



# Growing season CH<sub>4</sub> and N<sub>2</sub>O fluxes from a subarctic landscape in northern Finland; from chamber to landscape scale

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**Abstract.** Subarctic and boreal emissions of CH<sub>4</sub> are important contributors to the atmospheric greenhouse gas (GHG) balance and subsequently the global radiative forcing. Whilst N<sub>2</sub>O emissions may be lower, the much greater radiative forcing they produce justifies their inclusion in GHG studies. In addition to the quantification of flux magnitude, it is essential that we understand the drivers of emissions to be able to accurately predict climate-driven changes and potential feedback mechanisms. Hence this study aims to increase our understanding of what drives fluxes of CH<sub>4</sub> and N<sub>2</sub>O in a subarctic forest/wetland landscape during peak summer conditions and into the shoulder season, exploring both spatial and temporal variability, and uses satellite-derived spectral data to extrapolate from chamber-scale fluxes to a 2 km × 2 km landscape area.

From static chamber measurements made during summer and autumn campaigns in 2012 in the Sodankylä region of northern Finland, we concluded that wetlands represent a significant source of CH<sub>4</sub> ( $3.35 \pm 0.44 \text{ mg C m}^{-2} \text{ h}^{-1}$  during the summer campaign and  $0.62 \pm 0.09 \text{ mg C m}^{-2} \text{ h}^{-1}$  during the autumn campaign), whilst the surrounding forests represent a small sink ( $-0.06 \pm <0.01 \text{ mg C m}^{-2} \text{ h}^{-1}$  during the summer campaign and  $-0.03 \pm <0.01 \text{ mg C m}^{-2} \text{ h}^{-1}$  during the autumn campaign). N<sub>2</sub>O fluxes were near-zero across both ecosystems.

We found a weak negative relationship between CH<sub>4</sub> emissions and water table depth in the wetland, with emissions decreasing as the water table approached and flooded the soil surface and a positive relationship between CH<sub>4</sub> emissions and the presence of *Sphagnum* mosses. Temperature

was also an important driver of CH<sub>4</sub> with emissions increasing to a peak at approximately 12 °C. Little could be determined about the drivers of N<sub>2</sub>O emissions given the small magnitude of the fluxes.

A multiple regression modelling approach was used to describe CH<sub>4</sub> emissions based on spectral data from PLEIADES PA1 satellite imagery across a 2 km × 2 km landscape. When applied across the whole image domain we calculated a CH<sub>4</sub> source of  $2.05 \pm 0.61 \text{ mg C m}^{-2} \text{ h}^{-1}$ . This was significantly higher than landscape estimates based on either a simple mean or weighted by forest/wetland proportion ( $0.99 \pm 0.16$ ,  $0.93 \pm 0.12 \text{ mg C m}^{-2} \text{ h}^{-1}$ , respectively). Hence we conclude that ignoring the detailed spatial variability in CH<sub>4</sub> emissions within a landscape leads to a potentially significant underestimation of landscape-scale fluxes. Given the small magnitude of measured N<sub>2</sub>O fluxes a similar level of detailed upscaling was not needed; we conclude that N<sub>2</sub>O fluxes do not currently comprise an important component of the landscape-scale GHG budget at this site.

## 1 Introduction

Almost a third of the world's soil carbon is estimated to be stored in boreal and subarctic wetlands (Gorham, 1991) yet greenhouse gas (GHG) emissions are still poorly constrained (e.g. Bridgman et al., 2013). Furthermore, the potential feedbacks between high-latitude carbon and the global atmospheric radiative balance is not fully understood or accurately accounted for in coupled climate–carbon cycle models

(Koven et al., 2011). Boreal nitrogen (N) stocks are significantly understudied compared to C. However, boreal forests are known to be significant stocks of organic N, peatlands are estimated to contain approximately 10–15 % of the global N pool, and permafrost regions are thought to contain between 40 and 60 Pg of N (Abbott and Jones, 2015; Loisel et al., 2014; Valentine et al., 2006).

