### Impacts of Changes in Winter Precipitation on

C Stocks and Fluxes in Arctic Tussock Tundra

### BY

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### **THESIS**

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**EBB** 

### CONTRIBUTION OF AUTHORS

**Chapter 1** is a review of the current state of knowledge regarding climate/C-cycle feedbacks from the Arctic region under current and future climate scenarios, and places my research in the context of recent literature.

**Chapter 2** is an unpublished manuscript investigating the rate at which permafrost C will become available for decomposition and will be released relative to ecosystem C inputs under future precipitation scenarios.

**Chapter 3** is an unpublished manuscript investigating the long-term impacts of altered winter precipitation patterns on the magnitude, form and direction of climate/C-cycle feedbacks from Arctic tundra.

Chapter 4 is a published manuscript for which I was first author. The research contained therein investigated the regulation mechanisms of winter precipitation on methane dynamics in Arctic tundra. In this thesis, this work is reprinted in its entirety with permission from: Blanc-Betes, E., Welker, J. M., Sturchio, N. C., Chanton, J. P. and Gonzalez-Meler, M. A. (2016) Winter precipitation and snow accumulation drive the methane sink or source strength of Arctic tussock tundra. *Glob Change Biol*, 22, 2818–2833. doi:10.1111/gcb.13242. (*See* Appendix A, Copyright clearance statement from publisher). EB-B conceived and designed the study, collected, processed and analyzed data, and wrote the manuscript. JMW designed the study and wrote the manuscript. NCS wrote the manuscript. JPC wrote the manuscript. MAG-M designed the study and wrote the manuscript.

**Chapters 5** is an unpublished opinion that elaborates on findings from Chapters 2, 3 and 4 to reconcile discrepancies among existing literature and reconsiders current line of thought on

the mechanisms driving the Arctic tundra C budget and radiative forcing on the climate system.

**Chapter 6** synthesizes my research, concisely addresses the significance of the findings presented herein, and point to research directions that would improve quantitative predictions of climate/C-cycle feedbacks from the Arctic region.

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#### **SUMMARY**

Projected increases in winter precipitation strongly affect carbon (C) cycling in Arctic tundra systems whose large stocks of soil organic carbon (SOC) make them critical to future climate trends. Warming and thawing of permafrost under deeper winter snow represents a potential positive feedback on climate warming, as long-term preserved SOC becomes available for decomposition. This response may be either mitigated or enhanced by associated increases in nutrient availability and changes in plant community structure and productivity. The derived climate/C-cycle forcing feedbacks remain largely unresolved due to uncertainties in the strength, form (CO<sub>2</sub> and CH<sub>4</sub>) and timing of C fluxes under future precipitation scenarios.

Critical to the fate of Arctic tundra SOC pools is the rate at which permafrost C will become vulnerable and released relative to ecosystem C inputs. We investigated both biological and physical impacts of short- (2yr) and long-term (14yr and 18yr) snow additions on permafrost dynamics and SOC pools in Alaskan Arctic tundra. Enhanced winter snow accelerated soil warming and permafrost thawing above climate-driven trends in the area of study, and increased the vulnerable SOC pool over time. As a result, deeper winter snow led to a fast depletion of the SOC pool at an annual scale and to a gradual recovery of the SOC pool at a decadal time scales, suggesting the potential of Arctic tundra to act as an additional C sink under future precipitation scenarios. We note that neglecting to incorporate soil physical processes and time dependent non-linearities may result in strong biases in both empirical and model observations of climate-driven permafrost degradation and its impacts on the Arctic tundra C budget.

To evaluate the structural and functional changes driving long-term responses of the Arctic tundra C budget and derived forcing on climate to changes in precipitation, we

investigated how 18 years of experimental snow depth increases and decreases affect the magnitude, direction and global warming potential (GWP) of ecosystem C fluxes. Deeper winter snow reduced the C source strength but increased the GWP of Arctic tundra over the growing season. Our results further indicate that the enhanced Arctic tundra C sink strength resulted mainly from impacts on the predominant microbial function and activity rather than from enhanced plant productivity. Moreover, our results suggest certain resistance of net plant productivity to long-term changes in winter precipitation, and that this resistance responded to metabolic adjustments at the canopy level mediated by shifts in plant community structure rather than by the acclimation of physiological processes. Importantly, by stimulating CH4 emissions, deeper snow increased the GWP of Arctic tundra C emissions, therefore representing a potentially strong positive feedback on climate change despite reducing ecosystem C losses. These results indicate a key role of the CH4 metabolism in driving C fluxes and GWP of Arctic tundra under future precipitation scenarios.

Given the potential of Arctic CH<sub>4</sub> emissions to act as a significant climate forcing feedback under future precipitation scenarios, we measured ecosystem CH<sub>4</sub> fluxes, and soil CH<sub>4</sub> and CO<sub>2</sub> concentration and <sup>13</sup>C composition to investigate the predominant metabolic pathways and transport mechanisms driving the response of Arctic tundra CH<sub>4</sub> fluxes after 18 years of experimental snow depth increases and decreases. Our results reveal a synergistic effect of soil moisture and temperature on net ecosystem CH<sub>4</sub> production and oxidation under near water-saturated (more anoxic) and drier (more oxic) soil conditions respectively. Therefore, changes in winter precipitation, by influencing both soil parameters may impact CH<sub>4</sub> fluxes beyond what may be predicted by Arctic warming alone. Moreover, changes in plant community structure

associated to persistent changes in snow accumulation critically defined the predominant CH<sub>4</sub> transport mechanism, largely contributing to the ecosystem CH<sub>4</sub> sink or source strength.

Taken together, our results provide empirical support to a growing body of literature that suggest that future climate/C-cycle feedbacks from Arctic regions may depend more strongly on future precipitation scenarios than currently considered in Earth system models. We suggest that an improved representation of the sensitivity of both physical and biotic processes to changes in precipitation at different time-scales will probably help reconcile empirical- and model-based discrepancies and reduce uncertainties on climate-forcing feedbacks from Arctic systems.

### 1. INTRODUCTION

The rate of accumulation of greenhouse gases (GHGs) in the atmosphere has been increasing since the industrial revolution reaching 2 ppm CO<sub>2</sub> yr<sup>-1</sup> and 6 ppb CH<sub>4</sub> yr<sup>-1</sup> over the last decade. Together, atmospheric CO<sub>2</sub> and CH<sub>4</sub> represent about 90% of current Global Warming Potential (i.e. GWP; CO<sub>2</sub> equivalents) (Nisbet et al., 2014). Under business as usual scenario (RCP8.5), global temperatures are projected to increase by 4.5°C by the end of this century (Stocker et al., 2013, 2014). To lessen the effects of future climate change, attempts have been made to stabilize atmospheric GHGs concentrations at levels that will limit warming to 2°C above pre-industrial temperatures by 2100 (UNEP, 2013). At present, photosynthetic CO<sub>2</sub> uptake of terrestrial ecosystems exceeds respiratory carbon (C) losses, mitigating anthropogenic C emissions by up to 30% (Le Quéré et al., 2015). Projected climate warming and associated changes in precipitation patterns may critically affect the C sink strength of terrestrial ecosystems, exerting a strong control on future atmospheric C concentrations and climate (Carvalhais et al., 2014; Le Quéré et al., 2015). Generating realistic GHGs emission targets requires the understanding and reliable quantification of the positive and negative climate/Ccycle feedbacks from terrestrial systems.

The permafrost region (area underlined by permanently frozen soils) has been, on average, a sink of C throughout the Holocene (Hicks Pries *et al.*, 2011; Walter Anthony *et al.*, 2014), as limited decay of organic matter within pervasive cold and wet soils allowed for the long-term protection of highly labile soil organic carbon (SOC) (Uhlířová *et al.*, 2007; Waldrop *et al.*, 2010). In recent decades, the permafrost region has removed between 0.5 and 0.8 PgC yr<sup>-1</sup> from the atmosphere, which represents 25% to 40% of the global net terrestrial CO<sub>2</sub> sink and about 10% to 15% of total anthropogenic C emissions (McGuire *et al.*, 2009; Hayes *et al.*, 2011;

Le Quéré *et al.*, 2015). As a result, with just 15% of the global area cover, the permafrost region contains up to 50% of the global SOC pool, twice as much C as the global atmosphere (Tarnocai *et al.*, 2009; Hugelius *et al.*, 2014). Any environmental change that affects the stability of even a fraction of this large C pool may lead to large emissions of CO<sub>2</sub> and CH<sub>4</sub>, thereby amplifying climate change (DeConto *et al.*, 2012; Harden *et al.*, 2012; Elberling *et al.*, 2013; Jorgenson *et al.*, 2013). The latest simulations indicate that the permafrost region will become a C source to the atmosphere by the end of the century regardless of the emissions scenario considered (Abbott *et al.*, 2016). The derived climate/C-cycle feedback is projected to increase global mean temperatures by 10–40% above expected warming trends (Crichton *et al.*, 2016), and risks overshooting the 2°C warming target.

Over the last three decades, the Arctic region has warmed 0.06°C yr<sup>-1</sup>, twice as fast as the global average (Serreze & Barry, 2011; Cohen *et al.*, 2014), and has experienced substantial increases in precipitation, particularly from October to February in the form of snow (Callaghan *et al.*, 2011; Cohen *et al.*, 2012; Mudryk *et al.*, 2014). There is unambiguous evidence of a system-wide response of the Arctic region to recent climate change. The rate of permafrost degradation and thermokarst development has abruptly increased since the 1970s (Romanovsky *et al.*, 2010; Smith *et al.*, 2010), principally affecting the Alaskan tundra that has lost 10–30% of its permafrost area (Jorgenson *et al.*, 2001, 2006; Åkerman & Johansson, 2008). Consistently, process-based models estimate that the seasonally-thawed soil layer (i.e. active layer) has deepened at a rate of 0.2 to 0.6 cm yr<sup>-1</sup> over the circumpolar region (Hayes *et al.*, 2014; Yi *et al.*, 2015), exposing a total of 10–15 PgC of thawed SOC to decomposition over this same period (Hayes *et al.*, 2014). The consequences are already noticeable in a weakening of the Arctic tundra CO<sub>2</sub> sink strength (Hayes *et al.*, 2011). Both process-based models and field data show a

recent shift from a historical C sink to a C source despite evidence of increased growing season CO<sub>2</sub> uptake over much of the Alaskan Arctic tussock tundra (Hayes *et al.*, 2011; Myers-Smith *et al.*, 2011; Belshe *et al.*, 2013). While 50% of recent permafrost warming and thawing in northern Alaska is linked to a rise in atmospheric temperatures, the other 50% is attributable to increased snowfall and accumulation (Stieglitz *et al.*, 2003; Osterkamp, 2007).

Climate models consistently predict an amplified warming of the Arctic region over the coming decades, with winter temperatures leading annual warming trends (Christensen *et al.*, 2013). Given the strong sensitivity of Arctic precipitation to climate warming (Räisänen, 2008; Rawlins *et al.*, 2010; Bintanja & Selten, 2014), the Arctic region is expected to experience 25–50% increases in precipitation during this century, particularly over winter and fall in the form of snow (Kattsov *et al.*, 2005, 2007; Räisänen, 2008; Collins *et al.*, 2013; Zhang *et al.*, 2013).

Accelerated C losses under future climate scenarios represent a potentially large but highly uncertain feedback to global climate change (Fisher *et al.*, 2014; Schaefer *et al.*, 2014; Crichton *et al.*, 2016) (Table I). About 50% of current model uncertainty on climate/C-cycle feedbacks from Arctic regions corresponds to the emissions scenario considered (Burke *et al.*, 2012); however, even assuming the same scenario predictions of permafrost degradation, the magnitude and global warming potential (i.e. GWP, CO<sub>2</sub>-equivalents) of associated C emissions vary widely among models (Table I). Much of the observed spread results from differences in how snow processes and associated effects on soil thermal and hydrological regimes are represented in models (Koven *et al.*, 2012; Schaefer *et al.*, 2014).

**TABLE I** 

Model predictions of permafrost degradation and projections of associated cumulative emissions in the northern hemisphere by 2100 arranged per emission scenario. Adapted from Schaefer *et al.* (2014).

Scenario	Loss of permafrost area (%)	Permafrost C emissions	
		(Gt C)	(CO <sub>2</sub> – Equiv.) <sup>1</sup>
A1B	26 – 85 <sup>a</sup>	104 <sup>d</sup>	130
A2	$30 - 90^{b}$	$37 - 347^{e}$	46 - 435
RCP 8.5	$32 - 65^{\circ}$	$50 - 218^{\rm f}$	62 - 273

<sup>&</sup>lt;sup>1</sup> Permafrost C emissions in CO<sub>2</sub> equivalent calculated assuming CH<sub>4</sub> represents 2.3% of total carbon emissions and has a global warming potential of 33 (Shindell *et al.*, 2009; Schuur *et al.*, 2013).

<sup>&</sup>lt;sup>a</sup> Euskirchen et al., 2006; Schaefer et al., 2011; Marchenko et al., 2008; Saito et al., 2007; Lawrence et al., 2008.

<sup>&</sup>lt;sup>b</sup> Koven et al., 2011; Lawrence et al., 2012, Eliseev et al., 2009; Lawrence and Slater, 2005.

<sup>&</sup>lt;sup>c</sup> Koven et al., 2013; Schuur et al., 2013; McDougall et al., 2012; Schneider von Deimling et al., 2012; Burke et al., 2012.

<sup>&</sup>lt;sup>d</sup> Schaefer et al., 2011

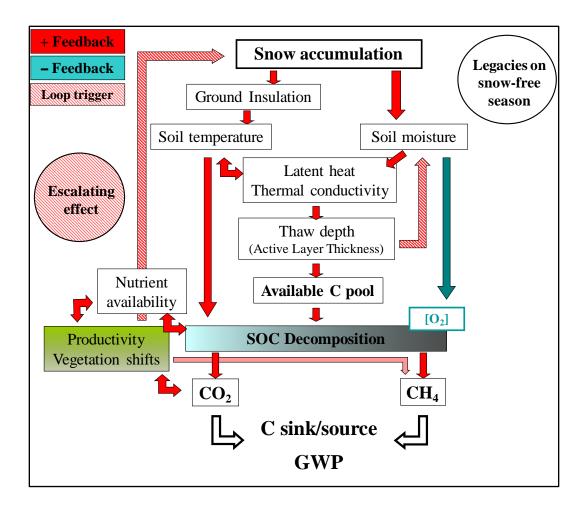
<sup>&</sup>lt;sup>e</sup> Zhuang et al., 2006; Koven et al., 2011; Schuur et al., 2009; Raupach and Canadell, 2008.

<sup>&</sup>lt;sup>f</sup> Burke et al., 2013; Schneider von Deimling et al., 2012; Burke et al., 2012; Schuur et al., 2013; MacDougall et al., 2012; Harden et al., 2012.

Variations in snow accumulation explain as much as 50% to 100% of total soil temperature variability, thereby exerting a strong control on Arctic C balance (McGuire *et al.*, 2000; Lawrence & Slater, 2010). The depth of the snow pack defines ground temperatures over the snow-covered season, as the insulating effect of snow allow for soil temperatures to remain several degrees warmer than atmospheric temperatures (Zhang, 2005; Morgner *et al.*, 2010). Given the high temperature sensitivity of heterotrophic respiration (Mikan *et al.*, 2002; Dorrepaal *et al.*, 2009), soil warming under deeper snow allows for greater SOC mineralization rates during the cold season (Gouttevin *et al.*, 2012; Webb *et al.*, 2016), which may account for up to 70% of annual C emissions from Arctic systems (Welker *et al.*, 2000).

Beyond the direct impacts of soil warming on the Arctic C balance during the snow-covered season, deeper winter snow may result in legacies over the snow-free season with significant implications on growing season C dynamics, annual C budgets, and climate/C-cycle feedbacks from Arctic systems (Fig. 1). Snow-induced increases in soil wetness results in greater soil latent heat and thermal conductivity upon snow-melt, promoting soil warming and thawing over the snow-free season (Qian *et al.*, 2011; Jorgenson *et al.*, 2013; Subin *et al.*, 2013).

Warmer and deeper active layer may enhance SOC availability and decomposition, promoting CO<sub>2</sub> losses from Arctic regions to the atmosphere (Trucco *et al.*, 2012; Elberling *et al.*, 2013; Xue *et al.*, 2016) (Fig. 1). Alternatively, greater mineralization rates may promote nutrient availability (Schimel *et al.*, 2004; Semenchuk *et al.*, 2015; Salmon *et al.*, 2016), which in turn could stimulate plant productivity and shrub expansion, mitigating or offsetting ecosystem CO<sub>2</sub> losses (Bret-Harte *et al.*, 2002; Elmendorf *et al.*, 2012b; DeMarco *et al.*, 2014) (Fig. 1).



**Figure 1:** Diagram depicting the physical and biological impacts of snow accumulation over the snow-free period.

In addition, snow- and thaw-induced increases in soil wetness may decrease oxygen availability and promote anaerobic decomposition (i.e. methanogenesis) above the aerobic decomposition of SOC (Fig. 1). The slower metabolism of methanogenesis could contribute to reduce ecosystem C losses but strengthen the positive forcing on climate owing to the greater GWP of CH<sub>4</sub> emissions (Shindell *et al.*, 2009; Myhre *et al.*, 2013). Arctic CH<sub>4</sub> emissions under deeper winter snow could be further fueled by greater substrate availability (e.g. newly available SOC and/or enhanced ecosystem productivity), and by facilitated emissions through plant-

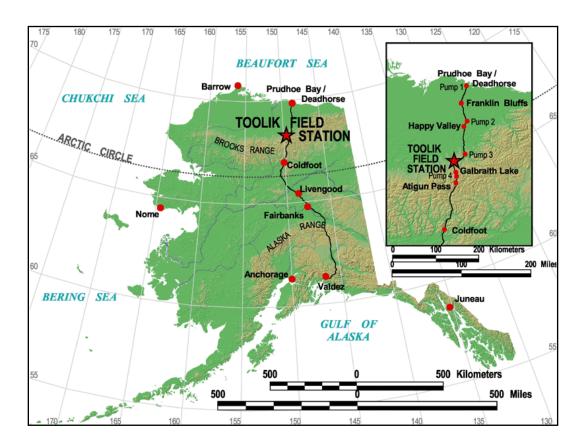
mediated transport aided by the expansion of tall graminoids accompanying the initial stages of thermokarst development (Chowdhury & Dick, 2013; Johansson *et al.*, 2013; Hodgkins *et al.*, 2014; McCalley *et al.*, 2014) (Fig. 1).

Notably, these processes are likely to be amplified over time, setting the system into a continuously degrading state (Osterkamp & Romanovsky, 1999) bolstered primarily by (i) thawinduced increases in soil wetness, which in turn promotes further permafrost warming and thawing (Fan *et al.*, 2011; Subin *et al.*, 2013), and by (ii) favoring the expansion of shrubs that favors snow trapping and accumulation (Sturm *et al.*, 2001) (Fig. 1).

Therefore, the potential magnitude of climate/C-cycle feedbacks derived from altered snow fall and accumulation patterns suggests that projected changes in winter precipitation may be as relevant as climate warming in driving climate/C-cycle radiative forcing from Arctic regions (Carvalhais *et al.*, 2014; Yi *et al.*, 2015), with its effects on the Arctic tundra C balance continuing for decades or even centuries after warming stops (Schaefer *et al.*, 2011).

Our ability to accurately predict climate forcing feedbacks from Arctic systems is currently limited by the stepwise addition of uncertainties in three major unresolved questions: (i) how much and how fast will the Arctic SOC pool become vulnerable and change in response to changes in climate?; (ii) what is the magnitude, form and direction of ecosystem C fluxes and derived climate forcing feedbacks?; and (iii) which are the mechanisms underlying such changes? (Burke *et al.*, 2012; Schuur *et al.*, 2013, 2015; Schaefer *et al.*, 2014; McGuire *et al.*, 2016). To address these overarching questions, we investigated the impacts of altered winter precipitation patterns on Arctic tundra C budget and fluxes. The moist acidic tussock tundra represents 40% of the Alaskan tundra – 20% of the Arctic tundra, globally – and contains 15% of the global SOC pool (Hugelius *et al.*, 2014; Forbes, 2015). This research was performed in moist

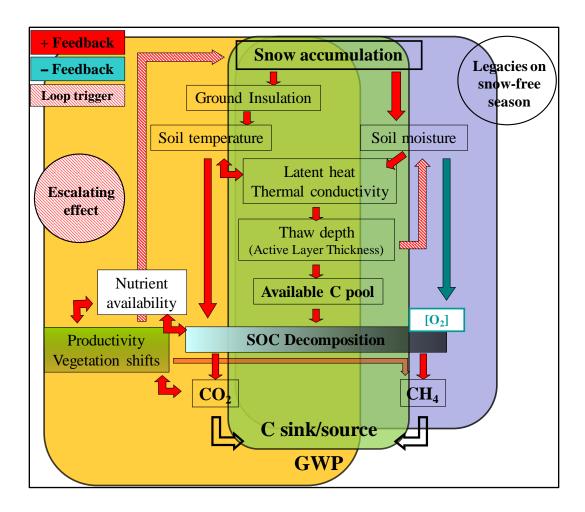
acidic tundra near Toolik Lake in the northern foothills of the Brooks Range, Alaska (Fig. 2) (Walker *et al.*, 1999).



**Figure 2:** Location map of the Toolik Field Station (68°38'N, 149°38'W). The inset shows the study area in relation to the northern coast of Alaska (Courtesy of the GIS & Remote Sensing Service Center, Toolik Field Station).

Specifically, we used a long-term snow manipulation experiment to investigate (Fig. 3):

- (a) Short- and long-term impacts of increased winter precipitation on the Arctic tundra SOC budget (Chapter 2; Winter snow drives transient modulations in Arctic tundra soil carbon budget).
- (b) Impacts of snow accumulation on C fluxes and climate/C-cycle forcing from Arctic tundra (Chapter 3; Winter precipitation drives ecosystem C fluxes (CO<sub>2</sub> and CH<sub>4</sub>) and climate/C-cycle feedbacks from Arctic tundra).
- (c) Regulation mechanisms of winter precipitation on CH<sub>4</sub> dynamics in Arctic tundra (Chapter 4; Winter precipitation and snow accumulation drive the CH<sub>4</sub> sink or source strength of Arctic tussock tundra).



**Figure 3:** Schematic of the three major questions that conform this research: (a) Short- and long-term impacts of increased winter precipitation on the Arctic tundra SOC budget (*in green*, Chapter 2); (b) Impacts of snow accumulation on C fluxes and climate/C-cycle forcing from Arctic tundra (*in orange*, Chapter 3); and (c) Regulation mechanisms of winter precipitation on CH<sub>4</sub> dynamics in Arctic tundra (*in purple*, Chapter 4).

We further capitalized on this system-wide, multi-year and multi-level approach to reconcile discrepancies among studies and reconsider the mechanisms driving the Arctic tundra C budget and radiative forcing on the climate system (Chapter 5; Discussion: Reshaping our understanding of Arctic tundra carbon dynamics). Finally, we concisely address the significance of the findings presented herein, and point to research directions that would improve quantitative predictions of climate/C-cycle feedbacks from the Arctic region (Chapter 6; Broader impacts).

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# 2. WINTER SNOW ACCUMULATION DRIVES TRANSIENT MODULATIONS IN ARCTIC TUNDRA SOIL CARBON BUDGET

# 2.1 ABSTRACT

Projected increases in winter precipitation strongly affect carbon (C) cycling in Arctic tundra systems whose large stocks of soil organic carbon (SOC) make them critical to future climate trends. Warming and thawing of permafrost under deeper winter snow represents a potential positive feedback on climate warming, as long-term preserved SOC becomes available for decomposition. This response may be either mitigated or enhanced by associated increases in nutrient availability and plant productivity. Related climate-forcing feedbacks remain largely unresolved due to uncertainties in their strength and timing. Critical to the fate of Arctic tundra SOC pools is the rate at which permafrost C will become vulnerable and released relative to ecosystem C inputs. Here we report both biological and physical impacts of short- (2yr) and long-term (14yr and 18yr) snow additions on permafrost dynamics and SOC pools in Alaskan Arctic tundra. We provide evidence of ongoing warming and deepening of the active layer that has turned Arctic tundra into a net C source at the study site. Deeper winter snow accelerated the rate of soil warming and deepening of the active layer above climate-driven trends, increasing the vulnerable SOC pool to 1.2, 3.0 and 5.2 kgC m<sup>-2</sup> after 2, 14 and 18yr. SOC dynamics were markedly non-linear and evolved over the course of progressive degradation, leading to a fast initial SOC loss (34% of the original SOC pool) and to a 40% SOC gain over the following decades that mitigated up to 61.5% of climate-driven C losses from Arctic tundra. Our results emphasize the potential of Arctic tundra to become a transient C source under future precipitation scenarios contributing to reduce the overall global terrestrial C sink, but also to act as an additional long-term C sink with persistent increases in winter precipitation. We further note that observing soil physical processes and time-dependent non linearities may help reduce

current uncertainty predictions of climate/C-cycle feedbacks from Arctic regions.

# 2.2 Introduction

There is growing evidence of a climate-driven shift of Arctic tundra from a historical C sink to a C source in recent decades – largely attributed to enhanced C losses during the cold season – raising great concern over the fate of the vast permafrost SOC stock under future climate scenarios (Belshe et al., 2013; Hayes et al., 2014; Oechel et al., 2014; Crichton et al., 2016; McGuire et al., 2016). Warmer winters have been observed and are projected for most of the Arctic region along with increases in annual precipitation, particularly as snow (Kattsov et al., 2005). Snow fall and accumulation are critical determinants of the C cycle in terrestrial Arctic systems (Fig. 1) (Walker et al., 1999; Blanc-Betes et al., 2016). Deeper snow, by increasing ground thermal insulation, promotes soil warming during the cold season (Lawrence & Slater, 2010) sustaining greater C mineralization (Nobrega & Grogan, 2007) and increasing winter contributions to annual C losses (Fig. 1) (Welker et al., 2000; Xue et al., 2016). Moreover, greater latent heat and thermal conductivity upon snowmelt promote soil warming over the growing season with strengthening effects on permafrost degradation (Johansson et al., 2013), SOC decomposition (Xue et al., 2016), nutrient cycling (Schimel et al., 2004; Xue et al., 2016), plant productivity (Natali et al., 2011; Xue et al., 2016) and shrub expansion (Leffler et al., 2016) beyond the impacts of winter warming alone (see Chapters 3 and 4) (Blanc-Betes et al., 2016).

The net impact of deeper snow cover on Arctic SOC pools integrates the individual responses of a variety of competing ecosystem C processes that operate at different time scales and at different rates. For example, deeper winter snow may affect Arctic SOC pools rapidly (years) via C and nutrient mineralization rates (Xue *et al.*, 2016), and more slowly (decades) via

SOC redistribution (Klaminder *et al.*, 2009), alterations of the SOC quantity and quality (Hodgkins *et al.*, 2014), and changes in the productivity and composition of the supported vegetation (*see* Chapters 3 and 4) (Johansson *et al.*, 2013; Leffler *et al.*, 2016; Xue *et al.*, 2016). Moreover, these processes respond to the intensity of a disturbance whose effects amplify over time. Through thaw-induced increases in soil wetness and heat transfer, deeper snow further accelerates warming and thawing triggering a hardly reversible positive feedback on permafrost degradation (Fig. 1) (Osterkamp *et al.*, 2009; Fan *et al.*, 2011; Subin *et al.*, 2013). In addition, associated shrub expansion enhances snow accumulation further amplifying the impacts of increased winter precipitation over time (Fig. 1) (Sturm *et al.*, 2005; Leffler *et al.*, 2016). The Arctic tundra C budget therefore responds to non-stationary dynamics that unfold over the course of progressive permafrost degradation.

Thaw-induced settlement of ice-rich permafrost under deeper winter snow may lead to soil consolidation, and hence the subsidence of the ground surface and progressive deformation of the active layer over relatively short timescales (years to decades) (Jorgenson *et al.*, 2006; Osterkamp, 2007; Osterkamp *et al.*, 2009). Overlooking this physical disturbance may lead to underestimation of the impact of changes in winter precipitation patterns on the rate of permafrost degradation and hence SOC availability, leading to biased predictions of C-climate forcing feedbacks from Arctic regions (Koven *et al.*, 2012; Streletskiy *et al.*, 2012).

At present, discrepancies remain on the magnitude and direction of climate-driven impacts on Arctic C balance. Arctic tundra SOC pools have been suggested to substantially decrease (Hicks Pries *et al.*, 2011; Natali *et al.*, 2014) or remain unaltered (Lamb *et al.*, 2011; Sistla *et al.*, 2013) with enhanced winter warming and precipitation, and model projections lead to a wide range of potential climate forcing feedbacks scenarios from Arctic regions (Table I)

(Schaefer *et al.*, 2014). This uncertainty results from inaccurate estimates of the rate of permafrost degradation determining the size of the SOC pool available for decomposition, and the lack of a time-hierarchical assessment of the vulnerability of C in Arctic soils to changes in climate (Burke *et al.*, 2012; Schuur *et al.*, 2013; Schaefer *et al.*, 2014; McGuire *et al.*, 2016).

We investigated the short- (years) and long-term (decades) impacts of increases in snow accumulation on permafrost thaw and the SOC budget in Arctic tundra.

#### **2.3 METHODS**

# 2.3.1 Site description

The experimental sites are located in moist acidic tussock tundra near Toolik Lake (68°38'N, 149°38'W; 760 m) at the Long Term Ecological Research Site in the northern foothills of the Brooks Range, Alaska (Fig. 2) (Jones et al., 1998; Welker et al., 2000; Pattison & Welker, 2014). Mean annual air temperature is -8°C, with summer temperatures averaging 10.5°C. The active layer thickness averages ~30cm during the growing season and reaches a maximum thaw depth of 45–50 cm by late August (Welker, Arctic LTER). Annual precipitation is around 350 mm, 50% of which falls as snow (Deslippe & Simard, 2011). Snow accumulation is 45–80cm, the snow-covered season typically running from mid-September to late-May. Soils are classified as acidic, coarse-loamy, mixed, Ruptic-Histic Pergelic Cryaquept (Michaelson et al., 1996). The area is characterized by poorly drained soils, with relatively shallow organic layers (10–15cm; 20–45 %C) progressively grading into organic-enriched mineral layers (5–20%C) and into mineral layers (1–3 %C) with depth (Ping et al., 1997). Vegetation is dominated by tussock forming sedges (*Eriophorum vaginatum*), and interspaced shrubs (*Betula nana*, *Salix pulchra*) and mosses (Sphagnum sp.) characteristic of moist acidic tundra across the Alaskan North Slope (Walker et al., 1994; Wahren et al., 2005).

#### 2.3.2 Experimental design

Two snow fences were built near Toolik Lake, AK, one in 1994 (ITEX, International Tundra Experiment) and the other in 2006 (IPY), to artificially increase snow accumulation (Walker et al., 1999; Welker et al., 2000). At each fence, we identified two distinct snow accumulation regimes: (i) ambient snow accumulation (CTL; 45–80cm snow depth), and (ii) Snow Addition treatment (SA) with 20–45% more snow than CTL. In 2008, we measured soil environmental variables, and soil profile SOC, radiocarbon (<sup>14</sup>C) abundance and <sup>137</sup>Cs activity within the active layer in both sites (IPY and ITEX) at CTL (CTL<sub>2008</sub>) and treatment plots, after 2yr (SA<sub>2</sub>) and 14yr (SA<sub>14</sub>) of persistent snow additions. Control plots in both sites were found similar in all measured and estimated parameters, and were therefore considered together for statistical purposes. The oldest fence (ITEX) was resampled (soil environmental variables, and SOC content and distribution) in 2012, at both CTL (CTL<sub>2012</sub>) and treatment (SA<sub>18</sub>) plots, after 18yr of snow additions. Direct comparison of control plots sampled in different years (CTL<sub>2008</sub> and CTL<sub>2012</sub>) allowed evaluation of current trends of permafrost and SOC dynamics in Arctic tundra underlying the snow treatment effect. Vegetation in the area of study is characteristic of moist acidic tundra across the Alaskan North Slope (Walker et al., 1994). A visible expansion of deciduous shrubs consistent with initial permafrost degradation (Johansson et al., 2013) was observed after two decades of experimental snow additions (SA<sub>14</sub> and SA<sub>18</sub>) (see Chapters 3 and 4) but not after two years of treatment (SA<sub>2</sub>).

#### 2.3.3 Soil environment

Soil environmental variables were monitored over the growing seasons of 2008 and 2012.

Soil temperature at 10cm depth was measured using a portable temperature probe (OMEGA Engineering Inc., CT, USA). Thaw depth was monitored using a metal depth rod. Replicates

(n=5) are averaged values of 8 pseudo-replicates per plot. Mean active layer thickness (ALT) was calculated at each plot and sampling year as the seasonal average of the depth to the permafrost table to integrate permafrost dynamics over the growing season. Measured ALT, uncorrected for physical distortion of the active layer, was regarded as apparent ALT.

## 2.3.4 Soil sampling and processing

Soil cores (4.8cm diameter) were collected at each plot and sampling year to mean active layer thickness (n=2–3). Cores were sectioned into 1-cm depth increments and air-dried to a constant weight for the direct determination of soil water content and bulk density (ρb; soil mass per unit of volume, g cm<sup>-3</sup>).

# 2.3.5 Soil carbon and nitrogen content and isotopic analyses

Total C and N content (%) and stable isotopic composition ( $\delta^{13}$ C and  $\delta^{15}$ N) were determined at each sampling year, plot and depth interval by dry combustion with a continuous flow Thermo Finnigan Delta-Plus XL equipped with Conflo III (Bremen, Germany) and zero-blank Elemental Analyzer (Costech Analytical, EC4010; Valencia, CA, USA).

Total C represents organic C as the presence of carbonates was negligible. The density of soil organic C (SOC; kgC m<sup>-2</sup>) at each depth section, plot and sampling year was calculated as:

(Eq. 2.1) 
$$SOC_n = (\rho b_n \times \%C_n \times T_n)/10$$

where  $\rho b_n$  is the soil bulk density (g cm<sup>-3</sup>), %C is the carbon content (%) and  $T_n$  is the thickness (cm) of the soil section considered (Bockheim & Hinkel, 2007).

Inventories of SOC within the active layer at each plot and sampling year were calculated as the sum of the SOC density of the soil sections to target depth (Z), and error biases resulted from the propagation of the variance accumulated with depth.

