

Reviews and Syntheses: Changing ecosystem influences on soil thermal regimes in northern high-latitude permafrost regions

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Abstract

Soils in arctic and boreal ecosystems store twice as much carbon as the atmosphere, a portion of which may be released as high-latitude soils warm. Some of the uncertainty in the timing and magnitude of the permafrost climate feedback stems from complex interactions between ecosystem properties and soil thermal dynamics. Terrestrial ecosystems fundamentally regulate the response of permafrost to climate change by influencing surface energy partitioning and the thermal properties of soil itself. Here we review how arctic and boreal ecosystem processes influence thermal dynamics in permafrost soil and how these linkages may evolve in response to climate change. While many of the ecosystem characteristics and processes affecting soil thermal dynamics have been examined individually (e.g. vegetation, soil moisture, and soil structure), interactions among these processes are less understood. Changes in ecosystem type and vegetation characteristics will alter spatial patterns of interactions between climate and permafrost. In addition to shrub expansion, other vegetation responses to changes in climate and rapidly changing disturbance regimes will affect ecosystem surface energy partitioning in ways that are important for permafrost. Lastly, changes in vegetation and ecosystem distribution will lead to regional and global biophysical and biogeochemical climate feedbacks that may compound or offset local impacts on permafrost soils. Consequently, accurate prediction of the permafrost carbon climate feedback will require detailed understanding of changes in terrestrial ecosystem distribution and function, which depend on the net effects of multiple feedback processes operating across scales in space and time.

1 Introduction

Permafrost, or perennially frozen ground, underlies approximately 24% of northern hemisphere land masses, primarily in arctic and boreal regions (Brown *et al.*, 1998). Soils in permafrost ecosystems have a seasonally thawed active layer that develops each summer. Organic carbon and nutrients in the active layer are seasonally subjected to mineralization, uptake by plants and microbes, and lateral hydrological transport. Carbon and nutrients locked in perennially frozen ground are considerably less active, often remaining isolated from global biogeochemical cycles for millennia (Froese *et al.*, 2008). However, changes in temperature, associated with recent climatic change are warming soils in many high-latitude regions (Romanovsky *et al.*, 2010), introducing permafrost carbon and nutrients to modern biogeochemical cycles (Schuur *et al.*, 2015). Microbial activity may release some carbon and nutrients to the atmosphere in the form of carbon dioxide, methane, and nitrous oxide, greenhouse gases that contribute to further warming (e.g. Koven *et al.*, 2011; Abbott & Jones, 2015; Voigt *et al.*, 2017). While the magnitude of this permafrost-climate feedback remains uncertain, it is considered one of the largest terrestrial feedbacks to climate change, potentially enhancing human-induced emissions by 22-40% by the end of the century (Schuur *et al.*, 2013; 2015; Comyn-Platt *et al.*, 2018).

A major source of uncertainty in estimating the timing and magnitude of the permafrost climate feedback is the complexity of the soil thermal response of permafrost ecosystems to atmospheric warming. Permafrost soil temperature and its response to climatic change are highly variable across space and time (Jorgenson *et al.*, 2010), owing to multiple biophysical interactions that modulate soil thermal regimes across arctic and boreal regions (Romanovsky *et al.*, 2010). Moving northward, permafrost temperature and active layer thickness generally

decrease, while permafrost thickness and spatial extent increase. In more northern locations, the areal distribution of permafrost may be continuous (> 90% areal extent), whereas at lower latitudes discontinuous, sporadic, and isolated permafrost (> 50-90%, 10-50%, and < 10% areal extent, respectively) (Brown *et al.*, 1998) have large areas that are not perennially frozen. This general latitudinal gradient is interrupted by considerable local variability in active layer and permafrost thickness and temperature due to differences in local climate, vegetation, soil properties, hydrology, topography, and snow characteristics. These factors can increase or decrease the responsiveness of permafrost soil temperatures to climate, mediating a high degree of spatial and temporal variability in the relationship between air and permafrost soil temperatures (Shur & Jorgenson, 2007; Jorgenson *et al.*, 2010). Understanding how ecosystem characteristics influence local and regional permafrost temperature is critical to interpreting variability in rates of recent permafrost temperature increases (Romanovsky *et al.*, 2010), and to predicting the magnitude and timing of the permafrost climate feedback. However, links between permafrost and climate could fundamentally change as arctic and boreal vegetation (e.g. Pearson *et al.*, 2013) and disturbance regimes (e.g. Kasischke & Turetsky, 2006) respond to climate change.

In this paper, we review how ecosystem structural and functional properties influence permafrost soil thermal dynamics in arctic and boreal regions. We focus on how ecosystem responses to a changing climate alter the thermal balance of permafrost soils (energy moving into and out of permafrost soil) and how these thermal dynamics translate into seasonal and interannual temperature shifts. Our objectives are to 1) identify and review the key mechanisms by which terrestrial ecosystem structure and function influence permafrost soil thermal dynamics; 2) characterize changes in these ecosystem properties associated with altered climate

and disturbance regimes; 3) identify and characterize potential feedbacks and uncertainties arising from multiple opposing processes operating across spatial and temporal scales; and 4) identify key challenges and research questions that could improve understanding of how continued climate-mediated ecosystem changes will affect soil thermal dynamics in the permafrost zone.

2 Ecosystem controls on permafrost soil thermal dynamics

Permafrost soil thermal regimes can be characterized by four seasonal phases annually. In spring, soils thaw onset occurs as day length increases energy inputs and air temperatures, and snow melts. Thaw onset occurs fairly rapidly, typically over a period of several days to weeks. During the summer, thaw period soils accumulate energy resulting in deepening of the active layer and warming of both frozen and unfrozen material. In autumn, soil freeze-back occurs as day length and air temperatures decrease. The length of the freeze-back period varies widely, from days to several months, and is heavily dependent on soil moisture content. Finally, the winter freezing period is characterized by energy losses to the atmosphere and declining soil temperatures until day length increases available energy in the spring and the annual cycle begins again. The permafrost soil thermal regime is complex because it varies with depth, and the four phases are connected. Key metrics used to characterize the soil thermal regime include the length of the freeze-back and summer thaw periods, mean annual temperature, the annual amplitude of mean temperature, and the ratio of air to soil freezing/thawing degree days (i.e., n-factors), among others. (e.g. Romanovsky & Osterkamp, 1995; Cable *et al.*, 2016).

Soil thermal dynamics in the permafrost zone are governed by ground-atmosphere energy exchange and internal energy transfers associated with phase changes of water and temperature

gradients within the soil. The simplified thermal balance at the ground surface is the difference between net radiation (R_N) absorbed by a vegetation-, snow-, and ice-free land surface, and energy loss via turbulent sensible (H), latent (LE), and ground (G) heat fluxes. R_N is the difference between incoming and outgoing longwave (LW) and shortwave (SW) radiation where net LW is a function of atmospheric and surface temperatures, and net SW is a function of incoming solar radiation and surface albedo. In terrestrial ecosystems G is therefore modulated by vegetation function and structure, snow cover, topography, and hydrology (Smith, 1975; Betts & Ball, 1997; Eaton *et al.*, 2001; Zhang, 2005; Stiegler *et al.*, 2016a; Helbig *et al.*, 2016a). Vegetation exerts strong controls on albedo, surface conductance, and surface temperature (Betts & Ball, 1997; Betts *et al.*, 1999; Helbig *et al.*, 2016a), and consequently partitioning of the surface energy balance into its component fluxes (Eugster *et al.*, 2000). These energy balance controls vary diurnally, seasonally, and spatially across arctic and boreal ecosystems (e.g. Beringer *et al.*, 2005), and are sensitive to natural and anthropogenic disturbances (Helbig *et al.*, 2016b).

Unlike lower-latitude ecosystems where G constitutes a relatively small fraction of the surface energy balance, G in permafrost regions is comparable in magnitude to gross soil-atmospheric heat fluxes (H and LE) due to relatively large temperature gradients between the ground surface and permafrost table (Eugster *et al.*, 2000; Langer *et al.*, 2011a; 2011b). G is important because it is the transfer of heat between the ground surface and the active layer and permafrost. G occurs primarily by thermal conduction, and is a function of the temperature gradient between the ground surface and the permafrost table (Kane *et al.*, 2001; but see Fan *et al.*, 2011), and the thermal conductivity (K_T) of the soil. Thus, variability in thermal dynamics of active layer and permafrost soils are most generally controlled by factors influencing: 1) the

temperature gradient between the ground surface and permafrost at a given depth, and 2) the K_T of active layer and permafrost soil substrates (Figure 1). The amount of energy available for G is governed by energy dynamics of the atmosphere and overlying plant canopies, ground cover influences on albedo, H , and LE (Figure 1). Ground surface temperature T_{SG} is different from the land surface temperature (T_{SL}), a measure typically used to assess ecosystem-climate interactions (e.g. Urban *et al.*, 2013), because T_{SL} includes tall-statured overlying vegetation canopies, whereas T_{SG} includes only ground-cover vegetation (e.g., mosses and lichens), bare soil, or plant litter that functionally represents the ground surface. Once energy is absorbed at the ground surface and T_{SG} is elevated, soil K_T and the surface-permafrost temperature gradient will dictate how much of this energy is transferred downward into the soil. Here we focus on T_{SG} and K_T because they are more dynamic than permafrost temperature and will mediate permafrost responses to climate and associated carbon cycle consequences, particularly in the coming decades to centuries. It is also important to note that G varies on diurnal, seasonal, and annual timescales. We focus on factors that affect G on seasonal and annual timescales because they are indicative of permafrost warming and thawing, and are thus most relevant for understanding changes to the thermal regime that will impact greenhouse gas fluxes from the soil in the coming decades. In the following subsections we review the ecological factors that affect individual phases of the soil thermal regime and then consider interactions across the annual cycle.

