1	Environmental correlates of peatland carbon fluxes in a
2	thawing landscape: do transitional thaw stages matter?
3	A. Malhotra and N. T. Roulet
4	Department of Geography, McGill University, Montreal, Quebec, Canada
5	Correspondence to: A. Malhotra (avni.malhotra@mail.mcgill.ca)
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## 22 Abstract

23 Peatlands in discontinuous permafrost regions occur as a mosaic of wetland types, each with 24 variable sensitivity to climate change. Permafrost thaw further increases the spatial heterogeneity in ecosystem structure and function in peatlands. Carbon (C) fluxes are well characterized in 25 end-member thaw stages such as fully intact or fully thawed permafrost but remain 26 27 unconstrained for transitional stages that cover a significant area of thawing peatlands. Furthermore, changes in the environmental correlates of C fluxes, due to thaw are not well 28 described: a requirement for modeling future changes to C storage of permafrost peatlands. We 29 30 investigated C fluxes and their correlates in end-member and a number of transitional thaw stages in a sub-arctic peatland. Across peatland lumped  $CH_4$  and  $CO_2$  flux data had significant 31 correlations with expected correlates such as water table depth, thaw depth, temperature, 32 33 photosynthetically active radiation and vascular green area. Within individual thaw states, bivariate correlations as well as multiple regressions between C flux and environmental factors 34 35 changed variably with increasing thaw. The variability in directions and magnitudes of correlates 36 reflects the range of structural conditions that could be present along a thaw gradient. These 37 structural changes correspond to changes in C flux controls, such as temperature and moisture, and their interactions. Temperature sensitivity of CH<sub>4</sub> increased with increasing thaw in bivariate 38 39 analyses, but lack of this trend in multiple regression analyses suggested cofounding effects of substrate or water limitation on the apparent temperature sensitivity. Our results emphasize the 40 41 importance of incorporating transitional stages of thaw in landscape level C budgets and highlight that end-member or adjacent thaw stages do not adequately describe the variability in 42 43 structure-function relationships present along a thaw gradient. 44 45 46 47 48

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### 51 **1** Introduction

Northern permafrost regions contain approximately 50% (1672 Pg) of the world's soil carbon 52 53 (C) pool and peatlands store 277 Pg of this C (Schuur et al., 2008; Tarnocai et al., 2009). Thawing permafrost is projected to act as a positive feedback to climate change via the release of 54 soil C to the atmosphere and the magnitude of this feedback remains uncertain (Schuur et al., 55 2013). Peatlands in the permafrost regions are currently experiencing increased rates of thaw and 56 related changes to abiotic and biotic components (structure) and elemental cycling (function; 57 Camill, 2005; Osterkamp, 2005). Thawing peatlands are a mosaic of different wetland types, 58 59 ranging from permanently frozen (e.g. palsa) to permafrost-free and minerotrophic fens (Luoto et al., 2004). Each component of these heterogeneous landscapes has distinct C function, 60 contributing to uncertainties in estimating landscape level C budgets. Constraining the spatial 61 62 variability in peatland C fluxes and related abiotic and biotic factors, is an essential step toward estimating the positive feedback potential of thawing permafrost on climate change. 63 Permafrost thaw in peatlands is associated with marked changes in ecosystem structure and 64 65 function. Initial ground subsidence from thaw results in wet habitats due to a high water table (Smith et al., 2012). Relative to dry areas, the seasonal frost table thaws faster in wet areas, 66 67 further increasing lateral flow of water to wet areas (Quinton et al., 2009). The increase in water table depth (WTD) leads to a vegetation shift toward wetter communities and an increase in 68 69 graminoid species (Camill, 1999; Camill et al., 2001; Malmer et al., 2005). Rapid changes also occur in the microbial community, notably an increased activity of methane (CH<sub>4</sub>) and nitrogen 70 cycling (Mackelprang et al., 2011). Associated with structural shifts, several functional changes 71 have been observed in thawed permafrost peatlands. Typically plant productivity increases 72 73 (Vogel et al., 2009), but so does autotrophic and heterotrophic respiration (Hicks Pries et al., 2013). Organic matter decomposition may decrease due to increased anoxic conditions after 74 ground subsidence (Camill et al., 2001). Thus, there could be an initial increase in organic matter 75 accumulation as a result of permafrost thaw (Turetsky et al., 2007; Vitt et al., 2000). 76 Subsequently, decomposition may increase due to the increase in easily decomposable litter from 77 78 community shifts toward more vascular plants (Hodgkins et al., 2014; Turetsky, 2004) and quantity of litter (Malmer et al., 2005). Regardless of the initial increase in C accumulation, the 79 80 net radiative forcing of a recently thawed area is offset by an increase in CH<sub>4</sub> emissions (Johansson et al., 2006; Sitch et al., 2007; Turetsky et al., 2007). This increase in  $CH_4$  emissions 81

may be a direct result of increased temperature on microbial processes or indirect consequences 82 such as increases in plant mediated transport of CH<sub>4</sub> by increased graminoid abundance and 83 increased anaerobic decomposition due to a high water table (Christensen et al., 2004). In 84 addition to magnitude, the dominant pathway of methane production is also altered after thaw, 85 shifting from CO<sub>2</sub> reduction (hydrogenotrophic) to acetate cleavage (acetoclastic; Hodgkins et 86 al., 2014; McCalley et al., 2014). The change in pathway is likely related to shifts in vegetation, 87 for example, a decrease in Sphagnum abundance could lead to an increase in pH and related 88 increase in acetoclastic methanogens (Hines et al., 2008; Ye et al., 2012). Dissolved organic 89 90 matter (DOM) is also more labile in the more thawed stages and there is increased export of 91 DOM out of the peatland catchment (Hodgkins et al., 2014; Olefeldt and Roulet, 2012, 2014). Recent studies highlight the interactive controls on C fluxes, emphasizing that net radiative 92 93 forcing of a thawing ecosystem depends on non-linear interactions among temperature, degree of anoxia and organic matter chemistry (Lee et al., 2012; Treat et al., 2014). For example, while 94 95 temperature sensitivity of  $CH_4$  flux increases in wet habitats (Olefeldt et al., 2013), ecosystem respiration is more sensitive in dry conditions (McConnell et al., 2013). Interactive controls on C 96 97 fluxes are further complicated by the variable structural conditions as thaw progresses, and the overall effect on landscape level fluxes remains unconstrained. 98