(Eq. 2.2) 
$$cSOC_Z = \sum_{i=1}^{n} (\rho b_n \times \%C_n \times T_n)/10$$

Radiocarbon content ( $^{14}$ C) was analyzed from a subset of samples collected in 2008 within and below the  $^{137}$ Cs activity peak (see below). Radiocarbon analyses were performed at Center for Accelerator Mass Spectometry facility at Lawrence Livermore National Laboratory (Van de Graaff FN accelerator mass spectrometer) following procedures described in Vogel et al. (1984). Measured  $\delta^{13}$ C values were used to correct for mass-dependent fractionation. Radiocarbon data reported in  $\Delta^{14}$ C notation had an average AMS precision of 3‰, and were corrected for  $^{14}$ C decay since the year of sampling (2008). Negative  $\Delta^{14}$ C values denote C fixed prior to nuclear weapons testing and the onset of fossil fuel expansion, old enough for significant radioactive decay to have occurred. Atmospheric  $\Delta^{14}$ C increased to +900‰ during the peak activity of nuclear testing in 1963–1964, and has declined thereafter at a rate of 6–10‰ yr $^{-1}$  reaching +120‰ and +45‰ in 1994 and 2008, respectively (Hua et al., 2013).

# 2.3.6 Assessment of physical disturbance and physical corrections on the active layer thickness and soil organic carbon inventories

Physical processes and the associated distortion of the active layer were identified and quantified using three different approaches: (i) <sup>137</sup>Cs depth distribution; (ii) equivalent soil mass (ESM); and (iii) ρb-predictive model. We further used assessments of physical disturbance to perform corrections in the active layer thickness and distribution of SOC inventories therein, allowing for direct comparisons between equivalent depths.

# 2.3.6.1 <sup>137</sup>Cs distribution approach

<sup>137</sup>Cs is a bomb-derived fallout radionuclide that had a global maximum deposition in 1963–1964, strongly adsorbing to clay and organic matter after deposition (Staunton *et al.*, 2002). Because <sup>137</sup>Cs – with a half-life of 30.2 yr – is largely immobilized by its strong physical adsorption and is biologically inert, the vertical distribution of <sup>137</sup>Cs within the soil column reflects deposition time and mechanical movement only, therefore allowing the investigation of physical processes (i.e. soil accrual, compaction, erosion, leaching and/or mixing) operating at annual to decadal time-scales (Staunton *et al.*, 2002; Harden *et al.*, 2008; Klaminder *et al.*, 2014).

Samples collected in 2008 were analyzed for <sup>137</sup>Cs content (Bq kg<sup>-1</sup>) using a high-purity Ge gamma spectrometer (Model GR3020-Reverse electrode, University of Illinois at Chicago, UIC) calibrated against standard ocean sediment NIST4357 (standard reference material 4357, 1994; National Institute of Standards and Technology, Gaithersburg, Maryland, USA) with reference activities adjusted for decay since certification date. Potential interferences to the <sup>137</sup>Cs measurement (photopeak at 661.6 keV) from trace contents of natural decay-series radionuclides were evaluated and found to be below the detection limit.

Measured  $^{137}$ Cs activities  $(Bq_i)$  were normalized to the date of collection  $(Bq_0)$  to account for decay lag-times between collection and analysis dates using the following equation:

(Eq. 2.3) 
$$Bq_0 = Bq_i/e^{-\lambda t}$$

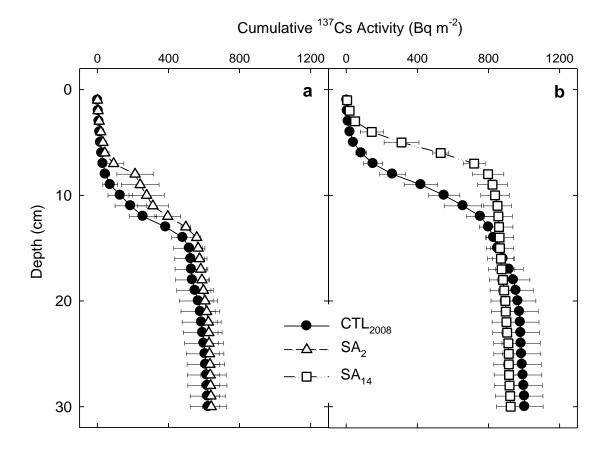
where  $\lambda$  is the  $^{137}Cs$  decay constant (0.023  $yr^{\text{--}1})$  calculated as:

(Eq. 2.4) 
$$\lambda = Ln2 / (^{137}Cs \ halflife)$$

and t is the time elapsed between sample collection and analysis in years.

The <sup>137</sup>Cs inventory within the active layer was calculated from the sum of depth-increment <sup>137</sup>Cs content within the soil column. Cumulative <sup>137</sup>Cs inventories at both control and

treatment plots fell within the deposition range reported for Arctic tundra in the vicinities of Toolik Lake (from 657.7 to 1044.5 Bq m<sup>-2</sup>, decay corrected to collection date; Cooper *et al.*, 1991), indicating that losses of <sup>137</sup>Cs in the area of study are negligible. Snow additions did not affect total <sup>137</sup>Cs inventories (Fig. 4). Therefore, alterations of the <sup>137</sup>Cs profile responded to the redistribution of material within the soil column with snow additions (Fig. 4).



**Figure 4:** Vertical distribution of cumulative  $^{137}$ Cs activity within the active layer after (a) 2yr (CTL<sub>2008</sub>, SA<sub>2</sub>) and (b) 14yr (CTL<sub>2008</sub> and SA<sub>14</sub>) of experimental snow additions. Values shown are depth averages within site ( $\pm$ SE).  $^{137}$ Cs inventories at both short- and long-term sites fall within the reported range of  $^{137}$ Cs deposited across Alaskan Arctic tundra ( $\sim$ 851.1  $\pm$  193.4 Bq m<sup>-2</sup>) (Cooper *et al.*, 1991) accounting for radioactive decay since deposition. Snow additions resulted in significantly altered cumulative  $^{137}$ Cs distribution within the soil profile at both SA<sub>2</sub> and SA<sub>14</sub> relative to CTL<sub>2008</sub> (K-S test: P<0.05).

<sup>137</sup>Cs-equivalent depths were determined from the proportion of cumulative <sup>137</sup>Cs activity at a given depth relative to the total <sup>137</sup>Cs inventory (%).

We used the Kolmogorov-Snirnov test (K-S test) to evaluate treatment effects on the vertical distribution of <sup>137</sup>Cs with in the soil profile. The vertical displacement of the <sup>137</sup>Cs distribution in response to treatment was calculated statistically using a Fourier-type cross correlation function analysis applying the extensively used principles of lag-time analyses to estimate lag-distances between control and treatment distributions (White *et al.*, 2003; Gomez-Casanovas *et al.*, 2012).

Soil compaction relative to control plots was then calculated as:

(Eq. 2.5) 
$$\%Compaction = \Delta Z/^{137}Cs_{max}$$

where  $\Delta Z$  is the estimated displacement between treatment and control and  $^{137}Cs_{max}$  is the depth of maximum  $^{137}Cs$  activity at control plots.

Estimates of SOC inventories at <sup>137</sup>Cs-equivalent depths, extracting the effect of soil compaction and/or consolidation relative to their corresponding controls were then calculated as:

(Eq. 2.6) 
$$cSOC_{Z_{Cs}} = \sum_{i=1}^{Z_{Cs}} (\rho b_{Z_{Cs}} \times \%C_{Z_{Cs}})/10$$

where  $cSOC_{Z_{Cs}}$  (kg m<sup>-2</sup>) is the cumulative SOC pool integrating all depth intervals down to the depth of equal %<sup>137</sup>Cs than that at 10-cm depth at the plot of reference ( $Z_{Cs}$ ; <sup>137</sup>Cs-equivalent depth), and  $\rho b_n$  and % $C_n$  are interval-specific bulk densities (g cm<sup>-3</sup>) and %C (%) of the 1-cm soil intervals included within the section considered.

#### 2.3.6.2 Equivalent Soil Mass (ESM) approach

Assuming that changes in soil mass within the soil section considered are negligible, equivalent depths (ESM-depth) may be defined as a function of soil mass instead of distance from the soil surface, therefore avoiding error biases inherent to fixed-depth procedures (Kimble *et al.*, 2000; Gifford & Roderick, 2003; Lee *et al.*, 2009).

The mass of soil, defined as total dry mass of soil per unit of ground area, may be calculated for each depth interval as:

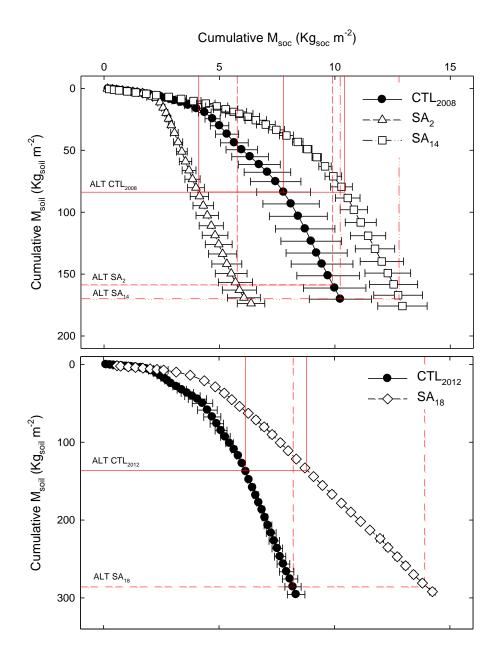
(Eq. 2.7) 
$$Msoil = \frac{DW}{\pi r^2} \times 10$$

where Msoil is soil mass per unit area (kg m<sup>-2</sup>), DW is the dry mass of the sample (g) and r is the radius of the soil section under evaluation (cm) (Lee  $et\ al.$ , 2009; Wendt & Hauser, 2013).

Similarly, the mass of soil organic carbon per unit area in each soil depth interval is calculated as follows:

(Eq. 2.8) 
$$Msoc = Msoil \times Csoc$$

where *Msoc* is defined as SOC mass per unit area (kg m<sup>-2</sup>) and *Csoc* is the organic carbon concentration per unit mass of dry soil (g kg<sup>-1</sup>) within that soil depth interval (Lee *et al.*, 2009; Wendt & Hauser, 2013) (Fig. 5).



**Figure 5:** Cumulative soil mass (*cMsoil*) versus soil organic carbon content (*cMsoc*) profile from both control (CTL) and treatment (SA) plots sampled in (**a**) year 2008 (CTL<sub>2008</sub>, SA<sub>2</sub> and SA<sub>14</sub>), and (**b**) year 2012 (CTL<sub>2012</sub> and SA<sub>18</sub>). Values shown are mean *cMsoc* (±SE) at given *cMsoil* within plot. Red lines indicate comparable SOC inventories at equal *cMsoil* corresponding to mean ALT at (**a**) CTL<sub>2008</sub> (continuous line), SA<sub>2</sub> (dashed line) and SA<sub>14</sub> (dashed-dotted line) in samples taken in 2008, and (**b**) CTL<sub>2012</sub> (continuous line) and SA<sub>18</sub> (dash-dash line) in samples taken in 2012.

Then, cumulative *Msoil* (*cMsoil*) and cumulative *Msoc* (*cMsoc*) within a given soil section may be calculated as the sum of the mass of bulk soil and SOC of the depth intervals (n) integrating the soil column to the target depth (Z; cm):

(Eq. 2.9) 
$$cMsoil_z = \sum_{i=1}^n Msoil_n$$

(Eq. 2.10) 
$$cMsoc_z = \sum_{i=1}^n Msoc_n$$

If cMsoil within a given soil section is maintained among plots, cMsoil at any given plot will be equal to the cMsoil of the plot of reference at equivalent depths  $(Z_{Eq})$ .

(Eq. 2.11) 
$$cMsoil_z = cMsoil_{ZEq}$$

where  $cMsoil_z$  is the soil mass per unit area to target depth at the plot of reference and  $cMsoil_{ZEq}$  is the soil mass per unit area of the plot of interest to a depth equivalent to that considered in the plot of reference.

Linear interpolation was used to estimate the  $Z_{Eq}$  at  $cMsoil_z$  considering the depth distribution of Msoil at the plot of interest, and error biases were calculated from the propagation of the variance across plots and with depth (Gifford & Roderick, 2003).

Then, the % compaction of the soil column at a given plot relative to the plot of reference may be then calculated as:

(Eq. 2.12) 
$$\%Compaction = \frac{Z_{Eq} - Z_{ref}}{Z_{ref}} \times 100$$

where  $Z_{Eq}$  is the thickness of the soil section of the plot of interest equivalent to that at the plot of reference, and  $Z_{ref}$  is the target depth at the plot of reference.

Implicit to the ESM approach is the attribution of apparent changes in soil mass to mechanical stress, considering the soil column as a closed system with negligible movement of material in or out the soil section under evaluation. If this assumption is invalid, comparisons of

SOC pools in contrasting soils must be based on soil masses that differ according to the amount of redistributed material (Kimble *et al.*, 2000). Both biotic (i.e. gross photosynthesis and respiration) and geomorphic processes (i.e. soil redistribution) may result in detectable changes in soil mass causing a systematic over- and underestimation of soil compaction in areas subject to substantial mineralization and accrual of organic matter, or erosion and sedimentation respectively, therefore leading to biases in SOC budget estimates (Kimble *et al.*, 2000). The <sup>137</sup>Cs vertical distribution and budget within the active layer showed no appreciable leaching or erosion in response to treatment but indicated net accrual of material, and previous results from the study site have revealed substantial biotic alterations with treatment (Welker *et al.*, 2000; Blanc-Betes *et al.*, 2016; Leffler *et al.*, 2016).

#### 2.3.6.3 pb-predictive model approach

Differences in pb among plots reflect variations in biotic (i.e. level of decomposition)

(Bockheim *et al.*, 2003) and physical (i.e. soil compaction and/or consolidation) (Ruehlmann & Körschens, 2009) processes in response to treatment.

The percentage organic carbon (%C) integrates the level of decomposition of the soil organic matter, explaining up to 90% of the variability in ρb at shallow horizons, with particularly good prediction efficiency at highly organic, undisturbed soils (Saini, 1966; Bockheim *et al.*, 2003; Heuscher *et al.*, 2005; Steller *et al.*, 2008).

Therefore, we used an empirical regression model to express pb as a function of %C, and hence integrating ongoing biotic processes within the soil column (Saini, 1966; Bockheim *et al.*, 2003; Heuscher *et al.*, 2005; Steller *et al.*, 2008; Ruehlmann & Körschens, 2009).

(Eq. 2.13) 
$$\rho b = a \times exp^{(-b \times \%C)}$$

where the intercept term (a) represents the theoretical  $\rho b$  of organic C-free mineral soil, and the slope term (b) is the expression for the nonlinear relation between %C and  $\rho b$  (Table II).

TABLE II

Model parameterization describing soil bulk density ( $\rho$ b) as a function of soil organic carbon content (%C) at each site and sampling year. Values with different letter denote statistical differences between snow treatment (P<0.05).

	CTL <sub>2008</sub>	CTL <sub>2012</sub>	$SA_2$	$SA_{14}$	SA <sub>18</sub>
Intercept (a)	$0.897 \pm 0.057^{a}$	$0.908 \pm 0.002^{ab}$	$0.908 \pm 0.045^{ab}$	$1.081 \pm 0.029^{b}$	$1.333 \pm 0.016^{c}$
Slope (b)	$-0.078 \pm 0.003^a$	$-0.079 \pm 0.002^a$	$-0.070 \pm 0.002^a$	$-0.068 \pm 0.002^a$	$-0.077 \pm 0.002^a$
<i>F</i> -value	1272.4	1180.6	2663.0	875.5	1569.8
<i>P</i> -value	< 0.0001	< 0.0001	< 0.0001	< 0.0001	< 0.0001
Corr. coef	-0.95	-0.97	-0.99	-0.95	-0.98
$r^2$	0.91	0.95	0.98	0.91	0.97

Given that the relationship between soil  $\rho b$  and %C was maintained (b; Table II), deviations of the intercept (a) reflect the theoretical  $\rho b$  of organic C-free mineral soil and mechanical stress exerted on the soil profile, and can be represented as follows:

(Eq. 2.14) 
$$a = \tau + \beta$$

where the coefficient  $\tau$  represents the value of maximum theoretical  $\rho b$  of organic C-free mineral soil and  $\beta$  expresses the compaction of the soil column integrating both the compactness inherent to the soil texture and structure ( $\varepsilon$ ) and physical stress ( $\mu$ ) (Ruehlmann & Körschens, 2009).

Given that most of the variability in soil texture defining  $\varepsilon$  is integrated in %C and hence included in the model description (Ruehlmann & Körschens, 2009), and that shared geological history suggest constant  $\tau$  across the area of study, alterations of a may be used as a proxy for the compaction of the active layer relative to the plot of reference:

(Eq. 2.15) 
$$\Delta a = \Delta \mu$$

Notably, warming and thawing of the active layer could result in alterations in the extent and distribution of organic and mineral horizons affecting  $\varepsilon$  and hence introducing biases in the measure of compaction. However, the depth and distribution of soil horizons was not affected by either treatment or underlying environmental changes (ANOVA; P=0.8), suggesting minimal or no effect of changes in soil texture on measures of relative soil compaction. Therefore, changes in  $\rho$ b were the result of relative compaction and or consolidation due to treatment and may be estimated as follows:

(Eq. 2.16) % Compaction = 
$$\frac{a_i - a_{ref}}{a_{ref}} \times 100$$

We used paired  $\rho b$  and %C values from CTL<sub>2008</sub> plots to parameterize the  $\rho b$ -predictive model (Table II). The regression of observed- against predicted-  $\rho b$  values for 6 randomly selected depth measurements per each CTL<sub>2008</sub> replicated plot revealed an unbiased relationship (R<sup>2</sup>=0.96; slope=0.97, intercept=0.003). Therefore, we used plot- and depth-specific %C from SA and CTL<sub>2012</sub> plots to estimate a theoretical vertical distribution of  $\rho b$  as affected by biotic processes alone (predicted- $\rho b$ ). Deviations between observed- (affected by biotic and geophysical processes) and predicted- $\rho b$  (affected by biotic processes) reflected the magnitude and extent of soil compaction due to the impact of treatment (SA<sub>2</sub> and SA<sub>14</sub>) and/or ongoing environmental change (CTL<sub>2012</sub> and SA<sub>18</sub>) on physical processes alone.

We estimated the mean deviation of predicted- with respect to the observed- values (RMSD; root mean squared deviation) as:

(Eq. 2.17) RMSD = 
$$\sqrt{\frac{1}{n-1}\sum_{i=1}^{n}(pred_{i}-obs_{i})^{2}}$$

and evaluated the source of deviation by evaluating the relative contribution of Theil's partial inequality coefficients, that partitions the square sum of predictive error (SSPE) into U<sub>bias</sub> (differences between observed and predicted values), U<sub>slope</sub> (proportion of variance associated with the slope fitted model and the 1:1 line, and Ue (unexplained variance) (Piñeiro *et al.*, 2008) (Table III).

(Eq. 2.18) 
$$U_{bias} = \frac{n (obs_{Mean} - pred_{Mean})^2}{SSPE}$$

(Eq. 2.19) 
$$U_{slope} = \frac{(b-1)^2 \sum_{i=1}^{n} (pred_i - pred_{Mean})^2}{SSPE}$$

(Eq. 2.20) 
$$U_e = \frac{\sum_{i=1}^{n} (a + (b \times pred_i) - obs_i)^2}{SSPE}$$

(Eq. 2.21) 
$$SSPE = \sum_{i=1}^{n} (pred_i - obs_i)^2$$

#### **TABLE III**

Evaluation of the goodness-of-fit of observed- versus predicted-pb. Model describes theoretical pb at each site and sampling year normalized to  $CTL_{2008}$  parameterization (a=0.897; b=0.057). Theil's partial inequality coefficients and root mean squared deviations are shown for the assessment of the source of variance contributing to total error of the predictions, being  $U_{bias}$  the proportions associated with mean differences between observed and predicted values,  $U_{slope}$  the proportion associated with the slope of the fitted model and the 1:1 line, and  $U_e$  the proportion associated with the unexplained variance. Minor contributions from  $U_{slope}$  and greater contributions from  $U_{bias}$  indicate maintained relationship between pb and %C, deviations of observed-pb from predicted values being primarily associated to geophysical alterations of the active layer.

	CTL <sub>2008</sub>	CTL <sub>2012</sub>	$SA_2$	SA <sub>14</sub>	SA <sub>18</sub>
$\mathbb{R}^2$	0.98	0.97	0.99	0.94	0.96
SSPE	0.062	0.140	0.234	1.855	2.549
$U_{\text{bias}}$	0.00	0.29	0.78	0.63	0.69
$U_{\mathrm{slope}}$	0.05	0.08	0.00	0.17	0.19
$U_{e}$	0.98	0.63	0.22	0.19	0.12
RMSD	0.046	0.070	0.090	0.197	0.296

Negligible deviation between observed- and predicted- $\rho$ b at CTL<sub>2008</sub> indicated that the model successfully reproduced variations in  $\rho$ b across the area of study. Mean deviation progressively increased at CTL<sub>2012</sub>, and with time of experimental snow additions suggesting increasing importance of physical alterations in defining  $\rho$ b relative to CTL<sub>2008</sub> (Table III). Most of the uncertainty at CTL<sub>2008</sub> was unexplained (U<sub>e</sub>) further supporting the robustness of the model, whereas U<sub>bias</sub> increased in prediction estimates of  $\rho$ b at CTL<sub>2012</sub> and SA plots, with minor contributions from U<sub>slope</sub> to total predictive error, attributing deviations between observed- and predicted-  $\rho$ b to  $\Delta a$ , alterations of the  $\rho$ b-%C relationship being negligible (Table III).

Estimates of inventories and distribution of SOC extracting the effect of relative soil compaction and/or consolidation were then calculated as:

(Eq. 2.22) 
$$cSOC_z = \sum_{i=1}^{n} (predicted - \rho b_n \times \%C_n \times T_n)/10$$

where  $cSOC_z$  is the cumulative SOC pool (kgC m<sup>-2</sup>) integrating all depth intervals down to target depth (Z), predicted- $\rho b_n$  is the depth-specific model-estimated  $\rho b$  considering biotic changes only, % $C_n$  is the depth-specific %C, and  $T_n$  is the thickness of the depth interval considered.

Thaw-induced increases in the SOC pool available for decomposition, SOC inventories and relative changes on SOC pools due to treatment and/or underlying environmental change using model-based physical corrections are shown in Figure 7 and Table V.

# 2.3.7 Approach comparison

Approach comparisons and associated biases are shown in Tables IV and V. Model estimates of soil compaction and variations on SOC pools in response to treatment were in agreement with <sup>137</sup>Cs-distribution estimated values indicating that the model was successful in reproducing physical and biotic responses to snow additions (Table IV). ESM estimates showed similar response trends of the ALT, the available SOC pool and SOC inventories to snow additions compared to modelled results, further validating model estimated values. However, the mass dependent method tended to over- and underestimate compaction in plots subject to substantial mineralization and net accrual of organic matter respectively, therefore leading to biases relative to model results (Tables IV and V).

## **TABLE IV**

Estimates of physical compaction (%) of the shallow horizon (0–10cm) and equivalent depths ( $Z_{Eq}$ ; cm) at each plot and sampling year estimated by  $^{137}$ Cs distribution,  $\rho$ b-predictive model and equivalent soil mass approaches. Compared to model estimates, the ESM approach over- and underestimated physical impacts at plots subject to substantial decomposition and accrual of soil organic matter respectively, likely by attributing changes in soil mass derived from biotic processes to mechanical stress.

	<sup>137</sup> Cs activity		ρb-predictive	ρb-predictive model		Equivalent soil mass	
	%Compaction	$Z_{Eq}$	%Compaction	$Z_{Eq}$	%Compaction	$Z_{Eq}$	
CTL <sub>2008</sub>	ref	10	ref	10	ref	10	
CTL <sub>2012</sub>	-	-	5.9±1.6%	9.4±0.2	10.1±2.4%	9.0±0.2	
$SA_2$	$8.7\pm2.9\%$	9.1±0.3	12.7±3.1%	8.7±0.3	17.4±4.4%	8.3±0.4	
$SA_{14}$	43.3±4.7%	5.7±0.5	45.3±3.8 %	5.5±0.4	58.8±8.8%	4.1±0.9	
$SA_{18}$	-	-	50.3±4.3%	5.0±0.4	57.8±9.2%	4.2±0.9	

#### **TABLE V**

Mean active layer thickness (ALT; cm), SOC availability<sup>1</sup> (kgC m<sup>-2</sup>), and SOC inventories<sup>2</sup> (kgC m<sup>-2</sup>) at each plot and sampling year as measured by (**A**) the fixed-depth approach (apparent), or estimated by (**B**) ρb-predictive model and (**C**) equivalent soil mass approaches. Error biases represent the % deviation from either model- or ESM- estimates to fixed-depth measures of change, corresponding to the over- or underestimation of the effect size derived from the fixed-depth method. Values in regular font use CTL<sub>2008</sub> as reference plot. Values in *italic* use CTL<sub>2012</sub> as reference plot. Direct comparisons of SA<sub>2</sub>, SA<sub>14</sub> and SA<sub>18</sub> to their corresponding controls reflect the impacts of snow additions on the considered variables, whereas the direct comparison of CTL<sub>2008</sub> to CTL<sub>2012</sub> reflects the impact of ongoing environmental change on the considered variables. (\*) Denotes statistical significance (ANOVA; *P*<0.05).

	CTL <sub>2008</sub>	CTL <sub>2012</sub>	$SA_2$	$SA_{14}$	SA <sub>18</sub>	
(A) Fixed-depth approach (Apparent)						
$\begin{array}{c} \text{ALT} \\ (\Delta \text{ALT}) \end{array}$	30.0±0.4 (ref)	31.9±0.3 (+1.9)	33.3±0.5 (+3.3*)	35.3±0.6 (+5.3*)	36.4±0.6 (+6.4*) (+4.6*)	
SOC Availability <sup>1</sup> $(\Delta SOC_{av})$	7.8±1.2 (ref)	8.4±1.3 (+0.6)	8.8±1.3 (+1.0)	9.3±1.2 (+1.5)	9.6±1.3 (+1.8) 6.8±0.1 (-1.0)	
SOC Inventory <sup>2</sup> $(\Delta SOC_{inv})$	7.8±1.2 (ref)	6.1±0.0 (-2.3*)	5.4±0.9 (-3.4*)	12.8±1.1 (+3.5)	13.0±0.1 (+4.4*) (+6.2*)	
( <b>B</b> ) ρb-predictive mod	lel approach					
% Compaction	(ref)	1.2±0.2%	1.1±0.4%	20.4±3.1%*	48.5±1.8%* 46.8±1.7%*	
$\begin{array}{c} \text{ALT} \\ (\Delta \text{ALT}) \end{array}$	30.0±0.2 (ref)	32.3±0.3 (+2.3*)	34.2±0.4 (+4.2*)	42.5±0.7 (+12.5*)	54.1±0.9 (+24.1*) (+21.8*)	
ΔALT Bias		1.2%	2.9%	24.0%	58.9% 53.4%	
SOC Availability <sup>1</sup> $(\Delta SOC_{av})$	7.8±0.0 (ref)	8.6±0.1 (+0.8*)	9.1±0.1 (+1.3*)	10.9±0.1 (+3.1*)	13.0±0.4 (+5.2*) 11.9±0.2 (+3.3*)	
ΔSOC <sub>av</sub> Bias		1.5%	2.5%	19.2%	43.2% 52.5%	
SOC Inventory <sup>2</sup> (ΔSOC <sub>inv</sub> )	7.8±0.0 (ref)	7.3±0.1 (-1.3*)	6.0±0.5 (-3.1*)	11.1±0.5 (+0.2)	12.5±0.7 (-0.5*) (+0.6*)	
$\Delta SOC_{inv}$ Bias		12.3%	3.9%	35.8%	39.3% 86.1%	

**TABLE V** (continued)

	CTL <sub>2008</sub>	CTL <sub>2012</sub>	$SA_2$	$SA_{14}$	SA <sub>18</sub>		
(C) Equivalent soil mass approach (ESM)							
% Compaction	(ref)	11.7±24.4%	13.2±3.6%*	10.3±21.4%	43.1±3.6% 34.4±15.2%		
ALT (ΔALT)	30.0±4.0 (ref)	35.4±7.8 (+5.4)	37.7±1.2 (+7.7)	39.0±7.6 (+9.0)	52.1±1.3 (+22.1) (+16.7)		
ΔALT Bias		11.7%	14.7%	12.1%	52.3% 33.0%		
SOC Availability <sup>1</sup> $(\Delta SOC_{av})$	7.8±1.2 (ref)	9.3±1.3 (+1.5)	9.9±1.4 (+2.1)	10.2±1.3 (+2.4)	13.1±1.3 (+5.3*) 8.8±0.8 (-0.5)		
ΔSOC <sub>av</sub> Bias		11.8%	14.4%	12.1%	46.1% 26.0%		
SOC Inventory <sup>2</sup> (ΔSOC <sub>inv</sub> )	7.8±1.2 (ref)	6.2±1.0 (-3.1*)	5.7±1.5 (-4.2*)	12.6±2.1 (+2.4)	12.9±0.7 (-0.2) (+4.1*)		
ΔSOC <sub>inv</sub> Bias		6.0%	3.8%	14.1%	36.9% 44.6%		

 $<sup>^1</sup>$  SOC availability (kgC m $^{-2}$ ) corresponds to the SOC pool available for decomposition within the mean active layer thickness (ALT) of each plot and sampling year assuming homogeneity in the distribution of the SOC inventory across the area of study. Control plots integrate a shared geophysical and biological history underlying the treatment effect. Therefore, the pool of available SOC unaffected by treatment and/or ongoing environmental change is considered equal to that of the plot of reference at depths corresponding to plot-specific ALT, and  $\Delta SOC_{av}$  is the estimate of thaw-induced increases in the available SOC pool (newly available SOC; increases in the SOC pool relative to that contained in the ALT of the plot of reference).

<sup>&</sup>lt;sup>2</sup> SOC inventory (kgC m<sup>-2</sup>) corresponds to the SOC pool contained within the active layer thickness (ALT) as affected by treatment and/or ongoing environmental change, calculated as cumulative SOC within plot-specific active layer thickness. ΔSOC<sub>inv</sub> is the net impact of snow additions and/or ongoing environmental change on SOC inventories calculated as the change in the SOC pool of each plot relative to their corresponding SOC availability<sup>1</sup>.

#### 2.3.8 Statistical analyses

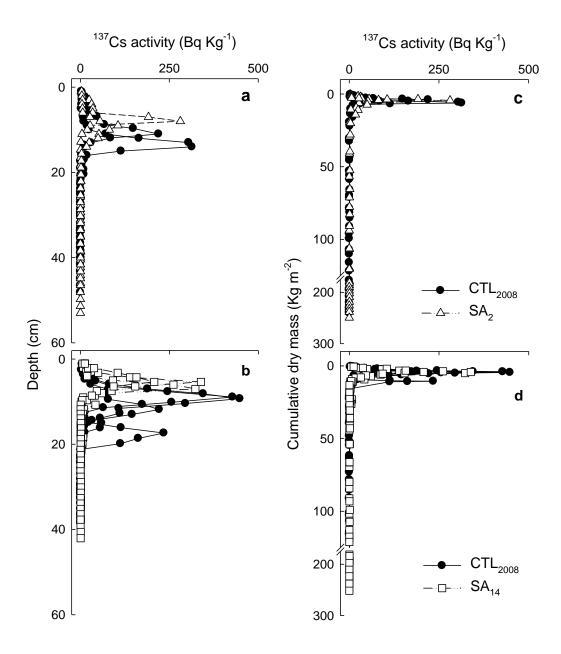
Repeated measures analyses of variance were used to examine the effects of treatment and/or ongoing climate change on soil environmental variables (i.e. soil temperature, active layer thickness). Soil content and depth distribution of <sup>137</sup>Cs, SOC and C and N content and isotopic composition were analyzed with multivariate analysis of variance using soil depth as a fixed factor within plot for the evaluation of alterations in response to short and long-term snow additions (SA<sub>2</sub>, SA<sub>14</sub> and SA<sub>18</sub>) and/or to underlying environmental change (CTL<sub>2012</sub>) relative to CTL<sub>2008</sub>. Significance levels of the distribution differences between each plot and the plot of reference were evaluated with Kolmogorov-Smirnov test (K-S test) on pairs of mean cumulative values of the considered variables. Displacements of the vertical distribution of <sup>137</sup>Cs within the soil column were assessed with a Fourier-type cross-correlation function analysis (Mystat v.12; Systat Software, Inc., Chicago, IL, USA). Differences among plots in <sup>137</sup>Cs and SOC inventories and mean C/N ratios,  $\delta^{13}$ C and  $\delta^{15}$ N values among plots at equivalent depths or within given soil sections were examined with simple analysis of variance (ANOVA). All residuals were checked for normality and homogeneity of variances to ensure that the assumptions of ANOVA were met, and the statistical significance was determined at the P<0.05 level. Statistical analyses were performed with Statgraphics Centurion XVI software (Statistical Graphics Corp., MD, USA) unless otherwise stated.

#### 2.4 RESULTS AND DISCUSSION

Snow additions resulted in higher soil temperatures during the cold season (Oct–Apr;  $+5.1\pm0.3^{\circ}$ C), and a warmer ( $+0.6\pm0.2^{\circ}$ C,  $+1.1\pm0.1^{\circ}$ C and  $+1.3\pm0.1^{\circ}$ C at SA<sub>2</sub>, SA<sub>14</sub> and SA<sub>18</sub> respectively; P<0.05) and deeper ( $+3.3\pm0.4$ cm,  $+5.3\pm0.6$ cm and  $+6.4\pm0.7$ cm at SA<sub>2</sub>, SA<sub>14</sub> and SA<sub>18</sub> respectively; P<0.05) active layer over the snow-free season (May–Sep) relative to the

corresponding control. The effect size increased over time, likely due to thaw-induced increases in soil wetness (Fan *et al.*, 2011; Subin *et al.*, 2013; Blanc-Betes *et al.*, 2016). However, thaw-induced settlement may result in underestimates of the apparent active layer thickness (ALT) in subsided areas, underestimating the rate of permafrost thaw (Shiklomanov *et al.*, 2013).

To correct error biases derived from fixed-depth characterizations of the ALT and SOC pools, physical alterations in response to short- (2yr) and long-term (14yr) snow additions were investigated by examining variations in soil <sup>137</sup>Cs distribution. <sup>137</sup>Cs displayed a regular peakshape distribution within the soil profile that recorded its depositional history from above-ground nuclear weapons testing fallout across Alaskan Arctic regions during the 1950s and early 1960s. Inventories of <sup>137</sup>Cs within the active layer indicated no significant losses at both control and treatment plots suggesting that Arctic tundra is an upward accreting system with negligible vertical mixing, lateral translocation or leaching of material within <sup>137</sup>Cs distribution depths (10– 15cm) (Fig. 4). Snow additions resulted in the vertical compression of the depth profile of <sup>137</sup>Cs activity (Fig. 6a and 6b), but did not affect its distribution when normalized to cumulative dry soil mass. These results indicate that thaw-induced consolidation and compaction of the active layer was a more dominant geomorphological agent under deeper snow than in controls (Fig. 6c and 6d). Analyses of <sup>137</sup>Cs-equivalent depths showed 8.7±2.9% and 43.3±4.7% compaction of the shallow organic layer (0–10cm) at SA<sub>2</sub> and SA<sub>14</sub> relative to CTL<sub>2008</sub> respectively (Table IV), revealing an intensification over time of thaw settlement and consolidation of the active layer under deeper snow consistent with the initial stages of thermokarst development (thaw-induced subsidence of the ground surface) (Johansson et al., 2013).