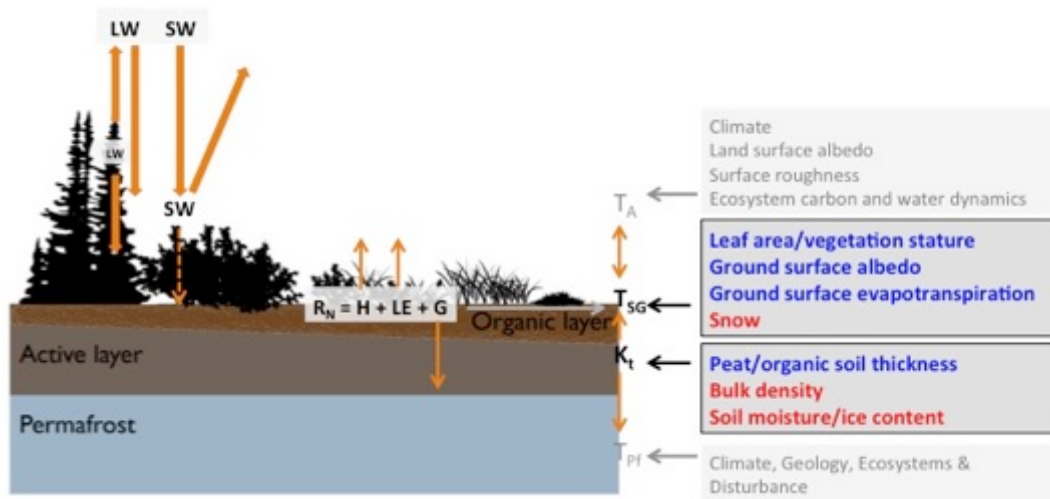


Figure 1. Key ecosystem controls on surface energy partitioning in relation to permafrost soil thermal dynamics (energy fluxes are indicated by orange arrows). Net radiation (R_N) is balanced by sensible (H), latent (LE), and ground (G) heat fluxes. Ground surface temperature (T_{SG}) and soil thermal conductivity (K_t) exert strong controls on G and are strongly influenced by a variety of ecosystem controls (indicated in dark gray boxes; red and blue text denote soil cooling and warming effects, respectively). Controls on air (T_A) and permafrost (T_{Pf}) temperatures are driven largely by climate, and we assume that ecosystem impacts on these variables are negligible at short timescales (e.g., seasonal to annual) and small spatial scales (e.g., m^2 to km^2) relative to factors highlighted in dark boxes.

2.1 Vegetation canopy effects on G

Vegetation canopies attenuate incoming solar radiation (Juszak *et al.*, thereby reducing radiation at the ground surface and subsequently T_{SG} . Canopy removal and addition experiments illustrate that shrub canopies insulate tundra soils in summer, maintaining soil temperatures upwards of 2 °C cooler than adjacent tall shrub-free areas (Bewley *et al.*, 2007; Blok *et al.*, 2010;

Myers-Smith & Hik, 2013; Nauta *et al.*, 2014). Canopy shading decreases soil temperatures in both evergreen (Jean & Payette, 2014a; 2014b; Roy-Léveillé *et al.*, 2014; Fisher *et al.*, 2016) and deciduous (Iwahana *et al.*, 2005; Fedorov *et al.*, 2016) needleleaf boreal forests. Canopy removal experiments have resulted in substantial soil warming, permafrost thaw and subsidence in ice-rich tundra (Blok *et al.*, 2010; Myers-Smith & Hik, 2013; Nauta *et al.*, 2014) and deciduous needleleaf forests (Iwahana *et al.*, 2005; Fedorov *et al.*, 2016). In the latter case, ecosystem recovery and winter processes lead to permafrost stabilization in the decades after clearing (Fedorov *et al.*, 2016). However manipulation experiments may increase soil moisture and thus K_T (described below) via reductions in transpiration that may not occur when vegetation change occurs naturally. Increases vegetation stature will tend to decrease T_{SG} resulting in local soil cooling during the summer months when plant canopies are present.

Whereas increases in tree and shrub cover reduce solar radiation at the ground surface, the increased canopy stature and complexity generally reduces canopy albedo leading to an overall increase of the canopy R_N (Beringer *et al.*, 2005; Chapin *et al.*, 2005; Sturm *et al.*, 2005; Lorant *et al.*, 2011). However, albedo may increase when shrubs replace bare ground or wet tundra (Blok *et al.*, 2011b; Gamon *et al.*, 2012) or depending on changes in community composition or structure (Williamson *et al.*, 2016). During the growing season these albedo differences are relatively small (Juszk *et al.*, 2016). Increased surface roughness with shrub or tree expansion also enhances heat transfer to the atmosphere, however, changes in R_N and H have not yet been linked to soil thermal dynamics at the ecosystem scale (Beringer *et al.*, 2005; Helbig *et al.*, 2016b; Göckede *et al.*, 2017). Vegetation canopies may enhance LW radiation inputs at the ground surface by re-radiating absorbed SW radiation, however most research has focused on LW enhancement effects on snowmelt (Webster *et al.*, 2016), and so the growing

season effects of LW enhancement on G in permafrost ecosystems remain largely unstudied. Observations of lower T_{SL} for boreal forest canopies relative to adjacent non-forested lands due to higher LE flux (Li *et al.*, 2015; Helbig *et al.*, 2016b) highlight the importance of canopy controls on transpiration when considering how vegetation change affects land surface energy partitioning and atmospheric temperatures. Within vegetation types growing season with higher LE reduce the amount of energy available for H and G (Boike *et al.*, 2008), however this is also related to variability in moisture inputs and can alter soil moisture dynamics, both of which also affect G, as discussed in following sections. In summary, during the growing season there is no clear evidence for altered ecosystem scale G associated with local evaporative cooling (Li *et al.*, 2015) or increased sensible heating as a function of canopy albedo (Beringer *et al.*, 2005), likely because these effects are overwhelmed by canopy light attenuation. Snow covers much of the arctic and boreal regions for long periods each year and is a critical driver of ground temperature (Goodrich, 1982; Stieglitz, 2003). Deep and/or low-density snow has low K_T and therefore reduces heat flux from the ground to the atmosphere during the non-growing season when air temperatures are typically colder than soil temperatures. Snow depth is initially controlled by the timing and intensity of snowfall, but wind can redistribute snow according to local topography, vegetation structure, landscape position and wind direction, leading to high heterogeneity in snow cover and depth (Walker *et al.*, 2001; Kershaw & McCulloch, 2007). Snow physical and insulative properties can also vary on the scale of broad ecoregions as a result of differences in air temperature, wind, precipitation, and vegetation cover (Sturm *et al.*, 1995). For example, high thermal conductivity and density of snow in tundra relative to boreal ecosystems has been linked to differences in soil temperatures (Gouttevin *et al.*, 2012; Mamet & Kershaw, 2013). Snow cover in the shoulder seasons (freeze-back and thaw periods) can cool soils as a result of albedo

effects, but generally ground insulation from snow cover during the extended winter period dominates the snow effects on G. For example, across the Alaskan arctic, ground surface temperatures are estimated to be 4 °C to 9 °C warmer as a result of higher snow cover (Zhang, 2005).

In tundra, shrub canopies trap blowing snow, leading to localized deepening of snow cover and higher winter soil temperatures (Sturm *et al.*, 2001; Liston *et al.*, 2002; Sturm *et al.*, 2005; Marsh *et al.*, 2010; Myers-Smith & Hik, 2013; Domine *et al.*, 2015). However, shrub canopies can bend in winter under the snowpack leading to potentially different amounts of snow trapping in years with heavy wet snow versus dry snow in early winter (Marsh *et al.*, 2010; Ménard *et al.*, 2014). Even buried vegetation can lead to turbulent airflow that transports snow in complex patterns (Filhol & Sturm, 2015), which creates spatially variable ground temperatures in a given year. In some cases vegetation-snow interactions can also have a negative effect on winter ground temperature, leading to soil cooling. In northeast Siberia, large graminoid tussocks exposed above the snowpack in early winter create gaps in the insulating snow layer, which leads to lower ground temperatures, earlier active layer freezing and cooling of surface permafrost (Kholodov *et al.*, 2012).

In the boreal forest, the presence of trees reduces the wind regime and snow redistribution (Baldocchi *et al.*, 2000). While there is less wind-distribution in boreal forests than in the tundra, tree composition and density affect snow distribution and depth through interception of snow by the canopy branches and subsequent evaporation and sublimation. This results in lower snow inputs in dense forests and areas of shallow snow underneath individual trees (Rasmus *et al.*, 2011). This winter effect of tree density on snow cover may, in part, explain the negative relationship found between larch stand density and ground thaw (Webb *et al.*, 2017)

and is consistent with the effects of winter warming experiments on summertime active layer dynamics (e.g. Natali *et al.*, 2011). However at treeline or areas with patchy tree cover, forests can trap blowing snow, leading to decreased heat loss from soil in winter (Roy-Léveillé *et al.*, 2014)

Tall-statured vegetation canopies that protrude above the snowpack decrease land surface albedo. While the accompanying increases in R_N will lead to sensible heating of the atmosphere at regional to local scales (Chapin *et al.*, 2005), they do not have a direct first order effect on T_{SG} or K_T . In the spring thaw period when snow covers the landscape and solar radiation is high, this increase in R_N is largest (Liston *et al.*, 2002; Pomeroy *et al.*, 2006; Marsh *et al.*, 2010) and may accelerate snow melt (Sturm *et al.*, 2005; Lorantý *et al.*, 2011). This could lead to a longer snow-free season and greater G during the summer thaw period, however, this snow-reducing effect can be offset by the snow-trapping effects of vegetation (Sturm *et al.*, 2005). Changes in the length of the snow-free season because of altered canopy albedo could lead to changes in G ; however, such an effect has not been observed. While canopy albedo does not directly influence G at the ecosystem scale, regional climate feedbacks associated with albedo changes (described below) may influence permafrost thermal dynamics (Lawrence & Swenson, 2011; Bonfils *et al.*, 2012).