Changes to peatland structure and function due to permafrost degradation have been studied 99 100 using a chronosequence approach with sites that have intact permafrost, completely thawed permafrost and one or two intermediate stages (e.g., Bäckstrand et al., 2010; Turetsky et al., 101 2007; Vogel et al., 2009). While end-member and major thaw stages of the permafrost gradient 102 have been well characterized for plant community structure and carbon cycling, the same is not 103 104 true for the transitional vegetation communities. Carbon cycling in thawing permafrost regions is spatially heterogeneous (e.g. Belshe et al., 2012; Morrissey and Livingston, 1992; Zhang et al., 105 106 2012) and a significant portion of the landscape is in varying stages of thaw. Spatial heterogeneity and transitional stages are therefore important to the ecosystem level C exchanges. 107 It is unclear whether 3 to 5 thaw classes of intact, intermediate and fully thawed permafrost can 108 be used to adequately extrapolate landscape scale C fluxes and their abiotic and biotic correlates. 109 Additional thaw stages may help resolve landscape scale C fluxes in models. 110

111 Our study aims to identify the abiotic and biotic factors (hereafter, correlates) that relate to C function and investigate how these correlates change along end-member and transitional 112 permafrost thaw stages. Our research questions are: 1) which correlates best explain the CH<sub>4</sub> and 113  $CO_2$  fluxes across all thaw stages at a peatland where permafrost is thawing? 2) How does the 114 importance of these correlates change along a gradient of increasing thaw? Our selection of 115 measured correlates was based on current understanding of C flux relationships with 116 temperature, moisture, pH, nutrients and plant biomass. Given the interactive nature of controls 117 on C fluxes and variable structural changes after thaw, we expected to see no relationship 118 between dominant correlates of C flux and degree of thaw. 119

120 2 Methods

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## 122 2.1 Study site

123 The study site, Stordalen mire is located 10 km east of Abisko in Sweden (68°22' N, 19°03' E). The Stordalen peatland complex consists of several landscape units and wetland types. 124 125 Permafrost is present in the dry hummocky sections of the peatland (palsa mire). Also present are areas where permafrost is thawing or has disappeared with vegetation communities that have 126 127 been classified as semi-wet, wet, and tall graminoid (Johansson et al., 2006; Kvillner and 128 Sonesson, 1980). Generally, the drier areas of the peatland complex are composed of species 129 such as Empetrum hermaphroditum, Betula nana, Rubus chamaemorus, Eriophorum vaginatum, Dicranum elongatum and Sphagnum fuscum. The wetter areas consist of species such as E. 130 131 vaginatum, Carex rotundata, S. balticum, E. angustifolium, C. rostrata, S. lindbergii, and S. 132 Riparium. The long term (1912-2003) mean precipitation measured at the Abisko Scientific Research Station (10 km from the site) is 303.3 mm, of which 150 mm occurs between June and 133 September. The long term (1912-2009) mean annual temperature at the site is  $-0.5^{\circ}$ C but has 134 135 surpassed 0°C in the recent decades (summarized in Olefeldt and Roulet (2012) from 136 observations made at Abisko Scientific Research Station). Smoothed mean annual temperature trends suggest a 2.5°C increase between 1913 and 2006. (Callaghan et al., 2010). 137

### 138 **2.2** Vegetation community and thaw stage selection

Ten vegetation communities were selected across Stordalen to represent major stages along the thaw gradient. Selection of communities was based on an across site survey of dominant vegetation communities, coupled with characterization of water table depth and active layer thickness. The sequence of the 10 thaw stages was based on a survey of spring thaw depth and previously established vegetation community relationships with permafrost thaw (Johansson et al., 2006; Kvillner and Sonesson, 1980).

#### 145 2.3 Gas flux measurements

Within each of the 10 selected communities 3 collars of 0.05 m<sup>2</sup> area <u>each</u> were inserted in the
peat surface and served as a seal for the manual gas flux measurements; with the exception of 2
communities that had only 2 collars each as they represent a small area in the mire (Table 1).
Each community also had a PVC dip well installed to measure the water table depth.

150 Methane flux was measured using opaque chambers of volume 9 or 18 liters. <u>Five headspace</u>

151 gas samples of 20 ml each were collected every 5 min over 20 min. Headspace gas samples were

152 collected every 5 minutes over 25 minutes. Prior to collecting each sample, the headspace was

mixed using a syringe. The collected headspace samples were analyzed within 24 hours for

154 concentrations of  $CH_4$  using a Shimadzu GC-2014 gas chromatograph with a flame ionization

detector, after separation on a HayeSep-Q packed column at the Abisko Scientific Research

156 Station. Helium was used as a carrier gas at the flow rate of 30 ml min<sup>-1</sup>. Injector, column and

detector temperatures were 120, 40 and 120  $^{\circ}$ C, respectively. A 10-repetition run of known CH<sub>4</sub>

standard (2 ppm concentration) was used to calibrate the GC before and after each sample run.

159 Accuracy of the analysis (calculated with the standard deviation of the 10 standard replicates)

160 was  $\pm 0.1$  to 0.75%. Flux rates were then calculated using the slope of the linear relationship

161 between gas concentrations and time. Only the relationships with a significant (p<0.05)  $R^2$  above

162 0.85 for the 5 time points were kept to calculate fluxes. If one of the five samples deviated from

- 163 the linear fit, flux was calculated without it as long as the  $R^2$  was greater than 0.95. Methane was
- measured on 7 days and 12 days in the 2012 and 2013 growing seasons, respectively.
- For carbon dioxide flux measurements on the 28 collars, we used clear cylindrical polycarbonatechambers (13 liter volume). The air enclosed within the chambers was mixed by fans and

167 circulated through an infrared gas analyzer (PP Systems, Model EGM-4) that measured changes

- 168 in CO<sub>2</sub> over 3-min measurement intervals (recording every 10 seconds for the first minute, and
- 169 then every 30 seconds for the last 2 minutes). Over the 3 minute measurement period, on
- 170 <u>average, temperature in the chamber only increased by 1.9 °C.</u> Measurements were performed
- 171 for full sun, with a mesh cover and finally with a black shroud, so that data from varying light
- 172 intensities could be collected. Photosynthetically active radiation (PAR) was measured (Model
- 173 LI-190SA, LI-COR<sup>®</sup>, NE, USA) within each chamber over the sample interval. Fluxes were
- 174 calculated using a linear regression of  $CO_2$  concentration change over time.  $CO_2$  was sampled on
- 175 10 days during the 2013 growing season.