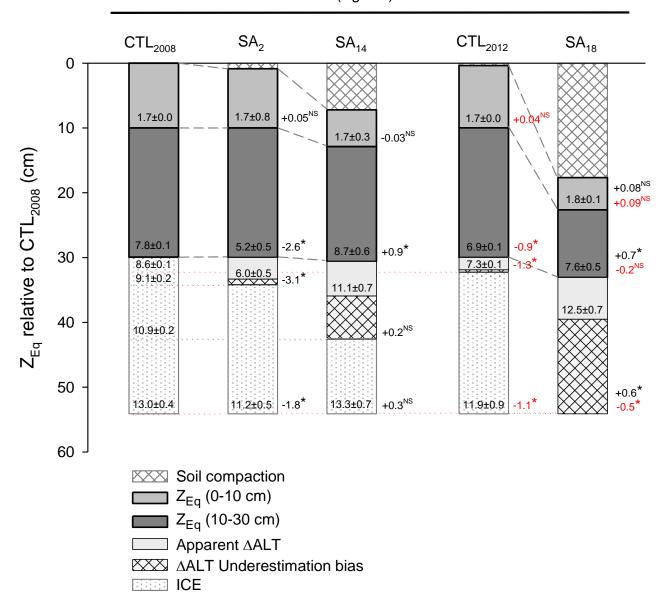


**Figure 6:** Profile distribution of  $^{137}$ Cs activity (Bq kg<sup>-1</sup>) at control (CTL<sub>2008</sub>) and snow addition treatment (SA<sub>2</sub> and SA<sub>14</sub>) plots expressed by (a), (b) depth and (c), (d) by cumulative dry mass (kg m<sup>-2</sup>). Snow additions caused a moderate displacement of the  $^{137}$ Cs distribution by depth at (a) SA<sub>2</sub> (CCFs:  $0.9\pm0.3$ cm, R<sup>2</sup>=0.73; K-S test: P=0.07, DN=0.36), that intensified at (b) SA<sub>14</sub> (CCFs  $4.3\pm0.5$ cm, R<sup>2</sup>=0.87; K-S test, P=0.007, DN=0.43) relative to CTL<sub>2008</sub>. No statistical differences were detected between CTL<sub>2008</sub> and (c) SA<sub>2</sub> or (d) SA<sub>14</sub> in the vertical distribution of  $^{137}$ Cs expressed by cumulative dry mass (K-S test>0.5).

The distribution of  $^{137}$ Cs is constrained by its deposition time and the active layer accretion rate, limiting its detection to near-surface (i.e. <10–15 cm depth) material. To effectively evaluate physical alterations integrating the entire active layer, ESM and model approaches were used to normalize SOC storage at equivalent depths across treatments and sampling times against their corresponding controls. Considering the entire active layer, deeper winter snow resulted in 1.3% compaction of the soil column at SA2 relative to CTL2008, suggesting that observed increases in  $\rho_b$  after 2yr of snow additions were almost entirely associated with greater level of decomposition of the organic material, physical compaction being largely limited to shallow organic layers (Fig. 7; Tables IV and V). At decadal scales, however, snow additions resulted in 20.4±3.1% and 46.8±1.7% compaction of the soil column at SA14 and SA18 relative to their corresponding controls and the impact of soil consolidation extended to the entire active layer. These results further support  $^{137}$ Cs evidence of an intensification of thaw-induced mechanical deformation over time (Fig. 7; Tables IV and V).

The progressive consolidation of the active layer resulted in a mean surface subsidence of  $0.9\pm0.1$ cm,  $7.3\pm0.4$ cm and  $17.7\pm0.5$ cm after 2yr, 14yr and 18yr of snow addition, respectively (Fig. 7). Physical corrections revealed that deeper winter snow increased the ALT by  $4.2\pm0.6$ cm,  $12.5\pm1.0$ cm and  $21.8\pm1.2$ cm at SA<sub>2</sub>, SA<sub>14</sub> and SA<sub>18</sub> relative to their corresponding controls, exposing a total of  $1.2\pm0.1$ ,  $3.0\pm0.2$  and  $4.6\pm0.4$  kgC m<sup>-2</sup> of additional thawed SOC to decomposition after 2yr, 14yr and 18yr of snow additions respectively (Fig. 7; Table V).

# Soil Organic Carbon Inventory at Equivalent Depth (Kg m<sup>-2</sup>)

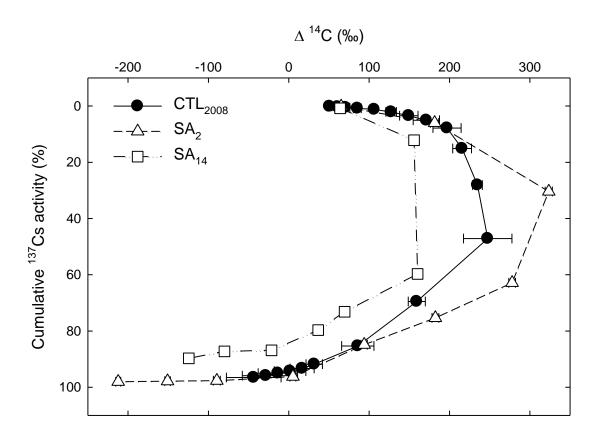


**Figure 7:** Diagram depicting mean active layer thickness (ALT), soil compaction and SOC inventories and distribution in all plots and sampling years, at model estimated equivalent depths ( $Z_{Eq}$ ) relative to CTL<sub>2008</sub>. Within column values correspond to model estimated SOC inventories ( $\pm$ SE) at shallow depths ( $Z_{Eq} = 10$ cm), and depths equivalent to ALT at each plot and sampling year. Side values indicate net changes in SOC pools in response to (black) snow additions, and (red) in response to underlying environmental changes. (\*) Denotes statistical significance (ANOVA; P<0.05).

Based on current understanding of SOC dynamics, the Arctic tundra C source strength is expected to increase proportionally to progressive soil warming and thaw-induced increases in the vulnerable SOC pool under deeper winter snow (Crichton et al., 2016; Hicks Pries et al., 2016). However, the Arctic tundra SOC pool was depleted by 34±7.2% at SA<sub>2</sub> but increased by 2±0.9% and 5±1.4% at SA<sub>14</sub> and SA<sub>18</sub> respectively relative to their corresponding controls (Fig. 7; Table V). These results reveal a marked non-linear in the response of the ecosystem C budget to projected changes in precipitation patterns over time, presumably defined by transitions in the controlling variables over the course of progressive permafrost degradation. These observations reconcile discrepancies across studies investigating the impacts of warming in Arctic C, reported responses ranging from enhanced C losses (Hicks Pries et al., 2011; Natali et al., 2014) to no change to experimental warming (Lamb et al., 2011; Sistla et al., 2013). The SOC pool increased by ~40% above SA<sub>2</sub> levels over the years following initial SOC losses, indicating that in apparent contradiction with the above mentioned studies, deeper winter snow converted Arctic tundra into a significant long-term C sink despite substantial warming and deepening of the active layer. Therefore, the assumption of linearity may lead to substantial inaccuracies of the effect size of environmental changes on the Arctic tundra C budget (Fig. 7; Table V).

Snow additions turned Arctic tundra into a transient C source likely by the combined effect of the high decomposability of permafrost SOC, the high temperature sensitivity of microbial activity within the active layer, and the rapid shift in microbial functional structure and abundance following permafrost thaw that allowed for greater mineralization rates (Waldrop *et al.*, 2010; Mackelprang *et al.*, 2011; Xue *et al.*, 2016). Accelerated SOC losses at SA<sub>2</sub> were consistent with increases in  $\Delta^{14}$ C relative to CTL<sub>2008</sub> at <sup>137</sup>Cs-equivalent depths (Fig. 8), which coupled to a substantial SOC loss suggest aging of the SOC pool due to the fast depletion of

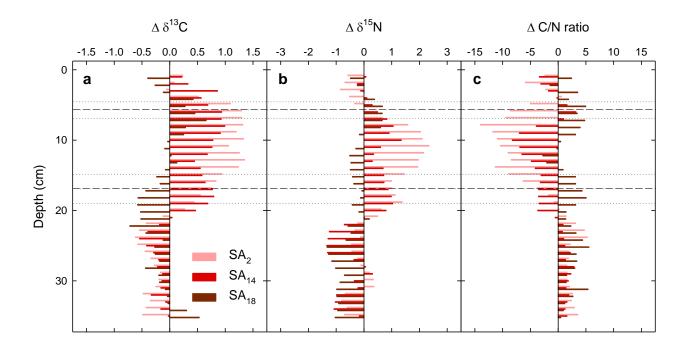
post-bomb SOC above the potential increases in primary productivity generally associated with warming trends (Welker *et al.*, 2000; Natali *et al.*, 2011).



**Figure 8:** Radiocarbon content (‰) normalized by cumulative  $^{137}$ Cs activity (%) at CTL<sub>2008</sub>, and SA<sub>2</sub> and SA<sub>14</sub> treatment plots. Bulk soil  $\Delta^{14}$ C increased at SA<sub>2</sub> but decreased at SA<sub>14</sub> at  $^{137}$ Cs equivalent depths. Error bars correspond to the error propagation of the standard error of the mean and analytical error for CTL<sub>2008</sub> (n=2) and to analytical error for SA<sub>2</sub> and SA<sub>14</sub> (n=1).

Notably, deeper snow did not alter surface SOC pools (0–10cm) at SA<sub>2</sub> significantly compared to CTL<sub>2008</sub>, the greatest losses occurring at subsurface depths roughly corresponding with C-enriched mineral horizons (5–20%C) (Fig. 7). This is consistent with the greater temperature sensitivity of the organic-enriched mineral horizons than the organic surface at subzero temperatures, and agrees with observations of shifts in the preferred substrate towards more recalcitrant compounds with increasing temperatures reported for Arctic tundra soils (Michaelson & Ping, 2003; Biasi *et al.*, 2005).

Observed decreases of C/N ratios and enrichment of  $\delta^{13}$ C and  $\delta^{15}$ N at SA<sub>2</sub> relative to CTL<sub>2008</sub> matching subsurface soil layers indicated a greater degree of decomposition of remaining soil organic matter within the organic-rich mineral horizon (Kuhry & Vitt, 1996; Boström *et al.*, 2007; Hobbie & Ouimette, 2009) (Fig. 9). This suggests that warmer soils under deeper snow promoted winter mineralization largely contributing to SOC losses at the annual scale (Welker *et al.*, 2000; Nobrega & Grogan, 2007; Natali *et al.*, 2014). In addition, increases in the availability of SOC and N with enhanced plant productivity and allocation of plant-derived organic compounds in deeper soil layers may have favored a transient priming effect in subsoil horizons contributing to the strong short-term response of subsurface SOC to snow additions during the snow-free season (Berg, 2000; Lavoie *et al.*, 2011; Wild *et al.*, 2014). These observations are consistent with reports of enhanced contributions from old SOC pools to ecosystem C losses following thaw in Arctic and subarctic regions (Nowinski *et al.*, 2010; Hicks Pries *et al.*, 2016).



**Figure 9:** Depth profile distribution of the effect size of snow additions after 2yr (SA<sub>2</sub>–CTL<sub>2008</sub>), 14yr (SA<sub>14</sub>–CTL<sub>2008</sub>) and 18yr (SA<sub>18</sub>–CTL<sub>2012</sub>) of snow additions on  $\delta^{13}$ C,  $\delta^{15}$ N and the C/N ratio. Each bar represents the difference between depth-specific averages at treatment plots and their corresponding controls. Dashed and dotted lines delimit average soil depths ( $\pm$ SE) corresponding to organic horizon (>20%C; upper section), organic-enriched mineral horizon (5–20 %C; mid-section), and mineral horizon (<5%C; lower section). No detectable treatment effect was detected on  $\delta^{13}$ C,  $\delta^{15}$ N and C/N ratios considering the entire ALT (two-way ANOVA, site effect, P>0.1), but there were significant differences between treatment plots and their corresponding controls within the soil section corresponding to the organic-rich mineral layer (P<0.05).

At a decadal time-scales however, initial SOC losses were gradually recovered likely by the combined effect of enhanced gross primary productivity matching the observed expansion of deciduous shrubs and suppressed SOC mineralization with long-term snow additions (Fig. 7; Table V). This was supported by lower  $\Delta^{14}$ C at SA<sub>14</sub> relative to CTL<sub>2008</sub> and SA<sub>2</sub> at <sup>137</sup>Csequivalent depths (Fig. 8), which indicated the net incorporation of recently fixed C into the soil column at SA<sub>14</sub> with respect to SA<sub>2</sub> and CTL<sub>2008</sub>. In agreement with these results, the effect size of deeper winter snow on C/N ratios,  $\delta^{13}$ C and  $\delta^{15}$ N decreased at SA<sub>14</sub> and SA<sub>18</sub> relative to SA<sub>2</sub> suggesting the progressive restoration of the SOM quality within the active layer at decadal time scales consistent with greater productivity and contributions from root-derived C (which in Arctic tussock tundra extend into mineral horizons), and enhanced transport of dissolved organic matter and dissolved inorganic carbon at depth within increasingly saturated soils (Fig. 9) (Lova et al., 2002). Additional results from our experimental site indicate that long-term snow additions stimulated GPP above increases in ecosystem respiration, the reduced C source strength being largely attributed to a constraint of the apparent temperature sensitivity of microbial respiration, as the progressive saturation of the active layer suppressed aerobic decomposition when soil warming would otherwise drive higher rates of SOC mineralization (see Chapters 3 and 4) (Blanc-Betes et al., 2016). Moreover, greater N availability under deeper winter snow has been shown to suppress decomposition of relatively recalcitrant C contributing to the stabilization of deep SOC in the long run (Berg, 2000; Schimel et al., 2004; Lavoie et al., 2011; Semenchuk et al., 2015). This is further supported by additional research from our experimental plots showing reduced abundance of genes associated with SOC mineralization after 18 consecutive years of snow additions at our experimental site (Ricketts *et al.*, 2016).

Importantly, while the slow anaerobic metabolism may favor SOC accumulation within increasingly anoxic soils, enhanced methanogenesis with deeper snow may result in a positive climate forcing feedback due to the amplified global warming potential of CH<sub>4</sub> (*see* Chapters 3 and 4) (Myhre *et al.*, 2013; Blanc-Betes *et al.*, 2016). The net climate forcing derived from altered precipitation patterns is therefore contingent upon the form as much as the strength of resulting C emissions (*see* Chapters 3 and 4) (Deng *et al.*, 2014; Blanc-Betes *et al.*, 2016).

Consistent with trends of permafrost warming and thawing recorded across Arctic regions over the last decades (Elberling, 2007; Hayes et al., 2014), our results showed warmer  $(+0.4\pm0.1^{\circ}\text{C}; P<0.05)$  and deeper  $(+1.9\pm0.4\text{cm}; P<0.05)$  active layer in CTL<sub>2012</sub> compared to CTL<sub>2008</sub>, suggesting an ongoing environmental change underlying the snow treatment effect. Thaw-induced consolidation led to a 1.2% compaction of the active layer at CTL<sub>2102</sub> relative to CTL<sub>2008</sub>, yielding 0.5±0.1cm subsidence of the ground surface in Arctic tundra (Fig. 7; Table V). Considering physical alterations of the soil column, CTL<sub>2012</sub> showed an 8% (+2.3±0.6cm; P<0.05) increase in the ALT with respect to CTL<sub>2008</sub> and exposed 0.8±0.1 kgC m<sup>-2</sup> of additional SOC to decomposition between 2008 and 2012 (Fig. 7; Table V). The mobilization of previously frozen C together with observed warming trends in the area resulted in a 15% loss of SOC at CTL<sub>2012</sub> relative to CTL<sub>2008</sub> (Fig. 7; Table V) supporting reports of a recent shift of terrestrial Arctic systems from C sinks to C sources (Hicks Pries et al., 2011; Hayes et al., 2014). Longterm snow additions reduced SOC losses derived from current warming trends at SA<sub>18</sub> (-4% relative to CTL<sub>2008</sub>) indicating that predicted increases in snow fall and accumulation could mitigate C losses from Arctic systems (Fig. 7; Table V).

It is important to note that disregarding the physical disturbance of the soil column derived from thaw-induced settlement and consolidation of the active layer underestimated the rate of permafrost thaw by 20–70%, resulting in a 25–65% underestimation of associated increases in recently thawed SOC pools, biases increasing with the intensity of the disturbance. These results imply that permafrost degradation may be occurring at a faster rate than previously anticipated, particularly in areas with subject to greater level of disturbance, and reconcile Arctic system-wide records of recent permafrost warming with reports of an apparent stability of the ALT (Streletskiy *et al.*, 2012; Shiklomanov *et al.*, 2013). Prior studies indicate that the extent of near surface permafrost degradation could differ dramatically as a result of model deficiencies in physical representations (McGuire *et al.*, 2016). We provide evidence that physical distortion due to changes in winter precipitation patterns occur at time and spatial scales well below those resolved in regional and global models (Biesinger *et al.*, 2007), and hence the impacts on SOC vulnerability that directly result from these processes may be underestimated.

# 2.5 Conclusions

Predicted increases in winter precipitation accelerated soil warming and permafrost thawing above climate-driven trends in the area of study, and increased the vulnerable SOC pool over time, critically defining the stability of SOC in Arctic tundra in future climate scenarios. We propose that the Arctic tundra SOC budget responded to non-stationary physical and biological processes that unfolded over the course of progressive permafrost degradation, reflecting a non-linear response of SOC pools over time. As such, deeper winter snow led to a fast depletion of the SOC pool at an annual scale and to a gradual recovery of the SOC pool at a decadal time scales, indicating a shift from short-term C source to a long-term C sink that contradicts the previously suggested resistance of the Arctic tundra SOC budget to warming (Lamb *et al.*, 2011;

Sistla et al., 2013). Our results further indicate that enhanced winter precipitation could reduce climate-driven increases of the C source strength of Arctic tundra, thereby playing a relevant role in the regulation of the annual to decadal radiative forcing from Arctic regions. From the intensification of the impacts of deeper snow on permafrost degradation over time, we infer that the system is unlikely to have reached equilibrium. If sustained, enhanced winter precipitation could further impact Arctic tundra C balance towards a new threshold in which new conditions (e.g. enhanced drainage with severe permafrost degradation, substrate quality) may stimulate decomposer activity above primary productivity ultimately offsetting ecosystem C inputs at multi-decadal time scales (Gouttevin et al., 2012; Sistla et al., 2013). Although permafrost degradation and associated increases of the vulnerable SOC pool with deeper snow are widely reported, we note an important underestimation bias with neglections of thaw-induced physical alterations, and an amplification of derived errors with the severity of the disturbance. We suggest that an improved representation of the time-hierarchical response of the Arctic tundra C budget and the physical processes associated with environmental disturbances will probably help reconcile observation- and model-based discrepancies and reduce uncertainties on climateforcing feedbacks from Arctic systems. Overall, our results show that winter precipitation is a non-trivial driver of the Arctic tundra C budget over time-spans relevant for near-future climate scenarios, adding an important nuance to the well-known coupling between climate warming and SOC dynamics.

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# 3. DEEPER WINTER SNOW REDUCES ECOSYSTEM CARBON LOSSES BUT INCREASES THE GLOBAL WARMING POTENTIAL OF ARCTIC TUSSOCK TUNDRA OVER THE GROWING SEASON

## 3.1 ABSTRACT

Projected changes in winter precipitation accompanying future warming may lead to major climate/C-cycle feedbacks from Arctic regions. However, the sign, magnitude and form (CO<sub>2</sub> and CH<sub>4</sub>) of C fluxes and derived climate forcing (i.e. GWP, global warming potential) from Arctic tundra under future precipitation scenarios remain unresolved. We investigated how 18-yrs of experimental snow depth increases and decreases affects ecosystem C fluxes and modulates the GWP of moist acidic tundra over the growing season. The response of Arctic tundra C fluxes to deeper winter snow was markedly non-linear. Both reduced- (RS, -15-30%) and increased- (MS, +20–45%; HS, +70–100%) winter snow decreased the Arctic tundra CO<sub>2</sub> source strength relative to Ambient, reducing net ecosystem C losses over the growing season. Decreases in the ecosystem CO<sub>2</sub> source strength responded mostly to constraints on SOC mineralization (R<sub>het</sub>), by temperature limitation within colder soils at RS and by snow- and thawinduced increases in soil moisture that promoted the anaerobic metabolism and dampened the temperature sensitivity of R<sub>het</sub> at MS and HS, with thaw-induced changes in SOC availability and decomposability likely exerting a secondary control. However, enhanced CH<sub>4</sub> emissions within wetter soils increased the GWP of Arctic tundra at MS and HS despite observed decreases in Arctic tundra C losses. Notably, our results suggest certain resistance of the net ecosystem productivity to long-term alterations of snow accumulation regimes, and that this resistance responds to metabolic adjustments at the canopy level mediated by shifts in plant community structure rather than by the acclimation of physiological processes. Our results indicate that projected precipitation scenarios in Arctic regions will largely determine the Arctic tundra C

budget and critically shape climate/C-cycle forcing feedbacks from Arctic regions.

# 3.2 Introduction

Permanently frozen soils (permafrost) contain up to 50% of the global terrestrial soil organic carbon (SOC) (Hugelius *et al.*, 2014). Current and projected Arctic warming and associated changes in precipitation are likely to increase the vulnerability of permafrost C but the magnitude, direction and form (CO<sub>2</sub> and CH<sub>4</sub>) of climate/carbon-cycle feedbacks from Arctic regions remain uncertain (Burke *et al.*, 2012a; Fisher *et al.*, 2014; Schaefer *et al.*, 2014; Schuur *et al.*, 2015).

Climate models robustly predict 25–50% more precipitation in Arctic regions by the end of the century, mostly as fall and winter snowfall (Kattsov et al., 2005; Zhang et al., 2013; Bintanja & Selten, 2014). However, spatial heterogeneity is expected, with some areas experiencing snow accumulation beyond predictions and others receiving less snow than current values (Callaghan et al., 2011; Stocker et al., 2013). Deeper snow promotes soil warming directly through the insulating effect of snow over the snow-covered season (Leffler & Welker, 2013; Pattison & Welker, 2014), and indirectly over the growing season through enhanced soil thermal conductivity and latent heat with snow- and thaw-induced increases in soil moisture (Fig. 1) (Qian et al., 2011; Subin et al., 2013; Zhang et al., 2013; Yi et al., 2015). Associated thermal and hydrological changes result in cascading effects on permafrost degradation (Osterkamp et al., 2009; Fan et al., 2011; Yi et al., 2015), soil C and N mineralization (Schimel et al., 2004) and plant community structure, phenology and productivity (Welker et al., 2000; Leffler et al., 2016), critically shaping the ecosystem C balance in Arctic tundra under future climate scenarios (Fig. 1) (Cassidy et al., 2015; Blanc-Betes et al., 2016; Zona et al., 2016). The potential magnitude of derived climate/C-cycle feedbacks suggests that projected changes in

winter precipitation may be as relevant climate forcing elements as climate warming in Arctic regions (Carvalhais *et al.*, 2014; Yi *et al.*, 2015; Blanc-Betes *et al.*, 2016).

Predictions of climate/C-cycle feedbacks from Arctic systems under future climate scenarios build on two major competing processes. Warmer soils and thaw-induced increases in SOC availability under deeper snow may accelerate SOC decomposition and hence ecosystem respiration, resulting in a positive feedback to climate change (Schaefer *et al.*, 2011; Mishra & Riley, 2012; Xue *et al.*, 2016). In turn, enhanced mineralization could increase nutrient availability and stimulate shrub expansion and plant productivity, partly compensating or offsetting ecosystem C losses (Elmendorf *et al.*, 2012a; DeMarco *et al.*, 2014; Salmon *et al.*, 2016).

Much effort has been invested into investigating the impacts of changes in precipitation on the C balance of tundra ecosystems within this conceptual framework. However, results are inconclusive. Experimental manipulations with snow accumulation, and soil warming and/or nutrient additions consistent with deeper snow have shown enhancing, constraining and neutral effects on microbial activity (Buckeridge & Grogan, 2008; Brooks *et al.*, 2011; Lamb *et al.*, 2011; Ricketts *et al.*, 2016; Semenchuk *et al.*, 2016), nutrient assimilation and uptake (Shaver *et al.*, 2001; Craine *et al.*, 2009; Natali *et al.*, 2012; Pattison & Welker, 2014; Semenchuk *et al.*, 2015; Leffler *et al.*, 2016) and physiological responses of the supported vegetation (Heskel *et al.*, 2012; Leffler & Welker, 2013; Weg *et al.*, 2013; Leffler *et al.*, 2016). Discrepancies persist at the ecosystem level, with the CO<sub>2</sub> sink or source strength of both Arctic and subarctic tussock tundra displaying an equally wide array of responses (Welker *et al.*, 2000; Natali *et al.*, 2011; Lund *et al.*, 2012; Li *et al.*, 2014; Abbott *et al.*, 2016; Leffler *et al.*, 2016).

The robustness of predictions of climate/C-cycle feedbacks from Arctic tundra is particularly sensitive to snow accumulation, as enhanced soil wetness, by reducing the proportion of aerobic to anaerobic decomposition slows down SOC mineralization but increases CH<sub>4</sub> emissions (Blanc-Betes *et al.*, 2016). Given the disproportional contributions of CO<sub>2</sub> and CH<sub>4</sub> to the global warming potential (GWP) of ecosystem C fluxes (33 CO<sub>2</sub>-eq; Shindell et al., 2009; Myhre et al., 2013), snow- and thaw-induced changes in soil hydrology may introduce to up to 50% divergence in model predictions of the resulting radiative forcing (McGuire *et al.*, 2012; Schneider von Deimling *et al.*, 2012; Lawrence *et al.*, 2015).

The complexity of Arctic tundra responses to changes in climate lies largely on the fact that the ecosystem C balance results from the integration of all contributing processes (i.e. ecosystem productivity, auto- and heterotrophic respiration, and net ecosystem CH<sub>4</sub> fluxes), which may differ in lag-times and sensitivities to disturbances (Weg et al., 2013). As such, there is growing evidence of non-linearity in the response of Arctic C dynamics to changes in the environment over time, where long-term (decades or longer) impacts differ from or even oppose short-term (years) impacts (Mack et al., 2004; Weg et al., 2013; Semenchuk et al., 2016). For example, although warmer soils under deeper winter snow may initially accelerate SOC decomposition rates (Morgner et al., 2010; Nowinski et al., 2010; Xue et al., 2016), SOC losses may decrease over time (see Chapter 2). The decline of the labile C pool (Semenchuk et al., 2016), the greater recalcitrance of litter inputs with transitions towards shrub-dominated communities (Hobbie, 1996; Cornelissen et al., 2007), the thermal acclimation and adaptation of microbial communities and plant respiration with persistent soil warming (Craine et al., 2012; McLaughlin et al., 2014; Wallenstein, 2014), and the development of anoxic soils (Blanc-Betes et al., 2016) are some of the mechanisms suggested to contribute to the long-term attenuation of

the ecosystem C source strength. In addition, previous studies have also reported a non-linear response of the Arctic tundra C balance to level warming (Sharp *et al.*, 2013) or nutrient additions (Arens *et al.*, 2008) consistent with deeper winter snow. Together, these observations suggest that the impacts of changes in winter precipitation on Arctic tundra C dynamics may be contingent upon the duration and intensity of the disturbance (*see* Chapter 2).

Here we investigated the mechanisms underlying the long-term responses (decadal or longer) of the ecosystem C sink or source strength and associated climate forcing from Arctic tundra to projected changes in winter precipitation. We combined periodic measurements of ecosystem, soil and heterotrophic CO<sub>2</sub> fluxes over the growing season with seasonal ecosystem CH<sub>4</sub> budgets from Arctic tussock tundra after 18 years of multi-level snow depth increases and decreases. We coupled alterations of the soil environment and plant community structure to examine causality in the observed changes, and used plot and period specific response curves to develop empirical models to estimate growing season C budgets and GWP from Arctic tundra in response to different levels of disturbance. We hypothesized that a deeper and warmer active layer would result in increases in SOC decomposition, but that C losses would be partly or fully compensated by increases in gross primary productivity associated with greater abundance of woody species. We further anticipated that enhanced CH<sub>4</sub> emissions from increasingly wetter soils with deeper winter snow would strongly influence the radiative forcing of C emissions from our moist tussock tundra site in northern Alaska, representative of 40% of the Alaskan tundra and 20% of the Arctic tundra, globally (Walker et al., 2005; Forbes, 2015).

#### **3.3 METHODS**

# 3.3.1 Site description

The research was conducted in moist acidic tussock tundra near Toolik Lake (68°38'N, 149°38'W; 760 m) at the long-term US ITEX (International Tundra Experiment) in the northern foothills of the Brooks Range, Alaska (Fig. 2) (Walker *et al.*, 1999). Annual air temperature averages –8°C, with monthly mean summer temperatures ranging from 7 to 12°C. Mean annual precipitation is 350 mm, with approximately 50% falling during winter as snow (Deslippe & Simard, 2011). Winter snow accumulation is typically 45–80 cm, and the area becomes snow-free by late-May setting the beginning of the growing season. Soils are classified as coarse-loamy, mixed, acidic, Ruptic-Histic Pergelic Cryaquept (Romanovsky et al., 2011). The experimental area is characterized by poorly drained soils and shallow organic horizons (10–15cm). The active layer typically reaches a maximum thaw depth of 45–50 cm by the end of August. The vegetation is dominated by tussock forming sedges (*Eriophorum vaginatum*) and mosses (*Sphagnum spp., Hylocomium splendens*), with scattered distribution of deciduous (*Betula nana, Salix pulchra*) and evergreen shrubs (*Cassiope tetragona, Ledum Palustra*) (Walker *et al.*, 1994; Wahren *et al.*, 2005).

#### 3.3.2 Experimental design

The experimental 2.8 x 60 m snow fence was installed in 1994 perpendicular to prevailing winter winds to create a snow drift that extends 60 m downwind (Walker *et al.*, 1999). In 2012, we established five sampling plots in each of the following distinct snow accumulation regimes (n=5): i) ambient snow accumulation (Ambient), ii) Medium Snow addition (MS) with 20–45% more snow than Ambient, iii) High Snow addition (HS) with 70–100% more snow than Ambient, and iv) Reduce Snow (RS) with 15–30% less snow than Ambient (Jones *et al.*, 1998;

Walker *et al.*, 1999; Pattison & Welker, 2014). The onset of the growing season was delayed by 5–7 days at MS and 15–20 days at HS compared to Ambient, whereas RS becomes snow-free 3–5 days before Ambient.

Measurements of ecosystem, soil and heterotrophic CO<sub>2</sub> fluxes and soil environmental variables (i.e. soil temperature and moisture, and thawing depth) were taken at biweekly intervals from May 30 to Aug 31, 2012, adding a total of six sampling periods. At each sampling period, measurements were made between 10 am and 3 pm over 3 days. To minimize potential confounding effects from day to day variability, measurements were randomly alternated among plots. To minimize disturbance, plots were accessed from permanently installed boardwalks.

# 3.3.3 Microclimate measurements

Hourly Photosynthetically Active Radiation (PAR) and air temperature data, were obtained from the micrometeorological station located 500 m from our site (Arctic LTER, Toolik Lake Field Station; http://www.lternet.edu/sites/arc). Point PAR and air temperature measurements were collected daily at the experimental site and agreed well with climate readings from the meteorological station ( $r^2$ =98.6; P<0.05).

Soil temperature (10 cm depth) was measured continuously (0.5 h intervals) over the growing season in each treatment using iButton temperature dataloggers to a precision of  $\pm 0.5$ °C (Maxim Integrated Products, Sunnyvale, CA, USA) (n=3). In addition, during each sampling session, handheld sensors were used to measure soil temperature (10 cm depth; OMEGA Engineering Inc., CT, USA) and 0–12 cm depth-integrated volumetric water content (HydroSense II, Campbell Scientific Inc., UT, USA), and thaw depth was measured using a metal depth rod. Replicates (n=5) were averaged values of 8 point measurements per plot and sampling session.

#### 3.3.4 Vegetation cover characterization

Vegetation cover was characterized at each treatment (n=5) with a 100-point 0.7 x 0.7 m frame following methods described by Walker (1996). Plant species, litter and standing dead biomass, and canopy height were recorded for each point measurement. These point-frame data provided percentage cover estimates for the most common species comprising more than 80% of biomass of Alaskan tussock tundra. Vegetation cover characterization was conducted at the peak of the growing season, between late July (RS, Ambient and MS treatments) and early August (HS treatment).

#### 3.3.5 Ecosystem CO<sub>2</sub> flux measurements

Net ecosystem  $CO_2$  exchange (NEE) represents the balance between gross primary productivity (GPP) and ecosystem respiration ( $R_{eco}$ ). Each of these components was directly measured (NEE,  $R_{eco}$ ) or indirectly estimated (GPP) at all treatments over the growing season.

Midday NEE was measured following procedures described in Shaver *et al.*, (2007). Briefly, we used a Li-6400 (Li-Cor Inc, Lincoln, NE, USA) fitted to a custom-designed 0.7x0.7x0.4 m clear acrylic chamber equipped with temperature and PAR sensors, and two internal chamber fans. At each plot and sampling period, we conducted a light response curve of NEE with six point NEE measurements corresponding to full ambient light, four levels of shade (ca. 15%, 30%, 50% and 70%), and one dark chamber measurement of R<sub>eco</sub>. The chamber volume was corrected for plot-level microtopography by measuring the distance between ground level and the base over a 100-point 0.7x0.7 m grid.

NEE is intrinsically linked to a given set of environmental conditions (i.e. air temperature and PAR) that may vary between measurements. To allow inter-comparison of CO<sub>2</sub> exchange between treatments and sampling periods excluding differences associated to environmental

conditions we generated plot- and period-specific light response curves by fitting rectangular hyperbolas to measured values of NEE and PAR using Sigmaplot v10 (Systat, Richmond, CA, USA).