It is now accepted that global surface air temperatures are rising and the rate of increase is greatest in these high-latitude areas (Pachauri and Reisinger, 2007). Hence understanding both the current magnitude of GHG emissions and the drivers is essential to monitor and predict climate-driven changes and climate feedback mechanisms.

Whilst it is important to understand the direct implications of increased temperature on net GHG emissions (CO<sub>2</sub>, CH<sub>4</sub> and N<sub>2</sub>O), it is also critical to consider the indirect impact through secondary drivers such as permafrost thaw, changes in vegetation community structure, substrate availability, soil hydrological regimes and flow path dynamics. These factors, both individually and via interactions, are likely to alter both net GHG emissions and GHG speciation; for example, a recent meta-analysis showed that the temperature sensitivity of CH<sub>4</sub> was greater than that of CO<sub>2</sub>, suggesting that increased temperature may lead to changes in the CH<sub>4</sub> : CO<sub>2</sub> emission ratio (Yvon-Durocher et al., 2014). The sensitivity of CH<sub>4</sub> fluxes to these environmental controls is not currently well understood; for example, previous studies show differing responses to water table dynamics (e.g. Aerts and Ludwig, 1997; Olefeldt et al., 2013; Turetsky et al., 2014; Waddington et al., 1996). This limits the ability of mechanistic models to accurately simulate actual net fluxes. A significant research focus is required to fully explain the drivers of GHG emissions to provide a solid basis for future prediction.

Much of the previous research effort in this field has been focussed on CO<sub>2</sub>, the most abundant atmospheric GHG, often followed by CH<sub>4</sub> and to a much lesser extent N<sub>2</sub>O. Knowledge of the distribution of N<sub>2</sub>O fluxes across high-latitude ecosystems is in fact almost entirely lacking. Examples of mean growing season net ecosystem exchange values across subarctic/boreal regions include an uptake of 1.7 g CO<sub>2</sub> m<sup>-2</sup> d<sup>-1</sup> (Lafleur, 1999) and 5.47 g CO<sub>2</sub> m<sup>-2</sup> d<sup>-1</sup> (Fan et al., 1995), both from Canadian forest sites, and an uptake of 3.86 g CO<sub>2</sub> m<sup>-2</sup> d<sup>-1</sup> (Aurela et al., 2002) from a Finnish mesotrophic flark fen. Whilst CH<sub>4</sub> and N<sub>2</sub>O emissions are generally lower than net CO<sub>2</sub> emissions, the greater radiative forcing they produce, as described by the global warming potential (GWP), justifies their inclusion in GHG studies. The 100-year GWPs with and without climate-carbon feedbacks, respectively, are currently estimated as 28 and 34 for CH<sub>4</sub> and 265 and 298 for N<sub>2</sub>O (Myhre et al., 2013). Overall, boreal forests appear to be a small sink for CH<sub>4</sub> and a small source of N<sub>2</sub>O (Moosavi and Crill, 1997; Pihlatie et al., 2007) whilst wetlands typically represent sources of CH<sub>4</sub>, and a small sink for N<sub>2</sub>O (e.g. Bubier et al., 1993; Drewer et al., 2010b; Huttunen et al.,

2003). Growing season emissions of CH<sub>4</sub> from subarctic and boreal ecosystems are estimated as 112.2 ± 6.2 and 72.7 ± 1.3 mg m<sup>-2</sup> d<sup>-1</sup>, respectively (Turesky et al., 2014), compared to modelled estimates of N<sub>2</sub>O emissions from tundra, forest tundra and boreal forest of 0.02, 0.09 and 0.15 mg m<sup>-2</sup> d<sup>-1</sup>, respectively (Potter et al., 1996). Most studies focus primarily on growing season fluxes. Whilst the logistics of making winter measurements in these ecosystems certainly plays an important role, the growing season has also been shown to represent the period of greatest emissions and therefore the most suitable time to study drivers. Jackowicz-Korczyński et al. (2010) found that summer season CH<sub>4</sub> emissions represented 65 % of the annual flux (with the shoulder seasons representing 25 % and the winter season only 10 % of annual flux) in a subarctic peatland. Similarly, Panikov and Dedysh (2000) found that winter CH<sub>4</sub> emissions contributed only 3.5 to 11 % of total annual flux in western Siberian boreal peat bogs and Dise (1992) reported winter CH<sub>4</sub> fluxes representing between 4 and 21 % of total annual flux in peatlands across northern Minnesota.

