from 0.47 to 0.64 [P < 0.001 two-sample non-parametric Kolmogorov-Smirnov test] for  $H_{LAND}$  with wetland contributions ≤36% (25th percentile) versus ≥63% (75th). In contrast, half-hourly LE at the wetland tower  $(LE_{WET})$  was about 54% larger than LE at the landscape tower (LE<sub>LAND</sub>, Fig. 2b). Slopes of LE<sub>LAND</sub> against LE<sub>WET</sub> were closer to unity with increasing contributions of wetlands to LE<sub>LAND</sub> (slope decreased significantly from 1.63 to 1.47 [P < 0.001] for  $LE_{LAND}$  with wetland contributions ≤36% vs. ≥63%). Monthly mean midday Bowen ratios in the snow-free period ranged from 1.3 in July to 2.5 in October and from 0.4 in June to 0.9 in October at the landscape and the wetland tower, respectively (Fig. 2c). The total half-hourly turbulent energy flux (H + LE) was 13% smaller at the wetland tower compared to the landscape tower (slope = 0.87,  $r^2 = 0.86$ ).

## Changes in surface properties

Albedo. Albedo determines how much short-wave radiation is reflected at the surface and, therefore, partly controls the available energy to generate H and LE. Between April and November 2014, the wetland albedo was consistently higher than the forest albedo, except for a 3-day period (28-30 April 2014) shortly after snow melt when the wetland was flooded (Fig. S2). Maximum albedo differences of 0.5 were observed during the snow cover period (April and October - November 2014). During the snow-free period, the wetland albedo exceeded the forest albedo by about 0.1. The regional

median albedo  $(2000 - 2015; \sim 4000 \text{ km}^2)$  in the southern Taiga Plains (Fig. 1b) showed similar seasonal dynamics as the albedo measured at the two towers. Median per cent tree cover of the region was 35% (2.5% percentile: 9%, 97.5% percentile: 69%). The forest albedo at Scotty Creek corresponded to the values at the lower end of the distribution of regional albedo, whereas the wetland albedo was consistently higher than the 95% confidence interval (except for the flooded period, Fig. 3).

Aerodynamic conductance. The median bulk aerodynamic conductance for heat  $(g_H)$  was 37.8 mm s<sup>-1</sup>  $(2.5\% \text{ percentile: } 15.8 \text{ mm s}^{-1}, 97.5\% \text{ percentile:}$  $69.8 \text{ mm s}^{-1}$ ) for the landscape and 23.7 mm s<sup>-1</sup> (2.5% percentile:  $16.6 \text{ mm s}^{-1}$ , 97.5% percentile:  $40.8 \text{ mm s}^{-1}$ ) for the wetland tower. Differences between gH at the landscape and the wetland tower decreased with increasing wetland contributions to the landscape fluxes (Fig. 4). Median-weighted LiDAR-derived canopy height (see A1) within the flux footprints was 2.0 m (2.5% percentile: 1.1 m, 97.5% percentile: 3.7 m) and 0.3 m (2.5% percentile: 0.1 m, 97.5% percentile: 0.4 m) for the landscape and the wetland tower, respectively. Surface roughness length  $(z_0)$  increased linearly with the mean weighted LiDAR-derived canopy height ( $r^2 = 0.75$ , P < 0.001) and wetland contributions to flux footprints  $(r^2 = 0.57, P < 0.001; Fig. S3).$ 

Aerodynamic surface temperature. A surface cooling effect of wetlands is indicated by increasingly warmer  $T_{\rm as}$  of the landscape tower footprints ( $T_{as\_LAND}$ ) with decreasing wetland contributions compared to  $T_{as}$  of the

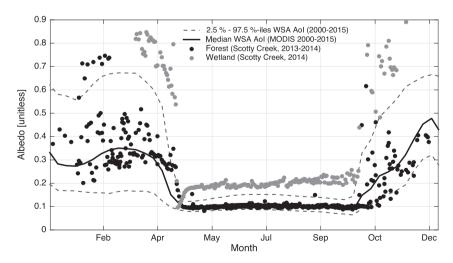
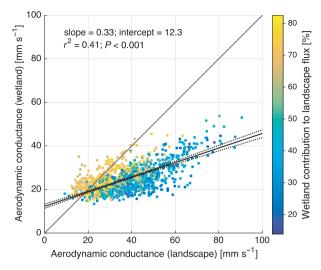


Fig. 3 Daily albedo of a boreal forest on a permafrost plateau (black dots, 2013-2014) and an adjacent permafrost-free wetland (grey dots, 2014), derived from four-component net radiometers at 1200 MST, and median (solid line, 2000-2015) and 2.5% percentile and 97.5% percentile (dotted lines) of 8-day 1-km white-sky albedo (WSA) across a ~4000 km<sup>2</sup> area of interest (AoI) in the southern Taiga Plains (derived from MCD43B3). Percentiles show spatial variability across the AoI.



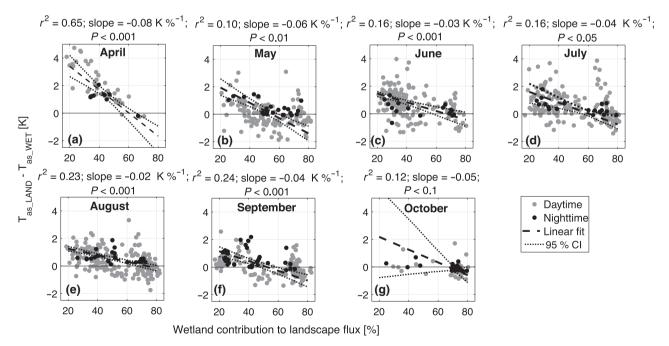
**Fig. 4** Bulk aerodynamic conductance for heat in the footprints of the landscape and wetland tower. Colours of dots indicate contributions of wetlands to landscape tower fluxes. The total least-squares regression fit is shown as a solid black line. Dotted black lines indicate the 95% confidence interval of the regression as derived from 1000 bootstrap simulations of the data.