Across the annual cycle, the net effect of vegetation canopies on soil thermal regimes remains unclear. Relatively few studies have simultaneously examined the role of summer energy partitioning and winter snow trapping on G or soil temperatures. Myers-Smith and Hik (2013) found that winter warming associated with snow-trapping by shrub canopies elevated soil temperatures by 4-5 °C whereas canopy shading led to 2 °C cooling in summer. Similarly, relative to non-forested palsas, forested palsas in eastern Canada exhibited winter soil warming

associated with snow trapping but slower rates of permafrost thaw due to summer cooling associated with thicker organic layers and canopy shading (Jean & Payette, 2014a; 2014b). Additionally, these studies observed delayed freeze-up and later spring thaw associated with late fall precipitation that resulted in complex relationships between annual air and soil temperatures and active layer depths (Jean & Payette, 2014b). Canopy snow trapping influences on winter soil temperature or G is likely affected by shrub or forest patch size, however this has not been explicitly examined. Conversely, the influence of canopy shading and LW enhancement on summer soil temperature should increase with vegetation stature and density, but vary little with patch size. At the ecosystem scale canopy influences on albedo have not been shown to impact the ground thermal regime. Thus it is likely that the magnitude of vegetation canopy influences on the annual permafrost soil thermal regime will be controlled jointly by vegetation stature, density, and patch size influences on snow-redistribution. The studies mentioned above also highlight the importance covariation in overstory and understory vegetation and canopy influences on soil moisture, which will be addressed in the following sections.

2.2 Groundcover impacts on ground surface temperature

Ground cover in permafrost ecosystems may include bare soil, plant litter, lichens, and mosses. Unlike vascular plant canopies, moss and lichen are in close thermal contact with the underlying soil layers so heat can be transferred from the vegetation into the soil (and vice versa) via conduction (Yi *et al.*, 2009; e.g. O'Donnell *et al.*, 2009a). During the growing season, differences in albedo and LE are the primary causes of variability in T_{SG} among ground cover types. During winter ground cover is masked by snow, and K_T is the dominant factor affecting G (described below). Under moist snow-free conditions, non-vascular evaporation rates are

generally high, leading to surface cooling (Heijmans *et al.*, 2004a; 2004b). Under dry conditions taxonomic level differences in physiological responses to drought (Heijmans *et al.*, 2004b), can lead to large differences in T_{SG} (Stoy *et al.*, 2012). Increased LE from bare soil after experimental- (Blok *et al.*, 2011a) and disturbance-induced (Rocha & Shaver, 2011) moss removal illustrates the importance of non-vascular plant physiology, and highlights the relatively high potential for evaporative cooling from bare soil surfaces. Low hydraulic conductivity in mosses relative to organic and mineral soils may result in suppression of LE once moisture held in surface vegetation is depleted, whereas higher hydraulic conductivity in underlying soil layers may allow for evaporation of deeper soil moisture and increased LE observed with moss removal (Rocha & Shaver, 2011; Blok *et al.*, 2011a). Albedo differences between common moss and lichen species may also contribute to large differences in T_{SG} ; in ways that either amplify or decrease the effects of physiological differences in evaporative cooling (Stoy *et al.*, 2012; Higgins & Garon-Labrecque, 2018; Loranty *et al.*, 2018). Variability in ground cover can correspond to large differences in T_{SG} that depend on the joint effects of albedo and LE, and are strongly dependent on available moisture. However the extent to which an increase in T_{SG} leads to an increase in G depends upon K_T of the groundcover and soil as well their soil moisture/ice content.

2.3 Impacts of ground cover and soil properties on thermal conductivity

Soil K_T , which often includes the moss layer where present, affects the rate of heat transfer through the soil profile across a temperature gradient between the ground surface and the soil at a given depth. K_T varies throughout the soil profile with soil moisture and composition. Under dry conditions, mosses have very low K_T , followed by organic and then mineral soils

(Hinzman *et al.*, 1991; O'Donnell *et al.*, 2009a). Moss and organic soil layers have low K_T owing to high porosity, and K_T typically increases with soil bulk density (Hinzman *et al.*, 1991; O'Donnell *et al.*, 2009a). Mineral soils typically have higher K_T than organic soils (Kane *et al.*, 1989; Hinzman *et al.*, 1991; Romanovsky & Osterkamp, 2000), and fine textured clay mineral soils have lower K_T than silt or sand (Johansen, 1977). In general, ecosystems with thick moss and organic soil (e.g., peat) layers with low bulk density tend to have low G and shallow active layers, all else held equal (Woo *et al.*, 2007; Fisher *et al.*, 2016).

Moisture content influences the thermal dynamics of soil and moss in a variety of important ways. Linear increases in K_T with moisture content (O'Donnell *et al.*, 2009a; Soudzilovskaia *et al.*, 2013) have strong impacts on G , soil temperatures, and active layer dynamics. Under saturated conditions, K_T values of mineral soils remain higher than in organic soils and mosses (Hinzman *et al.*, 1991; Romanovsky & Osterkamp, 2000; O'Donnell *et al.*, 2009a), so the general pattern of increasing K_T with depth/bulk density is maintained. Local- and ecosystem-scale observations of warmer soil temperatures and deeper thaw depths in areas of perennially elevated soil moisture (Hinkel *et al.*, 2001; Hinkel & Nelson, 2003; e.g. Shiklomanov *et al.*, 2010; Curasi *et al.*, 2016) indicate increases in K_T outweigh the concurrent increase in specific heat capacity associated with increasing moisture content. Similarly, interannual variability in soil moisture and active layer thickness are positively related across a range of spatial scales (Iijima *et al.*, 2010; Park *et al.*, 2013). Across soil types, K_T increases in winter when soils freeze (Romanovsky & Osterkamp, 1997), and also with soil ice content meaning that increased soil moisture will increase summer and winter K_T (Langer *et al.*, 2011b).

Liquid water and water vapor can also warm soils through non-conductive heat transfer (Hinkel & Outcalt, 1994; i.e. water movement; Kane *et al.*, 2001). Here, the timing and source of

water is important. For example, infiltration of snowmelt in spring does not deliver substantial heat to the soil because the water temperature is very close to freezing (Hinkel *et al.*, 2001) and near-surface soil horizons are mostly frozen. Alternatively, condensation of water vapor in frozen soils can lead to fairly rapid temperature increases during spring melt (Hinkel & Outcalt, 1994). Heat delivery from groundwater flow has been implicated as a cause for permafrost degradation in areas of discontinuous permafrost in interior Alaska (Jorgenson *et al.*, 2010). The hydraulic properties of soil horizons are especially important in this regard. Unsaturated peat and organic-soil horizons with large interconnected pore spaces generally promote non-conductive transport of heat in soils unless the substrate is dry enough that it absorbs water.

The relative importance of non-conductive heat transfer on permafrost thermal dynamics is difficult to determine. Observations of elevated soil temperature, active layer thickness, and thermal erosion in areas with poorly drained or inundated soils (Woo, 1990; e.g. Jorgenson *et al.*, 2010; Curasi *et al.*, 2016) suggest the effects of soil moisture on K_T may have stronger influences than convective processes on soil thermal dynamics. However, several recent studies indicate that heat advected in groundwater may promote permafrost thaw (de Grandpré *et al.*, 2012; Sjöberg *et al.*, 2016). This process is likely most important in fens, water tracks, and areas of discontinuous permafrost, and less important in areas of continuous permafrost with thin organic layers because mineral soils generally have low hydraulic conductivity. Soil moisture distribution within the soil profile is important as well; dry surface organic layers with low K_T may buffer against warmer air temperatures even though deeper soils may have high K_T associated with moisture and soil composition (Rocha & Shaver, 2011; Göckede *et al.*, 2017). Observations of co-varying heterogeneity in soil structure, temperature, and moisture also

illustrate the importance of spatio-temporal variability in soil moisture and K_T for understanding permafrost soil thermal dynamics (Boike *et al.*, 1998).

In wet soils the large latent heat content of soil moisture can delay freezing of the active layer (i.e., extend the freeze-back duration; Romanovsky & Osterkamp 2000). The period during which soil active layer temperatures remain constant near 0 °C as latent heat is released from soil moisture is commonly referred to as the ‘zero-curtain’ (Outcalt *et al.*, 1990). Longer zero-curtain periods promote warmer winter active layer and permafrost temperatures (Outcalt *et al.*, 1990; Morse *et al.*, 2015). Soil thaw during spring tends to occur more rapidly than freeze-back during autumn, despite the high latent heat required to thaw ground ice, likely due to increases in K_T associated with snowmelt infiltration and/or latent heat released by condensation of water vapor (Hinkel & Outcalt, 1994). Excess ground ice deeper in the active layer or permafrost requires larger amounts of latent heat energy to melt, and so typically buffer permafrost soils against thaw (Halsey *et al.*, 1995). However, when this type of ground ice does melt, it can lead to an array of physical and ecological changes via thermokarst development (Mamet *et al.*, 2017), which further alter the soil thermal regime and can promote further warming (Osterkamp *et al.*, 2009; Kokelj & Jorgenson, 2013).

Across the seasonal cycle soil and ground cover thermal properties interact to affect the thermal regime in complex ways that vary across ecosystem types. For example, a comparison of wet and dry microsites within tundra ecosystems found warmer surface soils in dry microsites due to lower heat capacity, however deeper soil layers in the dry microsite remained cooler because of lower thermal conductivity of dry surface soils (Göckede *et al.*, 2017). In wet microsites greater soil moisture lengthened the fall freeze-back period meaning that soils were warmer than dry microsites, however once soils froze, temperatures in the wet microsites

dropped rapidly and became cooler than dry microsites because of higher K_T (Göckede *et al.*, 2017). This example illustrates how covariation in vegetation and soil properties within a single ecosystems affect the soil thermal regimes in complex ways across the annual cycle.