(Eq. 3.1) 
$$NEE = \hat{R}_{eco} + \frac{Amax \times I}{Ks + I}$$

where  $\hat{R}_{eco}$  is a fitted estimate of  $R_{eco}$  (µmol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>),  $A_{max}$  is the rate of light-saturated photosynthesis (µmol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>),  $K_s$  is the half-saturation constant (µmol photons m<sup>-2</sup> s<sup>-1</sup>), and I is the incident PAR (µmol photons m<sup>-2</sup> s<sup>-1</sup>) (Williams *et al.*, 2006; Shaver *et al.*, 2007; Street *et al.*, 2007). The goodness-of-fit fit of the rectangular hyperbola was evaluated using the coefficient of determination (r<sup>2</sup>) of each the light-response curve. Data with r<sup>2</sup> below the 95% confidence limit (r<sup>2</sup><0.80) were rejected (< 3% of the data).

Midday NEE fluxes were then normalized to 600  $\mu$ mol photons m<sup>-2</sup> s<sup>-2</sup> (i.e. NEE<sub>600</sub>) using treatment- and period-specific fitted photosynthetic parameters (A<sub>max</sub> and K<sub>s</sub>). Normalized GPP (GPP<sub>600</sub>) was calculated as the difference between NEE<sub>600</sub> and R<sub>eco</sub> values (GPP<sub>600</sub> = NEE<sub>600</sub> – R<sub>eco</sub>). The accuracy of NEE and GPP standardizations is contingent upon the fitness of model-fitted parameters. Therefore, derived errors were further examined by regressing predicted against observed NEE from randomly selected measurements excluded from model parameterizations. The strong linear relationship (r<sup>2</sup>=0.96; *P*<0.0001) and negligible deviations from the 1:1 line (slope=0.97±0.1; intercept=-0.09±0.08) indicated the robustness of model-fitted parameters. Similarly, model-fitted  $\hat{R}_{eco}$  and observed R<sub>eco</sub> showed no evidence of a bias (r<sup>2</sup>=0.99, *P*<0.001).

#### 3.3.6 Effective leaf area index

Effective leaf area index (i.e. Effective LAI) was estimated from the linear relationship that describes GPP<sub>600</sub> as a function of leaf area index developed by Street *et al.* (2007) for moist acidic tussock tundra near the area of study (slope=6.7842; intercept=0.732).

#### 3.3.7 Soil and heterotrophic respiration measurements

Soil CO<sub>2</sub> fluxes were measured with a Li-6400 infrared gas analyzer equipped with a 6400-09 soil flux chamber (Li-Cor Inc, Lincoln, NE, USA). At each plot and sampling period, soil respiration (R<sub>soil</sub>) was measured from PVC collars (10 cm diameter) inserted into the soil to the average depth of the Oe horizon (5–7 cm depth) upon snowmelt (n=5). Measurements of R<sub>soil</sub> were conducted two weeks after insertion to minimize the impact of disturbance.

At each sampling period, heterotrophic respiration (R<sub>het</sub>) was measured using the root exclusion method. Root exclusion PVC collars (50-cm long) were installed by late Aug in 2011 (before the first snow of the previous year) (n=3). We note that root exclusions for R<sub>het</sub> are problematic (Hopkins *et al.*, 2013) but the large amount of SOC and relative low root density are likely to minimize the impacts of rhizosphere on R<sub>het</sub> when compared to other ecosystems (Chen *et al.*, 2013). All soil CO<sub>2</sub> fluxes were calculated considering chamber volume corrections accounting for plot specific depths of insertion. Replicates are averaged values of 2 pseudoreplicates of three cycles each (30 and 10 μmol mol<sup>-1</sup> for R<sub>soil</sub> and R<sub>het</sub> measurements respectively) per plot.

3.3.8 Modeling seasonal gross primary productivity, ecosystem respiration and net ecosystem exchange.

Seasonal ecosystem CO<sub>2</sub> fluxes (GPP, R<sub>eco</sub> and NEE) at each treatment were estimated from gap filling methods considering response functions to environmental factors (PAR and atmospheric temperature). Previous studies show that model parameterizations with midday values accurately predict daily CO<sub>2</sub> fluxes in Arctic systems (Sharp *et al.*, 2013). Therefore, we used midday model-fitted parameters to estimate seasonal NEE using the Photosynthetic Irradiance-Response and Temperature-sensitive respiration model (PIRT model; Williams et al., 2006). The PIRT model is a two-term algorithm that integrates ecosystem photosynthetic irradiance-response (i.e. GPP') and develops the R<sub>eco</sub> term as a function of the ecosystem respiration-temperature response (i.e. R'<sub>eco</sub>) (*Supp. Info.* 3.9.1).

We estimated hourly GPP' by fitting the photosynthetic irradiance-response term to daily treatment-specific model-fitted parameters ( $Amax_d$  and  $Ks_d$ ), and PAR hourly records.

(Eq. 3.2) 
$$GPP' = \frac{Amax_d \times I}{Ks_d + I}$$

To integrate phenology that may be cause of divergence in the photosynthetic response among treatments, we used mean  $A_{max}$  and  $K_s$  at each treatment and sampling period (n=5) to calculate mean quantum efficiency (E<sub>0</sub>;  $\mu$ mol CO<sub>2</sub>  $\mu$ mol<sup>-1</sup> PAR) using the following equation (Street *et al.*, 2007):

(Eq. 3.3) 
$$E_0 = \frac{Amax}{Ks}$$

Then, daily  $A_{max}$  ( $Amax_d$ ) was calculated by linearly interpolating between sampling periods, and daily Ks ( $Ks_d$ ) was calculated assuming constant  $E_0$  over the interpolated period. The uncertainty associated to each individual curve fit for  $A_{max}$  and  $K_s$  was propagated within treatment and over time, and therefore the error term integrated both model fitness and spatial heterogeneity.

Alternative models estimate GPP' using an adaptation of the aggregated canopy photosynthesis model that considers the hyperbolic photosynthesis-light equation at the leaf level and light extinction through the canopy to reflect the seasonality of plant development (Shaver *et al.*, 2007; Ives *et al.*, 2013; Sharp *et al.*, 2013). To gauge confidence in our predictions, we tested for discrepancies between both model predictions (*Supp. Info.* 3.9.2). The strong agreement between model estimates (r<sup>2</sup>=0.97, P<0.0001; slope=0.93, intercept=0.4) suggested that the photosynthetic irradiance-response term of the PIRT model was a useful tool for predicting GPP, and that the interpolation of period-specific parameterizations successfully integrated seasonality in our model outputs (*Supp. Info.* 3.9.2).

We estimated hourly  $R'_{eco}$  by fitting the ecosystem respiration-temperature response to treatment-specific parameterizations of the exponential regression that describes the temperature sensitivity of  $R_{eco}$  and hourly records of air temperature (Vogel *et al.*, 2009; Natali *et al.*, 2011).

(Eq. 3.4) 
$$R'_{eco} = R_b \times e^{\beta T_{air}}$$

where  $R'_{eco}$  is the modeled estimate of  $R_{eco}$  (µmol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup>),  $R_b$  represents basal ecosystem respiration (i.e. µmol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup> at 0°C), and  $\beta$  quantifies the relative increase in  $R_{eco}$  with air temperature,  $T_{air}$  (1/°C).

We used dark chamber measurements and corresponding air temperature values to determine treatment-specific  $R_b$  and  $\beta$ . The regression of predicted against observed  $R_{eco}$  values of two randomly selected measurements per plot and sampling period excluded from model parameterizations revealed unbiased relationships at all treatments ( $r^2$ =0.83, P<0.0001; slope=1.01±0.1, intercept=0.5±0.7) (*Supp. Info.* 3.9.1).

Hourly GPP' and R'<sub>eco</sub> were combined to estimate hourly NEE (i.e. hourly NEE') for each treatment (*Supp. Info.* 3.9.1).

(Eq. 3.5) 
$$NEE' = \left[ R_b \times e^{\beta T_{air}} \right] + \frac{Amax \times I}{Ks + I}$$

Hourly estimates were summed to calculate daily and seasonal GPP',  $R'_{eco}$  and NEE' for each treatment.

# 3.3.9 Modeling soil, heterotrophic and autotrophic respiration

Daily values of soil respiration ( $R'_{soil}$ ) at each treatment were estimated by linearly interpolating  $R_{soil}$  between sampling periods. Previous research showed high performance of linear interpolation methods for  $R_{soil}$  records with low sampling frequency (Gomez-Casanovas *et al.*, 2013). Alternatively, to evaluate the robustness of our estimates, we applied gap filling methods considering the temperature sensitivity of  $R_{soil}$ . Results from treatment-specific temperature-dependent functions showed good agreement with linearly interpolated values ( $r^2$ =0.92; P<0.0001) ( $Supp.\ Info.\ 3.9.3$ ). Therefore, linear interpolation was used to avoid additional self-correlation with other variables using temperature-dependent model estimates. Daily estimates were summed to calculate seasonal  $R'_{soil}$  at each treatment.

Given the strong correlation of  $R_{het}$  with changes in soil temperature (Table IX), daily values of  $R_{het}$  at each treatment were estimated from treatment-specific temperature-dependent functions:

(Eq. 3.6) 
$$R'_{het} = R_0 \times e^{\varphi T_{soil}}$$

where  $R'_{het}$  is a temperature-dependent estimate of  $R_{het}$ ,  $R_0$  represents basal heterotrophic respiration (µmol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup> at 0°C), and  $\varphi$  quantifies the relative increase in  $R_{het}$  with soil temperature,  $T_{soil}$  (1/°C). We used daily records of soil temperature and treatment-specific parameterizations of the temperature-response function of  $R_{het}$  to predict daily  $R'_{het}$  for each treatment. Robust predictions resulted when treatment-specific parameters were used to predict  $R_{het}$  for point measurements not included in the parameter development, indicating that the gap filling methods applied were successful in interpolating daily values ( $r^2$ =0.82; Slope 0.98±0.08, Intercept 0.09±0.08) (*Supp. Info.* 3.9.3). Daily estimates were summed to calculate seasonal  $R'_{het}$  at each treatment.

For each treatment, we estimated the temperature sensitivity of  $R_{het}$  ( $Q_{10}$ ) by using model fit parameters from temperature-dependent functions (Eq. 3.4) into the following equation:

(Eq. 3.7) 
$$Q_{10} = e^{-10\phi}$$

Soil moisture and substrate quality and quantity may exert a major control over temperature sensitivity of  $R_h$  (Davidson *et al.*, 2006). Therefore,  $Q_{10}$  is referred to as apparent temperature sensitivity of  $R_{het}$  hereafter.

Daily estimates of autotrophic respiration ( $R'_{aut}$ ; above- and below-ground plant respiration) were calculated as the difference between  $R'_{eco}$  and  $R'_{het}$ , and daily estimates were summed to calculate seasonal  $R'_{aut}$  at each treatment.

#### 3.3.10 Seasonal ecosystem carbon budgets and Global Warming Potential

Seasonal ecosystem C budgets at each treatment were calculated from the sum of the net seasonal ecosystem CO<sub>2</sub> and CH<sub>4</sub> balance, accounting for the mass difference between CO<sub>2</sub> and CH<sub>4</sub> gas and expressed in gCO<sub>2</sub>-C and gCH<sub>4</sub>-C. We used model estimates of NEE to calculate the seasonal ecosystem CO<sub>2</sub> budget. Seasonal net ecosystem CH<sub>4</sub> budget was estimated from the direct CH<sub>4</sub> flux determination from the same sampling plots and periods taken in parallel to CO<sub>2</sub> flux measurements (Blanc-Betes *et al.*, 2016). Details on CH<sub>4</sub> flux sampling procedures, data analyses and calculations are provided in Blanc-Betes *et al.* (2016). Briefly, seasonal CH<sub>4</sub> budgets were calculated for each treatment as the sum of the daily ecosystem CH<sub>4</sub> flux using linear interpolation gap-fill methods. Ecosystem CH<sub>4</sub> fluxes, and CH<sub>4</sub> seasonal dynamics and budgets of each treatment are available in Fig.3 and Table 4 of Blanc-Betes *et al.* (2016) (*see* Chapter 4; Fig. 27, Table XV).

To calculate the ecosystem global warming potential (GWP) resulting from ecosystem C fluxes over the growing season, the net seasonal ecosystem C flux from each treatment was expressed in CO<sub>2</sub> equivalents (CO<sub>2</sub>-eq) by multiplying the seasonal CH<sub>4</sub> budget of each treatment by its 100-year GWP (33 CO<sub>2</sub>-eq; Shindell *et al.*, 2009; Myhre *et al.*, 2013), and adding that value to its corresponding seasonal CO<sub>2</sub> budget.

#### 3.3.11 Statistical analyses

All statistical analyses were performed using Statgraphics Centurion XVI (Statistical Graphics Corp., MD, USA) software. We investigated the effect of snow treatment on abiotic factors (air and soil temperature, volumetric water content, and thaw depth), biotic variables (NEE<sub>600</sub>, GPP<sub>600</sub>,  $R_{eco}$ , and  $R_{het}$ ), model-fitted parameters ( $A_{max}$ ,  $K_s$ ), and derived variables (Effective LAI) using repeated measures analysis of variance (repeated ANOVA), with treatment (RS, Ambient, MS, and HS) and sampling period (1 to 6) as main effects, and plot within treatment (n=5, except for R<sub>het</sub> where n=3) as a random effect. Treatment effects on CO<sub>2</sub> fluxes within period were examined with simple analysis of variance (ANOVA). Simple regression analyses (SRA) were conducted to describe ecosystem, soil and heterotrophic CO<sub>2</sub> flux responses to single environmental variables. Multiple regression analyses were performed to investigate the combined effect of abiotic variables on CO<sub>2</sub> fluxes. Normalized GPP<sub>600</sub>, R<sub>eco</sub>, and R<sub>het</sub> were independently measured, thus avoiding overestimation of regression coefficients derived from the calculation of auto-correlated variables (DeLucia et al., 2007). However, given the inherent codependency between estimates of ecosystem CO<sub>2</sub> assimilation and respiration, we subtracted self-correlation by estimating the fraction attributed to shared variables (r<sub>SC</sub>; Vickers et al., 2009; Gomez-Casanovas et al., 2012). All residuals were checked for normality and homogeneity of variances to ensure that the assumptions of ANOVA and regressions were met, and the statistical significance was determined at the P<0.05 level. For seasonal budgets of ecosystem CO<sub>2</sub> and CH<sub>4</sub> fluxes, and soil and heterotrophic CO<sub>2</sub> fluxes the error term was propagated considering daily variance as the main parameter representing the uncertainty associated with spatial heterogeneity within treatment (Davidson et al., 2008).

# 3.4 RESULTS

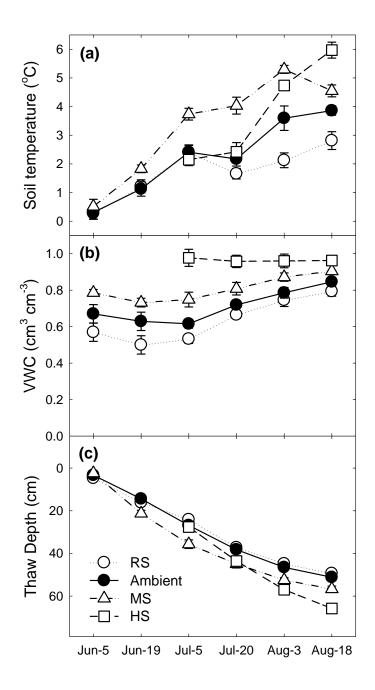
# 3.4.1 Environmental parameters

Seasonal mean temperature was 12.1°C, with highest monthly mean occurring in July (14.4°C) (*Supp. Info.*, Fig. 18a). Over the growing season, (PAR) was above 600 μmol photon m<sup>-2</sup> s<sup>-1</sup> for more than 30% of the time. PAR was highest in June and decreased thereafter, being below 600 μmol photon m<sup>-2</sup> s<sup>-1</sup> over 90% of August (*Supp. Info.*, Fig. 18a).

Soil temperature increased and differences among treatments intensified as the season progressed (P<0.05). Soils were colder in RS than in Ambient (1.8±0.07 and 2.4±0.1 °C at RS and Ambient respectively; P<0.05), and increasingly warmer with snow additions (3.5±0.08 and 4.1±0.04 °C at MS and HS respectively; P<0.05) (Fig. 10a).

Soil volumetric water content (0–12 depth integrated) increased over the growing season at all treatments except for HS that maintained water-saturation conditions throughout the season. Soils were drier at RS ( $0.63\pm cm^3$  cm<sup>-3</sup>; P<0.05), and wetter with snow additions ( $0.88\pm0.02$  and  $0.96\pm0.03$  cm<sup>3</sup> cm<sup>-3</sup> at MS and HS respectively; P<0.05) than at Ambient ( $0.71\pm0.03$  cm<sup>3</sup> cm<sup>-3</sup>) (Fig. 10b).

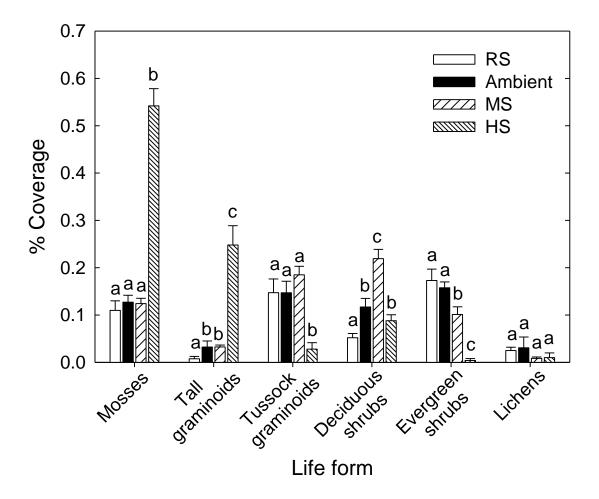
Thaw depth and differences among treatments increased as the season progressed. Maximum thaw depth was similar in RS and Ambient (49.3 $\pm$ 1.1 and 51.1 $\pm$ 1.6 cm in RS and Ambient; P>0.1), and increased with snow additions (56.7 $\pm$ 1.4 and 65.8 $\pm$ 2.3 cm at MS and HS respectively; P<0.05) (Fig. 10c).



**Figure 10:** Seasonal variation from point measurements of (a) soil temperature, (b) volumetric water content and (c) thaw depth at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments. Error bars correspond to Standard Error of the Mean ( $\pm$ SE). Mean values within the same sampling period with different letter indicate statistical differences between treatment sites within sampling period (ANOVA; P<0.05).

# 3.4.2 Vegetation cover

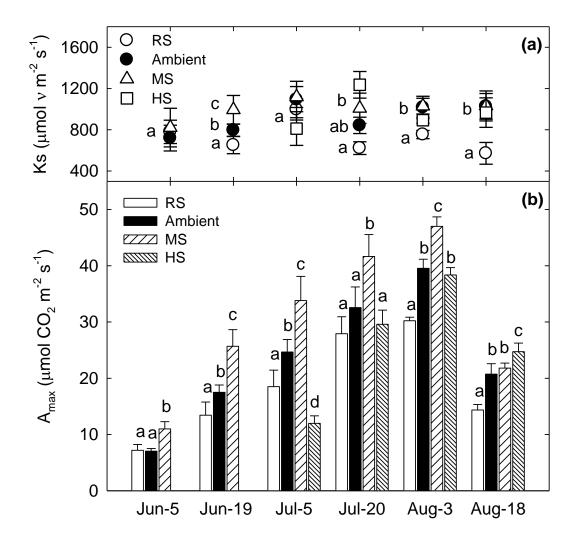
The relative abundance of shrubs increased with deeper winter snow from RS to Ambient to MS, but decreased with further snow additions at HS (Fig. 11). RS lowered the presence of deciduous (–56%) and increased the presence of evergreen (+10%) shrubs, decreasing the relative abundance of shrubs by 18% compared to Ambient (Fig. 11). At MS, deciduous shrubs increased (87%) and evergreen shrubs decreased (–36%), increasing the relative abundance of shrubs relative to Ambient by +17% (Fig. 11). In contrast, HS decreased both deciduous (–25%) and evergreen (–97%) shrubs, reducing the presence of shrubs by 66% relative to Ambient (Fig. 11). The relative abundance of total graminoids decreased at RS (–14%) and increased at MS (+21%) and HS (+54%) compared to Ambient, mostly driven by changes in tall graminoids (Fig. 11). The relative abundance of mosses was similar in RS, Ambient and MS, and increased by 600% at HS (Fig. 11).



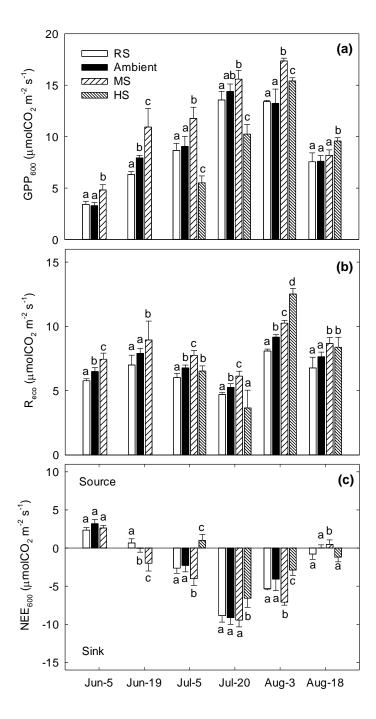
**Figure 11:** Percentage coverage of main life forms at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments. Mosses include *Spagnum sp.* and *Hylocomium splendens*; Tall graminoids are dominated by *Carex bigelowii*; Tussock forming graminoids refer to *Eriophorum vaginatum*; Deciduous shrubs are dominated by *Betula nana*, *Salix pulchra* and *Vaccinum ulginosum*; Evergreen shrubs include *Vaccinum vitis-ideae*, *Ledum decumbens* and *Cassiope tetragona*; Lichens are dominated by *Peltigera sp.* and *Cladina sp.* Values shown are mean percentage coverage (n=5). Mean values within the same sampling period with different letter indicate statistical differences among sites within sampling period (ANOVA; *P*<0.05). Error bars correspond to Standard Error of the Mean (±SE).

# 3.4.3 Ecosystem, soil and heterotrophic CO<sub>2</sub> fluxes

Mean GPP<sub>600</sub> was similar in RS and Ambient despite lower  $A_{max}$  due to smaller Ks (Figs. 12 and 13a; Tables VI and VII). Over the growing season, GPP<sub>600</sub> was consistently higher in MS than in Ambient due to a greater  $A_{max}$  despite increased Ks (Figs. 12 and 13a; Tables VI and VII). However, further snow additions reduced GPP<sub>600</sub> due to lower  $A_{max}$  and higher Ks in HS compared to Ambient (Figs. 12 and 13a; Tables VI and VII). Co-variation of  $A_{max}$  and Ks across treatments yielded relatively constant  $E_0$ , although  $E_0$  increased slightly from RS and Ambient to MS (P<0.1), and decreased at HS below Ambient values (P<0.05) (Tables VI and VII).



**Figure 12:** Seasonal variation of estimated values of (a) half-saturation constant ( $K_s$ ;  $\mu$ mol photons m<sup>-2</sup> s<sup>-1</sup>) and (b) light-saturated photosynthesis ( $A_{max}$ ;  $\mu$ mol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>) at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments. Mean values within the same sampling period with different letter indicate statistical differences among sites within sampling period (ANOVA; P<0.05; n=5). Error bars correspond to Standard Error of the Mean ( $\pm$ SE).



**Figure 13:** Seasonal variation of (a) GPP<sub>600</sub>, (b) R<sub>eco</sub> and (c) NEE<sub>600</sub> rates at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments ( $\mu$ mol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>). Mean values within the same sampling period with different letter indicate statistical differences among sites within sampling period (ANOVA; P<0.05; n=5). Error bars correspond to Standard Error of the Mean ( $\pm$ SE).

## **TABLE VI**

Results of the PIRT model parameterization. Section (**A**) shows model parameters and statistics for each treatment developed from treatment specific period averages. Values reported are seasonal mean  $\pm$  Standard Error of the Mean ( $\pm$ SE). Values with different letter denote statistical differences between snow treatment (P<0.05). Section (**B**) shows statistics of the fit when treatment specific parameters are used to predict NEE in the whole data set. Section (**C**) shows statistics of fit when treatment specific parameters are used to predict NEE in a subset of data not included in the parameterization of the model.

			3.50	****			
	RS	Ambient	MS	HS			
(A) PIRT model parameterization							
$A_{max}$	$18.2\pm1.1^a$	$22.0 \pm 1.4^{\rm b}$	$22.0 \pm 1.4^{b}$ $28.2 \pm 1.1^{c}$				
Ks	$711.3 \pm 74.7^{a}$	$870.1 \pm 80.3^{ab}$	$1019.4 \pm 98.0^{b}$	$976.2 \pm 77.8^{ab}$			
$E_0$	$0.026 \pm 0.003^a$	$0.025 \pm 0.002^a$	$0.028 \pm 0.002^a$	$0.021 \pm 0.003^{b}$			
Effective LAI	$1.08\pm0.02^a$	$1.19 \pm 0.02^{b}$	$1.42 \pm 0.03^{c}$	$1.05 \pm 0.02^{d}$			
$R_b$	1.57	1.72	2.17	0.31			
β	0.078	0.080	0.075	0.177			
$Q_{10}$	2.2	2.2	2.1	5.9			
$r^2$	0.41	0.57	0.59	0.79			
(B) Model evaluation							
Slope	0.954	0.968	0.972	0.965			
Intercept	-0.068	-0.209	-0.247	0.037			
$\mathbb{R}^2$	0.970	0.951	0.953	0.974			
RMSE	0.960	1.298	1.342	0.877			
n	180	180	180	120			
(C) Model validation							
Slope	0.922	0.949	0.936	0.945			
Intercept	0.166	-0.452	-0.407	0.336			
$\mathbb{R}^2$	0.974	0.919	0.936	0.968			
RMSE	0.883	1.213	1.253	1.028			
n	36	36	36	24			

**TABLE VII** 

Results from repeated ANOVA. Evaluation of the single and combined effects of treatment and period on the parameters defining ( $\mathbf{A}$ ) ecosystem photosynthetic activity, ( $\mathbf{B}$ ) normalized ecosystem  $CO_2$  fluxes, and ( $\mathbf{C}$ ) soil and heterotrophic respiration.

_	Effect	df (res)	F	P	
(A) Photosynth	netic activity parameters				
$A_{\text{max}}$	Period	5 (85)	55.4	< 0.0001	
	Treatment	3 (85)	15.4	< 0.0001	
	Period x Treatment	9 (48)	7.3	< 0.0001	
Ks	Period	5 (85)	0.4	0.8375	
	Treatment	3 (85)	3.0	0.0523	
	Period x Treatment	9 (48)	2.5	0.1223	
$E_0$	Period	5 (85)	32.2	< 0.0001	
	Treatment	3 (85)	3.5	0.0392	
	Period x Treatment	9 (48)	3.9	0.0012	
Effective LAI	Period	5 (85)	53.9	< 0.0001	
	Treatment	3 (85)	10.3	0.0002	
	Period x Treatment	9 (48)	4.2	0.0001	
(B) Ecosystem CO <sub>2</sub> Fluxes					
GPP <sub>600</sub>	Period	5 (85)	54.0	< 0.0001	
	Treatment	3 (85)	10.6	0.0004	
	Period x Treatment	9 (48)	4.6	0.0002	
$R_{eco}$	Period	5 (85)	65.6	< 0.0001	
	Treatment	3 (85)	46.7	< 0.0001	
	Period x Treatment	9 (48)	16.6	< 0.0001	
NEE <sub>600</sub>	Period	5 (85)	18.3	< 0.0001	
	Treatment	3 (85)	4.2	0.0198	
	Period x Treatment	9 (48)	13.0	< 0.0001	

**TABLE VII** (continued)

Effect		df (res)	F		P
(C) Soil and heterotrophic respiration					
$R_{soil}$	Period	5 (264)	14.2	<	0.0001
	Treatment	3 (264)	54.0	<	0.0001
	Period x Treatment	9 (202)	8.9	<	0.0001
$R_{\text{het}}$	Period	5 (51)	31.0	<	0.0001
	Treatment	3 (51)	47.0		0.0198
	Period x Treatment	9 (26)	21.6	<	0.0001

 $R_{eco}$  was lower at RS and higher with snow additions than in Ambient plots, although it was greater at MS than at HS (Fig. 13b; Table VII). Although seasonal variation of  $R_{eco}$  was mainly driven by air temperature ( $r^2$ =0.51; P<0.05), differences in  $R_{eco}$  among treatments were mostly explained by changes in GPP<sub>600</sub> (Table VIII). The correlation between  $R_{eco}$  and GPP<sub>600</sub> varied among treatments, increasing from RS to Ambient to MS, but decreasing at HS (Table VIII).

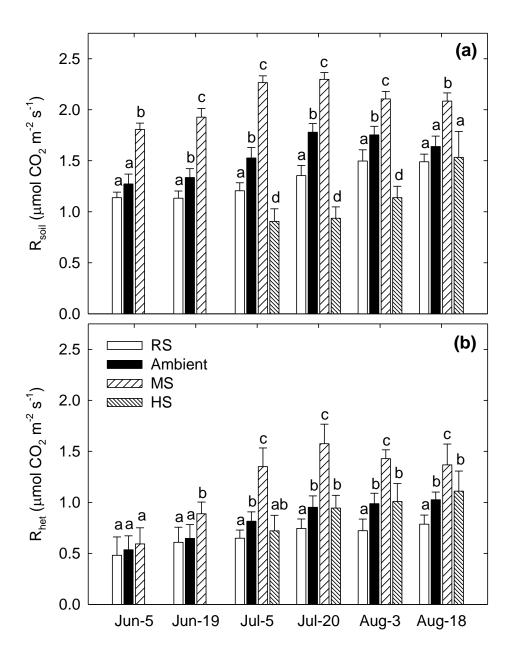
**TABLE VIII** 

Results from simple regression analyses. Evaluation of the relationship between GPP<sub>600</sub> and ecosystem and soil respiration<sup>1</sup>. Coefficients of determination considering raw regression ( $r^2$ ), estimated self-correlation between co-dependent variables ( $r^2$ sc), and estimated real correlation between variables subtracting inherent co-dependency ( $\hat{r}_2$ ) are reported.

Dependent		$r^2$	$r^2_{sc}$	$\hat{\mathbf{r}}^2$	F	P
$R_{ m eco}$	All treatments	0.16	0.12	0.04	18.8	< 0.0001
	RS	0.42	0.08	0.34	15.9	0.0006
	Ambient	0.50	0.08	0.42	23.4	0.0001
	MS	0.74	0.08	0.66	64.6	< 0.0001
	HS	0.48	0.26	0.23	12.2	0.004
$R_{\rm soil}$	All treatments	0.29	0.01	0.28	40.4	< 0.0001
	RS	0.32	0.00	0.32	12.8	0.0013
	Ambient	0.51	0.01	0.50	29.2	< 0.0001
	MS	0.66	0.01	0.65	53.7	< 0.0001
	HS	0.28	0.01	0.27	6.5	0.0207

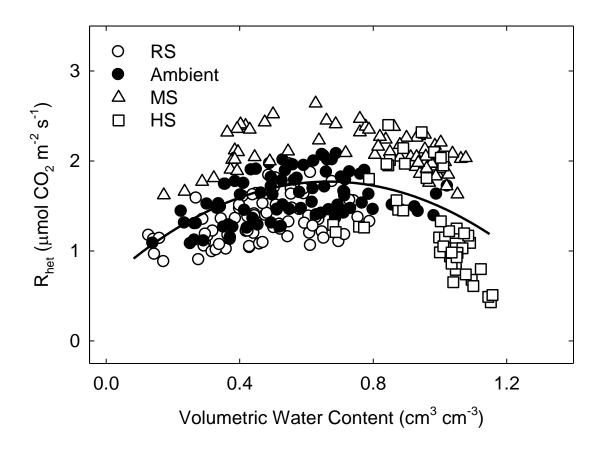
 $<sup>^1</sup>$  Units are in  $\mu mol~CO_2~m^{\text{--}2}~s^{\text{--}1}.$  Normalized GPP  $_{600}$  were ln-transformed.

Snow treatments altered R<sub>soil</sub> and R<sub>het</sub> (Fig. 14; Table VII). R<sub>soil</sub> increased from RS to Ambient to MS, but decreased at HS relative to Ambient (Fig. 14a; Table VII) and was positively correlated with GPP<sub>600</sub>, but correlation coefficients varied among treatments, increasing from RS to Ambient to MS, but decreasing at HS (Table VIII).



**Figure 14:** Seasonal variation of (**a**)  $R_{soil}$  and (**b**)  $R_{het}$  rates at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments ( $\mu$ mol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup>). Mean values within the same sampling period with different letter indicate statistical differences among sites within sampling period (ANOVA; P<0.05; n=5). Error bars correspond to Standard Error of the Mean ( $\pm$ SE).

Over the growing season,  $R_{het}$  was consistently lower at RS and higher at MS than in Ambient (Fig. 14b; Table VII). However,  $R_{het}$  was similar in HS and Ambient (Fig. 14b; Table VII). Soil temperature and moisture explained variations in  $R_{het}$  (Fig. 15; Table IX). Seasonal  $Q_{10}$  decreased slightly from RS to Ambient to MS, and substantially at HS (Table IX). Basal  $R_{het}$  ( $R_{0}$ ;  $R_{het}$  at  $0^{\circ}$ C) was unaffected by snow treatment (Table IX). Increases in soil moisture increased  $R_{het}$ , reaching maximum rates between 0.65-0.77 cm<sup>3</sup> cm<sup>-3</sup>, but decreased with further increases in VWC (Fig. 15). The relative importance of soil temperature and moisture in explaining  $R_{het}$  differed among treatments, with soil temperature losing leverage as soil moisture gained control with deeper snow (Table IX).



**Figure 15:** Results from simple regression analysis. Evaluation of the relationship between soil moisture (volumetric water content, VWC; cm<sup>3</sup> cm<sup>-3</sup>) and heterotrophic respiration ( $R_{het}$ ;  $\mu$ mol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup>) during the growing season including Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) plots.

TABLE IX

Results from simple regression analyses. Evaluation of the relationship between heterotrophic respiration ( $R_{het}$ ; µmol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup>) and (A) soil volumetric water content, (B) soil temperature, and (C) thaw depth. Coefficients of determination ( $r^2$ ) and statistics across and within treatments are reported. Section (B) includes model parameters describing the apparent temperature sensitivity of  $R_{het}$ . Values with different letter denote statistical differences between snow treatment (P<0.05).