Net CH<sub>4</sub> emissions are controlled by the balance of activity between anaerobic methanogenic and oxidizing aerobic methanotrophic bacteria. Hence the degree of soil saturation, which controls the position of the oxic–anoxic boundary and the associated soil redox potential, has been identified as an important driver of net CH<sub>4</sub> emission (Bubier et al., 1995; Kettunen et al., 1999; Nykanen et al., 1998). Other factors such as temperature, substrate availability, soil porosity and pH are also commonly reported drivers of CH<sub>4</sub> emissions (Baird et al., 2009; Dinsmore et al., 2009b; Levy et al., 2012; Strack et al., 2004; Yvon-Durocher et al., 2014). Whilst the rate of methanogenesis and methanotrophy are both influenced by temperature, methanogenesis is generally considered to be more temperature sensitive, resulting in a positive relationship between temperature and net CH<sub>4</sub> emission (Dunfield et al., 1993; van Hulzen et al., 1999). CH<sub>4</sub> produced within the soil environment is then transported to the atmosphere via diffusion, ebullition or plant-mediated transport.

Vegetation can exert either a direct control on CH<sub>4</sub> emission via plant-mediated transport or an indirect control via its contribution to soil structure, moisture, anaerobic microsites and substrate availability. The development of aerenchyma is an adaptation to waterlogged conditions found in many vascular wetland species. Where such species are present they can act as gas conduits, allowing GHGs produced in the anoxic layer to be transported to the atmosphere with minimal oxidation, subsequently increasing emissions by up to an order of magnitude (Dinsmore et al., 2009a; MacDonald et al., 1998; Minkinen and Laine, 2006). Vegetation community structure also provides a useful proxy for environmental variables that are themselves difficult to measure, such as long-term water table dynamics (Gray et al., 2013; Levy et al., 2012).

The primary processes controlling N<sub>2</sub>O emissions from soils, including boreal soils, are nitrification processes, where ammonium is oxidized to nitrate under aerobic conditions, and denitrification processes where oxidized nitrogen species are reduced to N<sub>2</sub>O or N<sub>2</sub> under anaerobic conditions (Firestone and Davidson, 1989). As CH<sub>4</sub>, also N<sub>2</sub>O production is a microbial process. The main drivers regulating N<sub>2</sub>O production are nitrogen, such as ammonium and nitrate, temperature and factors which regulate the ratio of aerobic to anaerobic soil microsites, such as soil moisture (Butterbach-Bahl et al., 2013). In peatlands, transport through aerenchyma is also a potential transport mechanism for N<sub>2</sub>O.

A number of different in situ methods are available for the measurement of GHG emissions. Eddy covariance methods can produce high temporal resolution measurements integrated at the field and ecosystem (Baldocchi et al., 2001; Hargreaves and Fowler, 1998); whilst useful for field scale quantification, the method does not allow separation of individual landscape components. Traditional chamber-based studies allow a more targeted experimental design where individual microtopographical features or vegetation communities can be selected and compared (Dinsmore et al., 2009b; Drewer et al., 2010a). By explaining small-scale spatial variability we can gain a greater understanding of GHG drivers and begin to predict how climate or land-use management changes will alter the GHG balance over the full landscape. Furthermore, both CH<sub>4</sub> and N<sub>2</sub>O can be measured simultaneously within the same chamber allowing greater confidence in comparisons between the flux estimates.