## 176 2.4 Ancillary measurements

Each flux measurement of  $CO_2$  or  $CH_4$  was coupled with simultaneous measurements of soil temperature at 10 cm, air temperature, thaw depth and water table depth (WTD). Once during the 2012 growing season, elevation (above sea level) of each collar was measured using a RTK-GPS.

Vegetation composition for vascular plants was surveyed once every growing season in each of 181 182 the collars recording the percent cover of each species. In 2013, vascular green area (VGA) was 183 also measured on 4 days during the growing season using species specific formulae based on leaf-geometry (Lai, 2012; Wilson et al., 2006). For each collar, the total number of green leaves 184 185 per species was recorded along with width and length of 10 leaves for each species. The seasonality of VGA was modeled using a Gaussian fit and combined with a quadratic fit with 186 187 elevation to extrapolate a spatially and temporally higher resolution dataset for VGA. Throughout the manuscript we only use the modeled VGA., referred to as modeled VGA in the 188 189 text.

- Surface water was sampled near the collars on each  $CH_4$  sampling day in thaw stages that had persistent water table throughout the growing season (Thaw stages 5, 7, 8, 9 and 10). Surface
- 192 water samples were analyzed for pH and conductivity (Oakton<sup>®</sup> portable pH conductivity meter)
- and reduced conductivity was calculated by removing H ion concentrations from the
- 194 conductivity. Subsequently, samples were filtered using Whatman<sup>®</sup> Glass Fiber Filters (0.45 μm

pore size) and analyzed for dissolved organic carbon and total nitrogen using a Shimadzu TOCV series Analyzer.

## 197 2.5 Data analysis

- 198  $CH_4$  flux- Each flux measurement was  $\log_{10}$  transformed after adding 12 mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup> to the
- 199 original value (to account for all the negative fluxes). <u>Log<sub>10</sub> transformation decreased the skew in</u>
- 200 the raw data and improved the linear relationship between methane and other variables, allowing
- 201 <u>for the use of multiple linear regressions.</u> Bivariate relationships with abiotic and biotic factors
- were explored with Spearman's rank-order correlations. To explore the relationship between
- 203 environmental correlates and CH<sub>4</sub> flux, we used stepwise multiple linear regression. We used
- 204 both additive and interactive effects to explore a best fit model, but found that interactive effects
- 205 were either insignificant or had a weak contribution to the overall model. For ease of
- 206 interpretation, given that our variables are already proxies for several interacting controls on
- 207 <u>methane fluxes, we only included additive effects in our final model.</u> The best fit model met the
- necessary assumptions of normality and homoscedasticity of model residuals. Multicollinearity
- 209 was checked using variance inflation factors (VIF), wherein any explanatory variable with VIF
- 210 greater than 2 was removed from the model.
- Arrhenius plots were utilized to study the temperature sensitivity of  $CH_4$  flux, regressing the log of  $CH_4$  flux with inverse of temperature in Kelvin.
- 213  $CO_2$  flux- We combined all CO<sub>2</sub> flux data using nonlinear regression of a rectangular hyperbola 214 to describe the relationship of NEE and PAR (Bubier et al., 2003)-

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$$NEE = \frac{GP_{MAX} \times PAR \times \alpha}{PAR \times \alpha + GP_{MAX}} + A$$
 (1)

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- 217 Where the parameters are:
- 218 GP<sub>MAX</sub> the maximum gross photosynthetic CO<sub>2</sub> capture at maximum PAR ( $\mu$ mol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>)
- 219  $\alpha$  the photosynthetic quantum efficiency (µmol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup> per µmol PAR m<sup>-2</sup> s<sup>-1</sup>)
- 220 A the dark respiration at 0 °C ( $\mu$ mol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>)

- 221 Other than PAR, we expected to see non-linear relationships between CO<sub>2</sub> flux and WTD, thaw
- 222 depth, soil temperature and VGA, but we did not find significant relationships. Instead we found
- 223 linear relationships to be significant. Since our data were non-parametric, we used Spearman's
- 224 correlation coefficients to quantify the link between  $CO_2$  flux with abiotic and biotic
- 225 <u>variables.Linear regressions were performed between the CO<sub>2</sub> flux data as well as WTD, thaw</u>
- 226 depth, soil temperature and VGA.
- 227 *Thaw gradient analyses-* above analyses for CH<sub>4</sub> and CO<sub>2</sub> were repeated independently for each
- of the 10 thaw stages. Subsequently, strength (adjusted  $R^2$  or Spearman's  $\rho$ ) and direction of
- relationships between correlates and function variables were organized by thaw stage to observe
- whether there is a significant trend in changing correlates of  $CH_4$  and  $CO_2$  fluxes along the thaw
- 231 gradient. The sequence of thaw stages along the gradient was based on a survey of spring thaw
- depth, as discussed in section 2.2. Multiple regressions were also performed for each thaw stage
- since  $CH_4$  and  $CO_2$  fluxes are not typically estimated using bivariate models. While the bivariate correlations identified how the dominant correlates change across the thaw gradient, multiple
- correlations identified how the dominant correlates change across the thaw gradient, multiple
   regressions across the thaw gradient provide a better idea of the changing interactive effects of
- 236 | abiotic and biotic correlates on  $CH_4$  or  $CO_2$  fluxes.
- 237 Lastly, we evaluated the relationship between  $CH_4$  and  $CO_2$  fluxes using a simple  $CH_4$ :  $CO_2$  flux
- 238 ratio. To use a standardized measure of  $CO_2$  flux we use the  $GP_{MAX}$  from each thaw stage.

## 239 3 Results

# 240 3.1 Across peatland C fluxes and correlates

- Mean and standard error of CH<sub>4</sub> flux across all collars from 2 years of sampling was 91.25 $\pm$ 8.17 mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup>, ranging from -1.1 $\pm$ 0.3 to 370.2 $\pm$ 52.1 mg CH<sub>4</sub> m<sup>-2</sup> d<sup>-1</sup> (Table 1).
- 243 Strongest bivariate relationships between CH<sub>4</sub> flux and abiotic variables were with elevation,
- 244 water table depth, pH, VGA, thaw depth and surface water C:N (Fig. 1). Significant but weaker
- relationships were also found with soil temperature and Julian day. TC, TN, conductivity and
- reduced conductivity did not have a significant relationship with CH<sub>4</sub> flux.