2.4 Interacting ecosystem influences on the soil thermal regime

The mechanisms described in the previous sections are relatively well understood individually and at seasonal timescales. But when considered in concert, the net effect of specific processes on annual ground temperatures and thermal regimes is often unclear. This is particularly true when ecological processes covary or have opposing effects on permafrost soil thermal dynamics. For example, is the effect of canopy shading mitigated by LW enhancement, or amplified by reductions in soil K_T resulting from plant utilization of soil moisture? Using successional gradients to answer such questions is complicated by concurrent accumulation of organic soil, canopy leaf area, and soil moisture (Jorgenson *et al.*, 2010). Likewise, manipulative experiments nearly always involve side effects and artefacts, for example, canopy manipulations affect soil moisture, changing soil thermal properties and surface energy inputs simultaneously (Fedorov *et al.*, 2016). On the other hand, carefully designed manipulations and gradient studies still provide the best avenue for studying single and interactive processes, and for parametrizing models. While there are a number of studies that have examined the role of variation in vegetation canopy cover, soil moisture, and ground/soil thermal properties on the permafrost thermal regime, few have fully isolated the relative contribution of each process to variation in active layer thickness or soil temperatures (Jiang *et al.*, 2015). A recent study by Fisher *et al.* (2016) examined the impact of multiple factors on active layer thickness in Canadian boreal forest and found overstory leaf area to be most important, followed by moss thickness and understory leaf

area. Further, this study revealed that moisture in deeper soil layers modified the impacts of vegetation whereas surface soil moisture did not (Fisher *et al.*, 2016). However this study did not explicitly consider how active vegetation canopy effects on snow-cover, or soil moisture influences on freeze-back and winter soil temperature might contribute to variability in active layer depth.

Further complexity is added when processes are considered across the annual cycle. The extent to which vegetation canopy effects on snow-distribution impact growing season soil moisture, either via direct moisture inputs or affects on growing season length, has not been thoroughly investigated. A study examining interannual variability in snow cover found that in that growing season energy partitioning was similar in a wet-fen after winters with above- and below-average snowfall (Stiegler *et al.*, 2016b). However, in a nearby dry heath below average snowfall resulted in earlier snowmelt and reduced soil moisture during the lengthened growing season, which in turn suppressed LE and G (Stiegler *et al.*, 2016b). Future research should focus on disentangling complex series of interactions between vegetation, soil properties, snow redistribution, and soil moisture across annual cycles of the soil thermal regime. Covariation in vegetation and soil characteristics and their influences on soil thermal regimes within ecosystems (Boike *et al.*, 2008) and regions (Cable *et al.*, 2016) may help to interpret empirical relationships between ecological and thermal variables at a range of scales.

Disentangling the relative impacts of multiple ecosystem characteristics on G will become increasingly important as ecological responses to continued climate warming may lead to shifts in ecosystem distribution (Pearson *et al.*, 2013; Abbott *et al.*, 2016), potentially resulting in novel ecosystems with no current eco-climatic analogs (Macias-Fauria *et al.*, 2012). Because ecosystems influence permafrost soil thermal dynamics in a variety of ways, shifts in ecosystem

distribution will fundamentally alter rates of permafrost thaw with projected future warming. This will occur directly via altered ecosystem surface energy dynamics that affect G and indirectly through changes to the surface energy balance that feed back to climate (e.g., Figure 1). The following sections describe ongoing and anticipated ecosystem responses to climate and associated changes to soil thermal regimes via impacts on G, and then the associated regional to global scale atmospheric feedbacks.

3 Implications of environmental change for permafrost thermal dynamics

Vegetation productivity and community composition are changing in response to longer and warmer growing seasons associated with amplified climate warming across the Arctic. Relationships between air temperature and soil thermal regimes vary with ecosystem properties and will therefore evolve as ecosystems respond to climate change. Ecosystem structural and functional characteristics that influence soil thermal dynamics may be altered directly by ecosystem responses to climate change, or indirectly by climatic alteration of disturbance processes that in turn modify ecosystems (e.g. O'Donnell *et al.*, 2011a). In this section, we outline key ecosystem changes arising from direct and indirect climate responses (summarized in Figure 2), and describe how these changes are likely to affect permafrost soil thermal regimes via impacts on processes described above.

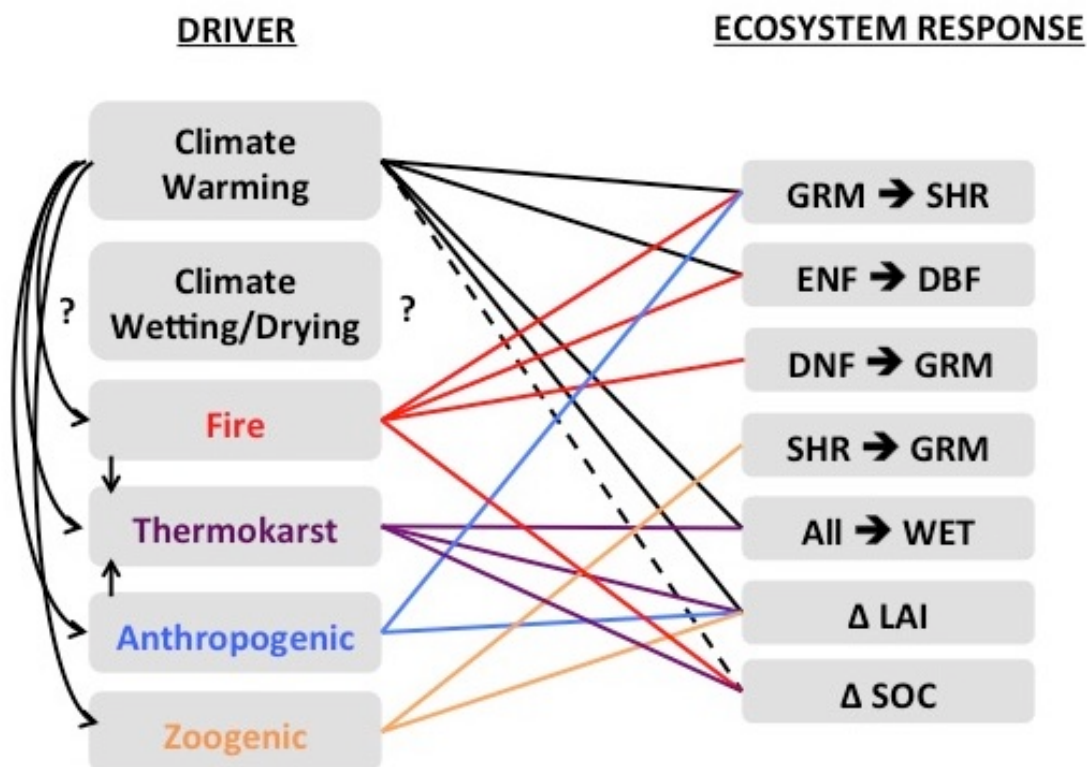


Figure 2. Summary of key drivers of ecosystem change, and the associated ecosystem responses observed (solid lines) or hypothesized (dashed lines) in permafrost ecosystems. Arrows (→) indicate transition from the current (left) to a new (right) ecosystem type, and the symbol delta (Δ) indicates a change in the associated ecosystem property. Ecosystem types are defined as follows: DBF = Deciduous Broadleaf Forest; DNF = Deciduous Needleleaf Forest; ENF = Evergreen Needleleaf Forest; GRM = Graminoid Dominated Ecosystem; SHR = Shrub Dominated Ecosystem; WET = Wetland Ecosystem; All = Any Initial Ecosystem type. Ecosystem properties are: LAI = Leaf Area Index and SOC = Soil Organic Carbon.

3.1 Vegetation change in response to climate

In tundra ecosystems, increases in vegetation productivity inferred from satellite observations (Jia *et al.*, 2003; Beck & Goetz, 2011) have been linked to shrub expansion and

accelerated annual growth at locations throughout the Arctic (Tape *et al.*, 2006; Forbes *et al.*, 2010; Macias-Fauria *et al.*, 2012; Frost & Epstein, 2014). However, warming experiments indicate that productivity increases may occur without shifts in the dominant vegetation type (Walker *et al.*, 2006; Elmendorf *et al.*, 2012b), and dendroecological observations illustrate that shrub responses to temperature are moderated by moisture and nutrient availability and are highly heterogeneous in space and time (Zamin & Grogan, 2012; Myers-Smith *et al.*, 2015; Ackerman *et al.*, 2017). Despite the high degree of heterogeneity in tundra vegetation responses to warming (Elmendorf *et al.*, 2012a), there are several consistent changes that include increased vegetation height, increased litter production, decreased moss cover (Elmendorf *et al.*, 2012b), and increased graminoid cover in lowland permafrost features (Malmer *et al.*, 2005; Johansson *et al.*, 2006; Malhotra & Roulet, 2015). However, reductions in greenness in some regions (referred to as ‘browning’) driven by, for example, reduced summer warmth index (Bhatt *et al.*, 2013) or acute ‘browning events’ from disturbances such as winter frost droughts (Bjerke *et al.*, 2014; Phoenix & Bjerke, 2016) add complexity to predicting vegetation change and hence subsequent impacts on permafrost.

Belowground vegetation dynamics are more difficult to study, but recent observations indicate that the below ground growing season length (period of unfrozen temperatures allowing for plant growth) can be greater than that aboveground (Blume-Werry *et al.*, 2015; Radville *et al.*, 2016). These differences likely vary with depth due to effects related to the progression of soil freezing and thawing (Rydén & Kostov, 1980). Thus, rooting depth and lateral root distributions will influence the below-ground phenology differentially for deep-rooted (e.g., sedge) versus shallow-rooted (e.g., shrub) species (Bardgett *et al.*, 2014; Iversen *et al.*, 2015), which may alter soil moisture via plant water uptake under future warming related vegetation

change increased active layer depth. The changing above- and below-ground growth phenology of tundra plants (Blume-Werry *et al.*, 2015; Iversen *et al.*, 2015; Radville *et al.*, 2016) could also favor the proliferation of certain functional groups or species creating potential feedbacks to vegetation change. In addition to belowground phenology, total root production could also increase in response to warming (e.g. Xue *et al.*, 2015). However, increased nutrient availability from warming could decrease root production relative to aboveground production (Keuper *et al.*, 2012; Poorter *et al.*, 2012). Improved understanding of interactions between root dynamics and soil moisture may help to understand thermal changes in permafrost soils during the summer thaw and fall freeze-back periods.