wetland ( $T_{\rm as\_WET}$ ). The strongest cooling effect of 0.08 K per per cent wetland contribution (K % $^{-1}$ ) was observed for the snow cover period (Fig. 5a). During the snow-free period, wetland cooling ranged from 0.02

to 0.06 K  $\%^{-1}$  and coefficients of determination between differences in  $T_{\rm as\_LAND}$  and  $T_{\rm as\_WET}$  and wetland contributions to landscape fluxes increased from 0.10 in May to 0.24 in September (Figs. 5b–g). Both, daytime and night-time  $T_{\rm as\_LAND}$ , were warmer than  $T_{\rm as\_WET}$  during the snow cover period. During the snow-free period, night-time  $T_{\rm as\_LAND}$  was consistently warmer than  $T_{\rm as\_WET}$ , whereas daytime  $T_{\rm as\_LAND}$  was at times colder than  $T_{\rm as\_WET}$  (Fig. 5).

Surface conductance. In May and June 2013 and 2014, maximum bulk surface conductance ( $g_{s_-0}$ ;  $G_{s_-bound}$  at a VPD of 0 kPa, see A3) increased from 7.2 mm s<sup>-1</sup> (Fig. 6a and Table 1) for the 'low wetland class' to 34.5 mm s<sup>-1</sup> for the 'high wetland class'. In late summer, a similar increase was observed, but  $g_{s_-0}$  for the high wetland class was reduced to 18.0 mm s<sup>-1</sup>. The sensitivity of  $G_{s_-bound}$  to VPD ( $G_{s_-bound} = g_{s_-0}$  e<sup>(- $b_d$  VPD)</sup>; see A3) was most pronounced for the 'high wetland class' for May and June with the slope parameter  $b_d$  being 0.57 kPa<sup>-1</sup>, whereas the 'medium wetland class' had the strongest sensitivity of  $G_{s_-bound}$  to VPD between July and August with a  $b_d$  of 0.48 kPa<sup>-1</sup>. The 'low wetland class' was the least sensitive during both periods (Table 1 and Fig. 6).

The limit of  $G_{s\_bound}$  at infinite  $SW_{in}$  ( $g_{s\_max}$  in  $G_{s\_bound} = g_{s\_max}$  [ $SW_{in}/(b_{infl} + SW_{in})$ ]; see A3)



**Fig. 5** Differences between aerodynamic surface temperatures of the landscape ( $T_{as\_LAND}$ ) and the wetland tower flux footprints ( $T_{as\_WET}$ ) as a function of wetland contributions to the landscape tower fluxes between April and October 2014. Daytime (grey dots) and night-time (black dots) differences are shown separately. Night-time is defined as periods with <50 W m<sup>-2</sup> incoming short-wave radiation. Best-fit lines with errors in both variables (York *et al.*, 2004) are shown as dashed lines. Dotted lines indicate the 95% confidence intervals of best-fit lines as derived from 1000 bootstrap simulations of the data.

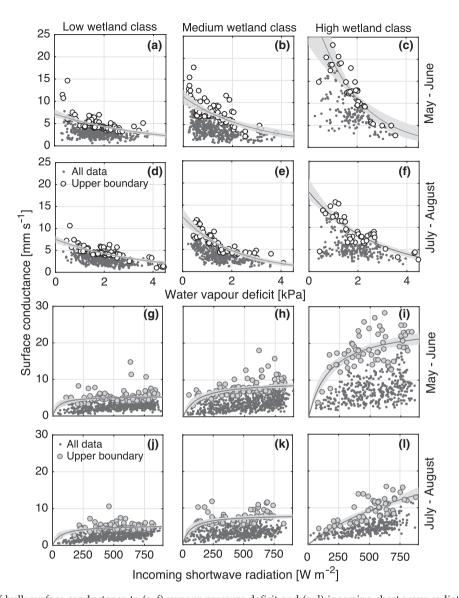


Fig. 6 Response of bulk surface conductance to (a-f) vapour pressure deficit and (g-l) incoming short wave radiation for the periods (a-c and g-i) May and June and (d-f and j-l) July and August for three classes of increasing permafrost-free wetland contributions ('low', 'medium', 'high'). Nonlinear model fits to the upper 15% of bulk surface conductance per 0.5 kPa (white circles) and 100 W m<sup>-2</sup> bins (grey circles) are shown as solid lines. 95% confidence intervals are shown as shaded areas.

increased with increasing flux footprints contributions from wetlands peaking in July and August at 33.8 mm s<sup>-1</sup>. The inflection point of the  $G_{\rm s\ bound}$  vs.  $SW_{in}$  relationship ( $b_{infl}$  [W m<sup>-2</sup>], see A3) ranged between  $45.8~\mathrm{W~m}^{-2}$  and  $1337.2~\mathrm{W~m}^{2}$  and was always highest for the 'high wetland class'. However,  $b_{infl}$  between classes were not significantly different, except for  $b_{infl}$  for the 'high wetland class' for July-August, which was significantly higher (Table 1). In July and August,  $g_{s \text{ max}}$ and  $b_{infl}$  were poorly constrained for the 'high wetland class' with 95% CI of 138.1 mm s<sup>-1</sup> and 7531.4 W m<sup>-2</sup>, respectively (Fig. 6).