	All treatments	RS	Ambient	MS	HS
(A) Volumetric water content (cm <sup>3</sup> cm <sup>-3</sup> ). Best fit: Polynomial					
$r^2$	0.31	0.48	0.50	0.64	0.88
RMSE	0.078	0.141	0.045	0.143	0.047
<i>F</i> -value	13.4	5.9	4.5	11.8	41.2
P	< 0.0001	0.0147	0.0441	0.0012	< 0.0001
(B) Soil temperature (°C). Best fit: Exponential					
$R_0$	0.602	$0.429^{a}$	0.478 <sup>a</sup>	$0.494^{a}$	$0.490^{a}$
φ	0.142	$0.237^{a}$	$0.220^{a}$	$0.247^{a}$	$0.158^{b}$
$\mathbf{Q}_{10}$	$4.1 \pm 1.5$	$10.7 \pm 1.3^{a}$	$9.0 \pm 1.2^{a}$	$8.6 \pm 1.3^{a}$	$4.8 \pm 1.3^{b}$
$\mathbf{r}^2$	0.56	0.87	0.85	0.81	0.77
RMSE	0.142	0.074	0.053	0.070	0.076
<i>F</i> -value	77.1	89.7	100.2	80.2	41.2
P	< 0.0001	< 0.0001	< 0.0001	< 0.0001	< 0.0001
(C) Thaw depth (cm). Best fit: Linear					
$r^2$	0.00	0.14	0.15	0.01	0.07
RMSE	0.223	0.210	0.131	0.233	0.159
<i>F</i> -value	0.2	1.3	1.4	0.1	1.0
P	0.6391	0.2835	0.2645	0.7928	0.3466

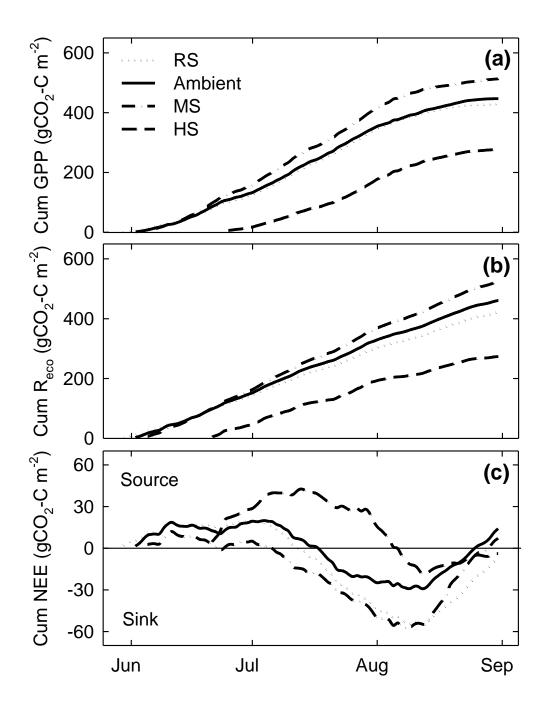
#### 3.4.4 Effective Leaf Area Index

Snow treatment altered Effective LAI (Tables VI and VII). Estimates of Effective LAI increased from RS to Ambient to MS, but decreased with further snow additions at HS below those in Ambient (Tables VI and VII).

#### 3.4.5 Seasonal CO<sub>2</sub>-C budgets

Both cumulative GPP and  $R_{eco}$  were lower in RS and higher in MS than in Ambient. However, further increases in snow accumulation at HS decreased both GPP and  $R_{eco}$  compared to Ambient (Figs. 16a and 16b). The contribution of  $R_{het}$  to  $R_{eco}$  was  $15\pm1.5\%$  in RS,  $20\pm1.2\%$  in Ambient,  $21\pm1.0\%$  in MS and  $26\pm1.7\%$  in HS. The contribution of  $R_{het}$  to  $R_{soil}$  was  $50.7\pm4.5\%$  in RS,  $51.2\pm3.2\%$  in Ambient,  $58.2\pm3.0\%$  in MS and  $87.3\pm7.9\%$  in HS.

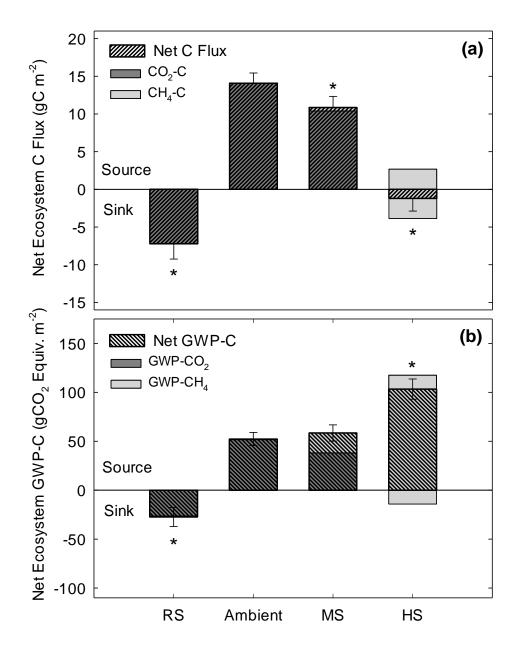
Snow treatment altered seasonal sums and patterns of NEE (Figs. 16c; Table VII). Over the growing season, Arctic tundra was a net CO<sub>2</sub> source at Ambient and a net CO<sub>2</sub> sink at RS (Figs. 16c). Snow additions reduced the CO<sub>2</sub> source strength at MS compared to Ambient, and switched the system into a weak CO<sub>2</sub> sink at HS (Figs. 16c). At Ambient, Arctic tundra transitioned from a CO<sub>2</sub> source into a sink by mid-July (Fig. 16c). RS and MS anticipated by 5 and 12 days the transition into a net sink for CO<sub>2</sub>, and HS delayed the transition by 19 days (Fig. 16c). By late August, Arctic tundra became a net CO<sub>2</sub> source at Ambient and MS, whereas RS and HS remained net CO<sub>2</sub> sinks until the first snow (Fig. 16c).



**Figure 16:** Seasonal cumulative of **(a)** GPP, **(b)** R<sub>eco</sub> and **(c)** NEE at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season (gCO<sub>2</sub>-C m<sup>-2</sup>).

#### 3.4.6 Seasonal ecosystem carbon budget and Global Warming Potential

Incorporating CH<sub>4</sub> emissions into the C budget, Ambient Arctic tundra was a net source of C and GWP (Fig. 17). RS converted Arctic tundra into a net sink of both C and GWP (Fig. 17). MS reduced net C losses by 30%, but did not affect the GWP compared to Ambient when accounting for the radiative forcing of a 20-fold increase in ecosystem CH<sub>4</sub> source strength (*see* Chapter 4) (Fig. 17). However, further snow additions at HS switched the system into a small net C sink, but increased the GWP source strength of Arctic tundra by 130% as a result of a 150-fold increase in the ecosystem CH<sub>4</sub> source strength compared to Ambient (*see* Chapter 4) (Fig. 17).



**Figure 17:** Seasonal estimates of (a) net ecosystem C fluxes (gC m<sup>-2</sup>), and (b) net C global warming potential (GWP-C, patterned; gCO<sub>2</sub> Equiv. m<sup>-2</sup>) derived from net ecosystem CO<sub>2</sub> (solid dark grey) and CH<sub>4</sub> (solid light grey) budgets at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments. Error bars correspond to Standard Error of the Mean ( $\pm$ SE). (\*) Denotes significant difference between treatment and Ambient sites (P<0.05).

#### 3.5 DISCUSSION

Our results indicate a marked nonlinearity in the response of the Arctic tundra C budget to changes in winter precipitation. Both reduced- (RS) and high- (HS) snow accumulation switched the system into a C sink, whereas medium snow additions (MS) reduced the C source strength of Arctic tundra relative to Ambient over the growing season (Fig. 17a). An evaluation of the components of Arctic tundra C balance (i.e. CO<sub>2</sub> and CH<sub>4</sub> budgets) revealed that this nonlinearity was a consequence of the nonlinear response of NEE to increasing levels of winter snow, and could be traced to shifts in plant community structure, and a strong control on R<sub>het</sub> (Fig. 17a). Parallel work at the site showed enhanced CH<sub>4</sub> emissions with deeper winter snow (Blanc-Betes *et al.*, 2016), which increased the GWP of Arctic tundra relative to Ambient despite decreases in the ecosystem C source strength (Fig. 17b). Our results indicate that by reshaping soil thermal and hydrological regimes and supported vegetation, projected precipitation scenarios in Arctic regions will drive the Arctic tundra C budget and climate/C-cycle forcing feedbacks beyond the impacts of winter warming alone.

#### 3.5.1 Snow accumulation effects on plant community structure

Snow additions favored the expansion of deciduous shrubs to the detriment of evergreen shrubs and sedges from RS to Ambient to MS likely due to thaw- and warming- induced nutrient availability (Schimel *et al.*, 2004; Salmon *et al.*, 2016), and improved rates of N uptake and developmental plasticity of deciduous species above that of evergreen shrubs or non-woody species (Chapin & Shaver, 1996; Oechel *et al.*, 2000; Bret-Harte *et al.*, 2001; Shaver *et al.*, 2001; Bret-Harte *et al.*, 2002) (Figs. 10 and 11). This is in agreement with changes in plant community structure observed at our experimental site after 8 years of 1-3 fold snow increases (Wahren *et al.*, 2005), and supports observations of recent shrub expansion into Arctic tundra accompanying

climate warming (Tape *et al.*, 2006; Walker *et al.*, 2006; Elmendorf *et al.*, 2012a, 2012b; Tape *et al.*, 2012). However, with further snow additions at HS both deciduous and evergreen shrubs were replaced by tall sedges and mosses (Fig. 11). Similar transitions towards wet sedge tundra have been reported associated with severe permafrost degradation (Jorgenson *et al.*, 2001; Christensen *et al.*, 2004; Osterkamp *et al.*, 2009).

#### 3.5.2 Snow accumulation controls on Arctic tundra CO<sub>2</sub> sink or source strength

Under Ambient conditions, Arctic tundra was a net CO<sub>2</sub> source over the growing season, similar in magnitude to that reported across the Alaskan Arctic tundra over the last decades (Figs. 16c and 17a) (Jones *et al.*, 1998; Grogan & Chapin III, 1999, 2000, Welker *et al.*, 2000, 2004; Kwon *et al.*, 2006; Biasi *et al.*, 2013; Leffler *et al.*, 2016).

Moderate snow additions reduced the Arctic tundra CO<sub>2</sub> source strength at MS relative to Ambient, whereas both reduced and high snow additions switched Arctic tundra into a CO<sub>2</sub> sink at RS and HS respectively (Figs. 16c and 17a). The observed nonlinearities resulted from the individual responses of all contributing fluxes (i.e. GPP, R<sub>eco</sub>, and R<sub>het</sub>) to greater soil wetness, warming and deepening of the active layer (Fig. 10), and alterations of the plant community structure with deeper winter snow (Fig. 11).

Seasonal GPP was not affected at RS, but increased at MS and decreased with further snow additions at HS relative to Ambient (Fig. 16a). These results contrast with measures of leaf-level photosynthesis across our experimental site, which decreased at RS (Pattison & Welker, 2014) and were not affected by MS or HS (Leffler *et al.*, 2016). The apparent discrepancy suggests that changes in A<sub>max</sub> and GPP resulted from changes in Effective LAI rather than in leaf-level physiology (Street *et al.*, 2007; Starr *et al.*, 2008; Sharp *et al.*, 2013). Both Effective LAI and ecosystem A<sub>max</sub> increased with deeper snow from RS to Ambient to MS

but decreased at HS in close correspondence with patterns of relative abundance of deciduous shrubs (Fig 12; Tables VI and VII). These results agree with greater LAI, branching and secondary growth of deciduous shrubs in response to experimental warming and fertilization (Bret-Harte *et al.*, 2001; Shaver *et al.*, 2001; Bret-Harte *et al.*, 2002; Miller & Smith, 2012).

The denser canopy of a deciduous shrub-dominated overstory however, comes to the detriment of shaded understory vegetation (Bret-Harte et al., 2001; Miller & Smith, 2012), leading to greater A<sub>max</sub>, but also increasing Ks (Table VI; Fig 12) (Sweet *et al.*, 2015). Consistently, Ks increased proportionally with  $A_{max}$  from RS to Ambient to MS yielding relatively conservative  $A_{max}$ -to-Ks values (E<sub>0</sub>), and hence limiting the GPP response to moderate changes in snow depth (Table VI). As such, at RS, lower Ks, by allowing greater GPP at low PAR, compensated decreases in A<sub>max</sub>, yielding similar seasonal GPP than Ambient (Figs. 12, 13a and 16a; Table VI). On the other hand, MS increased A<sub>max</sub> and enhanced GPP early in the growing season likely by accelerated green-up rates and early leaf expansion of deciduous shrubs (Bosiö et al., 2014; Sweet et al., 2015). This hastened the transition from CO<sub>2</sub> source to sink by 12 days with respect to Ambient despite the 7-day delay in the onset of the growing season (Figs. 12, 13a and 16a; Table VI). However, greater Ks, particularly by the end of the growing season due to the earlier senescence of deciduous shrubs, along with low PAR by mid-late Aug partly limited increases in seasonal GPP at MS (Figs. 12, 13a and 16a; Table VI). In contrast, the drastic shortening of the growing season and the succession towards wet sedge-dominated tundra at HS reduced E<sub>0</sub> and seasonal GPP compared to Ambient (Figs. 12, 13a and 16a; Table VI). Together, these observations indicate the resistance of ecosystem productivity to moderate longterm changes in climate (Oechel et al., 2000; Bosiö et al., 2014), and suggest that correlations between plant productivity and the length of the growing season (Groendahl et al., 2007; Lund et al., 2010; Wipf & Rixen, 2010) are mediated by shifts in vegetation structure and contingent upon the severity of the disturbance.

GPP<sub>600</sub> and R<sub>eco</sub> were positively correlated across treatments suggesting important contributions from autotrophic respiration (R<sub>aut</sub>; above- and below-ground pant respiration) to R<sub>eco</sub> (Table VIII) (Hobbie & Chapin, 1998; Gonzalez-Meler *et al.*, 2004; La Puma *et al.*, 2007). Consistently, GPP<sub>600</sub> explained and increasing portion of the R<sub>eco</sub> variability from RS to Ambient to MS but lose leverage at HS, showing greater uncoupling between ecosystem productivity and respiration at RS and HS (Table VIII). This uncoupling can be traced to differences in the fraction of GPP lost through R<sub>aut</sub>, and R<sub>het</sub>.

Across treatments, variations in GPP were largely compensated by proportional changes in  $R_{aut}$ , suggesting that the uncoupling between GPP<sub>600</sub> and  $R_{eco}$  determining the ecosystem  $CO_2$  sink or source strength was mostly attributable to the direct impact of winter snow on  $R_{het}$ .

 $R_{het}$  and GPP have been shown to be linked (Gomez-Casanovas *et al.*, 2012; Hopkins *et al.*, 2013). Consistently,  $R_{soil}$  was positively correlated with GPP<sub>600</sub>, as greater plant productivity likely increased root respiration and provided additional labile substrates for microbial decomposition (Table VIII) (Raich & Schlesinger, 1992; Christiansen *et al.*, 2012; Gomez-Casanovas *et al.*, 2012). However, GPP<sub>600</sub> and  $R_{soil}$  lost correlation at RS and HS (Tables VIII), suggesting that additional parameters drove  $R_{soil}$  responses to snow accumulation possibly through impacts on  $R_{het}$ . Soil temperature was a key driver of  $R_{het}$  across treatments (Table IX), which exhibited apparent seasonal  $Q_{10}$  values of ~10 at RS, Ambient and MS, and ~5 at HS (Table IX), similar to those reported for tussock and wet-sedge Arctic tundra soils respectively and hence, in agreement with observed changes in plant community structure across treatments (Fig. 11) (Mikan *et al.*, 2002).

Values of Q<sub>10</sub> above 2.5 however, suggest that other variables such as soil moisture and substrate supply may co-vary with soil temperature to explain changes in R<sub>het</sub> (Davidson *et al.*, 2006; Davidson & Janssens, 2006). Soil moisture explained an increasing fraction of R<sub>het</sub> variability from RS to Ambient to MS, and became the main driver at HS (Table IX), where near water-saturation conditions likely limited the aerobic metabolism within anoxic soils (Fig. 15) (*see* Chapter 4; Fig. 29) (Blanc-Betes *et al.*, 2016). Consistently, Q<sub>10</sub> decreased at HS, explaining similar R<sub>het</sub> values at HS and Ambient despite substantial increases in soil temperature (Fig. 14; Table IX). This is consistent with the negative relationship between water table position and ecosystem Q<sub>10</sub> reported from subarctic and Arctic regions (Huemmrich *et al.*, 2010; McConnell *et al.*, 2013).

In addition, high Q<sub>10</sub> of Arctic soils has been suggested to integrate temperature responses to SOC decomposability (Mikan *et al.*, 2002). However, contrary to recent studies that propose that litter quantity (Myers-Smith & Hik, 2013) and quality (DeMarco *et al.*, 2014) are more important than environmental variables in determining decomposition rates, similar R<sub>0</sub> (i.e. R<sub>het</sub> at 0°C) suggests comparable substrate utilization across snow treatments despite the greater decomposability of graminoid-derived litter than that of deciduous shrubs (Fig. 11; Table IX) (Hobbie, 1996; Mikan *et al.*, 2002; Mack *et al.*, 2004). Similarly, R<sub>0</sub> did not respond to deeper and warmer active layer contravening arguments of thaw-induced shifts in substrate utilization (Biasi *et al.*, 2005; Uhlířová *et al.*, 2007; Abbott *et al.*, 2014). This is further supported by the negligible effect of thawing depth on R<sub>het</sub> (Table IX). Unaltered R<sub>0</sub> despite substantial changes in plant community structure and deepening of the active layer with deeper winter snow suggests that microbial activity responded to soil thermal and hydrological constraints rather than plant-derived or thaw-induced changes in C availability and decomposability.

## 3.5.3 Impacts of snow accumulation on Arctic tundra carbon balance and Global Warming Potential

Both reduced snow and snow additions increased the strength of the net C sink of Arctic tundra, a response primarily driven by impacts on ecosystem CO<sub>2</sub> dynamics (Fig. 17a). However, greater CH<sub>4</sub> emissions increased the GWP of Arctic tundra with increases in winter snow accumulation (Fig. 17b). These results agree with model predictions of climate/C-cycle forcing feedbacks from Arctic regions including the prognostic dynamics of incomplete permafrost degradation (Grant, 2015), but contrast with model projections considering scenarios of dramatic losses of permafrost area by the end of the century (Koven *et al.*, 2011; Schaefer *et al.*, 2011; Burke *et al.*, 2012b; Koven *et al.*, 2015). Severe permafrost degradation under projected increases in winter precipitation over time spans longer than considered in this study, by promoting soil drainage could accelerate R<sub>het</sub> and suppress ecosystem CH<sub>4</sub> emissions, increasing ecosystem C losses but reducing the GWP of Arctic tundra (Romanovsky *et al.*, 2010; Avis *et al.*, 2011; Lawrence *et al.*, 2015).

#### **3.6 CONCLUSIONS**

In summary, deeper winter snow reduced the C source strength but increased the GWP of Arctic tundra over the growing season. Our results further indicate that increases in the Arctic tundra C sink strength resulted from impacts on the predominant microbial function and activity rather than from enhanced nutrient availability and plant productivity, and variations in microbial activity responded to changes in soil thermal and hydrological regimes rather than on plant-derived or thaw-induced changes in C availability or decomposability. Notably, our results suggested certain resistance of net plant productivity to long-term changes in winter precipitation that responded to metabolic adjustments at the canopy level mediated by shifts in plant

community structure rather than the acclimation of physiological processes. Overall, our findings suggest the capacity of Arctic tundra to dampen C flux responses to long-term changes in climate but significantly contribute to the ecosystem GWP. However, the sign and magnitude of these feedbacks hinge on intensity of the disturbance and operating time spans. Predictions of climate/C-cycle feedbacks from Arctic regions would greatly benefit from improved representations of the timing and intensity of changes in precipitation and impacts on soil hydrology.

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#### 3.9 SUPPLEMENTARY INFORMATION

# 3.9.1 Photosynthetic Irradiance-Response and Temperature-sensitive respiration model. Model parameterization, validation and evaluation

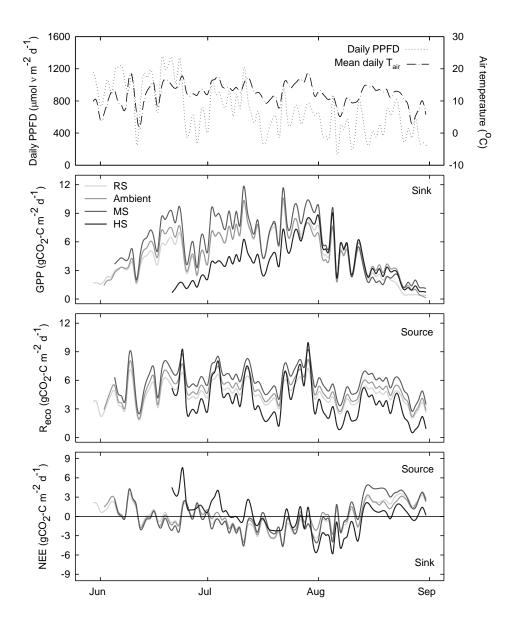
The Photosynthetic Irradiance-Response and Temperature-sensitive respiration model (PIRT model; Williams et al., 2006) estimates NEE (NEE') using a two-term algorithm that integrates ecosystem photosynthetic irradiance-response (i.e. GPP) and develops the  $R_{\rm eco}$  term as a function of the ecosystem respiration-temperature response.

(Eq. S3.1) 
$$NEE' = \left[R_b \times e^{\beta T_{air}}\right] + \frac{Amax \times I}{K_{S+I}}$$

where  $R_b$  represents basal ecosystem respiration (µmol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup> at 0°C),  $\beta$  quantifies the relative increase in respiration with air temperature,  $T_{air}$  (1/°C),  $A_{max}$  is the rate of light-saturated photosynthesis (µmol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup>),  $K_s$  is the half-saturation constant (µmol photons m<sup>-2</sup> s<sup>-1</sup>), and I is the incident PAR (µmol photons m<sup>-2</sup> s<sup>-1</sup>) (Williams *et al.*, 2006; Shaver *et al.*, 2007; Street *et al.*, 2007).

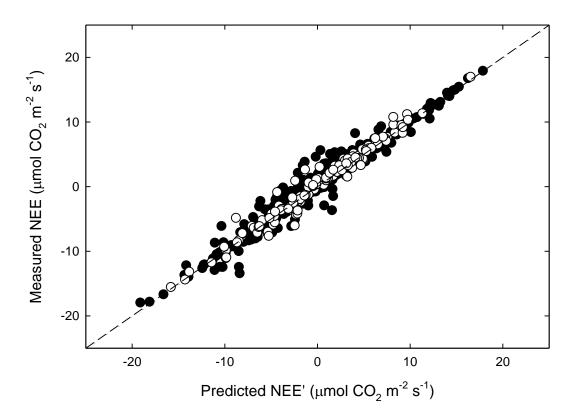
We used 30 individual measurements per treatment and period, adding a total of 720 observations over the growing season, and their corresponding air temperature and PAR values. Model-fitted parameters were  $A_{max}$  (rate of light-saturated photosynthesis;  $\mu$ mol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup>), Ks (half-saturation constant;  $\mu$ mol photons m<sup>-2</sup> s<sup>-1</sup>),  $R_b$  (basal ecosystem respiration;  $\mu$ mol  $CO_2$  m<sup>-2</sup> s<sup>-1</sup>), and  $\beta$  (sensitivity of  $R_{eco}$  to changes in air temperature;  $1/{}^{o}C$ ) (Fig. 12; Table VI).

Treatment- and period- specific model-fitted parameters were used to simulate the NEE and  $R_{\text{eco}}$  within each treatment and to predict NEE and  $R_{\text{eco}}$  for the reminder of the data set (Fig. 18).

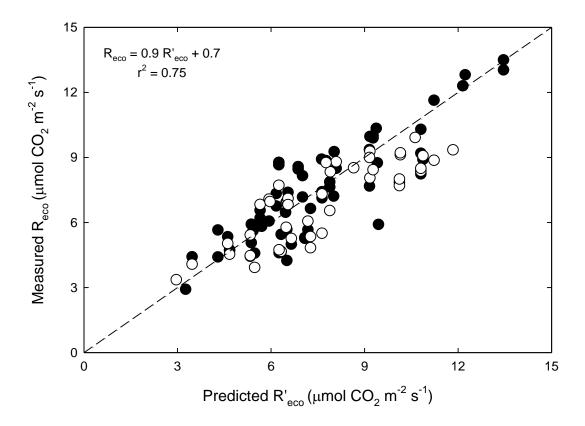


**Figure 18:** Mean daily records of (a) PPFD (μmol photon  $m^{-2}$  s<sup>-1</sup>) and  $T_{air}$  (°C), and (b) daily estimates of GPP, (c)  $R_{eco}$  and (d) NEE (gCO<sub>2</sub>-C  $m^{-2}$  d<sup>-1</sup>) at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season. Daily NEE values are PIRT model estimates (Williams et al., 2006). Daily GPP corresponds to the photosynthetic irradiance-response term of the PIRT model fitted to site- and period-specific  $A_{max}$  and  $K_s$  estimates (n=5), and hourly PAR records (Fig. 12; Table VI). Daily  $R_{eco}$  corresponds to the temperature-response term of the PIRT model fitted to site-specific  $R_b$  and β estimates, and hourly  $T_{air}$  records (n=5) (Table VI). Daily flux estimates correspond to the sum of hourly values over each day.

Model performance was evaluated by regressing observed vs. modelled values of NEE and  $R_{eco}$  based on  $r^2$ , RMSE, and slope and intercept deviations from the 1:1 line considering the entire data set within each treatment, and randomly selected measurements excluded from model parameterizations (Figs. 19 and 20; Table VI).



**Figure 19:** Validation of modelled net ecosystem exchange (NEE'). Measured NEE versus modelled NEE' for all plot measurements (closed symbol), and for one randomly selected measurement per plot and period not included in the model parameterization (open symbol). Statistics of the fit are shown in Table VI. The dashed line represents the ideal relationship (slope=1, intercept=0).



**Figure 20:** Validation of modelled ecosystem respiration ( $R'_{eco}$ ). Measured  $R_{eco}$  versus modelled  $R'_{eco}$  for all plot measurements (closed symbol), and for one randomly selected measurement per plot and period not included in the model parameterization (open symbol). The dashed line represents the ideal relationship (slope=1, intercept=0).

Model-fitted parameters were similar to those reported for moist acidic tundra in the proximities of the area of study. Mean A<sub>max</sub> and Ks values at our Ambient and treatment plots ranged within values reported by Williams et al., (2006) across the area of study (6.6–30.0 µmol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup> and 281–1000 μmol PAR m<sup>-2</sup> s<sup>-1</sup> respectively) (Table VI). Accordingly, peak season values of quantum efficiency (E<sub>0</sub>; Eq. 3.3) ranged between 0.031–0.035 µmol CO<sub>2</sub> µmol<sup>-1</sup> PAR across our Ambient and treatment plots, agreeing with those reported for Alaskan tussock tundra (0.035 μmol CO<sub>2</sub> μmol<sup>-1</sup> PAR; Shaver et al., 2007; Street et al., 2007). Mean R<sub>b</sub> at RS, Ambient and MS plots were consistent with values reported for moist acidic tundra (0.25–1.98 µmol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>; Williams et al., 2006; Shaver et al., 2007), whereas HS showed values within those observed in sedge-dominated areas (0.1–0.6 μmol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>; Williams et al., 2006; Shaver et al., 2007) (Table VI). Similarly, model-fitted respiration-temperature coefficients (β) under Reduced snow (RS), Ambient and Medium Snow addition (MS) conditions ranged within values expected for moist acidic tundra (0.01–0.09; Williams et al., 2006; Shaver et al., 2007) but increased with High Snow additions (HS) to values similar to those reported for wet-sedge areas (0.08–0.189; Williams et al., 2006; Shaver et al., 2007) (Table VI).

3.9.2 Leaf Area Index – dependent model for Gross Primary Productivity. Evaluation of modelled GPP'

Daily GPP was estimated by applying the photosynthetic irradiance-response term from the PIRT model to daily treatment-specific  $A_{max}$  and Ks. However, while phonologic development is inherently integrated within the seasonal variation of these model-fitted parameters, considerations of seasonal patterns of gross productivity are indirect in this approach. In addition, GPP is a variable estimated from the direct determination of NEE and  $R_{eco}$ , direct validations being therefore impossible.

Therefore, to gauge confidence in our GPP predictions we applied an alternative model to estimate GPP' using an adaptation of the aggregated canopy photosynthesis model that considers the hyperbolic photosynthesis-light equation at the leaf level and light extinction through the canopy to integrate the seasonality of plant development (Shaver *et al.*, 2007; Ives *et al.*, 2013; Sharp *et al.*, 2013).

(Eq. S3.2) 
$$GPP' = \frac{Amax_L}{k} \times Ln \frac{Amax_L + (E_0 \times PAR)}{Amax_L + (E_0 \times PAR) \times e^{-k \times LAI_{Eff}}}$$

where  $Amax_L$  is the light-saturated photosynthetic rate per unit of leaf area ( $\mu$ mol CO<sub>2</sub> m<sup>-2</sup> leaf s<sup>-1</sup>), k is the Beer's law light extinction coefficient (m<sup>-2</sup> ground m<sup>-2</sup> leaf),  $E_0$  is the initial slope of the light response curve ( $\mu$ mol CO<sub>2</sub>  $\mu$ mol<sup>-1</sup> photons), PAR is the light level at the top of the canopy, and  $LAI_{Eff}$  is the effective leaf area index (m<sup>2</sup> leaf m<sup>-2</sup> ground).

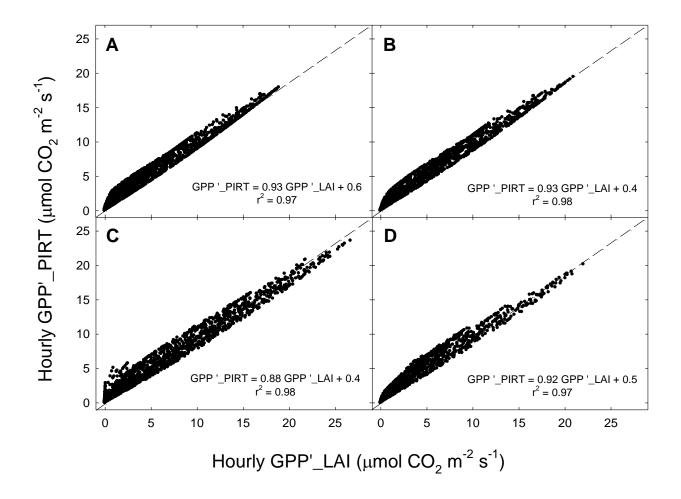
Treatment- and period- specific  $LAI_{Eff}$  was estimated from the linear relationship between leaf area index and GPP<sub>600</sub> described by Street et al. (2007) for moist acidic tussock tundra in the proximities of our experimental site, and  $Amax_L$  was calculated as the light-saturated photosynthetic rate per unit of effective leaf area index:

(Eq. S3.3) 
$$Amax_L = \frac{Amax}{LAI_{Eff}}$$

Estimated values of  $LAI_{Eff}$  at our Ambient plots (1.2±0.1 m<sup>2</sup> m<sup>-2</sup>) were within the range expected for moist acidic tundra with similar vegetation cover and equivalent phonologic development (0.8–1.2 m<sup>2</sup> m<sup>-2</sup>; Street *et al.*, 2007), and increased at MS (2.3±0.2 m<sup>2</sup> m<sup>-2</sup>) to values comparable to those in response to experimental fertilization (2.2–2.8 m<sup>2</sup> m<sup>-2</sup>; Street *et al.*, 2007). This is consistent with observed increases in the area cover of deciduous shrubs. Similarly,  $Amax_L$  across our Ambient and treatment plots (19.2±0.1  $\mu$ mol CO<sub>2</sub> m<sup>-2</sup> leaf s<sup>-1</sup>) agreed well with those reported for tussock-dominated tundra in the vicinities of Toolik Lake (19.8  $\mu$ mol CO<sub>2</sub> m<sup>-2</sup> leaf s<sup>-1</sup>; Shaver *et al.*, 2007).

Regression of PIRT against LAI-dependent model predictions showed a strong agreement of in hourly GPP' estimates for all treatments, suggesting that the photosynthetic irradiance-response term of the PIRT model was a useful tool for interpolating GPP, and that the interpolation of period-specific parameterizations successfully integrated seasonality in our model outputs (Fig. 21).

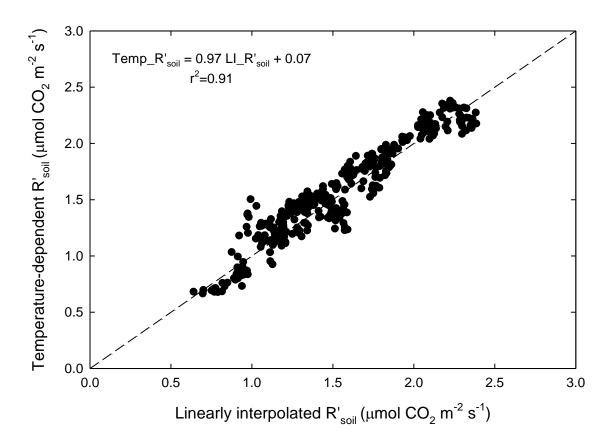
While the LAI-dependent approach integrates unquantified parameters that are likely to affect photosynthesis (e.g. leaf nitrogen concentrations, stomatal conductance), it may create circularity in the parameters used and the model output. Therefore, reported daily GPP' and GPP seasonal budgets at our Ambient and treatment plots were estimated from PIRT model outputs, using the LAI-dependent model for validation purposes only.



**Figure 21:** Evaluation of modelled Gross Primary Productivity (GPP'). Linear regression of hourly GPP' predicted by the photosynthetic irradiance-response term of the PIRT model against hourly GPP' predicted by the LAI-dependent model for (a) Reduced Snow (RS), (b) Ambient, (c) Medium Snow addition (MS), and (d) High Snow addition (HS) treatments. Regressions were significant (P<0.05), and the slope and intercept terms were not significantly different from 1 and 0 respectively for all treatments and Ambient plots. Dashed lines represent ideal relationships (slope=1, intercept=0).

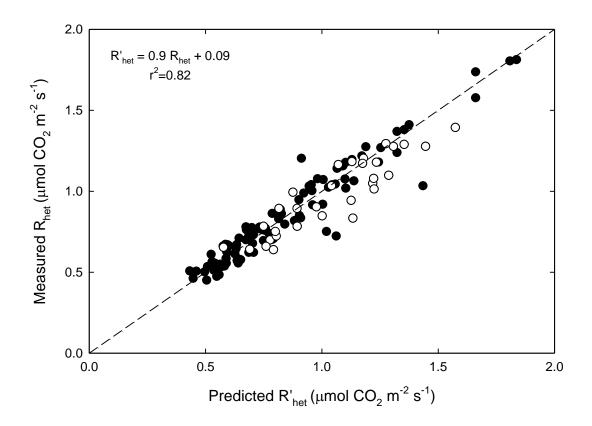
#### 3.9.3 Evaluation of model estimates of seasonal soil and heterotrophic respiration

To evaluate the robustness of daily soil respiration estimates ( $R'_{soil}$ ), we applied both linear interpolation and temperature sensitivity gap filling methods of  $R_{soil}$ . Results from treatment-specific temperature-dependent functions showed good agreement with linearly interpolated values of  $R'_{soil}$  ( $r^2$ =0.92; P<0.0001) (Fig 22).