Determining the net effect of tundra vegetation productivity changes on soil thermal regimes requires improved understanding of the magnitude and spatial extent of changes in vegetation stature and rooting dynamics. Enhanced tundra vegetation productivity may reduce summer soil temperatures via ground shading and increase winter soil temperatures via effects on snow depth and density. The effect of declining moss cover will depend on the balance between reduced insulation (i.e., K_T) and latent cooling associated with increased soil evaporation. Vegetation change may also alter organic soil accumulation rates via altered litter quality and quantity (Cornelissen *et al.*, 2007). This overall effect on soil K_T will depend on the net effects of changing litter inputs, lability, and decomposition rates with warming (Hobbie, 1996; Hobbie & Gough, 2004; Cornelissen *et al.*, 2007; Christiansen *et al.*, 2018; Lynch *et al.*, 2018). Overall the effects of vegetation change on snow redistribution and soil moisture will likely have the strongest influence on soil thermal regimes. Boreal forest responses to climate in recent decades were generally more heterogeneous than those observed in tundra ecosystems due to a variety of interacting factors including species differences in physiology, disturbance

regimes, and successional dynamics. Initial satellite observations of boreal forest productivity increases (Myneni *et al.*, 1997) have slowed or even reversed in recent decades (Beck & Goetz, 2011; Guay *et al.*, 2014). Tree ring analyses confirm productivity declines associated with temperature induced drought stress in interior Alaska boreal forests (Barber *et al.*, 2000; Walker & Johnstone, 2014; Juday *et al.*, 2015; Walker *et al.*, 2015), and have been used to corroborate satellite observations (Beck *et al.*, 2011). Similarly, drought-induced mortality has been observed at the southern margins of Canadian boreal forests (Peng *et al.*, 2011) where correspondence between satellite and tree ring records have also been observed (Berner *et al.*, 2011). In Siberia, positive forest responses to air temperatures observed in tree rings and satellite observations near latitudinal tree lines give way to declines in tree growth further south (Lloyd *et al.*, 2010; Berner *et al.*, 2013). These results are in line with ecosystem-scale observations of suppressed transpiration under high vapor pressure deficits and low soil moisture conditions (Lopez C *et al.*, 2007; Kropp *et al.*, 2017). More generally, forests growing on continuous permafrost exhibit more widespread productivity increases (Loranty *et al.*, 2016), suggesting that permafrost may buffer against drought stress. However, waterlogged soil resulting from permafrost thaw can also lead to unstable soils and forest mortality (Baltzer *et al.*, 2014; Iijima *et al.*, 2014; Helbig *et al.*, 2016a).

The extent to which ongoing boreal forest productivity changes influence permafrost soil thermal dynamics is not entirely clear. If forest canopy cover changes with productivity (e.g., canopy infilling or increased leaf area), then changes in ground shading and LW dynamics could alter ground thermal regimes. Increases in forest cover have been observed in northern Siberia (Frost & Epstein, 2014); however, it is unclear whether the cause is climate warming or ecosystem recovery after fire. Conversely, productivity declines are more pronounced in high-

density forests (Bunn & Goetz, 2006) and, consequently, browning trends associated with mortality in southern boreal forests (Peng *et al.*, 2011) may increase radiation at the ground surface. Additionally, if browning is indicative of drought stress, vegetation may enhance the insulation of organic soils by further depleting of soil moisture via plant water uptake (Fisher *et al.*, 2016). Forest mortality and declines in canopy cover in southern boreal forests as a consequence of permafrost thaw (Helbig *et al.*, 2016a) may feedback positively to permafrost thaw. Functional changes (e.g., stomatal suppression of transpiration in response to drought) occur more quickly than structural changes, so boreal forest effects on soil moisture will likely be an important driver of changes in soil thermal regimes. In addition there has been relatively little work on how the effects of forest distribution on snow cover alters G in winter, and this will also become increasingly important as forests change.

3.2 Wildfire disturbance

Wildfire is the dominant disturbance in the boreal forest and is increasingly present in arctic tundra. Wildfire influences surface energy dynamics via impacts on vegetation and surface soil properties, likely accelerating permafrost thaw (Burn, 1998; Viereck *et al.*, 2008; O'Donnell *et al.*, 2011a; Jafarov *et al.*, 2013; Brown *et al.*, 2015; Jones *et al.*, 2015). Vegetation combustion and mortality increases radiation at the ground surface. The combustion and charring of moss and organic soil lowers albedo and increases K_T , leading to warmer soils with deeper active layers in the decades following a fire (Yoshikawa *et al.*, 2003; Liljedahl *et al.*, 2007; Rocha & Shaver, 2011; French *et al.*, 2016). In boreal forests, loss of canopy cover increases albedo during the snow-covered period (Jin *et al.*, 2002; Lyons *et al.*, 2008; Jin *et al.*, 2012), which may result in local atmospheric cooling (Lee *et al.*, 2011). However, such atmospheric cooling has not

572 been linked to soil climate, and canopy loss may also result in a deeper snowpack, which inhibits
573 ground cooling during winter (Kershaw, 2001). In general, wildfire effects on permafrost soil
574 climate are primarily the result of altered growing season surface energy dynamics.

575 The magnitude of wildfire effects on soil temperature is closely linked to burn severity,
576 as indicated by the degree of organic soil combustion and the post-fire organic horizon thickness
577 (Kasischke & Johnstone, 2005). Post-fire recovery of the organic-soil horizon can allow recovery
578 of soil temperature and active layer thickness to pre-fire conditions (Rocha *et al.*, 2012).
579 However, relatively warm discontinuous zone permafrost is often ecosystem-protected by
580 vegetation and organic horizons (Shur & Jorgenson, 2007), thus loss or reduction of organic soil
581 may result in the irreversible thaw or loss of permafrost (Romanovsky *et al.*, 2010; Jiang *et al.*,
582 2015). Site-based model simulations suggest that fire-driven change in organic-horizon thickness
583 is the most important factor driving post-fire soil temperature and permafrost dynamics (Jiang *et*
584 *al.*, 2015).

585 Wildfire impacts on permafrost also vary spatially with ecosystems and topography. For
586 instance south-facing forest stands tend to burn more severely than north-facing stands (Kane *et*
587 *al.*, 2007). Further, poorly drained toe-slopes burn less severely than more moderately drained
588 upslope landscapes. These topographic effects on burn severity can strongly influence the
589 response of soil temperature and permafrost to fire (O'Donnell *et al.*, 2009b). The loss of
590 transpiration due to the combustion of trees may result in wetter soils in recently burned stands
591 compared to unburned stands (O'Donnell *et al.*, 2011a). However, other studies have
592 documented drier soils in burned relative to unburned stands (Jorgenson *et al.*, 2013),
593 particularly at sites underlain by coarse-grained, hydrologically conductive soils. Post-fire
594 thawing of permafrost can increase the hydraulic conductivity of mineral soils due to ice loss,

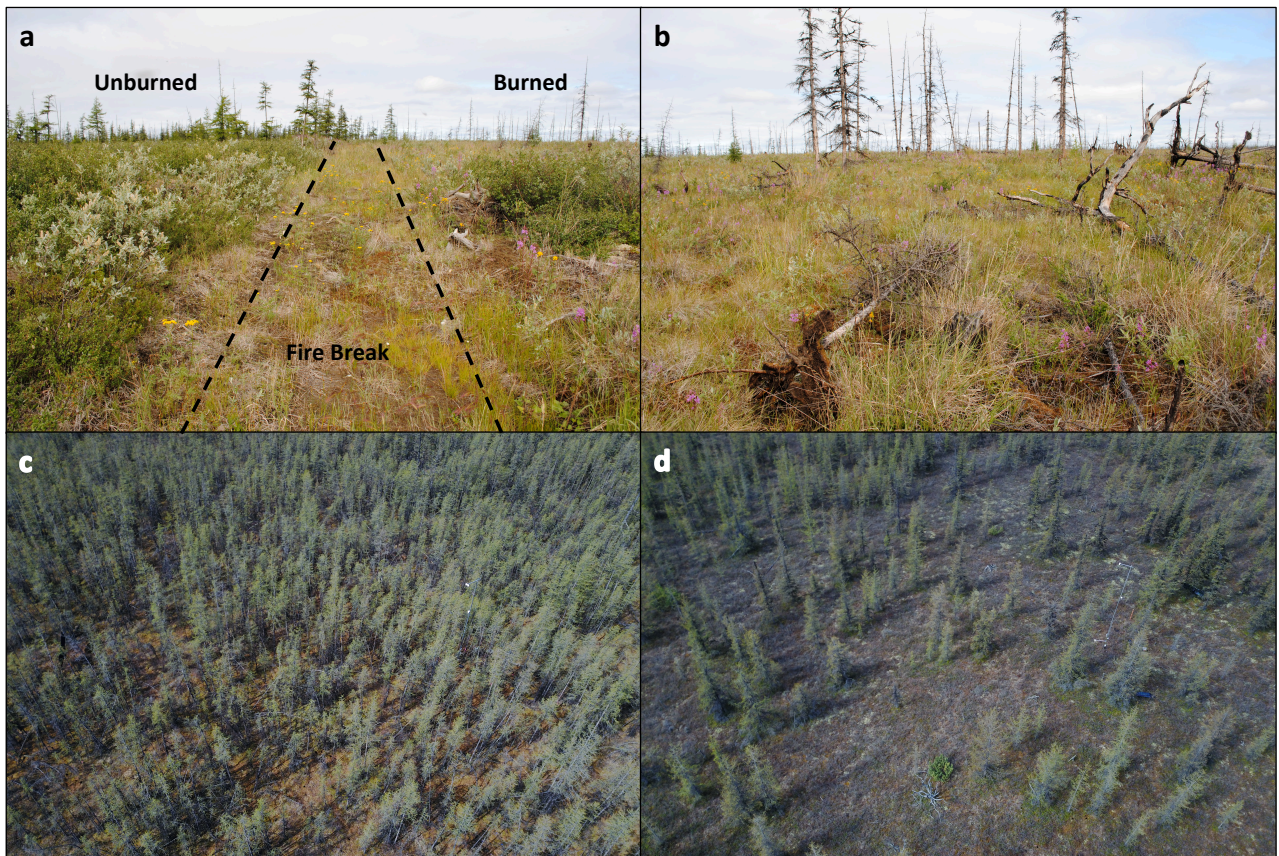
leading to enhanced infiltration of soil water and soil drainage. Post-fire changes in soil moisture and drainage can function as either a positive or negative feedback to permafrost thaw (O'Donnell *et al.*, 2011b). Recent evidence also indicates that mineral soil texture is an important control on post-fire permafrost dynamics (Nossov *et al.*, 2013).