Regional-scale controls on surface properties in the lowlands of the southern Taiga Plains

To assess the regional-scale relationships between tree cover and daytime and night-time  $T_{\rm rs}$  and albedo, we analysed 1-km MODIS per cent tree cover,  $T_{rs}$ , and white-sky albedo between 2000 and 2015 for the southern Taiga Plains (Fig. 1b). The strongest relationships between daytime and night-time  $T_{rs}$  and tree cover were observed for March and April with  $r^2$  of 0.34 and 0.27, respectively (Fig. 7a). During the night, areas with high tree cover were characterized by warmer  $T_{\rm rs}$ 

throughout the year with maximum  $T_{\rm rs}$  sensitivities to tree cover of 0.08 K %<sup>-1</sup> in late winter. During the snow-free period (May to November), sensitivities were

smaller with about 0.01 K  $\%^{-1}$  (expressed as increase in K per one per cent tree cover). Similarly, during the day,  $T_{\rm rs}$  increased with tree cover during the winter

Table 1 Best parameter estimates and their 95% confidence intervals (CI) for vapour pressure deficit ( $G_{s\_bound} = g_{s\_0} e^{(-b_d \text{ VPD})}$ ) and an incoming short-wave radiation models ( $G_{s\_bound} = g_{s\_max} [SW_{in}/(b_{infl} + SW_{in})]$ ) of the upper boundary of bulk surface conductance ( $G_{s\_bound}$ ) for the periods May–June and July–August and for three classes of increasing permafrost-free wetland contribution to flux footprints.  $G_{s\_bound}$  at a vapour pressure deficit of 0 kPa is given by  $g_{s\_0}$ , while  $b_d$  is a slope parameter.  $G_{s\_bound}$  at infinite short-wave incoming radiation is given by  $g_{s\_max}$ , while  $b_{infl}$  is the inflection point (i.e. indicates the radiation value at which half of  $g_{s\_max}$  is reached)

Wetland class	Vapour pressure deficit (VPD) model				Incoming short-wave radiation (SW <sub>in</sub> ) model			
	$g_{s_{-0}} [\text{mm s}^{-1}]$	95% CI	$b_{\rm d}[{\rm kPa}^{-1}]$	95% CI	$g_{s_{\text{max}}} [\text{mm s}^{-1}]$	95% CI	$b_{\rm infl}$ [W m <sup>-2</sup> ]	95% CI
	May–June							
Low	7.2	6.4-8.2	0.25	0.19-0.32	5.5	5.1-6.1	45.8	12.2-107.1
Medium	11.3	9.5-12.9	0.35	0.23 - 0.45	9.6	8.4-10.9	120.6	51.8-197.1
High	34.5	23.2-53.1	0.57	0.36-0.80	25.3	22.0-29.4	175.4	96.7-279.3
	July-August							
Low	7.5	6.6-8.3	0.28	0.22 - 0.33	5.5	4.9-6.2	71.4	20.6-144.7
Medium	12.4	10.7-14.3	0.48	0.39-0.59	8.2	7.4-9.3	63.1	28.8-113.5
High	18.0	16.4-21.0	0.38	0.32 - 0.46	33.8	20.2-158.3	1337.2	567.8-8099.2

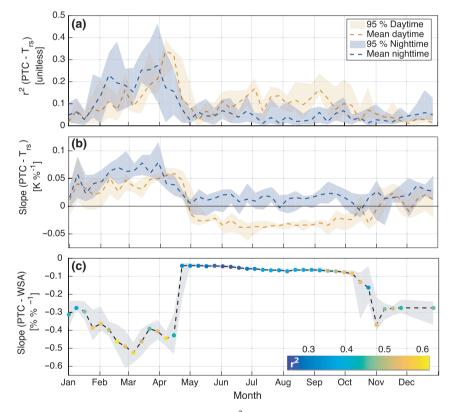


Fig. 7 (a) Seasonal dynamics of mean coefficients of determination ( $r^2$ ) between 1-km per cent tree cover (PTC; MODIS VCF MOD44B) and 1-km daytime and night-time radiometric surface temperature ( $T_{\rm rs}$  at about 1230 and 0030 MST, respectively; MODIS Land Surface Temperature/Emissivity MOD11A2) for a ~4000 km² area in the southern Taiga Plains. (b) Seasonal dynamics of mean slopes of the regression between PTC and  $T_{\rm rs\_rad}$ . (c) Seasonal dynamics of mean slopes between PTC and white-sky albedo (WSA, MODIS Albedo MOD43A3). Colours of dots represent mean  $r^2$ . Shaded areas indicate the 95% confidence intervals of the means for the period 2000–2015. All slopes are significant at  $\alpha = 0.001$ .

(November to April) peaking at 0.06 K %<sup>-1</sup> in mid-April. In contrast, high tree cover areas were characterized by colder  $T_{rs}$  compared to areas with low tree cover during the snow-free period (negative slopes of up to  $-0.04 \text{ K } \%^{-1}$ , Fig. 7b).

The strongest relationships between  $T_{rs}$  and tree cover in late winter coincided with the strongest relationship between tree cover and albedo (maximum slope of -0.55% %<sup>-1</sup> in March;  $r^2 = 0.62$ ; Fig. 7c). In April, slopes and  $r^2$  between tree cover and albedo rapidly decreased and remained small until September before they gradually increased again to a slope of  $-0.38 \% \%^{-1}$  and an  $r^2$ of 0.36 in early November (Fig. 7c).

In comparison, tower-based  $T_{rs}$  for the forest and wetland during the snow-free period indicate that median  $T_{rs}$  of the forest was 0.5 K colder during the day (1030 MST) and 1.7 K warmer during the night (2230 MST) (Fig. S4). During late winter, just before snow melt (13-30 April 2014), median daytime and nighttime  $T_{\rm rs}$  of the forest was consistently warmer than  $T_{\rm rs}$ of the wetland with differences of 1.2 and 1.8 K, respectively (Fig. S4).

Permafrost thaw-induced boreal forest loss effects on regional air temperature and atmospheric moisture

To estimate the potential effects of permafrost thawinduced boreal forest loss on air temperature and atmospheric moisture, we modelled diurnal dynamics of PBL height,  $\theta_{\rm m}$ , and  $q_{\rm m}$  for 49 clear-sky days in 2014 for two scenarios: a present-day heterogeneous boreal forest-wetland landscape ('present-day landscape') and a hypothetical homogeneous, permafrost-free, treeless wetland landscape ('permafrost-free landscape'). Results for one clear-sky day (22 June 2014) are discussed in detail.