**Figure 22:** Evaluation of modelled daily soil respiration ( $R'_{soil}$ ). Linear regression of daily  $R'_{soil}$  predicted by soil temperature dependent functions against daily  $R'_{soil}$  predicted by linear interpolation. Regression was significant (P<0.05), and the slope and intercept terms were not significantly different from 1 and 0 respectively. The dashed line represents ideal relationships (slope=1, intercept=0).

We used treatment-specific model parameters ( $R_0$  and  $\phi$ ) to predict daily  $R_{het}$  ( $R'_{het}$ ) for point measurements not included in parameter determinations. The strong robustness of predicted values indicated that the gap filling methods applied were successful in interpolating daily values (Slope 0.98±0.08, Intercept 0.09±0.08;  $r^2$ =0.82; Fig. 23).



**Figure 23:** Validation of modelled heterotrophic respiration (R'<sub>het</sub>). Measured versus modelled heterotrophic respiration for all plot measurements (closed symbol), and for two randomly selected measurements per plot and period not included in model parameterizations (open symbol). Statistics of the fit are shown in Table VIII. The dashed line represents the ideal relationship (slope=1, intercept=0).

#### 3.9.4 Supplementary information. Cited literature

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### 4. WINTER PRECIPITATION AND SNOW ACCUMULATION DRIVE THE METHANE SINK OR SOURCE STRENGTH OF ARCTIC TUSSOCK TUNDRA

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#### 4.1 ABSTRACT

Arctic winter precipitation is projected to increase with global warming, but some areas will experience decreased snow accumulation. Although Arctic CH<sub>4</sub> emissions may represent a significant climate forcing feedback, long-term impacts of changes in snow accumulation on CH<sub>4</sub> fluxes remain uncertain. We measured ecosystem fluxes, and soil CH<sub>4</sub> and CO<sub>2</sub> concentration and <sup>13</sup>C composition to investigate changes in emission and the predominant metabolic pathways and transport mechanisms driving moist acidic tundra CH<sub>4</sub> fluxes over the growing season (Jun-Aug) after 18 years of experimental snow depth increases and decreases. Deeper snow promoted soil wetness and warming, which reduced soil %O<sub>2</sub> saturation and increased thaw depth. Soil moisture, through changes in soil %O<sub>2</sub>, determined predominance of methanotrophy or methanogenesis, with soil temperature regulating the ecosystem CH<sub>4</sub> sink or source strength. Reduced snow (RS) increased the fraction of oxidized CH<sub>4</sub> (F<sub>ox</sub>) by 75–120% compared to Ambient, switching the system from a small source to a net CH<sub>4</sub> sink (21±2 and –  $31\pm1$  mg CH<sub>4</sub> m<sup>-2</sup> season<sup>-1</sup> at Ambient and RS). Deeper snow reduced F<sub>ox</sub> by 35–40% and 90– 100% in medium- (MS) and high- (HS) snow additions relative to Ambient, largely contributing to increased CH<sub>4</sub> source strength (464±15 and 3,561±97 mg CH<sub>4</sub> m<sup>-2</sup> season<sup>-1</sup> at MS and HS). Decreases in F<sub>ox</sub> with deeper snow were partly explained by increased plant-mediated CH<sub>4</sub> transport associated with the expansion of tall graminoids. Deeper snow stimulated CH<sub>4</sub>

production within newly thawed soils responding mainly to warming rather than to increases in acetate fermentation expected with thaw-induced increases in SOC availability. Our results suggest that increased winter precipitation will increase the CH<sub>4</sub> source strength of Arctic tundra, but the resulting positive feedback on climate change will depend on the balance between areas with more or less snow accumulation than they are currently facing.

#### **4.2 Introduction**

In a changing climate, Arctic warming and associated precipitation increases may largely exceed global trends (Kattsov & Walsh, 2000; Miller *et al.*, 2010; Christensen *et al.*, 2013; Cohen *et al.*, 2014). Because Arctic regions contain up to 50% of the global soil organic carbon (SOC) within frozen soils (permafrost), climate change may induce soil C losses as CO<sub>2</sub> and CH<sub>4</sub> causing a positive feedback on permafrost degradation and climate change (Hugelius *et al.*, 2014; Ping *et al.*, 2014; Schaefer *et al.*, 2014). While the vulnerabilities of Arctic SOC to rising temperatures are identified (Schuur *et al.*, 2013, 2015), the sensitivity of ecosystem C dynamics to changes in precipitation has only recently been appraised (Hicks Pries *et al.*, 2013; Sharp *et al.*, 2013; Carvalhais *et al.*, 2014).

Climate models robustly predict 25–50% more precipitation globally in Arctic regions by the end of the century, mostly as fall and winter snow (Kattsov *et al.*, 2005; Zhang *et al.*, 2013; Bintanja & Selten, 2014). However, subject to regional and local heterogeneity in winter precipitation and snow accumulation, some areas will experience snow accumulations beyond predictions or reduced below current values across the Arctic region (Callaghan *et al.*, 2011; Stocker *et al.*, 2013a). Changes in winter precipitation strongly influence soil hydrological and thermal conditions (Fan *et al.*, 2011; Subin *et al.*, 2013; Zhang *et al.*, 2013), with cascading effects on permafrost degradation (Osterkamp, 2007; Johansson *et al.*, 2013), soil C and N

mineralization (Schimel *et al.*, 2004), and associated changes in plant community composition (Fig. 1) (Elmendorf *et al.*, 2012; Tape *et al.*, 2012). Moreover, derived changes in microrelief and vegetation cover could further alter snow accumulation locally (Liston *et al.*, 2002; Seppälä, 2011; Johansson *et al.*, 2013), triggering a feedback loop that amplifies the impacts of changes in snow accumulation over time (Fig. 1) (Sturm *et al.*, 2005; Osterkamp *et al.*, 2009). These effects combine to influence the magnitude and timing of C fluxes from Arctic ecosystems (Fig. 1). However, research on the effects of changes in Arctic winter precipitation has primarily focused on CO<sub>2</sub> rather than CH<sub>4</sub> fluxes, leaving a large portion of the C cycle climate feedback unresolved (Elberling, 2007; Morgner *et al.*, 2010; Nowinski *et al.*, 2010; Lupascu *et al.*, 2014a, 2014b, 2014c; Schuur *et al.*, 2015).

Current models estimate that CH<sub>4</sub> emissions will be responsible for 20–30% of the radiative forcing from Arctic regions over the course of this century (Schneider von Deimling *et al.*, 2012; Myhre *et al.*, 2013; Deng *et al.*, 2014). At present, Arctic tundra contributes to about 45% of all Arctic CH<sub>4</sub> sources and 7% of global CH<sub>4</sub> emissions (McGuire *et al.*, 2012; Kirschke *et al.*, 2013; Turner *et al.*, 2015). Changes in CH<sub>4</sub> emissions from Arctic tundra could substantially alter climate forcing feedbacks from the Arctic region.

Changes in snow fall and accumulation influence CH<sub>4</sub> emissions in Arctic tundra through complex controls on CH<sub>4</sub> production (methanogenesis), oxidation (methanotrophy), and transport, all processes intimately linked to soil hydrology, temperature, and substrate availability (Elberling *et al.*, 2008; Chowdhury & Dick, 2013; Treat *et al.*, 2014, 2015). Limited drainage of permafrost soils increases soil wetness upon snowmelt, altering the zonation of prevalent methanogenesis and methanotrophy and hence the potential of the ecosystem to produce and oxidize CH<sub>4</sub>. Increased soil water content also favors heat transfer within the soil

column (Lunardini, 1991; Romanovsky & Osterkamp, 2000; Subin *et al.*, 2013) with synergistic effects on CH<sub>4</sub> production, as warmer soils may promote both metabolic activity (Wallenstein *et al.*, 2009; Inglett *et al.*, 2012; Tveit *et al.*, 2015) and permafrost thaw, exposing previously frozen SOC to methanogens (Fig. 1) (McCalley *et al.*, 2014). In addition, transitions in dominant vegetation associated with changes in snow accumulation may further alter SOC quality and availability through changes in root exudation and litter inputs (Fig. 1) (Ström *et al.*, 2003, 2012; Dorrepaal *et al.*, 2005). Understanding how long-term changes in winter precipitation affect CH<sub>4</sub> dynamics in Arctic tundra is therefore critical for accurate predictions of the fate of permafrost SOC and climate forcing from the Arctic region.

Methanogens utilize two major metabolic pathways, acetate fermentation and CO<sub>2</sub> reduction. Acetate is the main substrate under anaerobic conditions accounting for up to 70% of the produced CH<sub>4</sub>, and is generally associated with decomposition of relatively labile SOC (Avery *et al.*, 2003; Metje & Frenzel, 2007). Thus, vegetation- and permafrost thaw- induced changes in substrate availability and decomposability could greatly alter CH<sub>4</sub> production and emission (Hodgkins *et al.*, 2014; McCalley *et al.*, 2014). Moreover, shifts in plant communities may further influence net ecosystem CH<sub>4</sub> uptake or emission by influencing gas diffusivity, promoting both rhizospheric CH<sub>4</sub> oxidation by the oxygenation of shallow horizons, and CH<sub>4</sub> efflux through plant mediated transport (Kelker & Chanton, 1997; King *et al.*, 1998; Ström *et al.*, 2005).

The carbon isotopic composition of CH<sub>4</sub> and CO<sub>2</sub> in pore water and surface emissions provides insight into ecosystem CH<sub>4</sub> dynamics, as  $\delta^{13}$ C-CH<sub>4</sub> and  $\delta^{13}$ C-CO<sub>2</sub> values integrate the effects of CH<sub>4</sub> production, oxidation and transport (Whiticar & Faber, 1986; Chanton *et al.*, 1992; Hornibrook *et al.*, 1997). While the intricacy of these codependent processes makes it

difficult to estimate the absolute magnitude of each process, shifts in the  $\delta^{13}$ C and distribution of co-existing CO<sub>2</sub> and CH<sub>4</sub> within the soil profile and emissions reflect changes in the relative predominance of the metabolic pathways and transport mechanisms contributing to ecosystem CH<sub>4</sub> fluxes (Corbett *et al.*, 2013; Throckmorton *et al.*, 2015).

The objective of this study was to determine the long-term effect of projected changes in snow accumulation (increase and decrease) on ecosystem CH<sub>4</sub> fluxes in moist acidic tundra, which represents over 25% of the Alaskan Arctic and globally over 15% of the circum-Arctic vegetated landscapes (Walker et al., 2005). We combined  $\delta^{13}$ C-CH<sub>4</sub> and  $\delta^{13}$ C-CO<sub>2</sub> measurements from the soil profile and ecosystem fluxes to evaluate changes CH<sub>4</sub> production, oxidation and transport through the soil column in response to 18 years of snow depth increase and decrease predicted by climate models. We coupled alterations of the soil climate and vegetation cover to shifts in the predominant metabolic and transport pathways to further investigate the control mechanisms ultimately driving changes in ecosystem CH<sub>4</sub> fluxes. We hypothesized that increases in snow accumulation would result in wetter and warmer soils, greater thaw depth and increases in the relative abundance of shrubs and tall sedges. We predicted that wetter and warmer soils would lead to increases of CH<sub>4</sub> production and would suppress CH<sub>4</sub> oxidation, overall increasing ecosystem CH<sub>4</sub> emissions. We further predicted that increases in ecosystem CH<sub>4</sub> emissions would be partly fueled by increases in the relative contribution of acetate fermentation to CH<sub>4</sub> production as a result of vegetation- and thawinduced increases in substrate availability, and by increases in plant mediated transport associated to increases in the relative abundance of tall graminoids.

## **4.3 METHODS**

### 4.3.1 Site description

The experimental site is located in moist acidic tussock tundra near Toolik Lake (68°38'N, 149°38'W; 760 m) at the Long Term Ecological Research Site in the northern foothills of the Brooks Range, Alaska (Fig. 2) (Jones *et al.*, 1998; Welker *et al.*, 2000; Pattison & Welker, 2014). Mean annual air temperature is  $-8^{\circ}$ C, with summer temperatures averaging 10.5°C. The soil active layer typically reaches a maximum thaw depth of 45–50 cm by late August (Welker, Arctic LTER). Annual precipitation is around 350 mm, 50% of which falls as snow (Deslippe & Simard, 2011). Winter snow accumulation is 45–80 cm, and the area becomes snow-free by late-May setting the beginning of the growing season. Soils are classified as coarse-loamy, mixed, acidic, Ruptic-Histic Pergelic Cryaquept (Romanovsky et al., 2011). Soils in the area are generally poorly drained, with shallow organic horizons (10–15cm; 20–45 %C) grading into increasingly mineral horizons at depth within the active layer (1–3 %C; Ping *et al.*, 1997). Vegetation is dominated by tussock forming sedges (*Eriophorum vaginatum*), and interspaced shrubs (*Betula nana*, *Salix pulchra*) and mosses (*Sphagnum sp.*) characteristic of moist acidic tundra across the Alaskan North Slope (Walker *et al.*, 1994; Wahren *et al.*, 2005).

#### 4.3.2 Experimental design

The experimental setup consists of a 2.8 x 60 m snow fence erected in 1994 perpendicular to prevailing winter winds to create a snow drift that extends 60 m downwind. In 2012, 4 plots were established in each of the following distinct snow accumulation regimes (n=4): i) ambient snow accumulation (Ambient), ii) Medium Snow addition (MS) with 20–45% more snow than Ambient, iii) High Snow addition (HS) with snow increase 70–100% over Ambient, and iv) Reduced Snow (RS) with 15–30% less snow than Ambient (Jones *et al.*, 1998;

Walker *et al.*, 1999; Pattison & Welker, 2014). After 18 years, snow addition treatments showed soil consolidation consistent with first stages of thermokarst development (*see* Chapter 2).

Measurements and samples were taken concurrently from permanently installed boardwalks, at biweekly intervals during the growing season (May 30 to Aug 31, 2012). At each sampling period, measurements were taken between 10am and 3pm over four days, and plot order was randomized during the sampling.

### 4.3.3 Soil environmental variables

Soil temperature at 10, 20, 35 and 50 cm depth was measured in each plot using a portable profile temperature probe (OMEGA Engineering Inc., CT, USA). Volumetric water content (VWC; 12-cm depth-integrated) was measured with a soil moisture meter (HydroSense II, Campbell Scientific Inc., UT, USA). Thaw depth (thickness of unfrozen ground) was monitored using a metal depth rod. Replicates (n=4) are averaged values of 8 pseudo-replicates per plot.

### 4.3.4 Vegetation cover characterization

Vegetation cover was characterized at each treatment (n=5) with a 100-point 0.7 x 0.7 m frame following methods described by Walker (1996). Plant species were recorded for each point measurement providing relative % cover and grouped according to growth form. Vegetation characterization was conducted at peak season, between late July (RS, Ambient and MS treatments) and early August (HS treatment).

# 4.3.5 Soil sampling and $\delta^{13}C$ determination

Soil cores (5 cm diameter) to the frost table (depth to the thawing front) were collected in mid-August at all treatments (n=5). Cores were sectioned into 2-cm depth intervals and kept frozen at  $-20^{\circ}$ C for the later determination of C isotopic composition ( $\delta^{13}$ C-OM) using a continuous flow ThermoFinnigan Delta Plus XL equipped with Conflo III, and zero-blank Elemental Analyzer (Costech Analytical, ECS 4010).

### 4.3.6 Ecosystem CH<sub>4</sub> flux measurements

At each plot, ecosystem CH<sub>4</sub> fluxes and  $\delta^{13}$ C values were measured using the static chamber approach (Bubier et al., 1995) with a 25-cm-diameter PVC collars inserted 15 cm into the soil (average depth to the mineral horizon) (n=4). Collar insertion had no effect on plant development, species composition, or soil moisture or temperature, and provided a gas-tight chamber-soil system. From each chamber, five gas samples were taken at 15-min intervals over a 75-min period and analyzed for CH<sub>4</sub> and CO<sub>2</sub> concentrations (pCH<sub>4</sub>, pCO<sub>2</sub>) and δ<sup>13</sup>C-CH<sub>4</sub> and δ<sup>13</sup>C-CO<sub>2</sub> within 4–6 hr after collection using a Picarro G2201-*i* cavity ring-down spectrometer (CRDS) (Supp. Info. 4.9.1). A standard mix of 2.5 ppm CH<sub>4</sub> ( $\delta^{13}$ C-CH<sub>4</sub> = -40.2 %) and 396 ppm  $CO_2$  ( $\delta^{13}C$ - $CO_2 = -35.7$  %) was run every five samples to account for instrument drift. The accuracy for pCH<sub>4</sub> and  $\delta^{13}$ C-CH<sub>4</sub> was better than 90 ppb and 0.1%. The accuracy of pCO<sub>2</sub> and δ<sup>13</sup>C-CO<sub>2</sub> was better than 1ppm and 0.06 ‰. Ecosystem CH<sub>4</sub> flux was calculated as the slope of the linear regression of pCH<sub>4</sub> versus time. The  $\delta^{13}$ C value of emitted CH<sub>4</sub> ( $\delta_{eco}$ ) was calculated as the intercept of  $\delta^{13}$ C-CH<sub>4</sub> against the inverse of pCH<sub>4</sub> in the chamber headspace over time (Keeling, 1958; Chanton et al., 2008a). Slopes with correlation coefficients below 0.9 (P<0.05; n=5) were rejected (< 5% of data).

$$(Eq. \ 4.1) \qquad \qquad \delta_{eco} = \left[ (\delta_{(f)} \cdot pCH_{4\ (f)}) - (\delta_{(i)} \cdot pCH_{4\ (i)}) \right] / pCH_{4\ (f)} - pCH_{4\ (i)}$$

### 4.3.7 Soil gas concentration and carbon isotopic composition

Soil interstitial gas and pore water were collected from soil probes progressively installed at each plot at 10, 20, 35 and 50-cm depth as the thaw depth increased over the growing season. Two samples were taken at each depth, plot and sampling period, and values were averaged for a total of 4 replicates per treatment, depth and period. All samples were analyzed within 4–6 hr after collection for the direct determination of pCH<sub>4</sub>, pCO<sub>2</sub>, δ<sup>13</sup>C-CH<sub>4</sub> and δ<sup>13</sup>C-CO<sub>2</sub> using a Picarro G2201-*i* CRDS (*Supp. Info.* 4.9.1). The percent saturation of O<sub>2</sub> (%O<sub>2</sub>) was determined using a fiber-optic oxygen meter on 20mL sample aliquots (Firesting O<sub>2</sub>; Pyroscience, Germany). Dissolved gas concentrations were calculated by applying Henry's Law and the solubility coefficient for O<sub>2</sub>, CH<sub>4</sub> and CO<sub>2</sub> considering the temperature and atmospheric pressure at the depth and time of collection (Sander, 1999). Values from non-water-saturated zones correspond to the calculated dissolved concentration in equilibrium with measured concentrations in the air-filled space (Sander, 1999; Whalen & Reeburgh, 2000).

# 4.3.8 Apparent carbon isotope fractionation

At each plot, depth and sampling period, values of coexisting  $\delta^{13}$ C-CH<sub>4</sub> and  $\delta^{13}$ C-CO<sub>2</sub> from soil interstitial gas and pore water were used to calculate the apparent C isotope fractionation factor ( $\alpha_C$ ) using the following equation (Whiticar *et al.*, 1986):

(Eq. 4.2) 
$$\alpha_C = (\delta^{13}C\text{-}CO_2 + 1000) / (\delta^{13}C\text{-}CH_4 + 1000)$$

where  $\alpha_C$  represents the magnitude of the kinetic isotopic separation effects between CO<sub>2</sub> and CH<sub>4</sub> during methanogenesis (Whiticar *et al.*, 1986). Values of  $\alpha_C$  are indicative of the relative

predominance of acetate fermentation versus  $CO_2$  reduction methanogenic pathways, which are responsible for 95% of total  $CH_4$  produced (Segers, 1998; Chowdhury & Dick, 2013). Lines of constant  $\alpha_C$  delineate regions of predominant acetate fermentation ( $\alpha_C \sim 1.040$  to 1.055) or  $CO_2$  reduction ( $\alpha_C \sim 1.055$  to 1.090) (Whiticar *et al.*, 1986). Conversely, methanotrophy is associated with a gradual enrichment of residual  $\delta^{13}$ C- $CH_4$ , yielding lower  $\alpha_C$  in zones with prevailing oxidation ( $\alpha_C \sim 1.005$  to 1.03; Barker & Fritz, 1981; Whiticar & Faber, 1986).  $\alpha_C$  values reflect the combined isotope fractionation effects of methanogenesis, methanotrophy and  $CH_4$  transport. Therefore,  $\alpha_C$  is used as an indication of the predominant metabolic process in response to treatment rather than a measure of the absolute contribution of each individual process.

### 4.3.9 Fraction of oxidized CH<sub>4</sub>

The fraction of oxidized CH<sub>4</sub> (F<sub>ox</sub>; CH<sub>4</sub> oxidation efficiency) was estimated from the  $\delta^{13}$ C value of emitted CH<sub>4</sub> and the  $\delta^{13}$ C value of dissolved CH<sub>4</sub> sampled in pore water at the production zone using an isotope mass balance approach (Liptay *et al.*, 1998).

(Eq. 4.3) 
$$F_{ox} = (\delta_{eco} - \delta_{anox}) / [(\alpha_{ox} - \alpha_{trans}) \cdot 1000]$$

where  $\delta_{eco}$  is the  $\delta^{13}C$  value of emitted CH<sub>4</sub> (Eq. 4.1),  $\delta_{anox}$  is the  $\delta^{13}C$  value of dissolved CH<sub>4</sub> at the production zone,  $\alpha_{ox}$  is the isotopic fractionation for CH<sub>4</sub> oxidation, and  $\alpha_{trans}$  is the isotope fractionation for diffusive soil/plant transport of CH<sub>4</sub>.

This approach considers the soil profile as an open system, where deep horizons dominate  $CH_4$  production and assumes no significant methanogenic pathway shift along the soil profile. A shift from  $CO_2$  reduction to acetate fermentation up the soil profile would enrich the  $\delta^{13}C$  of produced  $CH_4$ , overestimating  $F_{ox}$ . While we observed a depth effect in the distribution of dominant methanogenic pathways (Fig. 32), more than 80% of the produced  $CH_4$  originated

below 35 cm predominantly by  $CO_2$  reduction across all treatments and sampling periods (Figs. 32 and 33). Therefore, our data indicates this is a reasonable assumption within the constraints of the  $F_{ox}$  model.

Because CH<sub>4</sub> isotope fractionation during oxidation and transport near the frost table has been shown to be negligible (Popp *et al.*, 1999; Hines *et al.*, 2008),  $\delta_{anox}$  is approximated to the  $\delta^{13}$ C-CH<sub>4</sub> value at the bottom of the thawed soil layer.  $\alpha_{ox}$  was determined at plots with net ecosystem CH<sub>4</sub> oxidation. Temperature corrections were made to estimate period- and treatment-specific  $\alpha_{ox}$  accounting for the temperature sensitivity of the fractionation factor (*Supp. Info.* 4.9.2; King *et al.*, 1989; Chanton *et al.*, 2008b).

The  $\alpha_{trans}$  coefficient is contingent upon the transport mechanism dominating upward transport of CH<sub>4</sub> through the soil profile. Transport of CH<sub>4</sub> may occur via non-fractionating mechanisms (i.e. diffusion through water-saturated soils, plant-mediated transport or ebullition), or via fractionating mechanisms (i.e. molecular diffusion within the plant aerenchyma or through unsaturated soils) (Chanton *et al.*, 1992; Chanton, 2005). Near water-saturation conditions across our study site (VWC=0.70–1.12 cm<sup>3</sup> cm<sup>-3</sup>) suggest the predominance of non-fractionating transport mechanisms through the soil column (Preuss *et al.*, 2013). However, plant-mediated transport may account for a substantial portion of emitted CH<sub>4</sub> (King *et al.*, 1998) yielding depleted  $\delta_{eco}$ , and hence, underestimating  $F_{ox}$ . A sensitivity analysis on estimates of  $F_{ox}$  considering predominant non-fractionating ( $\alpha_{trans}$  = 1.0013; Chasar *et al.*, 2000; Teh *et al.*, 2005; Preuss *et al.*, 2013) and predominant fractionating transport mechanisms ( $\alpha_{trans}$  = 1.012; Chanton *et al.*, 1992) showed that changes in  $\alpha_{trans}$  alter  $F_{ox}$  by 17.2% across treatments. Therefore, the reported  $F_{ox}$  values incorporate this uncertainty as in Chanton *et al.*, (2011).

## 4.3.10 Methane produced, oxidized and transported within the soil column

At each treatment and sampling period, the CH<sub>4</sub> produced within the soil column was estimated as in Corbett *et al.* (2013). Assuming that both methanogenic pathways produce an equimolar amount of CO<sub>2</sub> and CH<sub>4</sub> as expected from the decomposition of cellulose or hemicellulose (Chanton *et al.*, 2004), we can estimate the  $\delta^{13}$ C-CO<sub>2</sub> derived from methanogenesis ( $\delta^{13}$ C-CO<sub>2</sub>-meth) as follows (Corbett *et al.*, 2013):

(Eq. 4.4) 
$$\delta^{13}\text{C-OM} = \frac{1}{2} (\delta^{13}\text{C-CH}_4) + \frac{1}{2} (\delta^{13}\text{C-CO}_2\text{-meth})$$

where  $\delta^{13}$ C-OM is the  $\delta^{13}$ C of the starting organic matter and  $\delta^{13}$ C-CH<sub>4</sub> is the  $\delta^{13}$ C of pore water dissolved CH<sub>4</sub>. This approach assumes that measured  $\delta^{13}$ C-CH<sub>4</sub> approximate that of produced CH<sub>4</sub>. This assumption implies negligible contribution of CO<sub>2</sub> from CH<sub>4</sub> oxidation, and that the upward transport of CH<sub>4</sub> is dominated by non-fractionating mechanisms. In our study site, the profile distribution of pCH<sub>4</sub>, %O<sub>2</sub> and  $\alpha_C$  values suggest minimal oxidation at depth (Figs. 28, 30, 32) (Popp *et al.*, 1999). However,  $\alpha_C$  values reveal substantial oxidation and shallow depths, especially at RS and Ambient plots (Fig. 32b). We estimated the potential error introduced from contributions of oxidized CH<sub>4</sub> to shallow pCO<sub>2</sub> to be negligible (*Supp. Info.* 4.9.3). While plant-mediated transport may potentially result in substantial contributions to ecosystem CH<sub>4</sub> emissions, associated fractionation is primarily attributed to diffusion processes within the plant aerenchyma rather than to root uptake in the rhizosphere (Chanton, 2005; Throckmorton *et al.*, 2015). Therefore, we considered that diffusion through water and bulk flow (plant mediated and ebullition) dominated transport mechanisms operating within the soil column, with negligible effects on belowground  $\delta^{13}$ C-CH<sub>4</sub>.

Methanogenesis, either by acetate fermentation or  $CO_2$  reduction, results in considerably enriched  $\delta^{13}C$ - $CO_2$  relative to  $\delta^{13}C$ -OM, but alternative decay processes (i.e. respiration and

fermentation) yield  $\delta^{13}$ C-CO<sub>2</sub> similar to  $\delta^{13}$ C-OM (Whiticar *et al.*, 1986; Zetsche *et al.*, 2011). Hence, we can calculate the fraction pCO<sub>2</sub> from methanogenesis (f CO<sub>2</sub>-meth) using the following mass balance equations (Corbett *et al.*, 2013):

(Eq. 4.5) 
$$\delta^{13}\text{C-CO}_2 = (\delta^{13}\text{C-OM} \times f \text{CO}_2\text{-OM}) + (\delta^{13}\text{C-CO}_2\text{-meth} \times f \text{CO}_2\text{-meth})$$

(Eq. 4.6) 
$$f \text{CO}_2\text{-OM} + f \text{CO}_2\text{-meth} = 1$$

where  $f \text{ CO}_2$ -meth is the fraction of  $\text{CO}_2$  from methanogenic pathways and  $f \text{ CO}_2$ -OM is the fraction derived from alternative decay processes of OM.

The amount of CO<sub>2</sub> formed from methanogenesis (CO<sub>2</sub>-meth) was determined using the following equation (Corbett *et al.*, 2013):

(Eq. 4.7) 
$$f CO_2$$
-meth x  $pCO_2 = CO_2$ -meth

Based on the equimolarity of CO<sub>2</sub> and CH<sub>4</sub> formed from methanogenesis, we assume equal amounts of CO<sub>2</sub>-meth and CH<sub>4</sub> (CH<sub>4</sub>-Prod). Differences between estimated CH<sub>4</sub>-Prod and observed pCH<sub>4</sub> at a given depth (CH<sub>4</sub>-Measured) reflects the fraction of CH<sub>4</sub> lost from the system (*f* CH<sub>4</sub>-Lost; Corbett *et al.*, 2013; Throckmorton *et al.*, 2015) by oxidation (CH<sub>4</sub>-Ox) or plant-mediated transport and/or ebullition (CH<sub>4</sub>-Trans):

(Eq. 4.8) 
$$f \text{ CH}_4\text{-Lost} = (\text{CH}_4\text{-Prod} - \text{CH}_4\text{-Measured}) / \text{CH}_4\text{-Prod}$$

Given that calculations of  $F_{ox}$  integrate the entire soil column, we estimated CH<sub>4</sub>-Ox within the soil column combining estimates of  $F_{ox}$  (Eq. 4.3) and CH<sub>4</sub>-Prod (Eq. 4.7). Differences between CH<sub>4</sub>-Lost and CH<sub>4</sub>-Ox will therefore provide a measure of the fraction of produced CH<sub>4</sub> lost by transport towards the atmosphere (f CH<sub>4</sub>-Trans).

(Eq. 4.9) 
$$CH_4$$
-Ox =  $F_{ox}$  x  $CH_4$ -Prod

(Eq. 
$$4.10$$
)  $CH_4$ -Trans =  $CH_4$ -Lost  $- CH_4$ -Ox

### (Eq. 4.11) $f \text{ CH}_4\text{-Trans} = \text{CH}_4\text{-Trans} / \text{CH}_4\text{-Prod}$

It should be noted that CH<sub>4</sub> production, oxidation and transport are codependent processes occurring simultaneously within the soil column. The fraction of CH<sub>4</sub> subject to each process is therefore uncertain. Hence, we reiterate that our goal was not to test the model or provide absolute values for CH<sub>4</sub> production, oxidation and transport, but to use it as a tool to identify the relative effect of changes in snow accumulation on the mechanisms affecting CH<sub>4</sub> dynamics.

## 4.3.11 Gross ecosystem CH<sub>4</sub> production and oxidation, and net ecosystem CH<sub>4</sub> flux

Gross ecosystem CH<sub>4</sub> production and oxidation over the growing season was calculated using the following equations (Teh *et al.*, 2005):

(Eq. 4.12) 
$$CH_{4 \text{ Prod}} = CH_{4 \text{ Net } x} 1/(1-F_{ox})$$

(Eq. 4.13) 
$$CH_{4 Ox} = CH_{4 Prod} - CH_{4 Net}$$

where CH<sub>4</sub> Net is the net ecosystem CH<sub>4</sub> flux (mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup>), CH<sub>4</sub> Prod is the gross ecosystem CH<sub>4</sub> production (mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup>), CH<sub>4</sub> Ox is the gross ecosystem CH<sub>4</sub> oxidation (mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup>), and F<sub>ox</sub> is the fraction of oxidized CH<sub>4</sub> (Eq. 4.3). Seasonal CH<sub>4</sub> Net, CH<sub>4</sub> Prod and CH<sub>4</sub> Ox were estimated from linear interpolation procedures between sampling periods over the growing season (Teh *et al.*, 2005, 2011).

### 4.3.12 Statistical analyses

Statistical analyses were performed using Statgraphics Centurion XVI software (Statistical Graphics Corp., MD, USA). Repeated measures analysis of variance were used to investigate the effect of snow treatment and sampling period and all interactions among these independent variables on soil environmental variables (i.e. soil moisture, temperature and

thawing depth), ecosystem CH<sub>4</sub> fluxes and  $\delta_{eco}$  with replicates (n=4) as a random effect. For seasonal and treatment effects on soil interstitial parameters ( $\%O_2$ , dissolved pCH<sub>4</sub>,  $\delta^{13}$ C-CH<sub>4</sub>,  $\delta^{13}$ C-CO<sub>2</sub>,  $\alpha_{\rm C}$ , and CH<sub>4</sub> production, oxidation and transport), depth was included as an additional fixed within treatment factor. Differences among treatments, within period and/or depth were examined with simple analysis of variance (ANOVA). We used the coefficient of determination (R<sup>2</sup>) from simple regression analyses to explore codependence between single variables. Separate analyses for each depth and/or treatment were used to evaluate changes in codependency with depth and/or treatment. Multiple regression analyses that included soil environmental parameters as independent variables and net ecosystem CH<sub>4</sub> flux, production and oxidation separately as dependent variables were used to assess the mechanisms driving CH<sub>4</sub> dynamics across treatments. Stepwise removal of independent variables based on changes in likelihood was used to evaluate individual contributions to the model. Paired t-tests were used to determine significant differences between  $\delta_{eco}$ ,  $\delta_{shallow}$  and  $\delta_{anox}$  within treatments. Data was transformed to ensure normality. A fixed integer was added to all CH<sub>4</sub> fluxes to make all values positive prior to transformations (Davidson et al., 2008). All seasonal means were calculated from linearly interpolated data and error propagation for seasonal averages and budgets were determined by linear interpolation of the variance as the main parameter representing the uncertainty associated with spatial heterogeneity (Davidson et al., 2008).