- 247 The best fit multiple regression model for CH<sub>4</sub> fluxes across the peatland included elevation,
- thaw depth, VGA and soil temperature, in decreasing order of contribution to the overall model,
- and these variables were able to explain 73% of the variance in CH<sub>4</sub> flux (Table 2). <u>An</u>
- 250 alternative model that excluded elevation wherein the adjusted R<sup>2</sup> drops to 0.62, is also reported
- 251 as it better isolated the effects of VGA, soil temperature and thaw depth. The contribution (beta
- 252 weights reported in brackets) of soil temperature (0.16) and thaw depth (-0.27) are similar in the
- 253 model with or without elevation. The contribution of VGA increases from 0.26 to 0.58 when
- 254 elevation is removed from the model.
- 255 Photosynthetically active radiation showed the strongest relationship with CO<sub>2</sub> fluxes, explaining
- 55% of the variance observed in the flux data (Fig. 2). The rectangular hyperbola fit of NEE
- against PAR, Eq. (1), provided the following parameter estimates and standard errors for the
- across site lumped data:  $GP_{MAX}$  was 4.24±0.26 µmol CO<sub>2</sub> m<sup>-2</sup> s<sup>-1</sup>,  $\alpha$  was 0.027±0.005 µmol CO<sub>2</sub>
- 259  $m^{-2} s^{-1}$  per µmol PAR  $m^{-2} s^{-1}$  and A was -1.78±0.09 µmol CO<sub>2</sub>  $m^{-2} s^{-1}$ .
- Water table depth and thaw depth showed weak relationships with NEE and GPP (calculated using NEE minus  $R_{eco}$ ; Table 3). Soil temperature was also related to  $R_{eco}$  and NEE. NEE and Reco were most strongly related to the mean growing season VGA (Table 3).

# **3.2 Correlate-function relationships within the thaw stages**

264 Along the thaw gradient, the strength and direction of bivariate relationships among 265 environmental variables and CH<sub>4</sub> flux changed variably (Fig. 3). No significant trend along the 266 thaw gradient was observed for the relationship between CH<sub>4</sub> flux and elevation, VGA (vascular green area) and WTD. Significant trends were observed with the water chemistry variables of 267 pH, C:N, TC, TN and conductivity and strength of correlations between correlate and CH<sub>4</sub> flux 268 269 increased as the permafrost thawed. However, these data were only available for thaw stages 270 with a water table (thaw stages 5 to 10). Soil temperature, thaw depth and Julian day, with data available for each of the 10 thaw stages, showed significant trends along the thaw gradient in 271 272 their correlation with the  $CH_4$  flux (Fig. 4 a, b, and c). There was an increase in the amount of variance explained in the CH<sub>4</sub> flux by temperature as well as the slope of this relationship (Fig. 273 274 5).

- 275 The parameter estimates from the best fit model of across peatland lumped flux data, as shown in
- Table 2, were used as inputs for individual multiple regression models for each thaw stage. The
- 277 interactive effects of elevation, soil temperature, thaw depth and vascular green area (VGA)
- showed varying results across the thaw gradient (Fig. 6). The model  $R^2$  values ranged from 0.09
- (insignificant) to 0.79 (significant with p<0.0001). Generally, elevation, soil temperature, thaw
- depth and VGA were better predictors of variance in  $CH_4$  fluxes in the later stages of thaw.
- 281 Model fit was non-significant for stages 2 and 3, and therefore their slope coefficients are not
- 282 <u>reported in Fig 6.</u>
- The relationship of NEE with temperature and with PAR varied across the thaw gradient without a statistically significant trend. Generally there is a trend of increasing,  $GP_{MAX}$ ,  $\alpha$  and A, going from less thawed to more thawed stages (Table 4). Furthermore, the amount of variance of NEE explained by PAR was typically higher in the more thawed stages.

# 287 3.3 The relationship between CO<sub>2</sub> and CH<sub>4</sub>

- **288** <u>GP<sub>MAX</sub> and CH<sub>4</sub> were positively correlated ( $\rho$ =0.56, p=0.0021; Fig. 7). We found that the best</u>
- **289** explanatory variables for CH<sub>4</sub>: GP<sub>MAX</sub> ratio were Sphagnum percent cover ( $\rho = -0.72$ , p=0.008;
- 290 and graminoid VGA ( $\rho = 0.63$ , p = 0.0004). While graminoid VGA did not have any interactive
- 291 <u>effects with abiotic variables in explaining CH<sub>4</sub>: GP<sub>MAX</sub> ratio, *Sphagnum* cover and soil</u>
- 292 <u>temperature had a significant interactive effect (Table 5)</u>
- 293

# 294 4 Discussion

We identified the major abiotic and biotic correlates of the ecosystem – atmospheric exchanges of  $CO_2$  and  $CH_4$  across Stordalen mire and found that, as per our expectation, these environmentfunction relationships changed variably across the thaw gradient, suggesting that correlates of  $CO_2$  and  $CH_4$  fluxes in transitional stages are not necessarily represented well by correlates of the end-member or adjacent thaw stages. Contrary to our expectation, we did see significant trends with thaw in certain bivariate correlations of  $CH_4$  fluxes such as temperature sensitivity, seasonality and effect of deepening frost table during the growing season. However, these trends were absent when multiple correlates were considered together, suggesting that dominantcontrols on C fluxes and their interactions, change variably as thaw progresses.