While the magnitude of fire effects on G and active layer depth is typically governed by burn severity, the persistence of these changes depends on ecosystem recovery (Jorgenson *et al.*, 2013). Albedo returns to pre-fire levels within several years after fire (Jin *et al.*, 2012) due to fairly rapid recovery of vegetation (Mack *et al.*, 2008). Recovery of moss and re-accumulation of the organic-soil horizon further facilitate recovery of soil temperatures and permafrost, and may occur within several decades (e.g. Lorantý *et al.*, 2014b). Finally, recovery of vegetation canopies over decades to centuries gradually reduces incident radiation at the ground surface to pre-fire levels. The effects of fire on T_{SG} and permafrost are well understood, and it may be reasonable to expect similar effects in the future that are amplified as fire exposes permafrost soils to increasingly warmer atmospheric temperatures. However, changes in the severity and extent of wildfires can result in new ecosystem dynamics with implications for permafrost that do not confer linearly from current eco-climatic conditions.

Recent warming at high latitudes has increased the spatial extent, frequency, and severity of wildfires in North America (Turetsky *et al.*, 2011; Rocha *et al.*, 2012) to levels that are unprecedented in recent millennia (Hu *et al.*, 2010; Kelly *et al.*, 2013). Fire regimes in boreal forests in Eurasia remain poorly characterized (Kukavskaya *et al.*, 2012), though several studies indicate that fire extent and frequency are likely increasing with climate warming (Kharuk *et al.*, 2008; 2013; Ponomarev *et al.*, 2016). Circumpolar wildfire in the boreal forest and arctic tundra are projected to substantially increase by the end of the century due to direct climate forcing and

ecosystem responses (Abbott *et al.*, 2016). Recovery of soil thermal regimes and permafrost after fire is strongly influenced by ecosystem recovery, and recent studies have established links between burn severity and post-fire succession (Johnstone *et al.*, 2010; Alexander *et al.*, 2018). Consequently, in North America burn severity is likely the dominant factor controlling the effects of wildfire on permafrost soil thermal regimes both through direct influences on soil thermal regimes and indirectly through influences on post fire succession.

In boreal North America, low-severity fires in upland black spruce forest typically foster self-replacing post-fire vegetation trajectories while high-burn severity fosters a transition to deciduous dominated forests. (Johnstone *et al.*, 2010). In addition to changes in canopy effects on ground shading, this transition also leads to reductions in post-fire accumulation of the soil organic layer (Alexander & Mack, 2015). Observations of mean annual soil temperatures that are 1-2 °C colder in soils underlying black spruce forests compared to deciduous forests (Jorgenson *et al.*, 2010; Fisher *et al.*, 2016) indicate that burn severity influences on post-fire succession will lead to alternate soil temperature and permafrost recovery pathways as well.

633
634

635 Figure 3. Impacts of fire on ecosystem structure in Siberian larch forests. A firebreak near the
 636 town of Cherskii (a) shows the contrast between burned and unburned areas ~10 years post-fire,
 637 where apparent larch and shrub recruitment failure has resulted a transition to graminoid
 638 dominance (b; detail of burned area). Nearby in a ~70 year old burn scar high-density (c) and
 639 low-density (d) forests illustrate the impacts of fire severity on canopy cover, and correspond to
 640 large differences in soil thermal regimes and active layers depths of ~40 cm in the high-density
 641 stand and ~90 cm in the low-density stand (M. Loranty, unpublished data). Photos M. Loranty.

642

643 In Siberian larch forests, post-fire recovery is impacted by fire severity and seed dispersal
 644 (Figure 3). High burn severity fires promote high rates of seedling recruitment and subsequent

forest stand density (Sofronov & Volokitina, 2010; Alexander *et al.*, 2018) when dispersal is not limited. But since larch are not serotinous and seed rain varies from year to year, high burn severity does not guarantee succession to high-density forests. Recovery tends to be slow and highly variable (Berner *et al.*, 2012; Alexander *et al.*, 2012b). Wide ranges of post-fire moss accumulation and forest regrowth have been observed, though consequences for permafrost are unclear (Furayev *et al.*, 2001). Observed declines in permafrost thaw depth with increasing canopy cover (Webb *et al.*, 2017) support the notion of a link between fire severity and permafrost soil thermal dynamics. However, the combined effects of fire and climatic warming and drying could lead to widespread conversion of larch forests to steppe (Tchebakova *et al.*, 2009), whereas declines in fire could result in increased cover of evergreen needleleaf species (Schulze *et al.*, 2012). Thus the impacts of fire on permafrost in Siberia will depend on the combined effects of climate and fire severity.

In tundra ecosystems fire is becoming increasingly common (Rocha *et al.*, 2012). Fire-induced transitions from graminoid- to shrub-dominated ecosystems have been observed in several instances (Landhäusser & Wein, 1993; Racine *et al.*, 2004; Jones *et al.*, 2013), while in others recovery of graminoid-dominated ecosystems has occurred, especially when fire leads to ponding (Vavrek *et al.*, 1999; Barrett *et al.*, 2012; Loranty *et al.*, 2014b). If unusually large tundra fires with high burn severity (e.g. Jones *et al.*, 2009) occur more regularly fire induced transitions from graminoid to shrub tundra may become more common (Jones *et al.*, 2013; Lantz *et al.*, 2013). A shift to shrub dominance could buffer permafrost soils from continued climate warming during summer (e.g Blok *et al.*, 2010; Myers-Smith & Hik, 2013) or promote warmer soils in winter (Lantz *et al.*, 2013; Myers-Smith & Hik, 2013) at the ecosystem-scale depending on how topography and the spatial distribution of shrubs impact snow redistribution (Essery &

Pomeroy, 2004; Ménard *et al.*, 2014). In addition, there is evidence that thermal erosion as a consequence of fire may facilitate shrub transitions, especially in areas of ice-rich permafrost (Bret-Harte *et al.*, 2013; Jones *et al.*, 2013), and the associated changes in local hydrology and topography will also impact soil thermal regimes.

Across arctic and boreal ecosystems increased fire extent and severity will increase summer G leading to warmer soils with deeper active layers that take longer to freeze-back in fall and thus reduce the time for heat loss in winter across larger portions of the permafrost region. Post-fire ecosystem recovery will determine the trajectory of soil thermal regimes in coming decades to centuries. In tundra and Siberian larch forests shifts toward increased canopy cover may help thermal regimes recover more quickly and buffer against continued warming. However the link between fire severity and increased canopy cover is not certain. In North American boreal forests increased deciduous cover after high severity fires may prevent full recovery of the soil thermal regime after severe fires (i.e., warmer soils) and loss of permafrost in areas where discontinuous permafrost is ecosystem protected (Jorgenson *et al.*, 2010).

3.3 Permafrost thaw, thermokarst disturbance, and hydrologic change

Permafrost thaw can occur in two primary modes, depending on pre-thaw ground ice content. In terrain underlain by low ground ice content (typically < 20% by volume), the soil profile can thaw from the top down without disturbing the surface in what is termed thaw-stable permafrost degradation (Jorgenson *et al.*, 2001). Alternatively, in ice-rich terrain, when ground ice volume exceeds unfrozen soil pore space (usually > 60%), permafrost thaw causes surface subsidence or collapse, termed thermokarst (Kokelj & Jorgenson, 2013). Thermokarst is the predominant disturbance in arctic tundra and is an important disturbance in boreal forests

underlain by permafrost (Lara *et al.*, 2016). Recent evidence indicates increasing prevalence of thermokarst features during the last half-century (Jorgenson *et al.*, 2006; 2013; Liljedahl *et al.*, 2016; Mamet *et al.*, 2017), though circum-arctic prevalence and change of thermokarst extent are poorly constrained (Yoshikawa & Hinzman, 2003; Lantz & Kokelj, 2008; Olefeldt *et al.*, 2016). Thermokarst features form over the course of weeks to decades, can involve centimeters to meters of ground surface displacement, and typically lead to dramatic changes in ecosystem vegetation and soil properties (e.g. Osterkamp *et al.*, 2000; Douglas *et al.*, 2016; Wagner *et al.*, 2018). Thermokarst could affect 20–50% of the permafrost zone by the end of the century, according to projections of permafrost degradation and the distribution of ground ice (Zhang *et al.*, 2000; Slater & Lawrence, 2013; Abbott & Jones, 2015). Upland thermokarst in the discontinuous permafrost zone already impacts 12% of the overall landscape in some areas and up to 35% of some vegetation classes (Belshe *et al.*, 2013).