### 4.4 RESULTS

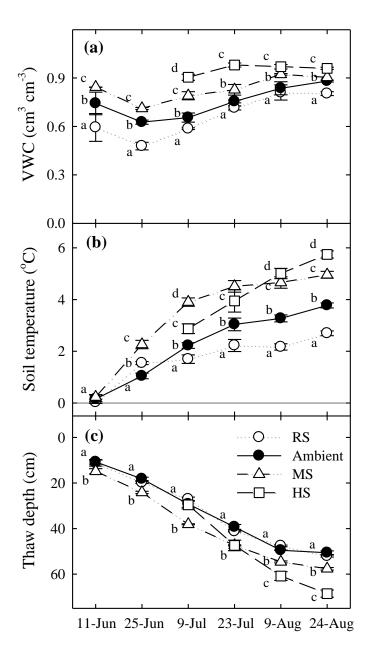
### 4.4.1 Soil environmental variables

Snow regimes substantially altered soil environmental variables over the growing season (Fig. 24). Soil volumetric water content (0–12 cm depth) increased over the growing season at all

treatments except for HS (High Snow) (P=0.01; Fig. 24a). Soil volumetric water content at RS (Reduced Snow) (0.66±0.03 cm<sup>3</sup> cm<sup>-3</sup>) was consistently lower than that of Ambient (0.75±0.02 cm<sup>3</sup> cm<sup>-3</sup>) (P=0.07) (Fig. 24a). Snow additions increased volumetric water content compared to Ambient (0.83±0.007 and 0.96±0.004 cm<sup>3</sup> cm<sup>-3</sup> at MS (Medium Snow) and HS respectively; P<0.05) (Fig. 24a). Soil was water-saturated below 15 cm at all treatments and sampling periods.

Soil temperature at 10-cm depth at the beginning of the growing season was similar across treatments, increasing over the growing season at all treatments, with significantly stronger treatment effect as the season progressed (P=0.0001; Fig. 24b). Soil temperature at 10-cm depth increased at a rate of  $0.045\pm0.001$  °C d<sup>-1</sup> at Ambient, averaging  $2.6\pm0.06$  °C over the growing season. RS reduced soil warming rate ( $0.043\pm0.001$  °C d<sup>-1</sup>; P<0.05) yielding lower mean soil temperatures compared to Ambient ( $2.0\pm0.06$  °C; P<0.05) (Fig. 24b). Seasonal warming rate was faster at MS and HS ( $0.05\pm0.002$  and  $0.10\pm0.002$  °C d<sup>-1</sup> respectively; P<0.05), averaging higher mean soil temperatures relative to Ambient ( $3.9\pm0.07$  and  $4.3\pm0.11$  °C at MS and HS respectively; P<0.05) (Fig. 24b). Soil temperature decreased with depth at all treatments (P<0.05), but differences among treatments persisted (P<0.05).

Thaw depth deepened over the growing season, with differences among treatments intensifying throughout the season (P=0.0001; Fig. 24c). Thaw depth reached a maximum of 50.5cm at Ambient, increasing by +6.5 and +11.7 cm at MS and HS, respectively (P<0.05; Fig. 24c). RS had no significant effect on thaw depth (P=0.21; Fig. 24c). Changes in volumetric water content explained 83% of the seasonal warming recorded across treatments (P<0.0001; Table X), which explained 77% of the seasonal deepening of thaw depth (P<0.0001; Table X).



**Figure 24:** Seasonal variation of (a) volumetric water content (VWC; –12 cm), (b) soil temperature (10 cm) and (c) thaw depth at Reduced Snow (RS), Ambient, Medium Snow (MS) and High Snow (HS) addition treatments over the growing season. Error bars correspond to Standard Error of the Mean ( $\pm$ SE). Mean values within the same sampling period with different letter indicate statistical differences among treatments at a given sampling period (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

### **TABLE X**

Results from simple regression analyses among soil environmental variables and between the soil profile distribution of  $O_2$  saturation (%) and volumetric water content (VWC), dissolved CH<sub>4</sub> concentration (Log[CH<sub>4</sub>]) and apparent isotopic fractionation ( $\alpha_C$ ). Soil profile dissolved CH<sub>4</sub> concentrations were log-transformed to meet the requirements of parametric correlations (*Reprinted with permission from: Blanc-Betes et al., 2016*).

Va	Curve fit	Coef.	$\mathbb{R}^2$	F	p	
Independent	Dependent	Curve III	Corr.	K	Г	Γ
VWC (cm <sup>3</sup> cm <sup>-3</sup> ) *	Seasonal warming (°C d <sup>-1</sup> ) <sup>1</sup>	Quadratic	0.93	0.83	28.81	0.0001
Soil temperature (°C) *	Thaw depth (cm)	Linear	0.88	0.77	308.35	< 0.0001
	VWC (cm <sup>3</sup> cm <sup>-3</sup> ) <sup>1</sup>	Sigmoidal	- 0.92	0.84	186.63	< 0.0001
O <sub>2</sub> Saturation (%)	$Log[CH_4]$ (µmol L <sup>-1</sup> )	Linear	-0.98	0.97	7059.14	< 0.0001
	$\alpha_{\text{C}}$	Exponential	-0.83	0.69	611.47	< 0.0001

<sup>&</sup>lt;sup>1</sup> Values correspond to shallow soil layers (0–10 cm depth).

# 4.4.2 Vegetation cover characterization

After 18 years of experimental snow accumulation, we observe changes in the relative abundance of the main vegetation life forms in response to treatment. RS did not show significant shifts in vegetation cover compared to Ambient (Fig. 25; P>0.05). MS increased the presence of shrubs but further snow additions at HS drastically decreased the relative abundance of shrubs and tussock forming species, and increased the % cover of tall sedges and mosses compared to Ambient (Fig. 25; P<0.05).

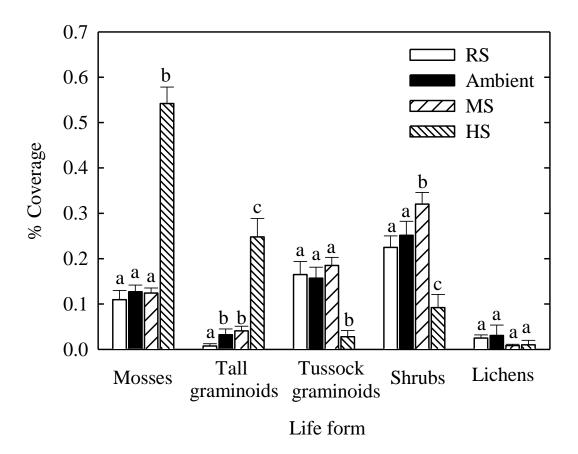
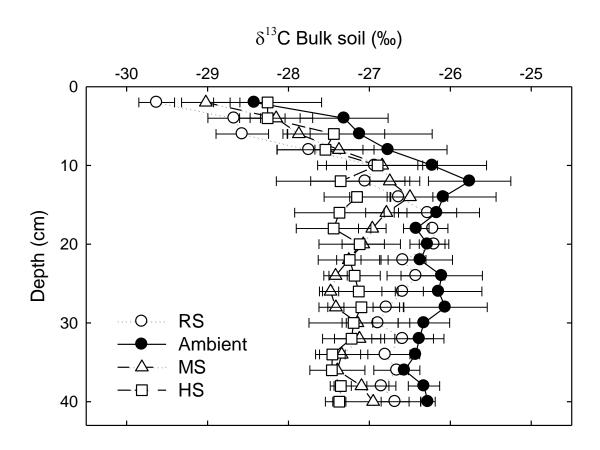


Figure 25: Percentage coverage of main life forms at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments. Values shown are mean percentage coverage from point-frame estimates taken at each site over peak season in 2012 and 2013. Error bars correspond to Standard Error of the Mean (±SE). Mosses include Sphagnum sp. and feather mosses; Tall graminoids are dominated by Carex sp.; Tussock forming graminoids refer to Eriophorum vaginatum; Shrubs include Betula nana, Salix pulchra, Vaccinum vitisideae, Vaccinum ulginosum, Ledum decumbens and Cassiope tetragona; Lichens are dominated by Peltigera sp. and Cladina sp. Different letter superscript denotes significant differences in the percentage coverage among treatments for a given life form (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

## 4.4.3 Carbon isotopic signature of bulk soil

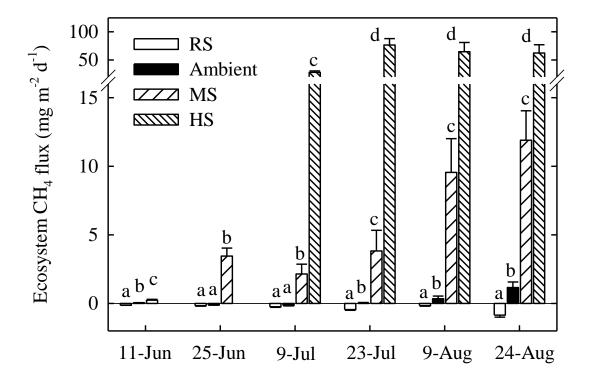
The  $\delta^{13}$ C of bulk soil was not statistically different among treatments (P=0.62) and no depth effect was detected (P=0.18), although an enrichment trend was observed down the soil profile,  $\delta^{13}$ C varying between –27‰ and –25.5‰ from soil surface to the permafrost table (Fig. 26).



**Figure 26:** Soil profile distribution of  $\delta^{13}C$  of the bulk soil at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments. Values shown are mean  $\delta^{13}C$  of bulk soil (n=5) collected at each site at the end of the growing season. Error bars correspond to Standard Error of the Mean ( $\pm$ SE) (*Reprinted with permission from: Blanc-Betes et al.*, 2016).

## 4.4.4 Ecosystem CH<sub>4</sub> fluxes

Ecosystem CH<sub>4</sub> fluxes showed treatment and seasonal effects with a significantly stronger treatment effect as the growing season progressed (*P*=0.02; Fig. 27). Under Ambient conditions, tussock tundra shifted from a CH<sub>4</sub> sink to a source as the season progressed, with a seasonal mean of 0.14±0.11 mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup> (greater than zero, *P*<0.01). Reduced snow increased the CH<sub>4</sub> sink strength, averaging –0.32±0.07 mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup> over the growing season (smaller than zero, *P*<0.05; Fig. 27). Snow additions converted tundra into increasingly stronger CH<sub>4</sub> sources (5.8±1.8 and 58±16 mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup> at MS and HS respectively; Fig. 27). The CH<sub>4</sub> sink or source strength increased as the growing season progressed (*P*<0.05).



**Figure 27:** Seasonal dynamics of net ecosystem daily CH<sub>4</sub> flux at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season. Negative values indicate net ecosystem CH<sub>4</sub> uptake, whereas positive values indicate net ecosystem CH<sub>4</sub> emission. Mean values within the same sampling period with different letter indicate statistical differences among treatments at a given sampling period (P<0.05). Error bars correspond to Standard Error of the Mean ( $\pm$ SE) (*Reprinted with permission from: Blanc-Betes et al.*, 2016).

Volumetric water content, followed by soil temperature and thaw depth, explained about 50% of variability in net ecosystem CH<sub>4</sub> flux across treatments (Table XI). Variability in net ecosystem CH<sub>4</sub> production and oxidation was mostly explained by soil temperature, with volumetric water content exerting a significant control only on net CH<sub>4</sub> production (Table XI). Thaw depth showed no correlation with net ecosystem CH<sub>4</sub> flux, net ecosystem CH<sub>4</sub> production, or net ecosystem CH<sub>4</sub> oxidation rates (Table XI).

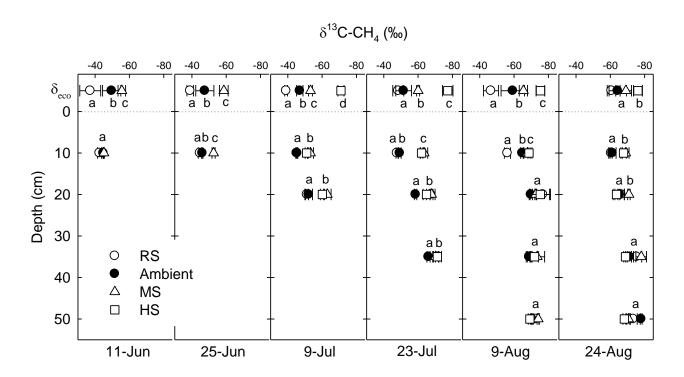
## **TABLE XI**

Results from multiple regression analyses. Evaluation of the relationship between soil environmental variables and net ecosystem CH<sub>4</sub> flux, production and oxidation<sup>1</sup>. Model coefficients of determination (R<sup>2</sup>) considering all independent variables and individual contributions from single environmental parameters to the model are reported. Values in bold denote statistical significance (P<0.05) (*Reprinted with permission from: Blanc-Betes et al.*, 2016).

Variables Dependent Independent		df (res)	Type III SS	F	$\mathbb{R}^2$	P
Net CH <sub>4</sub> Flux	Model	3 (88)	71.6	24.9	0.46	< 0.0001
	VWC (cm <sup>3</sup> cm <sup>-3</sup> )	1	66.6	23.6	0.35	< 0.0001
	Soil temperature (°C)	1	7.9	2.8	0.10	0.113
	Thaw depth (cm)	1	1.1	0.4	0.01	0.545
Net CH <sub>4</sub> Production	Model		178.7	19.4	0.57	<0.0001
	VWC (cm <sup>3</sup> cm <sup>-3</sup> )	1	69.0	22.5	0.50	< 0.0001
	Soil temperature (°C)	1	14.6	4.8	0.07	0.035
	Thaw depth (cm)	1	1.0	0.3	0.00	0.570
Net CH <sub>4</sub> Oxidation	Model	3 (41)	14.7	9.5	0.42	0.0001
	VWC (cm <sup>3</sup> cm <sup>-3</sup> )	1	0.4	0.8	0.02	0.421
	Soil temperature (°C)	1	3.7	7.3	0.40	0.010
_	Thaw depth (cm)	1	0.0	0.0	0.00	0.999

 $<sup>^{1}</sup>$  Units are mg CH<sub>4</sub> m $^{-2}$  d $^{-1}$ . Net ecosystem CH<sub>4</sub> flux, production and oxidation rates were Intransformed.

The  $\delta^{13}$ C values of emitted CH<sub>4</sub> ( $\delta_{eco}$ ) were depleted over the growing season (P=0.03) and varied with treatment, yielding gradually  $\delta^{13}$ C depleted values with increases in snow accumulation (P=0.003) (Fig. 28; Table XII).



**Figure 28:**  $\delta^{13}$ C of emitted CH<sub>4</sub> ( $\delta_{eco}$ ) and soil profile distribution of  $\delta^{13}$ C of dissolved CH<sub>4</sub> at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season. Error bars correspond to Standard Error of the Mean ( $\pm$ SE). Mean values within the same sampling period and depth with different letter indicate statistical differences among treatments at a given sampling period (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

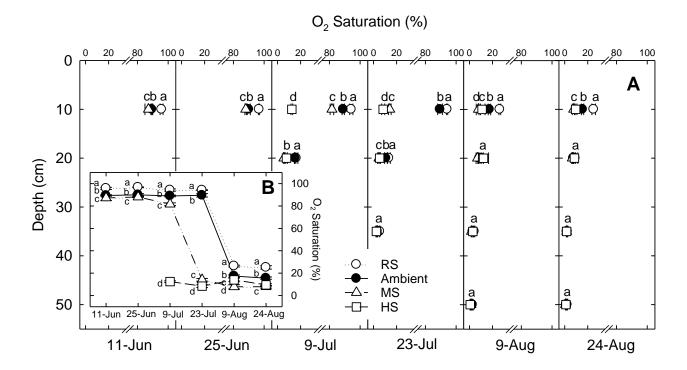
#### **TABLE XII**

Carbon isotope ratios ( $\delta^{13}$ C values) of CH<sub>4</sub> efflux ( $\delta_{eco}$ ), soil CH<sub>4</sub> at shallow depths ( $\delta_{shallow}$ ; 10-cm depth), and soil CH<sub>4</sub> near the frost table ( $\delta_{anox}$ ) at Reduced Snow (RS), Ambient, Medium Snow (MS) and High Snow (HS) treatments. The F<sub>ox</sub> term refers to the calculated fraction of oxidized CH<sub>4</sub> considering predominant diffusion within water-saturated soils ( $\alpha_{trans} = 1.0013$ ) or through the plant aerenchyma ( $\alpha_{trans} = 1.012$ ). Values reported are seasonal averages and Standard Error of the Mean ( $\pm$ SE). (\*) Denotes statistical significance between  $\delta_{eco}$  and  $\delta_{shallow}$  or  $\delta_{anox}$  within site (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

	2	9	2	$F_{ox}$		
	$\delta_{ m eco}$	$\delta_{ m shallow}$	$\delta_{ m anox}$	$\alpha_{trans} = 1.0013$	$\alpha_{trans} = 1.0120$	
RS	-45.1 ± 1.4 ‰	-49.7 ± 0.5 % *	-59.3 ± 0.6 % *	$72.2 \pm 8.0 \%$	119.4 ± 13.3 %	
Ambient	$-53.6 \pm 2.0 \%$	$-52.9 \pm 0.3 \%$	$-60.1\pm0.4$ % *	$41.3\pm8.9~\%$	$54.7\pm18.5~\%$	
MS	$-60.3 \pm 0.9 \%$	$-58.6\pm0.7$ % *	$-62.6\pm0.5$ % *	$26.9 \pm 4.7~\%$	$33.4 \pm 12.6 \%$	
HS	$-74.9 \pm 0.8 \ \%$	$-62.4 \pm 0.3 \%$ *	$-67.2\pm0.5$ % *	$0.0 \pm 0.0$ %	$5.6\pm8.8~\%$	

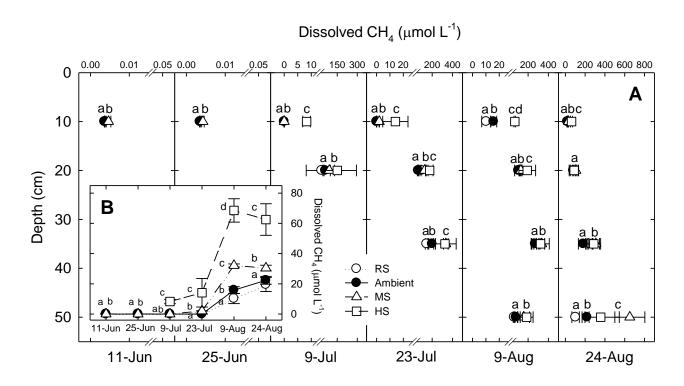
# 4.4.5 Soil gas concentration and carbon isotopic composition

Soil  $O_2$  saturation (% $O_2$ ) decreased with snow additions and over the growing season (P<0.0001; Fig. 29a). At 0–10 cm depth, % $O_2$  was consistently higher at RS than at Ambient but decreased at MS and HS (Fig. 29b). Below 10-cm depth, % $O_2$  decreased with depth in all treatments (P<0.05), except for HS where % $O_2$  was consistently low throughout the soil column resulting in hypoxia/anoxia below 10-cm depth (P=0.4) (Fig. 29a). Roughly, 85% of the depth distribution of % $O_2$  was explained by volumetric water content (P<0.0001; Table X). In turn, % $O_2$  explained 96.6% of pCH<sub>4</sub> depth distribution and seasonal dynamics (P<0.0001; Table X).



**Figure 29:** O<sub>2</sub> Saturation (**a**) throughout the soil profile and (**b**) at shallow depths (10-cm depth) at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season. Error bars correspond to Standard Error of the Mean ( $\pm$ SE). Mean values within the same sampling period and depth with different letter indicate statistical differences among treatments at a given depth and sampling period (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

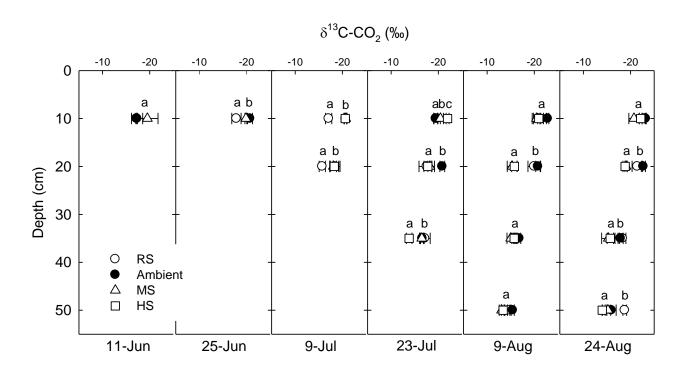
Dissolved CH<sub>4</sub> concentration (pCH<sub>4</sub>) increased over the growing season at all treatments and depths (P=0.002; Fig. 30a). At 0–10cm, snow additions consistently increased dissolved pCH<sub>4</sub> compared to Ambient and RS (P<0.05; Fig. 30b). Dissolved pCH<sub>4</sub> increased with depth at all treatments (P<0.0001; Fig. 30a).



**Figure 30:** Dissolved CH<sub>4</sub> concentration (a) throughout the soil profile and (b) at shallow depths (10-cm) at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season. Error bars correspond to Standard Error of the Mean ( $\pm$ SE). Mean values within the same sampling period and depth with different letter indicate statistical differences among treatments at a given depth and period (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

The  $\delta^{13}$ C value of dissolved CH<sub>4</sub> ( $\delta^{13}$ C-CH<sub>4</sub>) varied with treatment (P=0.002), sampling period (P<0.0001) and depth (P<0.0001). Values of  $\delta^{13}$ C-CH<sub>4</sub> became more  $\delta^{13}$ C depleted as the growing season progressed (P=0.07; Fig. 28). The  $\delta^{13}$ C-CH<sub>4</sub> value at 0–10cm ( $\delta_{shallow}$ ) was consistently  $\delta^{13}$ C enriched at RS but depleted at MS and HS relative to Ambient (P<0.0001; Fig. 28). Values of  $\delta_{shallow}$  were  $\delta^{13}$ C depleted relative to  $\delta_{eco}$  at RS (P<0.05; Table XII; Fig. 28). No significant differences between  $\delta_{shallow}$  and  $\delta_{eco}$  were observed at Ambient (P=0.12; Table XII; Fig. 28), but  $\delta_{shallow}$  was increasingly  $\delta^{13}$ C enriched relative to  $\delta_{eco}$  with snow additions (P<0.05; Table XII; Fig. 28). Across treatments,  $\delta^{13}$ C-CH<sub>4</sub> was increasingly  $\delta^{13}$ C depleted with increasing depth (P<0.0001), and converged at 50 cm depth by the end of the growing season (ranging from –67 to –73‰) (Fig. 28). Deep  $\delta^{13}$ C-CH<sub>4</sub> ( $\delta_{anox}$ ; permafrost surface depth) at RS was consistently  $\delta^{13}$ C enriched, whereas snow additions resulted in increasingly  $\delta^{13}$ C depleted  $\delta_{anox}$  relative to Ambient (P<0.0001; Table XII; Fig. 28).

The  $\delta^{13}$ C value of dissolved CO<sub>2</sub> ( $\delta^{13}$ C-CO<sub>2</sub>) varied with treatment (P=0.003) and depth (P<0.0001). Values of  $\delta^{13}$ C-CO<sub>2</sub> became more  $\delta^{13}$ C enriched with snow additions and with increasing depth (Fig. 31).

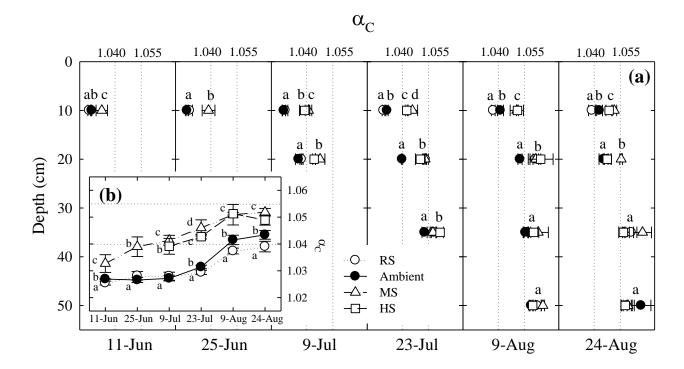


**Figure 31:** Soil profile distribution of  $\delta^{13}$ C of dissolved CO<sub>2</sub> at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season. Error bars correspond to Standard Error of the Mean ( $\pm$ SE). Mean values within the same sampling period and depth with different letter indicate statistical differences among treatments at a given sampling period (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

## 4.4.6 Apparent carbon isotopic fractionation and oxidation efficiency

The apparent C isotopic fractionation ( $\alpha_{\rm C}$ ) within the soil profile increased at all treatments over the growing season, showing stronger treatment effect on the relative dominance of the CH<sub>4</sub> metabolic pathways as the season progressed (P<0.05; Fig. 32a). Soil %O<sub>2</sub> explained 70% of the distribution of  $\alpha_{\rm C}$  within the soil profile and across treatments (P<0.0001; Table X). At 10-cm depth (i.e. shallow depths), lower  $\alpha_{\rm C}$  values were observed at RS and Ambient, increasing with snow additions and over the growing season (P<0.0001; Fig. 32b). At RS, shallow  $\alpha_{\rm C}$  remained below the 1.040 line of constant fractionation indicative of prevailing methanotrophy ( $\alpha_{\rm C}$ <1.040; Fig. 32b). At Ambient, shallow  $\alpha_{\rm C}$  increased over the growing indicating a shift from predominant methanotrophy to predominant methanogenesis by acetate fermentation (1.040 <  $\alpha_{\rm C}$ <1.055; Fig. 32b). At MS and HS, shallow  $\alpha_{\rm C}$  indicated predominant acetate fermentation throughout the growing season (Fig. 32b). The value of  $\alpha_{\rm C}$  increased with depth at all treatments and over the growing season displaying relatively more fractionation in the methanogenic CO<sub>2</sub> reduction zone (1.055 <  $\alpha_{\rm C}$ <1.090) with increasing snow, depth and sampling period (P<0.0001; Fig. 32a).

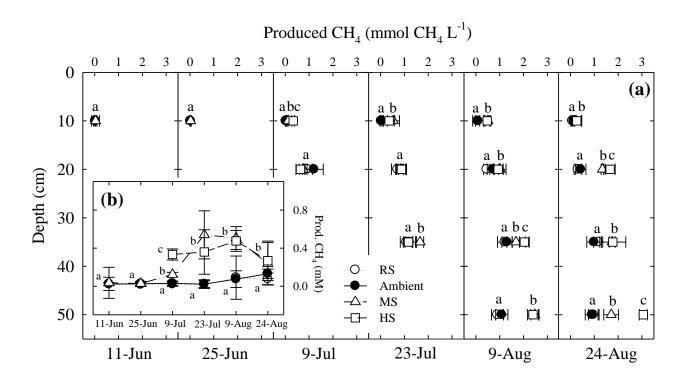
Estimates of the oxidized fraction of  $CH_4$  produced within the soil column ( $F_{ox}$ ; oxidation efficiency) was highest at RS and gradually decreased with snow accumulation reaching negligible values at HS (Table XII).



**Figure 32:** Apparent isotopic fractionation of coexisting pairs of  $\delta^{13}$ C-CO<sub>2</sub> :  $\delta^{13}$ C-CH<sub>4</sub> (α<sub>C</sub>) (a) throughout the soil profile and (b) at shallow depths (10-cm) at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season. Error bars correspond to Standard Error of the Mean (±SE). Mean values within the same sampling period and depth with different letter indicate statistical differences among treatments at a given sampling period (P<0.05). Lines of constant fractionation show ranges of α<sub>C</sub> for coexisting CO<sub>2</sub> and CH<sub>4</sub> as reported by Whiticar et al. (1986) to be characteristic of predominant CH<sub>4</sub> oxidation (α<sub>C</sub> < 1.040), and production by the acetate fermentation (α<sub>C</sub> ~ 1.040 to 1.055) and CO<sub>2</sub> reduction (α<sub>C</sub> ~ 1.055 to 1.090) pathways (*Reprinted with permission from: Blanc-Betes et al., 2016*).

## 4.4.7 Methane produced, oxidized and transported within the soil column

Produced CH<sub>4</sub> increased with depth and over the growing season at all treatments, with 83–86% being produced below 35-cm depth (P<0.05; Fig. 33a). At 0–10 cm, snow additions increased produced CH<sub>4</sub> compared to Ambient and RS (P<0.05; Fig. 33b), and differences among treatments increased with depth (P<0.05; Fig. 33a).



**Figure 33:** Estimates of produced  $CH_4$  (a) throughout the soil profile and (b) at shallow depths (10-cm) at Reduced Snow (RS), Ambient, Medium Snow addition (MS) and High Snow addition (HS) treatments over the growing season. Error bars correspond to Standard Error of the Mean ( $\pm$ SE). Mean values within the same sampling period and depth with different letter indicate statistical differences among treatments at a given sampling period (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

Accordingly, gross CH<sub>4</sub> production was on average slightly lower at RS than Ambient (P>0.1; Table XIII), and significantly increased with snow additions (P<0.05; Table XIII). Variations in produced CH<sub>4</sub> estimates across treatments was correlated to soil %O<sub>2</sub> ( $R^2$ =0.83; P<0.05) (Table XIV). However, while %O<sub>2</sub> controlled CH<sub>4</sub> production at shallow depths ( $R^2$ =0.88; P<0.05) (Table XIV), soil temperature gained leverage with depth, governing CH<sub>4</sub> production near the frost table ( $R^2$ =0.86; P<0.05) (Table XIV).

Only 10–15% of the CH<sub>4</sub> produced remained dissolved in pore water, with no significant differences in the fraction of CH<sub>4</sub> lost among treatments (Table XIII). Contribution of oxidation to ecosystem CH<sub>4</sub> losses increased at RS but decreased with snow additions relative to Ambient (Table XIII). Conversely, the estimated fraction of produced CH<sub>4</sub> lost via ebullition or plant mediated transport was lowest at RS, and increased with increasing snow accumulation (Table XIII).

#### **TABLE XIII**

Estimates of gross CH<sub>4</sub> production within the soil column (CH<sub>4</sub>-Prod), CH<sub>4</sub> lost from the soil column (CH<sub>4</sub>-Lost), and the fraction of CH<sub>4</sub>-Lost by oxidation (CH<sub>4</sub>-Ox) or via plant-mediated transport to the atmosphere (CH<sub>4</sub>-Trans) at Reduced Snow (RS), Ambient, Medium Snow (MS) and High Snow (HS) treatments. Values of CH<sub>4</sub>-Prod and CH<sub>4</sub>-Lost are seasonal averages and Standard Error of the Mean ( $\pm$ SE). (\*) Denotes statistical significance relative to Ambient (P<0.05). Values for CH<sub>4</sub>-Ox and CH<sub>4</sub>-Trans correspond to % of CH<sub>4</sub>-Lost calculated considering predominant diffusion within water-saturated soils ( $\alpha_{trans}$  = 1.0013) or through the plant aerenchyma ( $\alpha_{trans}$  = 1.012) (*Reprinted with permission from: Blanc-Betes et al.*, 2016).

	RS	Ambient	MS	HS
CH <sub>4</sub> -Prod (mM)	$0.75 \pm 0.1$	$0.79 \pm 0.1$	1.4 ± 0.1 *	1.5 ± 0.1 *
CH <sub>4</sub> -Lost (mM)	$0.65 \pm 0.1$	$0.66 \pm 0.1$	$1.1 \pm 0.1 *$	$1.3 \pm 0.1 *$
CH <sub>4</sub> -Ox (%CH <sub>4</sub> -Lost)	84 - 139	47 - 65	32 - 40	0 - 6
CH <sub>4</sub> -Trans (%CH <sub>4</sub> -Lost)	0.1 - 16	35 - 53	60 - 68	94 - 100

#### **TABLE XIV**

Results from linear regression analyses between estimates of CH<sub>4</sub> produced considering the entire soil profile and at a given depth against  $\%O_2$  saturation (%) and soil temperature ( $^{\circ}$ C). Estimated values of produced CH<sub>4</sub> were log-transformed to meet the requirements of parametric correlations. Values in bold denote statistical significance (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

	O <sub>2</sub> Saturation (%)			Soil temperature (°C)				
DEPTH	Coef Corr	$\mathbb{R}^2$	F	P	Coef Corr	$\mathbb{R}^2$	F	P
ALL DEPTHS	-0.91	0.83	273.1	<0.0001	0.08	0.01	0.4	0.5310
10	-0.94	0.88	150.2	< 0.0001	0.63	0.41	13.6	0.0015
20	-0.49	0.24	4.3	0.0566	0.61	0.37	8.5	0.0112
35	-0.41	0.16	2.0	0.1887	0.72	0.52	10.8	0.0083
50	-0.60	0.36	3.3	0.2123	0.92	0.86	37.8	0.0008

## 4.4.8 Cumulative gross ecosystem CH<sub>4</sub> production and oxidation, and net CH<sub>4</sub> flux

At Ambient, gross ecosystem CH<sub>4</sub> production was slightly higher than gross ecosystem CH<sub>4</sub> oxidation, resulting in a small net CH<sub>4</sub> source over the growing season (Table XV). RS did not affect gross ecosystem CH<sub>4</sub> production (*P*>0.1; Table XV) but increased gross ecosystem CH<sub>4</sub> oxidation compared to Ambient (*P*<0.05; Table XV), resulting in a net CH<sub>4</sub> sink over the growing season (Table XV). Snow additions significantly increased both gross ecosystem CH<sub>4</sub> production and oxidation at MS and HS compared to Ambient over the growing season (*P*<0.05; Table XV). Increases in snow accumulation increased gross ecosystem CH<sub>4</sub> production above increases in gross ecosystem CH<sub>4</sub> oxidation resulting in increasingly stronger net CH<sub>4</sub> sources with snow additions over the growing season (*P*<0.05; Table XV).

### TABLE XV

Cumulative seasonal net CH<sub>4</sub> fluxes, and cumulative seasonal gross CH<sub>4</sub> production and oxidation at Reduced Snow (RS), Ambient, Medium Snow (MS) and High Snow (HS) treatments. Values of gross CH<sub>4</sub> production and oxidation correspond to seasonal budgets calculated considering predominant diffusion within water-saturated soils ( $\alpha_{trans} = 1.0013$ ) or through the plant aerenchyma ( $\alpha_{trans} = 1.012$ ). All values reported are in mg CH<sub>4</sub> m<sup>-2</sup>  $\pm$  Standard Error of the Mean ( $\pm$ SE). Values with different letter denote statistical differences between snow treatment (P<0.05) (Reprinted with permission from: Blanc-Betes et al., 2016).

	Net CH <sub>4</sub> Flux	Gross CH <sub>4</sub>	Production	Gross CH <sub>4</sub> Oxidation		
Net CH4 Plux		$\alpha_{trans} = 1.0013$	$\alpha_{trans} = 1.0120$	$\alpha_{trans} = 1.0013$	$\alpha_{trans}=1.0120$	
RS	$-31\pm0.6$ a	93 ± 9.9 a	$116 \pm 6.6$ a	$-123 \pm 9.9^{a}$	$-147\pm6.6~^{\rm a}$	
Ambient	$21 \pm 1.7$ b	$72\pm16^{\ a}$	$113\pm10^{a}$	$-52 \pm 16$ b	$-93 \pm 10^{\ b}$	
MS	$464 \pm 15$ °	$719 \pm 34^{\ b}$	$837 \pm 50$ b	$-256 \pm 37$ °	$-373 \pm 52$ <sup>c</sup>	
HS	$3,561 \pm 97$ d	$3,561 \pm 97$ <sup>c</sup>	$3,838 \pm 149$ <sup>c</sup>	$-7.4\pm137$ d	$-284\pm177^{\rm d}$	

## **4.5 DISCUSSION**

Arctic tundra switched from a small source to a sustained CH<sub>4</sub> sink under reduced winter snow, and to an increasingly stronger CH<sub>4</sub> source with increases in winter snow depth (Table XV). Ecosystem CH<sub>4</sub> fluxes at Ambient conditions agreed with those reported for Alaskan tussock tundra (0.2–1.3 mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup>; Morrissey & Livingston, 1992; Torn & Chapin III, 1993). Our results showed that increases in snow accumulation, by promoting soil wetness and warming, and favoring the expansion of tall graminoids stimulated CH<sub>4</sub> production and transport while suppressing CH<sub>4</sub> oxidation, ultimately increasing the ecosystem CH<sub>4</sub> source strength over the growing season.