## **304 4.1 Across peatland correlates of C fluxes**

305 Strongest environmental factors associated with the CH<sub>4</sub> flux across all sampled collars wereelevation, water table depth, pH, VGA, thaw depth and surface water C:N. Each of these 306 307 correlates is a possible proxy of one or more controls of temperature, moisture and substrate quantity and quality on CH<sub>4</sub> flux. Our correlations support previous findings from various 308 309 wetland types (as reviewed in Lai, 2009; Olefeldt et al., 2013; Turetsky et al., 2014). The multiple regression of lumped data across Stordalen also showed similar trends to other 310 temperate, boreal or arctic peatlands. For example, a peatland complex sampled in the 311 discontinuous permafrost region of Manitoba, Canada by Bubier et al. (1995) showed a best fit 312 313 model including WTD, water chemistry and vegetation variables explaining 81% of the variance 314 in CH<sub>4</sub> fluxes. Bubier et al. (1995) reported WTD as being the strongest individual correlate with the CH<sub>4</sub> fluxes, but in our best fit model, WTD was not an important variable likely because the 315 316 stages with little or no thaw had no water table. Elevation seems to be a better proxy for soil moisture (and other CH<sub>4</sub> controls), showing the highest contribution to the best fit model (Table 317 318 2). Elevation has been previously recognized as an integrator of multiple structural changes resulting from permafrost thaw and is a potentially useful component of models estimating C 319 320 flux in permafrost landscapes (Lee et al., 2011). Rerunning the best fit model without elevation decreases the overall model fit by 10% but increases the contribution of VGA to the model, 321 322 while the contribution of thaw depth and soil temperature remain the same. Removal of elevation from the model better isolates the relative effects of thaw depth, temperature and VGA on 323 324 methane fluxes and suggests that the strongest contribution is from VGA, followed by thaw depth and soil temperature. VGA is likely a strong effect as it is linked with spatial and seasonal 325 326 changes in substrate availability, litter input and root exudates and thus relates to both spatial and temporal variability in CH<sub>4</sub> flux (Whiting and Chanton 1993). 327 Soil temperature and thaw depth are significant variables in our multiple regression model of 328

- $CH_4$  flux, while Julian day is not. It may be that across the permafrost gradient, Julian day does
- not capture seasonality as well as a combination of thaw depth and soil temperature (Table 2),

suggesting the role of the variable seasonal trajectories of thaw depth and soil temperature in the
different thaw stages, for predicting CH<sub>4</sub> flux.

As expected, PAR was the strongest correlate of NEE both in across peatland lumped data and 333 334 within thaw stage data. Using the rectangular hyperbola fit, Frolking et al. (1998) reported parameters from 13 peatland sites wherein PAR explained, on average, 68% (ranging from 47 to 335 336 89%) of the variance in NEE. Comparatively our across peatland lumped data fit to the 337 rectangular hyperbola model explain a lower percent of the variance (52 %) in NEE, likely due to biases introduced by the high spatial heterogeneity on our site (Laine et al., 2009). 338 Comparatively our across peatland lumped data fit to the rectangular hyperbola model explain a 339 lower percent of the variance (52%) in NEE, likely due to the structural heterogeneity on our 340 341 site. WTD, thaw depth and soil temperature also show significant but weak relationships with  $CO_2$  fluxes. Vascular green area seems to be a better proxy than WTD, thaw depth and soil 342 343 temperature for controls on  $CO_2$  fluxes, which was makes sense as VGA represents the amount of photosynthesizing area as well as approximates above and belowground biomass which is 344 345 related to autotrophic and heterotrophic respiration (Schneider et al., 2011; Wilson et al., 2006).

346 4.2 Trends with increasing thaw

Bivariate relationships between correlates and CH<sub>4</sub> flux progress variably as the permafrost 347 348 thaws although some significant trends of increasing correlations are seen in soil temperature, thaw depth and Julian day, as thaw progresses (Fig. 3, 4 and 5). We found that as the permafrost 349 thaws, temperature sensitivity increases (Fig. 4a), increasing thaw depth has an increasing effect 350 351 on CH<sub>4</sub> fluxes (Fig. 4b) and there is a stronger seasonality effect (Fig. 4c). This trend of increasing correlation could be partly due to the increasing magnitude and variance of not only 352 CH<sub>4</sub> fluxes but also the environmental variables with thawing permafrost. Additionally, higher 353 VGA later in the growing season could also be result in a stronger seasonality effect (Fig. 4c) in 354 the later stages of thaw, especially as these stages had the highest sedge VGA. The Arrhenius 355 plots of soil temperature and  $CH_4$  fluxes showed increased temperature sensitivity from less 356 thawed to more thawed stages, with the slope and  $R^2$  of this regression increasing (Fig. 5). 357 358 Changing temperature sensitivity in our results contradicts results from Yvon-Durocher et al. 359 (2014) that suggest a consistent temperature sensitivity of CH<sub>4</sub> fluxes across scales. Apparent temperature sensitivity can be confounded due to changes in substrate availability (Kirschbaum, 360

361 2006). Increasing temperature sensitivity with thaw in our results could be related to higher substrate availability (supported by higher VGA) in thawed stages switching CH<sub>4</sub> production 362 363 from being substrate limited to becoming temperature limited. Lower temperature sensitivity in the intact permafrost could also be related to DOC quality. Olefeldt et al. (2012) report higher 364 aromaticity in DOC exported from palsa and bog catchments at Stordalen compared to fen 365 catchments and a high proportion of aromatic compounds in litter is generally associated with 366 decreased temperature sensitivity (eg. Erhagen et al., 2013). High temperature sensitivity in 367 wetter sites has also been reported by Olefeldt et al. (2013) in a meta-analysis of  $CH_4$  emissions 368 369 from terrestrial ecosystems worldwide. Christensen et al. (2003) found that temperature is a 370 limiting factor only when the WTD is 10 cm or less below the surface, whereas a lower WTD is more sensitive to WTD fluctuations than to soil temperature fluctuations. This is generally 371 372 supported in our results with stages 4 to 6 that have growing season mean WTD greater than 10 cm (Table 1) having lower sensitivity to WTD than stages 7 to 10, though there is variability in 373 both classes (Fig. 3). Our estimated temperature sensitivity for each thaw stage is the net effect 374 of temperature on methanogenesis and methanotrophy and since we only measure the net CH<sub>4</sub> 375 flux we cannot isolate the relative temperature sensitivities for the two processes. Also 376 interesting is the effect of the increasing thaw, over the growing season, on CH<sub>4</sub> flux- more 377 378 significant in the wetter more thawed stages than the drier intact permafrost stages (Fig. 3 and 4b). A similar trend was also emphasized in Olefeldt et al. (2013). The deepening frost table is 379 380 related to temperature and thus could also represent the larger temperature sensitivity of CH<sub>4</sub> in later thaw stages. Additionally, larger variance in thaw depths of later thaw stages could explain 381 382 the larger effect of thaw depth in these stages .The larger variance in thaw depth could be attributed to a steeper drop in thaw depths as the growing season progresses in the wetter thaw 383 384 stages due to the dependence of thermal conductivity of peat on the degree of wetness (Quinton et al. 2009). 385