Following initial thaw, hydrologic conditions play an important role in the subsequent evolution of thermokarst features because the high thermal conductivity of water can increase heat flux to the active layer and permafrost (Nauta *et al.*, 2015). Lowland and upland thermokarst may have contrasting effects on surface hydrology, with lowland thermokarst initially increasing wetness (e.g. O'Donnell *et al.*, 2012), but eventually leading to greater drainage if permafrost is completely degraded (Anthony *et al.*, 2014). Upland thermokarst can either increase or decrease surface wetness, depending on soil conditions and local topography (Abbott *et al.*, 2015; Abbott & Jones, 2015; Mu *et al.*, 2017). Redistribution of water to thermokarst pits and gullies can lead to drying in adjacent areas that have not subsided (Osterkamp *et al.*, 2009). In winter, increases in snow accumulation in thermokarst depressions insulates soils (Stieglitz, 2003).

Ecological responses to thermokarst formation can act as either positive or negative feedbacks to continued thaw, depending on how thermokarst formation affects vegetation and hydrology, including snow cover (Kokelj & Jorgenson, 2013). Active layer detachments in uplands remove vegetation and organic soil, increasing energy inputs to deeper soil layers. In upland tundra, shifts from graminoid- to shrub-dominated vegetation communities have been observed with thaw, though communities varied locally with microtopography created by thermokarst features themselves (Schuur *et al.*, 2007). In boreal forests, thermokarst and permafrost thaw can cause transitions to wetlands or aquatic ecosystems (Jorgenson & Osterkamp, 2005); whereas, vegetation community shifts are more subtle in uplands (Jorgenson *et al.*, 2013). Permafrost thaw may also lead to a more nutrient-rich environment (Keuper *et al.*, 2012; Harms *et al.*, 2014), but this depends on local soil properties. The succession of aquatic or terrestrial vegetation can curb thaw through negative feedbacks associated with canopy cover and organic soil accumulation and aggrade permafrost (Briggs *et al.*, 2014). Hydrologic changes associated with thermokarst likely have a stronger influence on the soil thermal regime than associated ecosystem changes, in part because the former occur more rapidly than the latter. Under thaw stable conditions there is the possibility that enhanced vegetation productivity could lead to summer soil cooling, however the effects on soil composition and moisture, and snow distribution will also affect the thermal regime and are as yet unclear.

3.4 Zoogenic disturbance

A large portion of the circumpolar Arctic is grazed by reindeer and caribou (both *Rangifer tarandus* L.), and their grazing and trampling causes important long-term vegetation shifts, namely inhibition of shrub proliferation (Olofsson *et al.*, 2004b; Forbes & Kumpula,

2009; Olofsson *et al.*, 2009; Plante *et al.*, 2014; Väisänen *et al.*, 2014). Besides direct consumption of lichen and green biomass, large semi-domestic reindeer herds of northwest Eurasia also exert a variety of impacts on biotic and abiotic components of Arctic and sub-Arctic tundra ecosystems that have implications for permafrost thermal regimes. For example, as reindeer reduce vertical structure of vascular and nonvascular vegetation, they tend to decrease albedo (Beest *et al.*, 2016) and reduce thermal conductivity at the ground level (Olofsson, 2006; Fauria *et al.*, 2008), which can lead to warmer soils (Olofsson *et al.*, 2001; van der Wal *et al.*, 2001; Olofsson *et al.*, 2004b). Recent research has revealed that the consequences of climate warming on tundra carbon balance are determined by reindeer grazing history (Zimov *et al.*, 2012; Väisänen *et al.*, 2014). Grazing by small mammals also influences arctic plant communities (Olofsson *et al.*, 2004a). The extent to which ongoing vegetation change across the Arctic is a result historic grazing patterns is unclear. However, it is plausible that social and/or ecoclimatic drivers that change the distribution or behavior of grazing mammals have impacted permafrost ecosystems in ways that affect the soil thermal regime. More targeted research is necessary to elucidate links between grazing, ecosystem vegetation and soil characteristics, and soil thermal regimes.

3.5 Anthropogenic disturbance

The most extensive direct anthropogenic disturbances within the permafrost zone occur in three regions that have experienced widespread hydrocarbon exploration and extraction activities: the North Slope of Alaska, the Mackenzie River Delta in Canada, and northwest Russia, including the Nenets and Yamal-Nenets Autonomous Okrugs. The types of terrestrial degradation commonly associated with the petroleum industry have historically included rutting

from tracked vehicles; seismic survey trails; pipelines, drilling pads and roads and the excavation of the gravel and sand quarries necessary for their construction (Walker *et al.*, 1987; Huntington *et al.*, 2013). A single pass of a vehicle over thawed ground can create ruts with increased K_T due to increased bulk density and soil moisture, while altered local hydrology can drain downslope wetlands and, in both cases, lead to vegetation changes that persist for decades (Forbes, 1993; 1998). As a result of these combined factors, the increase from scale of impact to scale of response can be several orders of magnitude (Forbes *et al.*, 2001). It has also been demonstrated that even relatively small-scale, low intensity disturbances in winter, like seismic surveys over snow-covered terrain, reduce microtopography, and increase ground temperatures and active layer thaw depths (Crampton, 1977; Kershaw, 1983).

More recently, gravel roads and pads have become common, however this elevated infrastructure causes other unanticipated impacts to the permafrost from accumulated dust, snow drifts, and roadside flooding (Walker & Everett, 1987; 1991; Auerbach *et al.*, 1997; Raynolds *et al.*, 2014). Over time, the warmer environments adjacent to roads have led to strips of earlier phenology and shrub vegetation and even trees along both sides of most roads and buried pipeline berms in the Low Arctic (Gill *et al.*, 2014). Aeolian sand and dust associated with gravel roads or quarries can affect tundra vegetation and soils up to 1 km from the point source (Forbes, 1995; Myers-Smith *et al.*, 2006). At present, there is concern that climate warming and infrastructure are combining to enhance melting of the top surface of ice-wedges, leading to more extensive ice-wedge thermokarst (Raynolds *et al.*, 2014; Liljedahl *et al.*, 2016) and cryogenic landslides (Leibman *et al.*, 2014) in areas of intensive development. The proportion of permafrost ecosystems affected by anthropogenic disturbance is not well quantified, but it will continue to increase in coming decades.

782

783 **4 Local versus regional ecosystem feedbacks on permafrost thermal dynamics**

784 Interactions between ecosystem scale microclimate feedbacks and regional or global
785 climate feedbacks stemming from ecological change are complex and represent a key source of
786 uncertainty related to understanding permafrost soil responses to continued climate warming. If
787 changing ecosystem characteristics influencing permafrost thermal dynamics described above
788 are widespread, the accompanying changes in land surface water and energy exchange will feed
789 back to influence regional climate, and changes in greenhouse gas dynamics will feed back on
790 global climate (Chapin *et al.*, 2000b). Therefore, ecosystem changes that alter local permafrost
791 soil thermal dynamics may also lead to regional and global climate feedbacks that compound or
792 offset ecosystem-scale effects (Table 1).

793

Table 1. Key ecosystem changes, associated drivers, and feedback effects on local soil climate and regional to global climate.

Ecosystem Property	Drivers of Change ¹	Local Feedbacks ²	Regional-Global Feedbacks ³
Canopy cover/density increases more likely, unless widespread wetting occurs or under certain conditions after fire.	Climate warming (+) Hydrologic change (?) Fire severity (+/-) Thermokarst (-) Permafrost thaw (+) Grazing (-/?) Anthropogenic (+/?)	T_{sg} - Ground Shading T_{sg} - LW Enhancement K_r - Soil moisture utilization K_r - Snow trapping	Albedo Increased Evapotranspiration Carbon Sequestration
Soil moisture uncertain; dependent on vegetation, soil, climate, topography, ground ice, and whether permafrost is continuous	Climate warming (+/-) Hydrologic change (+) Fire severity (+/-) Thermokarst (+/-) Permafrost thaw (-) Anthropogenic (+/?)	K_r T_{sg} - Evaporation	Increased Evapotranspiration Carbon Sequestration Greenhouse gas emissions
Moss cover/organic layer thickness uncertain; dependent on overstory vegetation, topography, and soil moisture	Climate warming (?) Hydrologic change (?) Fire severity (-) Thermokarst (+/-) Permafrost thaw (+/-) Grazing (-) Anthropogenic (+/?)	K_r T_{sg} - Evaporation	Evapotranspiration Carbon Sequestration

¹ Parentheses indicate whether driver is likely to cause an increase (+) or decrease (-) in ecosystem properties, or if the direction of the relationship is unclear.

² Effects of changing ecosystems property on local soil temperatures. Red and blue indicate positive and negative effects on soil temperature, respectively.

³ Regional and Global climate feedbacks associated with changing ecosystem properties. Red and blue colors indicate positive and negative feedbacks respectively, gray indicates uncertain feedback effects.

4.1 Regional biogeochemical climate feedbacks

The net biogeochemical climate effects of ecosystem change across permafrost regions will be a balance of changes in CO₂ uptake that accompany shifts in vegetation, and changes in CO₂ and CH₄ release associated with shifts in autotrophic and heterotrophic respiration, and fire and thermokarst disturbance. These feedback effects will be global in extent and will not contribute directly to regional variability in permafrost thaw because greenhouse gasses are well mixed in the atmosphere. Changes in the net CO₂ balance remain uncertain, but a recent expert survey suggests that over the next century increases in vegetation productivity may not be large enough to offset increases in carbon release to the atmosphere (Abbott *et al.*, 2016). In tundra

ecosystems, this conclusion is in line with projections of future biomass distribution (Pearson *et al.*, 2013) and atmospheric inversions showing that increased autumn CO₂ efflux offsets increases in uptake during the growing season (Welp *et al.*, 2016; Commane *et al.*, 2017). In boreal forests, carbon cycle changes are more complex; long-term trends in the annual amplitude of atmospheric CO₂ concentrations (Graven *et al.*, 2013; Forkel *et al.*, 2016) suggest increases in biological activity while satellite observations and tree ring analyses suggest widespread declines in productivity (Beck *et al.*, 2011). Further, model analyses indicate a weakening terrestrial carbon sink associated with declining uptake, increases in respiration, and disturbance (Hayes *et al.*, 2011), which is crucially important in boreal forests (Bond-Lamberty *et al.*, 2013).