## 4.5.1 Snow accumulation and soil microclimate and vegetation

Snow accumulation, through variations in soil water content and winter thermal insulation influenced soil warming and thawing trends over the growing season likely as a result of changes in soil thermal conductivity and latent heat (Table X; Subin *et al.*, 2013). This suggests that winter precipitation plays a prominent role on governing ecosystem processes beyond the impacts of winter warming alone (Lupascu *et al.*, 2014c). Snow additions were accompanied by successional shifts plant communities, from tussock-dominated to wet-meadow vegetation dominated by tall graminoids (Fig. 25). Similar transitions have been reported with thermokarst development (Jorgenson *et al.*, 2001; Christensen *et al.*, 2004; Johansson *et al.*, 2006; Osterkamp *et al.*, 2009).

### 4.5.2 Snow accumulation and ecosystem CH<sub>4</sub> fluxes

Soil climatic variables influenced ecosystem CH<sub>4</sub> fluxes over the growing season (Table XI). Soil water content defined the predominant CH<sub>4</sub> metabolism (aerobic vs anaerobic; Whalen & Reeburgh, 1990b; Yavitt *et al.*, 1990; Bartlett *et al.*, 1992), whereas soil temperature enhanced methanogenic or methanotrophic activity under prevailing anoxic or oxic soil conditions (Blankinship *et al.*, 2010; Tveit *et al.*, 2015). This is supported by seasonal patterns of ecosystem CH<sub>4</sub> fluxes, as both net production and oxidation increased with seasonal warming (Table XI; Fig. 27). The strengthening effect of soil temperature on net CH<sub>4</sub> production and oxidation is consistent with previous research from northern peatlands, where soil warming increased the CH<sub>4</sub> source strength by 75 to 80% above the effects of flooding alone (Updegraff *et al.*, 2001; Turetsky *et al.*, 2008). Similarly, a recent study showed enhanced CH<sub>4</sub> sink strength of nonwater-saturated soils with progressive Arctic warming (Juncher Jørgensen *et al.*, 2015). The synergistic effect that snow accumulation exerts on CH<sub>4</sub> fluxes by influencing both soil moisture and temperature emphasizes the importance of winter precipitation on modulating climate forcing feedbacks from Arctic tundra, especially under a climate warming scenario.

Net ecosystem CH<sub>4</sub> oxidation showed relatively higher correlation with soil temperature than net ecosystem CH<sub>4</sub> production, despite the higher temperature sensitivity to methanogenesis compared to methanotrophy (Table XI) (Dunfield *et al.*, 1993). This may be explained by soil %O<sub>2</sub> limiting the methanotrophic community to the near-surface, where changes in soil temperature are more pronounced. In addition, soil warming indirectly stimulates methanotrophy by increasing CH<sub>4</sub> availability owing to the strong temperature sensitivity of the methanogenic community (West & Schmidt, 2002; Shukla *et al.*, 2013). This agrees with seasonal increases of pCH<sub>4</sub> and produced CH<sub>4</sub> at RS despite increases in net ecosystem CH<sub>4</sub> oxidation (Fig. 33).

#### 4.5.3 Snow accumulation and methane metabolism and transport

Soil water content was a major driver of soil  $\%O_2$  distribution within the soil profile, which in turn determined the zonation for prevailing methanogenesis and methanotrophy ( $\alpha_C$ ) over the growing season (Table X).

Methane oxidation dominated shallow depths at Ambient and RS (mean  $\alpha_C$  < 1.040 over most or all the growing season; Fig. 32b), as supported by relatively enriched  $\delta_{eco}$  over  $\delta_{shallow}$  (Table XII; Fig. 28) (Hornibrook *et al.*, 1997; Popp *et al.*, 1999). Accordingly, 41–55% and 72–119% of produced CH<sub>4</sub> was oxidized (F<sub>ox</sub>) at Ambient and RS respectively, total oxidation mitigating or even offsetting CH<sub>4</sub> production (Table XII). The F<sub>ox</sub> observed at Ambient and RS agree with values reported for tussock-dominated tundra (55–90%; Reeburgh *et al.*, 1993; Ström *et al.*, 2005). Notably, RS maintained gross CH<sub>4</sub> production but increased gross CH<sub>4</sub> oxidation relative to Ambient, shifting to a net CH<sub>4</sub> sink despite negligible decreases in volumetric water content (Tables XIII and XV). These results indicate a strong sensitivity of methanotrophy to soil wetness and suggest the potential of Arctic tundra to rapidly shift into a CH<sub>4</sub> sink under favorable conditions, with important implications in climate forcing feedbacks (Stocker *et al.*, 2013b).

With snow additions,  $F_{ox}$  dropped to 27–33% at MS and to negligible values at HS (Table XII). Accordingly,  $\alpha_C$  values indicate predominant methanogenesis with increased snow even at shallow depths (mean  $\alpha_C > 1.040$  over most or all the growing season; Fig. 32b). This is consistent with observed increases in estimates of produced CH<sub>4</sub>, lower %O<sub>2</sub> and higher soil temperature under increased snow accumulation (Figs. 24, 29 and 33; Table XIV), which partly contributed to greater net CH<sub>4</sub> emissions with deeper winter snow (Fig. 27, Table XIII). Moreover, snow additions resulted in depleted  $\delta_{eco}$  relative to  $\delta_{shallow}$  (Table XII) suggesting the

increasingly important role of plant-mediated CH<sub>4</sub> transport with snow accumulation (Chanton *et al.*, 1992; King *et al.*, 1998; Chanton, 2005). In agreement with these results, while the fraction of CH<sub>4</sub> lost from the system was unaffected by winter snow depth, the relative contribution of CH<sub>4</sub> lost by plant-mediated transport increased with snow accumulation following the expansion of tall graminoids (Table XIII; Fig. 25). The estimated fractions of CH<sub>4</sub> emitted by plant-mediated transport at Ambient (35–53%) and HS (94–100%) are consistent with values reported for tussock-dominated (0–50%; Torn & Chapin III, 1993; Greenup *et al.*, 2000; Dorodnikov *et al.*, 2011) and tall-graminoid dominated systems (>90%; Torn & Chapin III, 1993; Kelker & Chanton, 1997) (Table XIII). Plant transport bypasses shallow methanotrophic zones limiting CH<sub>4</sub> oxidation (Table XIII) (Torn & Chapin III, 1993; Joabsson & Christensen, 2001), and hence contributing to increase the ecosystem CH<sub>4</sub> source strength with deeper snow.

Within predominantly methanogenic zones, values of  $\alpha_C$  indicated that acetate fermentation dominated at depths roughly corresponding with the rhizosphere (0–20 cm), where root exudates, rapid root turnover and litter inputs likely fueled methanogenesis (Popp *et al.*, 1999; Greenup *et al.*, 2000), whereas  $CO_2$  reduction dominated at deeper zones (Fig. 32). At shallow depths,  $\alpha_C$  is susceptible to oxidation, which could potentially explain lower values near the surface. However, higher  $\alpha_C$  with snow additions relative to Ambient matched parallel increases in produced  $CH_4$  (Figs. 32b and 33b) and plant-mediated transport (Table XIII), suggesting that methanogenesis dominated at shallow depths, and that the upward decrease in  $\alpha_C$  can be mostly attributed to shifts from  $CO_2$  reduction to acetate fermentation. This is consistent with previous research linking acetate fermentation with high SOC decomposability, and  $CO_2$  reduction with greater recalcitrance of the organic substrate (Hornibrook *et al.*, 1997, 2000; Avery *et al.*, 2003).

Permafrost SOC is labile (Uhlířová *et al.*, 2007; Waldrop *et al.*, 2010; Wild *et al.*, 2014; Abbott *et al.*, 2014). However, consistent with other studies, deeper active layer with snow additions (10% and 28% at MS and HS, respectively) did not stimulate acetate fermentation (Fig. 32b) (Prater *et al.*, 2007; Lee *et al.*, 2012). Instead, we observed an increasing correlation between produced CH<sub>4</sub> estimates and soil temperature with depth, which suggests that warming rather than thaw-induced increases in SOC availability drove increases in CH<sub>4</sub> production within newly thawed horizons (Table XIV).

### 4.5.4 Implications of projected changes in winter precipitation for CH<sub>4</sub> emissions

A major concern associated with permafrost degradation in a changing climate is the vulnerability of previously frozen SOC to rapidly decompose (MacDougall *et al.*, 2012; O'Donnell *et al.*, 2012; Schneider von Deimling *et al.*, 2012; Schuur *et al.*, 2013, 2015). Our results suggest that CH<sub>4</sub> fluxes responded primarily to changes in vegetation, and soil hydrology and temperature rather than increases in SOC availability with deeper active layer (Table XI, Fig. 32b). The lack of response of the acetoclastic community could be explained by low presence and activities of acetate fermenters relative to CO<sub>2</sub> reducers in newly thawed soils (Waldrop *et al.*, 2010; Mondav *et al.*, 2014). In our study site, low pH (~5.4) and temperatures likely limited acetate fermentation at permafrost surface (Horn *et al.*, 2003; Kotsyurbenko *et al.*, 2007). However, given that acetate fermentation accounts for approximately 70% of the produced CH<sub>4</sub>, any climate-induced shift in the ability of acetate to act as a CH<sub>4</sub> precursor could greatly stimulate CH<sub>4</sub> production and emission rates (Hines *et al.*, 2001, 2008; Metje & Frenzel, 2007).

Recent research has shown substantial increases in CH<sub>4</sub> production rates coupled to thawinduced shifts towards acetate fermentation with severe permafrost degradation (Hodgkins *et al.*, 2014; McCalley *et al.*, 2014). Increased snowfall and accumulation, by promoting progressive permafrost degradation, could facilitate the development of an acetoclastic community, thereby triggering CH<sub>4</sub> production and emission over time spans longer than considered in this study (Sistla *et al.*, 2013; McCalley *et al.*, 2014; Tveit *et al.*, 2015). Alternatively, the extensive permafrost degradation projected under future scenarios could promote the gradual drainage of permafrost supported soils (Romanovsky *et al.*, 2010; Avis *et al.*, 2011). Given the strong sensitivity of CH<sub>4</sub> oxidation to soil moisture and temperature, drier soils together with Arctic warming could potentially convert extended areas of upland tundra from net CH<sub>4</sub> sources to net CH<sub>4</sub> sinks (Juncher Jørgensen *et al.*, 2015; Lawrence *et al.*, 2015).

# **4.6 CONCLUSIONS**

In summary, changes in winter precipitation, by regulating soil water content, influence soil %O<sub>2</sub>, temperature and thawing over the growing season, affecting ecosystem CH<sub>4</sub> fluxes beyond the direct effects of snow insulation on winter processes. Moreover, our results reveal a synergistic effect of soil moisture and temperature on net ecosystem CH<sub>4</sub> production and oxidation under near water-saturated (more anoxic) and drier (more oxic) soil conditions respectively. Thus, changes in winter precipitation, by influencing both soil wetness and temperature impact ecosystem CH<sub>4</sub> fluxes beyond what may be predicted by Arctic warming alone. Shifts in vegetation cover derived from changes in snow accumulation define the predominant CH<sub>4</sub> transport mechanism within the soil profile and largely contribute to the ecosystem CH<sub>4</sub> sink or source strength. Contrary to our expectations, our results suggest that thaw-induced changes in SOC availability play a minor role on CH<sub>4</sub> forcing from Arctic tundra under the studied scenarios and time spans, and that increases in CH<sub>4</sub> production within newly thawed horizons under deeper snow were mostly driven by soil warming. Progressive permafrost degradation under projected increases in winter precipitation has the potential to further

exacerbate (if anoxia is maintained) or mitigate (if degradation results in drier, more oxic soils) the radiative forcing of CH<sub>4</sub> emissions from Arctic tundra over longer time-scales. Whether Arctic tundra will act as a significant source or sink of CH<sub>4</sub> over the 21<sup>st</sup> century will largely depend on soil moisture-temperature interactions associated to changes in winter precipitation.

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## 4.9 SUPPLEMENTARY INFORMATION

# 4.9.1 Ecosystem CH<sub>4</sub> emissions and soil profile sampling and analyses

## 4.10.1.1 Field sampling

4.10.1.1.1 Ecosystem CH<sub>4</sub> emissions

Ecosystem CH<sub>4</sub> fluxes and δ<sup>13</sup>C values of emitted CH<sub>4</sub> were measured using the static chamber approach (Bubier *et al.*, 1995). At each plot, we installed a fixed 25-cm-diameter PVC collar inserted 15 cm into the soil (average depth of the mineral horizon) to ensure a good seal at the bottom of the chamber. Collar insertion had no effect on plant development, species composition, soil water content or soil temperature, indicating that the collar diameter was enough to minimize disturbance. At the moment of the sampling, collars were capped with opaque lids fitted with a rubber closed cell foam gasket, resulting in an average chamber volume of 12L. Chamber lids were equipped with a stainless-steel sampling port (Swagelok Corporation, OH, USA) fitted with a PTFE/butyl septum (Restek Corporation, PA, USA). From each chamber, five 90 mL samples were taken at 15-min intervals over a 75-min period with 60 mL syringes equipped with 3-way stopcocks. Gas samples were injected into pre-evacuated sampling bags equipped with Luer-Lock valve fittings (Cali-5-Bond<sup>TM</sup>, Calibrated Instruments Inc., NY, USA).

#### 4.10.1.1.2 Soil profile

Soil interstitial gas and pore water were collected from soil probes progressively installed at each plot at 10, 20, 35 and 50-cm depth as the thaw depth increased over the growing season. Two pseudo-replicates were taken at each depth, plot and sampling period, and values were averaged for a total of 4 replicates per treatment, depth and period. Soil probes consisted of ½"

OD stainless-steel tubing fitted with stainless-steel Swagelok unions and PTFE/butyl septum creating a gas tight unit. The bottoms of the probes were crimped and small holes were drilled 2-cm above the bottom to allow sample collection. Interstitial gas samples were extracted from non-water-saturated soil depths with a 60mL plastic syringe equipped with 3-way stopcock and injected into pre-evacuated sampling bags. At water-saturated soil depths, bubble-free pore water samples were extracted with a 60mL syringe and injected into sampling bags filled with a known volume of N<sub>2</sub> (i.e., water:N<sub>2</sub> ratio was 70:30) and equilibrated by vigorously agitating for 5-min following procedures described in Lewin et al., 1990. The headspace was subsequently extracted and injected into a pre-evacuated bag.

# 4.10.1.2 Sample analyses

All samples were analyzed within 4–6 hr after collection for the direct determination of pCH<sub>4</sub>, pCO<sub>2</sub>,  $\delta^{13}$ C-CH<sub>4</sub> and  $\delta^{13}$ C-CO<sub>2</sub> using a Picarro G2201-*i* cavity ring-down spectrometer (CRDS) equipped with a 16-port distribution manifold (Picarro Inc., CA, USA). The inlets of the distribution manifold were adapted with stainless-steel Luer-Lock valve fittings for a gas tight connection with the sampling bags. Samples were run in continuous flow for 5 min in High Dynamic Range mode. For each measurement, the signal was allowed to stabilize for 30 secs, and the result integrated 4.5 min of data at measurement intervals of 3 secs for manufacturer guaranteed precision of <0.05% of the reading for pCH<sub>4</sub> and pCO<sub>2</sub> values, and <0.55‰ and <0.16‰ for  $\delta^{13}$ C-CH<sub>4</sub> and  $\delta^{13}$ C-CO<sub>2</sub> values respectively. A standard mix of 2.5 ppm CH<sub>4</sub> ( $\delta^{13}$ C-CH<sub>4</sub> = -40.2 ‰) and 396 ppm CO<sub>2</sub> ( $\delta^{13}$ C-CO<sub>2</sub> = -35.7 ‰) was run every five samples from both sampling bags and directly from the tank with no sign of drift or bias. The accuracy for pCH<sub>4</sub> and  $\delta^{13}$ C-CH<sub>4</sub> was better than 90 ppb and 0.1‰. The accuracy of pCO<sub>2</sub> and  $\delta^{13}$ C-CO<sub>2</sub> was better than 1ppm and 0.6 ‰. All pCH<sub>4</sub> data were pressure and temperature corrected.

#### 4.9.2 Calculation of the oxidation fractionation factor

The oxidation fractionation factor ( $\alpha_{ox}$ ) was described as a Rayleigh fractionation process (1896) and calculated as in King *et al.*, (1989):

(Eq. S4.1) 
$$1/\alpha_{ox} = \{ Ln \left[ \left( \delta_{(f)} + 1000 \right) / \left( \delta_{(i)} + 1000 \right) \right] / Ln \left( pCH_{4(f)} / pCH_{4(i)} \right) \} + 1$$

where  $\delta_{(i)}$  and  $\delta_{(f)}$  are  $\delta^{13}$ C of the initial and final CH<sub>4</sub> in the chamber headspace, and pCH<sub>4(i)</sub> and pCH<sub>4(f)</sub> are the initial and final pCH<sub>4</sub> in the chamber headspace (Tyler *et al.*, 1994; Reeburgh *et al.*, 1997).  $\alpha_{ox}$  was determined at plots where net CH<sub>4</sub> oxidation was observed through part or the entire growing season. Calculated  $\alpha_{ox}$  averaged 1.0206±0.0003 and 1.0209±0.0004 at Ambient and RS respectively and were within those reported for Arctic tundra ecosystems (1.009–1.031; Tyler *et al.*, 1994; Reeburgh *et al.*, 1997; Preuss *et al.*, 2013).

Given the temperature sensitivity of  $\alpha_{ox}$  (Tyler *et al.*, 1994; Chanton *et al.*, 2008), calculations were additionally conducted with a temperature-dependent correction of the average  $\alpha_{ox}$  reported at the RS (sustained net CH<sub>4</sub> oxidation over the growing season) to allow common ground calculations of ecosystem oxidation efficiency for treatments where no net CH<sub>4</sub> oxidation was observed using the following relationship:

(Eq. S4.2) 
$$\alpha_{ox,(I)} = \alpha_{ox,measured} - 0.00039 (T_{(I)} - T_{measured})$$

where  $\alpha_{ox,(I)}$  represents the oxidation fractionation factor at the temperature of interest,  $T_{(I)}$  in  ${}^{o}C$ , and  $\alpha_{ox,measured}$  is the fractionation factor at  $T_{measured}$  in  ${}^{o}C$  (Chanton *et al.*, 2008).

 $\alpha_{ox}$  at Ambient was used to test the predictability of  $\alpha_{ox}$  at our experimental treatments, with a 98% agreement. Comparisons between  $F_{ox}$  calculated from treatment specific  $\alpha_{ox}$  and  $F_{ox}$  calculated from the theoretical  $\alpha_{ox}$  reported for Arctic tundra soils (1.020; Tyler *et al.*, 1994; Reeburgh *et al.*, 1997) revealed a 0.6% bias on  $F_{ox}$  estimates, which was considered an

acceptable uncertainty for the purpose of this paper.

# 4.9.3 Error introduced by contributions from oxidized CH<sub>4</sub> to total pCO<sub>2</sub>

Using calculated estimates of the oxidation efficiency ( $F_{ox}$ ; Methods, Eq. 4.2), we estimated that 0.6–0.8% of the pCO<sub>2</sub> within the soil column originated from oxidized CH<sub>4</sub>, which was considered an acceptable uncertainty for the purpose of the paper (Throckmorton et al., 2015).

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# 5. DISCUSSION: RESHAPING OUR UNDERSTANDING OF THE ARCTIC TUNDRA CARBON DYNAMICS

Climate (i.e. atmospheric temperatures and precipitation patterns) is changing at a rate that is unprecedented in the last 1300 years (Serreze *et al.*, 2000; Miller *et al.*, 2010; Serreze & Barry, 2011; Mudryk *et al.*, 2014), reshaping Arctic tundra structure and functioning (Schuur *et al.*, 2013, 2015; Abbott *et al.*, 2016). The Arctic tundra has been responsible for a substantial portion of the global land-based sink for atmospheric CO<sub>2</sub> throughout the 20<sup>th</sup> century (McGuire *et al.*, 2009, 2012). However, paleo-reconstruction studies indicate large losses of permafrost C during past warming episodes that largely contributed to increases in GHGs concentrations in the atmosphere, raising great concern about the fate of the large permafrost SOC pool and derived feedbacks on the climate system (DeConto *et al.*, 2012; Crichton *et al.*, 2016; Tesi *et al.*, 2016). At present, model predictions vary widely among studies suggesting the incomplete or inaccurate representation of the mechanisms driving the C sink or source strength of Arctic tundra and radiative forcing on future climate (Schaefer *et al.*, 2011; Burke *et al.*, 2012).

Deeper winter snow results in cascading effects on many key system drivers including winter and summer warming, enhanced soil wetness, accelerated permafrost thaw, increased nutrient availability, and changes in plant community structure and plant productivity (Fig. 1). The complex interactions among these variables difficult the assessment of the full impacts of progressive degradation on Arctic tundra C cycle from single factor responses. With multiple, and often contrasting, lines of evidence emerging on the response of Arctic tundra C dynamics to changes in individual driving factors, a comprehensive and integrated view of the overall impact of changes in climate is needed (Hicks Pries *et al.*, 2011; Bosiö *et al.*, 2012; Elmendorf *et al.*, 2012a; Trucco *et al.*, 2012; Elberling *et al.*, 2013; DeMarco *et al.*, 2014; Leffler *et al.*, 2016;

Webb *et al.*, 2016). The research presented here, by using a holistic approach in a system-wide, multi-year and multi-level snow manipulation experiment provides a unique opportunity to reconcile discrepancies, and identify and constrain the mechanisms driving the response of the Arctic tundra C cycle to future climate scenarios.

# 5.1 HELPING RECONCILE PREDICTIONS OF THE IMPACTS OF CHANGES IN CLIMATE ON ARCTIC TUNDRA CARBON BUDGET AND FEEDBACKS TO THE GLOBAL CLIMATE SYSTEM

The depth of the active layer is a major determinant of the Arctic tundra C cycle, as it determines the amount and rate at which permafrost C becomes vulnerable for decomposition (Grosse *et al.*, 2011; Koven *et al.*, 2011; Burke *et al.*, 2012; Harden *et al.*, 2012; Schuur *et al.*, 2015), influences soil thermal and hydrological regimes thereby regulating microbial activity and decomposition rates (Kuhry *et al.*, 2010; Lee *et al.*, 2012), and determines rooting depth of tundra vegetation and access to nutrients influencing plant community structure and productivity (Bret-Harte *et al.*, 2001; Iversen *et al.*, 2015). Therefore, an adequate assessment of permafrost dynamics and active layer thickness (ALT) under future climate scenarios is a critical step towards accurately predicting C-cycle/climate feedbacks from Arctic regions.

Long-term climatic records from northern Alaska indicate an increase in atmospheric and near-surface permafrost temperatures since the 1970s (Osterkamp, 2007; Solomon, 2007), a trend that has intensified over the last decades (Shiklomanov *et al.*, 2010). However, data from the Circumpolar Active Layer Monitoring (CALM) network show no clear indication of a deepening of the active layer accompanying warming trends (Shiklomanov *et al.*, 2010; Streletskiy *et al.*, 2012). This contradicts model reconstructions that estimate significant permafrost degradation and deepening of the active layer across the Arctic region over the considered period (Hayes *et al.*, 2014). Our results provide evidence of a significant thaw-

induced soil consolidation of the active layer and subsidence of the ground surface in the area of study between 2008 and 2012, which led to a 20% underestimation in the rate of permafrost thaw resulting in the apparent stability of the ALT (*see* Chapter 2). Accounting for physical alterations of the soil column, the depth of active layer increased at a mean rate of 0.4 cm yr<sup>-1</sup>, which exposed 0.2 kgC m<sup>-2</sup> yr<sup>-1</sup> to decomposition over the 4-yr period considered (*see* Chapter 2). These values are comparable to model-estimated rates of increases in ALT and the vulnerable SOC pool across the Arctic region over the last decades (Hayes *et al.*, 2014). Therefore, our findings bridge the gap between empirical observations and model simulations of permafrost dynamics in recent decades, and suggest that failing to adequately reproduce climate-driven alterations of the physical properties of the active layer, the full impacts of Arctic warming could go unnoticed until long after the onset of permafrost thaw.

Arctic C dynamics are defined by the integration of the constraining, saturating or accelerating effects of driving variables on all contributing C fluxes, which may differ in lagtimes and sensitivities to disturbance. As such, the response of the Arctic tundra C budget to climate change is unlikely to be neither permanent nor fixed, but rather to evolve over the course of progressive permafrost degradation, initial responses not necessarily being maintained in the long run. Given the paucity of direct measurements of long-term responses of the Arctic tundra SOC pool and C fluxes to changes in climate, climate/C-cycle coupled models must rely heavily on the linear extrapolation of short-term responses to infer long-term changes in Arctic tundra C stocks and fluxes (Luo *et al.*, 2011; Koven *et al.*, 2015a, 2015b).

We show that the response of C fluxes and budget from Arctic tundra to changes in winter precipitation are markedly nonlinear with both time and treatment intensity (*see* Chapters 2 and 3). These results help reconcile discrepancies among empirical and model reports of the

impacts of warming on the Arctic C balance (Hicks Pries et al., 2011; Lamb et al., 2011; Lund et al., 2012; Sistla et al., 2013; Li et al., 2014; Natali et al., 2014). Our findings are consistent with studies showing similar non-linearities in other ecosystems under a changing environment over time and treatment intensity (Burkett et al., 2005; Gomez-Casanovas et al., 2016). Taken together, our results and those from other studies suggest that assumptions of linearity could lead to substantial inaccuracies in both the magnitude and direction of the response of the C budget to changes in climate of terrestrial ecosystems, including the Arctic tundra.

Overall, we show that the response of Arctic tundra C balance to altered winter precipitation patterns is defined by thresholds and tipping points beyond which the ecosystem shifts to alternative states. Therefore, the short-term effects of changes in climate on the ecosystem physical and biological parameters should be understood as the dynamic foundation shaping long-term ecosystem responses to climate change. Designing multi-year and multi-level field manipulation experiments that integrate the interactions among all variables driving ecosystem C fluxes over time will improve predictions of the C cycle of Arctic tundra.

# 5.2 RECONSIDERING THE MECHANISMS DRIVING THE ARCTIC TUNDRA CARBON SINK OR SOURCE STRENGTH AND RADIATIVE FORCING ON FUTURE CLIMATE.

At present, predictions of climate forcing from Arctic regions build upon a conceptual framework based on two competing hypotheses. The first hypothesis states that under future climate scenarios, projected warming will increase primary productivity above ecosystem C losses, enhancing the Arctic C sink strength. Alternatively, the second hypothesis states that the combined effect of warming and thaw-induced increases in the availability of permafrost SOC to decomposers will stimulate C mineralization and emission rates, offsetting photosynthetic CO<sub>2</sub> uptake and turning the Arctic region into a C source. Whether plant productivity or microbial

decomposition will drive the Arctic tundra C sink or source strength in future climate scenarios is a long-lasting question with important implications on predictions of climate forcing feedbacks from the Arctic region. Our results suggest that the overall behavior of Arctic tundra C dynamics in response to changes in climate may diverge in some important ways from these conceptual hypotheses.

Remote sensing data indicate a warming-driven increase in vegetation greenness and productivity of 15% in northern high latitudes over the last 50 years (Elmendorf *et al.*, 2012b; Forkel *et al.*, 2016; Zhu *et al.*, 2016), primarily associated to widespread shrub expansion into Arctic tundra (Tape *et al.*, 2006, 2012; Myers-Smith *et al.*, 2011). The cumulative effects of long-term warming on shrub expansion have been used as indication of the potential of enhanced photosynthetic CO<sub>2</sub> uptake to act as a significant mitigating agent of climate change (Schuur *et al.*, 2013; Koven *et al.*, 2015a; Abbott *et al.*, 2016).

Our results indicate that enhanced Gross Primary Productivity (GPP) associated to increases in the relative abundance of shrubs with moderate permafrost thaw under medium snow additions was largely compensated with increases in plant respiration (R<sub>aut</sub>). The observed decreases in the Arctic tundra C source strength relative to ambient conditions were mostly explained by constraints on the aerobic decomposition of SOC (*see* Chapter 3). However, transitions towards wet-sedge tundra with severe permafrost thaw under high snow reduced plant respiration below photosynthetic CO<sub>2</sub> uptake, increasing the ecosystem C sink strength despite substantial decreases in GPP relative to ambient conditions (*see* Chapter 3). Together, these results suggest that the ability of Arctic tundra to mitigate climate forcing feedbacks through the changes in supported vegetation is determined by changes of plant respiration relative to GPP rather than by enhanced greenness or GPP alone.

In contrast with model estimates predicting a large attenuating effect of the Arctic radiative forcing from enhanced plant productivity (Qian *et al.*, 2010; Schuur *et al.*, 2013; Koven *et al.*, 2015a), our results indicate a tight coupling between R<sub>aut</sub> and GPP. These observations suggest a limited role of supported vegetation in driving the ecosystem C sink or source strength, and that changes are primarily explained by impacts on microbial activity and function (*see* Chapter 3). These results agree with studies suggesting a predominant role of ecosystem respiration (R<sub>eco</sub>) in driving responses of Arctic tundra C fluxes to warming (Cahoon *et al.*, 2012; Lund *et al.*, 2012; Trucco *et al.*, 2012; Belshe *et al.*, 2013). Our findings provide empirical support to recent modelling studies that suggest a limited ability of increases in biomass to offset C losses under future climate scenarios (Hayes *et al.*, 2011; Abbott *et al.*, 2016).

The impacts of climate change on plant community structure however, could be critical to the regulation of climate forcing feedbacks from Arctic tundra. We show that the increased abundance of tall sedges with transitions towards wed-sedge tundra with severe permafrost degradation favors the transport of CH<sub>4</sub> through the plant aerenchyma. By bypassing the oxidation zone, enhanced plant-mediated transport reduces CH<sub>4</sub> oxidation subsidizing ecosystem CH<sub>4</sub> emissions, and hence contributes to increases in the GWP of C emissions from Arctic tundra (*see* Chapter 4).

The permafrost C feedback on climate (i.e. amplification of climate warming due to warming-induced release of C currently frozen in permafrost) represents a critical potential for climate change amplification from the Arctic region. Model estimates of the permafrost C feedback is generally assumed proportional to thaw-induced increases in the SOC pool available to decomposers (Harden *et al.*, 2012; Schaefer *et al.*, 2014; Koven *et al.*, 2015a; Lawrence *et al.*, 2015). Radiocarbon studies consistently report the release of old C accompanying permafrost

thaw further supporting this assumption (Schuur *et al.*, 2009; Vogel *et al.*, 2009; Nowinski *et al.*, 2010; Lupascu *et al.*, 2014). However, our results suggest little contributions of newly thawed permafrost SOC to either CO<sub>2</sub> or CH<sub>4</sub> emissions despite significant thaw-induced increases in the vulnerable SOC pool with deeper snow (*see* Chapters 3 and 4). Rather, our results suggest that the release of old C following thaw responded to the increased vulnerability of the SOC contained within the organic-mineral horizon (*see* Chapter 2).

We propose that the fate of permafrost SOC is closely tied not only to temperature but also to hydrology, which may add an additional constraint in permafrost C mobilization following thaw. As such, permafrost SOC may be rapidly released or long-term protected. Therefore, predictions of permafrost C feedback from thaw-induced increases in the vulnerable SOC pool may result in large biases in the magnitude and timing of the radiative forcing from terrestrial Arctic systems to global climate.

In summary, based in our findings from a multi-year and multi-level field manipulation experiment, we suggest that an integrative conceptualization of both physical and biological processes driving changes in the Arctic tundra C budget and emissions over time is likely to reshape our understanding of Arctic C dynamics in a changing environment, and help improving predictions of the contribution of the Arctic region to future climate.

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#### 6. BROADER IMPACTS

Findings presented herein add to a growing body of evidence suggesting the potential of projected changes in precipitation to derive in a significant radiative forcing from Arctic regions, critically affecting future climate. At present, the lack of an accurate process-based, allencompassing assessment of Arctic C dynamics under future precipitation scenarios is a major gap in our ability to estimate climate/C-cycle feedbacks from the Arctic region. Our results emphasize the potential of Arctic tundra to become a transient C source under future precipitation scenarios contributing to reduce the overall global terrestrial C sink, but also to act as an additional long-term C sink with persistent increases in winter precipitation, as SOC may remain largely immobilized over decades under thaw-induced near-water saturated conditions. This additional C sink however, may come at the cost of a substantial positive feedback on climate, as near-surface hydrological conditions may stimulate CH<sub>4</sub> production and emission, further subsidized by transitions in plant community structure over the course of progressive permafrost degradation. We suspect that much of current divergence among predictive models stem from inaccurate representations of the sensitivity of both physical and biotic processes to changes in precipitation at different time-scales. If such projections are used to establish meaningful GHGs emission targets, climate targets are likely to be uncertain. Improving predictions of Arctic climate/C-cycle feedbacks will require conceptualizing and adequately parameterizing the magnitude and evolution of key processes such as permafrost dynamics, the potential of plant productivity to offset ecosystem C emissions, and the ability of Arctic tundra to act as a significant source of CH<sub>4</sub> under future precipitation scenarios.

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Blanc-Betes E. (2004) Evaluation of the tree-line uprising in the Catalan Pyrenees due to Global Change and its effects using photointerpretation and GIS. MSc. Catalan Institute of Technology (UPC-EOI-ICT).

*In review or in preparation* 

Blanc-Betes E., Welker J.M., Gomez-Casanovas N., Gonzalez-Meler M.A. *in prep*. Deeper winter snow reduces ecosystem C losses but increases the global warming potential of Arctic tussock tundra over the growing season. *Global Change Biology*.

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Blanc-Betes E., Thurnhoffer B.M., Gonzalez-Meler M.A., Sturchio N.C., Welker J.M. Increased winter precipitation makes Arctic tundra a methane source but gas diffusion modulates abiotic sensitivity of soil C efflux. American Geophysical Union (AGU), San Francisco, CA, December 2012 (poster presentation).

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