There exists a fundamental mismatch between the scale of measurements required to increase process level understanding of CH<sub>4</sub> and N<sub>2</sub>O emissions, and the scale required to make useful assertions about the magnitude of emission sources that are relevant to the global GHG budget. Whilst land-surface models provide one way to bridge this mismatch of scale, they are often limited by the availability of specific input variables, e.g. water table depth, which cannot be measured at the spatial resolution required to provide an accurate output. As a result, modelled estimates of northern high-latitude wetland CH<sub>4</sub> sources are highly variable between studies ranging from approximately 20 to 157 Tg CH<sub>4</sub> yr<sup>-1</sup> (Zhu et al., 2013 and references therein). An alternative method of upscaling is empirically mapping emission factors onto spectral data provided by high-resolution satellite imagery. This method utilizes the spectral signatures of different vegetation types and vegetation-specific differences in GHG emissions to create a landscape-scale emission map. In this study we use static chambers and satellite imagery to assess the primary spatio-temporal drivers of CH<sub>4</sub> and N<sub>2</sub>O emissions in subarctic/boreal Finland and upscale this to a 4 km<sup>2</sup> landscape containing both forest and wetland ecosystems.

## 2 Methods

### 2.1 Site description

The Arctic Research Centre of Sodankylä (67°22' N 26°39' E, 179 m a.s.l.) is located in central Lapland, northern Finland, approximately 100 km north of the Arctic Circle. The centre is run by the Finnish Meteorological Institute, is part of the Pallas-Sodankylä GAW station and includes a level 1 ICOS ecosystem station. Whilst referenced as an Arctic site in respect to stratospheric meteorology and geographical location, it is considered to be within the subarctic/boreal vegetation zone and is not underlain by permafrost. Mean annual temperature and precipitation on site for the period 1981–2010 was -0.4 °C and 527 mm, respectively. Records of mean annual air temperature on site have shown an increase of 0.02 °C yr<sup>-1</sup> over the period 1961–2000; the rate of increase specifically during March to May was 0.04 °C yr<sup>-1</sup> (Aurela et al., 2004; Tuomenvirta et al., 2001). The mean snow depth (mid-March) is 75 cm with median snowfall start and end dates of 26 September and 14 May (Finnish Meteorological Institute). Permanent snow cover starts approximately at the end of October/beginning of November. Scots pine forests and wetlands are the two dominant ecosystems in this region. Both ecosystems were covered by the greenhouse gas flux measurements in order to enable the landscape scale upscaling of the results.

The forest (67°21.708' N 26°38.290' E, 179 m a.s.l.) is classified as an Uliginosum–Vaccinium–Empetrum (UVET) type Scots pine (*Pinus sylvestris*) forest on a sandy podzol. The mean vegetation height within the forest is 12 m in the area where our measurements were made with an average stand age of 60–100 years and tree density of 2100 ha<sup>-1</sup>. The forest floor contains a varying degree of lichen (*Cladonia* spp.), which is heavily dependent on the presence/absence of reindeer. We located static chambers evenly between three forest sites (unfenced, 12-year enclosure, 50-year enclosure) to ensure that variability in GHG emissions due to lichen cover was included in our results. The nearby Halssiaapa wetland (67°22.111' N 26°39.269' E, 180 m a.s.l.) is described as a eutrophic fen dominated by large, treeless flarks with abundant sedge vegetation and intermittent brown moss and *Sphagnum* cover. Intermediate, low ridges consist of birch fen vegetation interspersed with pubescent birch trees (*Betula pubescens*), with a dominant height of approximately 5–7 m. The most common shrubs are *Betula nana*, *Andromeda polifolia* and *Vaccinium oxycoccus*; herbaceous plants are primarily *Potentilla palustris* and *Menyanthes trifoliata*; and grasses are predominantly *Carex* species (several different species observed) or *Scheuchzeria palustris*. Across the duration of the study water table levels varied substantially and no consistently submerged areas which could be easily distinguished as flarks existed; we have therefore avoided subjective classification of ridges and flarks within

our plots and refer only to measurable environmental variables such as water table depth and temperature.