Clear-sky conditions are usually characterized by a smooth diurnal curve of SW<sub>in</sub> as observed on 22 June 2014 (Fig. 8a). Heat flux for the present-day scenario peaked at 1300 MST. In comparison, the sensible heat flux for the permafrost-free scenario was consistently smaller and peaked at 1200 MST. For the permafrostfree scenario, LE was larger than the present-day scenario LE between 1000 MST and 2030 MST and was slightly smaller during the morning hours (Fig. 8a).

Modelled  $\theta_{\rm m}$  fitted measured  $\theta_{\rm m}$  with a RMSE of 0.7 °C, while modelled  $q_{\rm m}$  had a RMSE of 0.7 mmol mol<sup>-1</sup>. The present-day scenario was warmer and drier than the permafrost-free scenario with differences of 2.0 °C in  $\theta_{\rm m}$  and 1.9 mmol mol<sup>-1</sup> in  $q_m$  just before the PBL collapsed (Fig. 8b, c).

The PBL height was consistently larger for the present-day scenario compared to the permafrost-free scenario with differences of up to around 600 m. The

mean effective heat capacity of the PBL for the presentday scenario was 52% higher. For the present-day and the permafrost-free scenario, 35% and 54% of the total sensible heat input was entrained with warm air from above the mixed layer. The total sensible heat input from the entrainment layer was 27% larger for the permafrost-free scenario just before the collapse of the PBL, mainly due to an enhanced gradient for this scenario between  $\theta_{\rm m}$  and potential temperature of the entrainment layer. The entrainment of dry air exceeded the surface input of water vapour for the present-day scenario causing a gradual  $q_{\rm m}$  decrease during the day. For the permafrost-free scenario, the entrainment of dry air exceeded the water vapour input from the surface until 1430 MST. Afterwards,  $q_{\rm m}$  gradually increased as the surface water vapour input (LE) exceeded the entrainment of dry air.

The largest mean differences in  $\theta_{\rm m}$  between the present-day and the permafrost-free scenario were observed during April 2014 when  $\theta_{\rm m}$  in the permafrostfree scenario were 3.6  $\pm$  2.4 °C ( $\pm$  one standard deviation; n = 3) colder. During the summer, the permafrostfree scenario was 1.25  $\pm$  0.8 (May and June; n = 22) and  $1.58 \pm 0.9$  °C (July and August; n = 16) colder. In September,  $\theta_{\rm m}$  for the permafrost-free and the presentday scenario were similar with differences of  $0.02 \pm 1.4$  °C (n = 8). Water vapour mixing ratios were higher for the permafrost-free scenario throughout the observation period with maximum differences in July and August of  $2.06 \pm 1.3 \text{ mmol mol}^{-1}$ . The permafrostfree scenario was  $1.42 \pm 1.2 \text{ mmol mol}^{-1}$  wetter in May and June and only marginally wetter in April and September with 0.30  $\pm$  0.2 and 0.17  $\pm$  0.9 mmol mol<sup>-1</sup>, respectively.

#### Discussion

Permafrost thaw impacts on turbulent energy fluxes

Permafrost thaw-induced boreal forest loss in the sporadic permafrost zone accelerates and actively changes vegetation composition and structure (e.g. Baltzer et al., 2014; Helbig et al., 2016; Lara et al., 2016). However, little is known about the biophysical impacts of these changes on local- to regional-scale land-atmosphere interactions. Insights from global climate models are limited by their spatial resolution (Oleson et al., 2004). Remote sensing allows biophysical impact assessment of deforestation on climate (e.g. surface and air temperature) across the globe (Li et al., 2015; Alkama & Cescatti, 2016) whereas in situ eddy covariance measurements in combination with local-scale modelling are useful to gain in-depth understanding of the underlying ecosystem processes (Juang et al., 2007a,b;

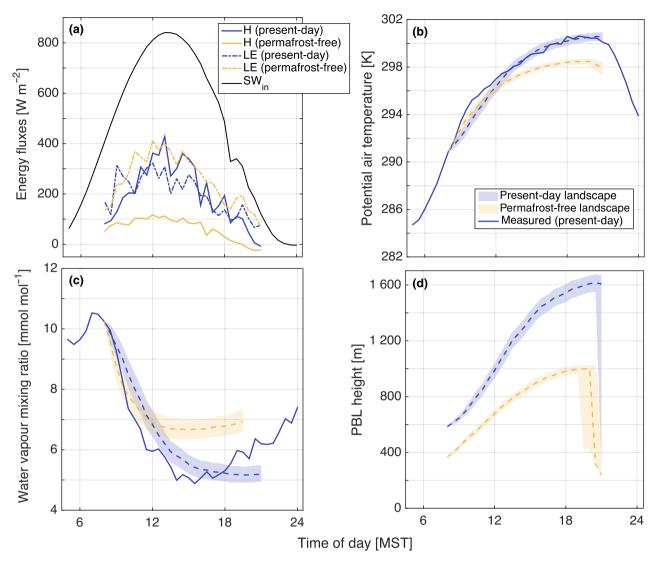


Fig. 8 (a) Sensible (H) and latent (LE) heat fluxes for a present-day heterogeneous boreal forest–wetland landscape with sporadic permafrost ('present-day landscape') and for a permafrost-free wetland landscape scenario ('permafrost-free landscape') and incoming short-wave radiation ( $SW_{in}$ ) for 22 June 2014. (b) Measured and modelled potential air temperatures in the mixed layer ( $\theta_{m}$ ). (c) Measured and modelled water vapour mixing ratios ( $q_{m}$ ) and (d) modelled planetary boundary layer (PBL) heights. Shaded areas represent uncertainty due to random errors in flux measurements.  $q_{m}$  is modelled only for the time period before the PBL collapsed.

Vanden Broucke *et al.*, 2015; Stiegler *et al.*, 2016). Here, we combine landscape-scale eddy covariance measurements with regional-scale remote sensing data to quantify an atmospheric cooling and wetting effect of thawinduced boreal forest loss.