While bivariate relationships between correlates and C flux provide insight into the possible controls on these fluxes, multiple regressions better demonstrate the interactive nature of these correlates. Re-running the best fit model of the lumped data (Table 2) for each thaw stage showed that the strength of the overall model and the parameter estimates are variable along the thaw gradient (Fig. 6). While elevation had a strong effect in across peatland lumped data, it makes sense that it was a significant effect only for a few within thaw stage analyses (thaw stages 1, 4, 8 and 9) because these stages had diverse habitats with spatially varying elevations. Soil Temperature was not a statistically significant estimate for any of the thaw stages, possibly because elevation and thaw depth are better proxies for the long term thermal regime and also relate to several other controls of  $CH_4$  flux, as previously mentioned.(significant for stages 1, 4, 5, 7, 8 and 10) better accounted for thermal regimes. VGA was only a significant effect within thaw stages 8 and 9. These results emphasize that spatial differences in elevation are not as important within thaw stages as they were in across peatland lumped data. Also, thaw depth and

399 VGA have variable effects but generally stronger in the thawed stages.

Similar to CH<sub>4</sub> flux, the strength of the major correlate for CO<sub>2</sub> flux (PAR) changes variably 400 across the thaw gradient. While the across peatland relationship of NEE with temperature and 401 402 PAR is weaker than that found in other peatland sites (e.g. Bubier et al., 2003), when broken down into thaw stages, the percent variance of NEE explained increases (up to 91%; Table 4) for 403 many thaw stages. The sample size for each thaw stages is different making it problematic to 404 statistically compare the thaw stages. However, we found that the  $R^2$  is not significantly 405 406 correlated to the sample size for that thaw stage, suggesting that there are other factors increasing the control of PAR on NEE as permafrost thaws such as increased photosynthesizing biomass 407 408 (reflected by increasing VGA and GPP). If VGA is no longer limiting, PAR sensitivity could be 409 increasing as permafrost thaws. This is supported in the parameter fitting for each thaw stage 410 (Table 4), the general trends observed are that the  $CO_2$  fixed at maximum PAR ( $GP_{MAX}$ ) increases as permafrost thaws as does the amount of  $CO_2$  fixed per unit of PAR ( $\alpha$ ), both of 411 which could be related to increase in VGA but also the photosynthetic capacity change from 412 plant species changes. The amount of respiration at 0°C generally increases with thaw, which 413 could be related to increasing substrate availability. Trends of increasing GPP and ecosystem 414 415 respiration with permafrost thaw have been reported in previous studies (eg. Dorrepaal et al., 2009; Hicks Pries et al., 2013). However, in our results these trends are not significant along the 416 417 thaw gradient and progress variably.

# 418 4.3 Relationship between NEE and CH<sub>4</sub>

NEE is thought to be related to CH<sub>4</sub> emissions due to the shared association with recently
produced substrate availability, root exudates and turnover and litter input, and this link has been
observed in several studies (Bellisario et al., 1999; Ström and Christensen, 2007; Whiting and

422 Chanton, 1993, etc.). In our thaw stages, there was also an overall significant and positive 423 relationship between growing season averages of  $GP_{MAX}$  and CH<sub>4</sub> ( $\rho$ =0.56, p=0.0021; Fig. 7). 424 Interestingly, thaw stages 8 to 10 (graminoid dominated) have a different relationship of  $GP_{MAX}$ and CH<sub>4</sub> compared with thaw stages 1 to 7 (moss dominated) suggesting a shift in the 425 partitioning of C loss from the system as CO<sub>2</sub> or CH<sub>4</sub> with increasing thaw and changing 426 vegetation. We further expected this shift to be related to an increase in graminoid VGA 427 428 (increase in lability and CH<sub>4</sub> emission via aerenchyma)investigated whether this shift is related, which was supported by our data. Surprisingly, we also found the shift to be related to a loss of 429 Sphagnum cover, -( perhaps due to an increase in pH and decrease in organic matter lability.) or 430 increase in graminoid species (increase in lability and CH<sub>4</sub> emission via aerenchyma). Both 431 percent cover of Sphagnum (p= 0.72, p=0.008) as well as VGA of graminoid species (p=0.63, 432 p=0.0004) in the collar were significantly related to CH<sub>4</sub>:CO<sub>2</sub>. AdditionallyFurthermore, there 433 was a significant interaction between soil temperature and *Sphagnum* cover in a linear model 434 explaining CH<sub>4</sub>:CO<sub>2</sub>, suggesting that the relationship of CH<sub>4</sub> and CO<sub>2</sub> depends on Sphagnum 435 abundance but the effect of *Sphagnum* varies by temperature (Table 5). 436

### 437 **4.4** Variable changes in ecosystem relationships with increasing thaw

438 Permafrost thaw increases magnitude and variance of CO<sub>2</sub> and CH<sub>4</sub> fluxes as well as changes the abiotic and biotic correlates of these fluxes. As a result, the relationships between the correlates 439 440 and C fluxes change. While in the lumped across peatland data, spatially variable factors are the dominant correlates of CO<sub>2</sub> and CH<sub>4</sub> fluxes (elevation being the best proxy for thermal regime, 441 442 soil moisture, VGA, etc.), within thaw stages it is the correlates with high temporal variations that play a critical role (Julian day, deepening frost table and soil temperature). The changing 443 correlates of  $CO_2$  and  $CH_4$  fluxes are important to consider from a context of upscaling these 444 processes from within thaw stage to site to landscape scales. Changing sensitivity of CH<sub>4</sub> fluxes 445 446 to temperature, likely related to a shift from substrate to temperature limitation going from low biomass and low nutrient palsa stages to high biomass and high nutrient thawed stages. Based 447 448 on the range of temperature response curves of  $CH_4$  flux across the thaw gradient (Fig. 4a), applying one activation energy value to estimate landscape level CH<sub>4</sub> fluxes at Stordalen would 449 450 not be appropriate and would likely require a set of parameterizations for the various thaw stages. Variable temperature sensitivities to C fluxes have been recognized in major thaw stages 451

in the past (eg. Lupascu and Wadham, 2012), but our study demonstrates that this variability is present even in the transitional stages. Furthermore, the multiple regression analyses for each thaw stages (Fig. 6) demonstrated the changing relative importance and interactive effects of dominant correlates of  $CH_4$  flux highlighting that controls in transitional stages of permafrost thaw are not necessarily related to controls in adjacent or end-member stages.