The net CO₂ effect of wildfire has typically been considered to be close to zero for evergreen needleleaf forests in interior Alaska over historic fire return intervals (Randerson *et al.*, 2006). However, the combined effects of climate warming and fire tend to reduce ecosystem carbon storage by thawing permafrost (Harden *et al.*, 2000; O'Donnell *et al.*, 2011b; Douglas *et al.*, 2014). Model simulations that include permafrost dynamics indicate ecosystem carbon losses may become larger in the future with continued warming and intensification of the fire regime, particularly for dry upland sites (Genet *et al.*, 2013; Jafarov *et al.*, 2013). These studies do not account for potential changes in post-fire vegetation communities (Alexander *et al.*, 2012a) however, the net effects of vegetation shifts on ecosystem carbon storage appear to be minimal (Alexander & Mack, 2015). In tundra ecosystems larger and more severe fires lead to large soil C losses (Mack *et al.*, 2011) that may be sustained over time due to permafrost thaw (Jones *et al.*, 2013; 2015). Taken together, this evidence suggests that fire will likely lead to net carbon losses in the coming decades to centuries across the permafrost region, thus acting as a positive feedback to climate warming with associated effects on permafrost soils (Abbott *et al.*, 2016).

The biophysical climate feedbacks associated with fire are more immediate and will be stronger than the carbon cycle feedbacks (Randerson *et al.*, 2006).

The effects of thermokarst on greenhouse gas dynamics depend largely on associated hydrological changes. With increased drainage and surface drying, increased oxidation rates reduce carbon accumulation (Robinson & Moore, 2000) and enhance CO₂ release (Frolking *et al.*, 2006), and reduce CH₄ production (Abbott & Jones, 2015). When ground thaw is associated with increased soil saturation, CH₄ production and emissions are increased (Johansson *et al.*, 2006; Olefeldt *et al.*, 2012; Abbott & Jones, 2015; Malhotra & Roulet, 2015; Natali *et al.*, 2015), which can shift tundra from a net CH₄ sink (Jorgensen *et al.*, 2015) into a CH₄ source (Nauta *et al.*, 2015). Thermokarst may also increase lateral transport of soil organic matter, which can decrease CO₂ release (Abbott & Jones, 2015) and alter carbon processing downslope. Thermokarst lakes emit CH₄, particularly along actively thawing lake margins (Walter *et al.*, 2007; 2008), and CO₂ (Kling *et al.*, 1991; Algesten *et al.*, 2004). However at millennial timescales, thermokarst lakes can sequester carbon as lake sediments and peat accumulate (Jones *et al.*, 2012; Anthony *et al.*, 2014). Currently thermokarst landscapes comprise upwards of 20% of the permafrost region (Olefeldt *et al.*, 2016), however their current and future impacts on the global carbon balance remain poorly constrained.

4.2 Regional biophysical climate feedbacks

The biophysical effects of ecosystem change arising from shifts in surface energy partitioning have climate feedback effects at scales ranging from local to regional and global. Whereas biogeochemical climate feedbacks will influence global temperature in conjunction with many other carbon cycle processes, biophysical feedbacks operating at local and regional

scales are likely to influence the spatial and temporal patterns of permafrost thaw with continued warming. As described in the previous sections, changes in vegetation composition and structure alter soil thermal dynamics via changes in G during the snow-free season (Chapin *et al.*, 2000a; Beringer *et al.*, 2005). However, changes in G associated with vegetation change will also be accompanied by changes in H and LE that may feedback to G, depending upon the scale of impact.

Decadal ecosystem responses to climate inferred from ‘greening’ or ‘browning’ trends are the most spatially pervasive change affecting vegetation in the permafrost zone (Loranty *et al.*, 2016). Increases in leaf area and/or vegetation stature will generally reduce albedo, and these effects are particularly pronounced during the spring and fall if enhanced productivity leads to increased snow-masking by vegetation (Sturm *et al.*, 2005; Loranty *et al.*, 2014a). Reductions in albedo will lead to sensible heating of the atmosphere (Chapin *et al.*, 2005) that may counteract the effects of canopy shading on G, if albedo reduction occurs at sufficiently large spatial scales (Lawrence & Swenson, 2011; Bonfils *et al.*, 2012). The magnitude and spatial extent of vegetation height increases are crucial to determine the net feedback strength, but these quantities remain largely unknown.

A second important but relatively unexplored feedback relates to evaporative cooling of the land surface associated with increases in LE (but see Swann *et al.*, 2010; Helbig *et al.*, 2016a). Productivity increases are likely accompanied by increases in evapotranspiration (Zhang *et al.*, 2009), which have been shown to mitigate temperature increases at global scales by increased cloud cover, which may reduce incoming short-wave radiation reaching the Earth’s surface (Zeng *et al.*, 2017). During the growing season, this cooling could effectively reduce the degree of atmospheric sensible heating associated with increased albedo, and would be

particularly important if there is no change in snow masking by vegetation (e.g., greening in tundra without shrub expansion, or in closed canopy boreal forest). However, the extent to which latent cooling with enhanced productivity may offset sensible heating associated with albedo decreases is uncertain for several reasons. First, model experiments simulating shrub expansion, for example, utilize canopy parameterizations for deciduous boreal tree species, because arctic shrub canopy physiology has not been thoroughly characterized (e.g. Bonfils *et al.*, 2012). Second, existing observations indicate an increasing degree of stomatal control on evapotranspiration with vegetation stature (Eugster *et al.*, 2000; Kasurinen *et al.*, 2014), indicating that LE will not necessarily continue to increase with climate warming, which is supported by the emergence of browning trends. Additionally, climatic changes in arctic hydrology are highly uncertain and likely to vary spatially (Francis *et al.*, 2009), meaning that LE may be limited by hydrology in some places but not others. Lastly, disturbance processes will also alter surface energy dynamics through short-term direct impacts on ecosystem structure and long-term impacts on post-disturbance succession (as described above).

5 Conclusions

The effects of climatic change on permafrost thermal dynamics depends directly on terrestrial ecosystem properties, which mediate surface energy partitioning and soil thermal characteristics. Relationships between permafrost and climate vary spatially with ecosystems properties and processes, and these patterns vary through time on event to millennial timescales. The changing nature of permafrost thermal regimes will be driven by surface energy feedbacks operating on local-, regional-, and global-scales. Complex interactions among many of these

896 feedbacks create uncertainty surrounding the timing and magnitude of the permafrost carbon
897 feedback.

898 Continued ecosystem-scale research focused on several key process interactions will
899 improve our understanding of ecological influences on soil thermal regimes. The influence of
900 plant water use on spatial and temporal variability in soil moisture is unclear. Future work should
901 seek to elucidate interactions between vegetation and soil moisture. The extent to which changes
902 in decomposition rates and litter substrate quantity and quality alter the insulating effects of
903 ground cover and the soil organic layer is also unclear and could benefit from continued
904 research. More research on relationships between the spatial distribution of vegetation canopies
905 and the insulative properties of snow is also needed, especially in boreal forests. Lastly, more
906 studies should involve year-round data collection focused on understanding time-lags and the
907 cumulative effects of seasonal processes. In particular the net thermal effects of canopy shading
908 versus snow-trapping, seasonally lagged effects of snow cover, and seasonally lagged effects of
909 soil moisture could all be better understood through focused observational studies.

910 Improved process level understanding of ecosystem influences on soil thermal regimes
911 will not be useful for predicting the fate of permafrost carbon unless the processes that control
912 the timing, extent, and trajectories of ecosystem change are known. There has been a strong
913 focus on graminoid-shrub transitions in tundra ecosystems, yet there are a number of other
914 potential vegetation transitions, many mediated by disturbance, with equally important
915 implications. Changes in boreal forest structure and function underlying productivity trends need
916 to be elucidated. Continued work focused on understanding how changing fire regimes influence
917 soils and post-fire succession is also important, especially in tundra and Siberian boreal forests.
918 These changes are not spatially isolated, and compounding disturbances will likely become

919 increasingly important to understand. In addition to vegetation changes, constraining the
920 proportion of landscapes affected by drying versus waterlogging associated with initial
921 permafrost thaw is central to predicting both soil organic matter stocks and vegetation responses
922 to climate warming. Related, whether precipitation increases or decreases with climate warming
923 remains highly uncertain, and this will exert strong influence on vegetation and ecosystem
924 responses to climate as well as disturbance mediated ecosystem changes.

925 Lastly, changes in ecosystem vegetation and soil characteristics that occur over
926 sufficiently large spatial scales will affect soil thermal regimes via feedbacks to regional and
927 global climate that with the potential to amplify or attenuate local ecosystem-scale feedbacks.
928 For example, could wetland expansion associated with widespread permafrost thaw lead to
929 regional cooling through increased albedo, or might warming as a result of increased methane
930 emissions offset this? Or could increased evapotranspiration associated with enhanced vegetation
931 productivity lead to surface cooling and cloud formation that cools soils in summer, or might the
932 rise in atmospheric water vapor increase late summer precipitation and extend the fall freeze-
933 back period? Complex feedback processes such as these will likely affect the trajectory of
934 permafrost responses to climate. Continued efforts to understand the fate of permafrost in
935 response to climate will require integrated analyses of processes affecting permafrost soil
936 thermal regimes, changing circumpolar ecosystem distributions, and the net effects of resulting
937 climate feedbacks operating across a range of spatial and temporal scales.

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