Similar to this study, a decrease of about 50% in annual *H* was observed for a fire-induced transition from a black spruce forest to bunch grasses in Alaska (Liu *et al.*, 2005) with the largest reduction at the end of the winter. In late winter, large albedo increases over treeless wetlands compared to forests drastically reduce available energy following thaw-induced forest-to-wetland conversion. Liquid water is unavailable for

LE until snow melt, and all available energy is transferred to H (Betts et al., 2001). During the summer, differences between boreal forest and wetland albedo are much smaller (e.g. Betts & Ball, 1997). Thus, larger H over the forested landscape in the summer is mainly explained by different partitioning of energy between coniferous forests and wetlands (Eugster et al., 2000). Increased post-thaw LE and decreased Bowen ratios are consistent with the thaw-induced increase in soil moisture availability (Quinton et al., 2011; Baltzer et al., 2014). A similar thaw-induced change in the partitioning of available energy to LE was reported for a tundra ecosystem in northern Sweden (Stiegler et al., 2016). In

temperate and tropical regions, deforestation is generally reducing LE (Bala et al., 2007). Similarly, LE of a black spruce forest in Alaska decreased during the early treeless postfire regeneration stages (Liu et al., 2005). Thus, impacts of thaw-induced boreal forest loss on land-atmosphere interactions contrast deforestation impacts caused by fire disturbance or clear-cutting due to the associated shift toward higher post-thaw soil moisture.

In contrast to the strong control of wetland coverage on  $H_{\text{LAND}}$ , the control of wetland coverage on  $LE_{\text{LAND}}$ is less pronounced, indicating a more complex spatial pattern of water vapour fluxes across the landscape. Transpiration fluxes across the transition from wetlands to forests show a strong spatial heterogeneity (Baltzer et al., 2014; Patankar et al., 2015) and, additionally, LE may vary within wetlands due to spatial variations in water table position. In the center of collapsescar bogs, the water table is deeper due to long-term peat accumulation (Zoltai, 1993; Turetsky et al., 2007). At the recently thawed forest edges, the water table is closest to the moss surface enhancing the LE contribution of open water evaporation. In contrast to the landscape tower, these transition zones contributed only little to the wetland tower footprints. The complex spatial patterns in LE may reflect these small-scale heterogeneity of surface evaporation sources across boreal forest-wetland landscapes (Brown et al., 2010; Angstmann et al., 2013).

Permafrost thaw and landscape-scale changes in land surface properties

In a well-mixed PBL, atmospheric conditions (e.g. SW<sub>in</sub>, VPD,  $T_{air}$ ) over individual wetlands are similar to conditions over the larger boreal forest-wetland landscape, if the surface structure of the landscape is disorganized at length scales <10 km (Shuttleworth, 1988; Garratt, 1994). Thus, contrasts in albedo, and eco-physiological and aerodynamic attributes between permafrost-free ecosystems (wetlands) and ecosystems with permafrost (forests) mainly produce the observed differences in turbulent energy fluxes.

In boreal forests, black spruce stands with low reflectance mask the highly reflective snow or ground cover (e.g. lichen, shrubs) resulting in a lower albedo compared to wetlands. The most pronounced albedo differences occur during the snow cover period when the nonforested ecosystems (e.g. wetlands) are entirely covered by snow. The higher available energy over forest stands (Betts & Ball, 1997; Liu et al., 2005; Lohila et al., 2010; Zhao & Jackson, 2014) indicates that albedo differences mainly induce the thaw-related decrease in H during the late winter. In the summer, with smaller albedo contrasts, differences in eco-physiological and aerodynamic properties enhance post-thaw LE and attenuate H.

Several studies have assessed the land use and land cover change impacts on remotely sensed  $T_{rs}$  (e.g. Houspanossian et al., 2013; Zhao & Jackson, 2014; Li et al., 2015). However, Tas represents the surface temperature driving H and can substantially differ from  $T_{\rm rs}$ , particularly in boreal forests with relatively sparse tree density, strong atmospheric coupling of the tree tops, and a ground surface that is more decoupled from the atmosphere (Sun & Mahrt, 1995; Friedl, 2002; Kustas et al., 2006). We suggest that studies of forest loss impacts on remotely sensed  $T_{rs}$  should be complemented with analyses of  $T_{\rm as}$  (e.g. derived from eddy covariance measurements) to better characterize the effects on local climate (e.g. Baldocchi & Ma, 2013). In this study, we show that thaw-induced forest loss leads to strong late winter cooling of  $T_{as}$  and  $T_{rs}$ . Summer, cooling of  $T_{as}$  instead is moderate, while remotely sensed  $T_{rs}$  for the same period indicates a daytime warming effect of forest loss. In contrast to tropical and temperate forests that are affected by large transpirational cooling (Bonan, 2008; Lee et al., 2011), LE of black spruce forests is small (Baldocchi et al., 2000). Thus, boreal forests have a minimal transpirational cooling effect (Lee et al., 2011). At the same time, large LE over permafrost-free wetlands substantially cools the surface, which explains their lower  $T_{as}$ despite lower  $g_H$ . Reduced  $g_H$  and thus heat transfer efficiency with decreasing forest cover are consistent with lower aerodynamic roughness of low stature ecosystems, such as wetlands, compared to forests (Kelliher et al., 1993; Juang et al., 2007b; Rotenberg & Yakir, 2010).

The thaw-induced decrease in Bowen ratios is mainly caused by increased post-thaw soil moisture (Wright et al., 2009; Baltzer et al., 2014). In addition, the limited stomatal control of LE in wetlands, dominated by Sphagnum and Carex species (Camill, 1999b), favours larger maximum  $g_s$  and consequently enhances LE. Consistently low  $g_s$  is typical for black spruce dominated boreal forests making them more drought resistant compared to other boreal tree species (Baldocchi et al., 2000; Ewers et al., 2005). Additionally, black spruce has a low light-saturation limit of photosynthesis, preventing stomata to open further at higher light levels (e.g.  $SW_{in} > 400 \text{ W m}^{-2}$ ; Kelliher *et al.*, 1993; Goulden et al., 1997; Dang et al., 1998; Baldocchi et al., 2000). The steady increase of wetland  $g_s$  even at high light levels in wetlands may be explained by the forestwetland differences in soil moisture, their high Sphagnum coverage, and their lack of stomata control (Nichols & Brown, 1980; Betts et al., 1999; McFadden

et al., 2003). Similarly, soil moisture limitation on evapotranspiration is reduced and  $g_s$  is increased upon thaw in a tundra environment in Sweden (Stiegler et al., 2016).