457 Paleo-ecological methods were not employed to confirm the actual thaw status of the thaw stages 458 used in our analyses. Rather, our space for time approach was employed to sample the major stages of thaw at Stordalen acknowledged in previous studies (Bäckstrand et al., 2010; Johansson 459 et al., 2006; Svensson et al., 1999, etc.)- encompassing palsa (our stages 1 to 3), internal fen (our 460 stages 4 to 6), completely thawed flow through fen (our stages 7 to 10) type habitats- while 461 462 capturing the wide range of structural conditions within each one of these 3 broad thaw stages. We acknowledge that structural changes due to thaw may progress variably and tried to capture 463 464 each of these pathways. For example, palsa may collapse abruptly into a wet sedge dominated habitat that then switches to a Sphagnum lawn (our thaw stage 1 progressing into stage 8 and 465 466 then to stage 5). Alternatively, this progression can be gradual with a decrease in elevation of palsa (stage 1 to 2 and then 3), followed by progression into Sphagnum lawn (stage 4 and 5). 467 468 Regardless, the focus of our study was the changing correlates of C fluxes along the thaw 469 gradient and a proposed sequence of thaw stages was required to analyze these changes.

#### 470 **5** Conclusions

Our results on the environmental correlates of C fluxes interacting and changing variably with
thaw suggest that using process based models or relationships between NEE and CH<sub>4</sub> flux to
derive landscape level C fluxes would require additional information about transitional thaw
stages.

Peatlands in the discontinuous permafrost zone are highly heterogeneous, especially if they are
actively thawing. Our research highlights the variability observed in structure-function
relationships with permafrost thaw. Additionally, by identifying across peatland structurefunction relationships that are maintained across the heterogeneous landscape our results will
assist in improving regional estimates of the carbon balance and provide insight into the level of
aggregation or disaggregation needed in models to capture ecosystem level response to change.

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### 676 **6 Tables**

**Table 1**. Details of each thaw stage- habitat description and dominant vegetation, vascular plant green area (VGA), presence or absence of permafrost, mean growing season water table depth (from 19 days of sampling over 2 years), mean surface water pH, reduced conductivity (Cond) and C:N ratio, growing season mean soil temperature at 10 cm depth below surface and mean growing season CH<sub>4</sub> fluxes. Details on CO<sub>2</sub> flux for each thaw stage can be found in Table 4. WTD was only reported for stages with a water table on more than 5 sampled days. All values reported after  $\pm$  are standard errors.

	Habitat description and dominant vegetation	Mean VGA (cm <sup>2</sup> )	Perma- frost	Mean WTD (cm)	pН	Cond (mg L <sup>-1</sup> )	C:N	Mean Soil temperature (°C)	$\begin{array}{c} \text{Mean } CH_4 \\ \text{flux} \\ (\text{mg } \text{m}^{-2} \text{ day}^{-1}) \end{array}$
1	Intact palsa, Dicranum elongatum, Vaccinium uliginosum	279.6	1	-	-	-	-	6.2±0.2	-1.3±0.2
2	Slightly thawing palsa, D. elongatum, Eriophorum vaginatum, Ptillidium ciliare	232.7	1	-	-	-	-	6.7±0.2	7.1±1.1
3	Collapsing palsa, desiccated Sphagnum fuscum, lichens, Andromeda polifolia	66.7	1	-	-	-	-	6.6±0.2	-1.1±0.3
4	<i>Sphagnum</i> lawn in transition between stage 3 and 5	54.0	-	-11.6±1.3	-	-	-	8.3±0.3	$7.6 \pm 1.4$
5	Sphagnum lawn	60.3	-	-10.1±0.7	4.0	8.0	35.8	7.2±0.3	$18.7 \pm 2.7$
б	Sphagnum lawn, Betula nana	312.1	-	-11.5±0.6	-	-	-	8.1±0.4	29.5±4.8
7	E. vaginatum, S. cuspidatum, open water	334.4	-	-2.3±0.6	4.1	17.0	45.3	9.9±0.3	$56.5 \pm 3.5$
8	E. vaginatum, Drepanocladus schulzei, open water	322.0	-	1.8±0.9	4.0	76.2	47.9	10.4±0.3	$102.4 \pm 7.5$
9	Eriophorum angustifolium, open water	1136.3	-	2.3±0.6	4.5	30.0	46.6	7.6±0.3	$370.2 \pm 52.1$
10	Polytrichum jensenii, Carex rostrata	1528.7	-	-5.8±1.3	4.7	22.6	53.0	7.2±0.3	266.2±22.7

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**Table 2.** Multiple regression model between environmental variables and CH<sub>4</sub> flux across the site. Listed environmental variables explain 73% of the variance in CH<sub>4</sub> flux ( $R^2 = 0.73$ ,  $F_{4,391}$ =267.1, p<0.0001)

		Std		
Term	Estimate	Error	t Ratio	Prob> t
Intercept	344.38	26.94	12.8	<.0001
Elevation	-0.98	0.077	-12.8	<.0001
Soil temp	0.031	0.007	4.43	<.0001
Thaw depth	-0.005	0.001	-8.50	<.0001
VGA	0.001	0.000	7.09	<.0001

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**Table 3.** Abiotic and biotic relationships with Gross Primary Production (GPP =NEE- $R_{eco}$ ), Net Ecosystem Exchange (NEE) and Ecosystem Respiration ( $R_{eco}$ ).  $R_{eco}$  has negative values and therefore, negative correlation signifies that larger VGA or Soil temp have higher  $R_{eco}$ . Similarly, since thaw depth has negative values, negative correlations with GPP and NEE mean that deeper frost tables relate to greater GPP and NEE.

Function	Correlate	Spearman's p	p-value
NEE	Thaw Depth	-0.21	0.0058
NEE	Soil Temp	0.14	0.0112
NEE	WTD	0.24	0.0002
NEE	VGA	0.58	0.0180
GPP	Thaw Depth	-0.29	0.0020
GPP	WTD	0.20	0.0177
$R_{eco}$	Soil Temp	-0.16	0.0226
R <sub>eco</sub>	VGA	-0.56	0.0250

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731	<b>Table 4.</b> Parameter estimates $\pm$ standard error from rectangular hyperbola fit of NEE and PAR.
732	PAR dependence of NEE generally increases and becomes more significant from less to more
733	thawed stages as shown by the adjusted $R^2$ (p<0.0001 for all thaw stages). There is a general
734	trend of increasing, GP <sub>MAX</sub> , alpha and A, going from less thawed to more thawed stages.