Regional tree cover controls on surface characteristics

Decreasing tree cover in the southern Taiga Plains favours warmer daytime  $T_{rs}$  in summer, contrasting the consistent cooling effect of thaw-induced forest loss on  $T_{\rm as}$ . Such a summertime warming effect of forest loss on daytime  $T_{rs}$  was previously reported for the boreal zone (Li et al., 2015). Similar to our study, Li et al. (2015) found a daytime  $T_{rs}$  cooling effect in winter and a year-round cooling effect on night-time  $T_{rs}$ . Albedo is most sensitive to tree cover in late winter, when SW<sub>in</sub> and Bowen ratios are high (Betts et al., 2001; Liu et al., 2005), indicating that albedo differences are the main cause for the observed cooling effect of forest and tree cover loss on  $T_{rs}$  (e.g. Betts, 2000; Zhao & Jackson, 2014; Li et al., 2015). In contrast, the warming effect on daytime  $T_{rs}$  in the summer is likely caused by eco-physiological and aerodynamic effects exceeding the impacts of smaller summer albedo differences (e.g. Juang et al., 2007b). Transpirational cooling of forests is small and unlikely causing these patterns due to lower LE over forests compared to wetlands. To explain the warming effect of tree cover loss on daytime  $T_{\rm rs}$  in the summer, we argue that, with increasing tree cover, sensible heat is more efficiently exchanged between the land surface and the atmosphere and ground surface shading is enhanced (e.g. Sun & Mahrt, 1995; Mahrt & Vickers, 2004). The ground surface, which receives less SW<sub>in</sub> beneath denser canopies due to below-canopy shading (Chasmer et al., 2011a), is strongly affecting remotely sensed  $T_{rs}$ . The observed warming effect of tree cover loss on daytime  $T_{rs}$  suggests enhanced summertime soil heat input in areas with declining tree cover. This warming effect is consistent with the absence of permafrost in mostly treeless wetlands and the occurrence of permafrost in forested plateaus (Zoltai, 1993; Quinton et al., 2009).

Warmer night-time  $T_{\rm rs}$  in densely forested areas may be related to the night-time biomass release of heat storage accumulated during the day (Lindroth et~al.,~2010). Larger radiative cooling of open-compared to closed-canopy sites was reported for Scotty Creek (Chasmer et al., 2011a). Additionally, forests can be warmer at night because trees reduce the formation of stable stratification allowing a more efficient transport of warm air from above to the surface (Lee et~al.,~2011). Our results highlight the importance to distinguish between  $T_{\rm rs}$  and  $T_{\rm as}$  when analysing land cover change impacts and to account for potentially contrasting effects between

the snow and snow-free periods as well as between daytime and night-time observations.

Effects of permafrost thaw-induced boreal forest loss on air temperatures and atmospheric moisture

Due to the complex interactions of various biophysical impacts on near-surface climates (Betts et al., 2001), previous studies demonstrated that forest loss appears to have either a cooling or a warming effect on surface air temperature (Juang et al., 2007a,b; Lee et al., 2011; Mildrexler et al., 2011; Alkama & Cescatti, 2016). Lee et al. (2011) observed warmer daytime and night-time air temperatures over mid- to high-latitude forests compared to nearby open land due to the combined effects of decreased albedo and increased surface roughness and Bowen ratios. Juang et al. (2007b) showed that increased g<sub>H</sub> of forests compared to agricultural fields can lead to a cooling effect of afforestation on surface temperature despite concurrent decreases in albedo. On a global scale, a warming effect of forest loss on air temperatures was explained by the decrease in surface roughness and reduced transpirational cooling (e.g. Mildrexler et al., 2011; Alkama & Cescatti, 2016). In this study, we show that thaw-induced boreal forest loss reduces H and increases LE (i.e. reducing Bowen ratios), exerting a cooling effect on regional air temperature along with an increase in atmospheric moisture.

Reduced diurnal H inputs to the PBL over permafrost-free wetlands result in more shallow PBL depths compared to the typically deeper PBL depths characteristic for intact boreal forests (Betts et al., 2001). More shallow PBL depths reduce the effective heat capacity of the PBL (Snyder et al., 2004), generally amplify surface temperature variability (Esau et al., 2012; Davy & Esau, 2014), and, thus, can have profound impacts on regional climates (Esau & Zilitinkevich, 2010). The large diurnal entrainment of warm and dry air into the PBL over boreal forests decreases  $q_{\rm m}$  causing a surface-PBL feedback by further increasing VPD, inducing further decreases in  $g_s$ , resulting in enhanced partitioning of available energy to H, and eventually further PBL growth (Baldocchi et al., 2000; Hill et al., 2008). However, boreal forest loss and conversion to wetlands with high Sphagnum coverage decrease stomata control of LE, which could slow down this positive feedback mechanism.

Changes in PBL depth, air temperature and water vapour dynamics may also affect cloud formation and regional precipitation patterns (e.g. Juang *et al.*, 2007b). A decrease in air temperature and a concurrent increase in atmospheric moisture would result in a lower lifting condensation level (height at which condensation of a lifting air parcel occurs) and could potentially increase

cloud cover and the frequency of convective rainfall events (e.g. Betts, 2009). However, as thaw-induced boreal forest loss also leads to decreases in PBL depth, the probability of more frequent convective rainfall events may not increase if the PBL height stays below the lifting condensation level (Juang et al., 2007b). Further research using more complex PBL models is required to better characterize the impacts of thaw-induced boreal forest loss on regional precipitation dynamics (e.g. Juang et al., 2007b; de Arellano et al., 2012).

Permafrost thaw and ultimately its disappearance are likely to continue causing boreal forest loss and wetland expansion in the lowlands of the sporadic permafrost zone in North America. Similar to the southern Taiga Plains, thaw-induced forest loss accelerates in the Tanana Flats in central Alaska. However, there, loss is mainly attributed to decreasing birch forest coverage with a concurrent wetland area increase (Lara et al., 2016). The biophysical impacts of deciduous forest loss are likely to differ from the loss of coniferous forests (Juang et al., 2007a), even when resulting in similar post-thaw wetland ecosystems. Deciduous forests are generally characterized by a higher albedo, a larger  $g_s$ and larger LE compared to boreal coniferous forests (Betts & Ball, 1997; Baldocchi et al., 2000; Liu et al., 2005; Amiro et al., 2006). Thus, to better understand how permafrost thaw-induced land cover change affects land-atmosphere interactions and consequently regional and global climates, the biophysical impacts of varying pathways of permafrost thaw need to be assessed in addition to its biogeochemical impacts.

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# Appendix 1: Footprint modelling

The 2D flux footprint parameterization of Kljun et al. (2015) was applied for the landscape tower for halfhours with roughness lengths smaller than 0.95 m. With larger roughness lengths, the eddy covariance instruments were within the roughness sublayer, where measurements at one fixed point are not representative due to horizontally varying flux magnitudes (Mahrt, 2000). The eddy covariance system at the wetland tower was always above the roughness sublayer. The relative flux contribution matrices were projected on a LiDAR/spectral data fusion-based land cover classification with discrete classes for forests, wetlands and thaw lakes, and a LiDAR-derived canopy height map, both derived from remote sensing (Chasmer et al., 2014; Fig. 1c).

# Surface energy balance closure at the landscape and the wetland tower

Sums of H and LE measured by the eddy covariance technique were shown to be consistently smaller than available energy (i.e. lack of land surface EBC) across different ecosystems and instrumental set-ups (e.g. Wilson et al., 2002; Stoy et al., 2013). The reported discrepancies could either be caused by an overestimation of the available energy or an underestimation of turbulent energy fluxes (e.g. Foken, 2008). To ensure the comparability of H and LE at the landscape and the wetland tower, the EBC at the two sites was assessed as follows:

$$H + LE = R_n - G - S - Q_m - C \tag{A1}$$

where  $R_n$  is net radiation [W m<sup>-2</sup>], G is the soil heat flux  $[W m^{-2}]$ , S is the rate of change of heat storage in the air column below the measurement height  $[W m^{-2}]$ , as derived from one-point changes in  $T_a$  and specific humidity  $[q_a; kg \ kg^{-1}]$ ,  $Q_m$  is the snow melt energy flux  $[W \ m^{-2}]$ , and  $C \ [W \ m^{-2}]$  is the closure term for measurement errors or missing terms (e.g. soil thaw). Heat storage in biomass and the energy flux related to photosynthesis were assumed to be negligible due to the typically low productivity and low biomass of northern boreal forests (Baldocchi *et al.*, 2000; Wilson *et al.*, 2002). No storage term was calculated for the consumption or release of energy for thawing and freezing of the soil above the heat flux plates.

As the flux footprints of the landscape tower mainly consisted of forests and wetlands, the available energy was calculated as a weighted average of the ecosystem-scale measurements of  $R_{\rm n}$ , G, and  $Q_{\rm m}$  at the wetland and the landscape tower. The weights were estimated for each half-hour as the relative contribution of these two land cover types to the flux measurements, quantified with the 2D footprint parameterization of Kljun *et al.* (2015) [see also Chasmer *et al.* (2011b) and Detto *et al.* (2006)].

The EBC for the two towers (defined as the slope of available energy against the sum of turbulent energy fluxes) scale with the contribution of wetlands to the flux measurements, with friction velocity (u\*; m  $s^{-1}$ ), and soil temperature at 20 cm in the forest ( $T_{\rm s~FOR}$ ; °C) (Fig. A1). We assume that the relationship of the EBC with T<sub>s FOR</sub> is caused by an underestimation of G early in the season due to the omission of a soil thaw energy flux (e.g. Betts et al., 1999; Nakai et al., 2013). In contrast, the dependence of EBC on  $u_*$  is likely caused by underestimated H and LE (e.g. Barr et al., 2006). For periods with  $T_{\rm s\_FOR}$ above 3 °C, u\* above 0.2 m s<sup>-1</sup> and wetland tower footprint contributions from the wetland larger than 95%, EBC was 0.79 and 0.78 for the landscape and the wetland tower, respectively. We therefore removed flux measurements from both towers when  $u_*$  was below 0.2 m s<sup>-1</sup>, and for the wetland tower when the wetland contribution to the flux footprint was <95% (i.e. footprints extended into surrounding forest). For the landscape tower, data coverage was 50% for H and LE in 2013 (12 May 2013 - 01 November 2013). In 2014 (13 April 2014 - 07 November 2014), data coverage was 52% for H and LE at the landscape tower and 20% for H and LE at the wetland tower.

#### Atmospheric controls of surface conductance

Nonlinear VPD and  $SW_{in}$  models were fitted to  $g_s$  for half-hours with low wetland contributions to landscape tower footprints ( $FR_{WET}$ ) ( $FR_{WET}$  < median of  $FR_{WET}$  [63%]), to  $g_s$  with high  $FR_{WET}$  ( $FR_{WET} \ge$  median of

FR<sub>WET</sub> [63%]), and to  $g_s$  derived from fluxes at the wetland tower (contributions from wetlands  $\geq$ 95%). Only daytime  $g_s$  (0900 and 2100 MST) and  $g_s$  for periods with LE >10 W m<sup>-2</sup> were used, as the expression of  $g_s$  becomes numerically unstable when LE <10 W m<sup>-2</sup>. The VPD control on  $G_{s\_bound}$  was modelled as follows (e.g. Blanken *et al.*, 1997):

$$G_{\text{s\_bound\_}i} = g_{s0\_i} e^{(-b_d \text{VPD})}$$
 (A2)

where i stands for the i-th data set class,  $g_{\rm s\_0}$  (m s<sup>-1</sup>) is the bulk surface conductance at a VPD of 0 kPA, and  $b_{\rm d}$  indicates the sensitivity of  $G_{\rm s\_bound}$  to VPD (kPa<sup>-1</sup>). The model was fitted to the upper 15% of  $g_{\rm s}$  per 0.5 kPa VPD window. Data for periods with SW<sub>in</sub> <300 W m<sup>-2</sup> were excluded to avoid radiation-controlled  $g_{\rm s}$ .