Thaw	$GP_{MAX}$	α	А	$R^2$	n
Stage	$(\mu mol CO_2 m^{-2} s^{-1})$	$(\mu mol CO_2 m^2 s^{-1})$ /( $\mu mol PAR m^{-2} s^{-1}$ )	$(\mu mol CO_2 m^{-2} s^{-1})$		
1	$3.85 \pm 1.21$		$-4.36 \pm 0.53$	0.59	26
2	$3.99 \hspace{0.2cm} \pm \hspace{0.2cm} 0.53$	$0.015 \hspace{0.2cm} \pm \hspace{0.2cm} 0.004$	$-1.72 \pm 0.16$	0.71	75
3	$2.82 \pm 0.61$	$0.008 \hspace{0.2cm} \pm \hspace{0.2cm} 0.003$	$-1.52 \pm 0.13$	0.80	26
4	$2.44 \hspace{0.2cm} \pm \hspace{0.2cm} 0.31$	$0.014 \hspace{0.2cm} \pm \hspace{0.2cm} 0.005$	$-0.89 \pm 0.11$	0.76	52
5	$3.87 \hspace{0.2cm} \pm \hspace{0.2cm} 0.30$	$0.030 \hspace{0.2cm} \pm \hspace{0.2cm} 0.007$	$-1.28 \pm 0.11$	0.85	78
6	$5.15 \hspace{0.2cm} \pm \hspace{0.2cm} 0.52$	$0.053 \hspace{0.2cm} \pm \hspace{0.2cm} 0.021$	$-2.76 \pm 0.25$	0.89	27
7	$6.28 \hspace{0.2cm} \pm \hspace{0.2cm} 0.72$	$0.032 \hspace{0.2cm} \pm \hspace{0.2cm} 0.010$	$-1.79 \pm 0.24$	0.74	78
8	$2.15 \hspace{0.2cm} \pm \hspace{0.2cm} 0.24$	$0.015 \hspace{0.2cm} \pm \hspace{0.2cm} 0.005$	$-0.94 \pm 0.09$	0.82	98
9	$8.16 \hspace{0.2cm} \pm \hspace{0.2cm} 0.86$	$0.072 \hspace{0.2cm} \pm \hspace{0.2cm} 0.023$	$-3.49 \pm 0.32$	0.91	27
10	$6.62 \pm 1.34$		$-5.35 \pm 0.82$	0.69	18

**Table 5.** Multiple regression model of CH<sub>4</sub>:CO<sub>2</sub> explained by percent cover of *Sphagnum* and

soil temperature. ( $R^2$ =0.86,  $F_{3,11}$  = 16.8, p= 0.0008). Estimates and standard errors (SE) are

reported along with t-ratio and p-value.

Intercept2107.1444.14.750.0013Soil Temperature-232.558.6-3.970.004% Sphagnum-3.00.5-5.710.0004		Estimate	SE	t-ratio	p-value
% Sphagnum         -3.0         0.5         -5.71         0.0004	Intercept		444.1		0.0015
		-232.5	58.6	-3.97	0.0041
Soil Temp x % <i>Sphagnum</i> 11.8 3.5 3.39 0.009.	% Sphagnum	-3.0	0.5	-5.71	0.0004
	Soil Temp x % Sphagnum	11.8	3.5	3.39	0.0095

# 771 7 Figure Captions

**Figure 1.** Relationship between the methane fluxes measured over two years and various environmental variables (across peatland lumped data). Methane flux across 28 sampled collars from two years (19 days of sampling) showed significant relationships with Julian day, elevation (above sea level) of collar, soil temperature at 10 cm depth below surface( $^{0}$ C), modeled VGA (vascular green area;cm<sup>2</sup>), water table depth (WTD), pH, thaw depth and C:N of surface water. Spearman's  $\rho$  of each correlation are shown on each graph (p<0.0001).

**Figure 2.** Rectangular hyperbola fit of site-level NEE with PAR (n= 525).

**Figure 3.** Correlation coefficients between  $CH_4$  flux and various biotic and abiotic variables along the thaw gradient from 1 to 10, where 1 is intact permafrost and 10 is fully thawed. Each data point represents correlations analysis of n=19 days. The missing data points in WTD, Conductivity, Reduced Conductivity, pH, TC, TN and C:N (total carbon, nitrogen and C:N in surface water) are from the thaw stages that did not have a water table or had a correlation coefficient of zero.

**Figure 4a.** Arrhenius plots for each thaw stage. Slope and  $R^2$  of the plots increases with increased thaw (Figure 6). **b.** changing linear fit between thaw depth and CH<sub>4</sub> flux with progressing thaw. **c.** increase in seasonality of CH<sub>4</sub> flux as the permafrost thaws.

**Figure 5.** Slope and adjusted  $R^2$  of the Arrhenius plot (Figure 4a) across the thaw stages. The left y axis is the estimate and standard error of the slope of the fit (represented by the gray bars±SE) and the right y axis shows the  $R^2$  of each fit (represented by the black dots±SE). The significant regressions (p<0.0001) are denoted by asterisk. Variance of methane fluxes explained by soil temperature generally increases (as shown by the dotted line of best fit of  $R^2$  along the thaw gradient) and becomes more significant (p-values) from less to more thawed stages. Slope of the soil temperature to methane flux relationship also increases with increased thaw.

**Figure 6.** Multiple regression of CH<sub>4</sub> fluxes with elevation, thaw depth, soil temperature (Temp) and vascular green area (VGA) for each thaw stage (Thaw stage 1= intact permafrost, 10= completely thawed). Model fit  $R^2$  values are reported along with model estimates (stacked bars). Significance of the  $R^2$  is denoted by asterisk (\* for p<.05, \*\* for p<.01, and \*\*\* for p<.001). Soil Temperature was not a statistically significant estimate for any of the thaw stages. Elevation was

- significant for thaw stages 1, 4, 8 and 9; thaw depth for 1, 4, 5, 7, 8 and 10; and VGA for 8 and9.
- **Figure 7.** Significant correlation between growing season means of CH<sub>4</sub> flux and GP<sub>MAX</sub> across
- all thaw stages. Thaw stage 1 (intact permafrost) to 10(thawed permafrost) are shown using blue
- to red colours.