The dependence of  $G_{s\_bound}$  on  $SW_{in}$  was modelled using a Michaelis–Menten function (e.g. Grelle *et al.*, 1999):

$$G_{\text{s\_bound\_}i} = g_{\text{s\_max\_}i} \frac{\text{SW}_{\text{in}}}{b_{\text{infl}} + \text{SW}_{\text{in}}}$$
(A3)

where  $g_{s\_max}$  is the upper limit of  $g_s$  at high SW<sub>in</sub> and  $b_{infl}$  is a parameter defining SW<sub>in</sub> when  $G_{s\_bound}$  reaches half of its upper limit. To assess the radiation dependence of  $G_{s\_bound}$ , only periods with VPD >0.3 kPa were analysed ensuring that  $g_s$  was not controlled by VPD. Uncertainties of the model fits were quantified by fitting the model to 1000 bootstrap realizations of the data sets.

### The planetary boundary layer model

The time rate of change in potential air temperature of the mixed layer  $(\frac{d\theta_m}{dt}; K \text{ s}^{-1})$  results from input of sensible heat from the surface (H) and from entrainment of warm air above the temperature inversion at the top of the mixed layer and was modelled using Eqn. 1 in McNaughton & Spriggs (1986). The time rate of change in  $q_m$  was calculated using Eqn. 2 in McNaughton & Spriggs (1986). Eqn. 10 in McNaughton & Spriggs (1986) was used to model the time rate of change in PBL height:

$$\frac{\mathrm{d}h}{\mathrm{d}t} = \frac{H_v}{\rho C_p h \Gamma_v} \tag{A4}$$

The vertical gradient of virtual potential air temperature [lapse rate ( $\Gamma_{\rm v}$ ); K m $^{-1}$ ] was taken as the lapse rate of moist air of 0.0065 K m $^{-1}$ .

To model  $q_{\rm m}$  at the landscape tower, we used H and LE from the landscape tower as forcing. Modelled  $\theta_{\rm m}$  and  $q_{\rm m}$  can only be compared to measured  $\theta_{\rm m}$  and  $q_{\rm m}$  when H and LE at the landscape tower are representative of the energy fluxes affecting instantaneous PBL

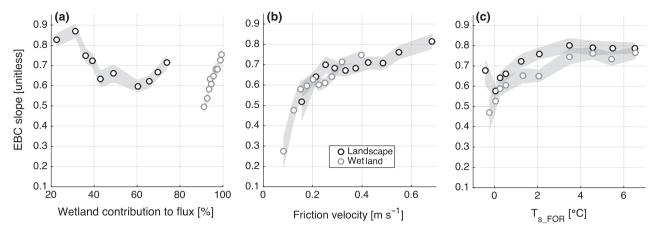


Fig. A1 Slope of the energy balance closure (EBC) for the landscape and the wetland tower as function of (a) permafrost-free wetland contributions to flux footprints, (b) friction velocity, and (c) soil temperature at 20 cm on the forested permafrost plateau  $(T_{s,FOR})$ . Shaded areas show the 95% confidence interval of the slopes.

dynamics, which is not always the case over a heterogeneous landscape. We included only days with clear-sky conditions and a total sum of less than five half-hours of missing or low quality (quality flag >1) H and LE at the landscape and the wetland tower. Remaining gaps were filled using linear interpolation and days with an RMSE of the modelled  $\theta_{\rm m}$ >2 K were discarded to ensure good model performance. The analysis of the EBC indicated an average underestimation of ~20% of the sum of H and LE (see above). Therefore, we corrected for this underestimation in our model by increasing the measured H and LE accordingly assuming that the lack of EBC was equally caused by H and LE (Twine et al., 2000; Wohlfahrt et al., 2009).

Air temperature and water vapour mixing ratio at Scotty Creek were only measured in the mixed layer and, thus,  $\theta_e$  and  $q_e$  were not known. Potential air temperature and  $q_e$  of the entrainment layer were derived numerically by minimizing the RMSE of modelled  $\theta_{\rm m}$ and  $q_{\rm m}$  versus measured  $\theta_{\rm m}$  and  $q_{\rm m}$  at the landscape tower. Friction velocity was used to calculate the initial PBL height (Rossby & Montgomery, 1935).

# Supporting Information

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

Data S1. Derivation of roughness parameters and aerodynamic conductance.

Figure S1. Seasonal dynamics of soil temperature, water table relative to moss surface, and snow depth in 2014 in the (a) wetland and in the (b) boreal forest at Scotty Creek.

Figure S2. Pictures of the studied wetland in Scotty Creek in the (a) late winter, (b) spring, (c) summer, and (d) fall of 2014.

Figure S3. Aerodynamic roughness length for momentum and LIDAR-derived mean weighted canopy height within flux footprints between May and September 2013 and 2014.

**Figure S4.** Mean diurnal averages of radiometric  $(T_{rs})$  and aerodynamic ( $T_{as}$ ) surface temperature for the (a, c, e) late winter and (b, d, f) the snow-free period in 2014 for (a, b) the wetland and (c, d) the forest (i.e.  $T_{rs}$ ) and the heterogeneous landscape (i.e.  $T_{as}$ ).

Figure S5. Random uncertainty in sensible heat (H; a-b) and latent heat flux measurements (LE; c-d) for the landscape (a, c) and the wetland tower (b, d) derived after Lasslop et al. (2008).