When set within a wider 2 km × 2 km landscape unit (to which we will upscale measurements), the proportion of wetland to forest was almost 2 : 1, with wetlands making up 61 % of the area, and forests 32 %. The remaining 7 % included open water and grass, bare soil and buildings primarily associated with the Sodankylä Arctic Research Centre. Within the larger regional area described in an associated study by O'Shea et al. (2014) (<http://www.eea.europa.eu/data-and-maps/data/corine-land-cover-2006-raster>) forests made up a much greater proportion of the landscape with coniferous and mixed forests representing 33 and 16 % of the land area, respectively, and wetlands 23 %.

## 2.2 Field methodology

Measurements were carried out during growing season 2012 in two measurement campaigns (summer: 12 July–2 August; autumn: 22 September–14 October) with the intention of capturing peak summer CH<sub>4</sub> emissions and the subsequent shoulder season.

A total of 60 static chambers were measured, 21 within the forest and 39 within the wetland. Within the forest, seven chambers were located in each of three subplots representing no enclosure, 12-year enclosure (built in summer 2000) and an approximately 50-year enclosure. Within the wetland, chambers were strategically located to cover the perceived range of both vegetation communities and water table depths covering both hummock and hollow microtopographic types (chamber numbers per microtopographic type: hummocks, 16; hollows, 11; neither hummock nor hollow, 12). Fluxes were measured on approximately 2-day intervals resulting in a total of 10 measurements for all chambers during the summer campaign, seven for the forest and eight for the wetland chambers during the autumn campaign.

Static chambers were constructed from 40 cm diameter opaque polypropylene pipe following the guidelines discussed in Clough et al. (2015). Wetland chambers were located so that sampling could be carried out from an existing boardwalk – this served the dual purpose of avoiding disturbance during chamber enclosure and minimized the environmental impact of footfall on the site. The ground surface within the forest plots was considered to be solid and therefore no such precautions were required. Shallow bases (10 cm depth) were inserted into the ground the day before the first sampling; bases were left in situ for the remainder of the study period. Fluxes calculated from the first sampling day were not significantly different from subsequent sampling occasions. The short settling period after base installation is therefore considered to have had no significant effect on subsequent fluxes, which as a result were included in the data analysis. Chamber lids, consisting of a 25 cm section of polypropylene pipe with a closed metal top, pressure compensation plug and draft excluder

tape for sealing, were attached and sealed to the in situ bases during the 45 min flux measurement period. Chamber air (100 mL) was sampled four times throughout the approximately 45 min sampling period and flushed through 20 mL glass vials sealed with butyl rubber plugs using a double needle system; vials were kept at atmospheric pressure reducing problems associated with pressure changes during transportation. Vials were returned to the laboratory at the Centre for Ecology and Hydrology, Edinburgh, for analysis within approximately 1 month. Samples were analysed on an HP5890 Series II gas chromatograph (Hewlett Packard (Agilent Technologies) UK Ltd, Stockport, UK) with electron capture detector (ECD) and flame ionization detector (FID) for N<sub>2</sub>O (detection limit < 7 µg L<sup>-1</sup>) and CH<sub>4</sub> analysis (detection limit < 70 µg L<sup>-1</sup>), respectively. Soil temperature was recorded at a depth of 10 cm from four replicate points immediately outside the chamber bases on each sampling occasion using the Omega HH370 temperature probe (Omega Engineering UK Ltd, Manchester, UK). Within the forest plots, four replicate volumetric soil moisture content (VMC) measurements were made, adjacent to each chamber base, using a Theta probe HH2 moisture meter (Delta T-Devices, Cambridge, UK). Within the wetland, a total of 21 dip wells constructed from 5 cm internal diameter pipe were installed either adjacent to, or where chambers were located close together, between chamber bases. All wetland chambers had at least one dip well located within a 50 cm radius; where more than one dip well was located equidistant from the chamber, the mean water table depth from the adjacent dip wells was calculated. Soil respiration (note whilst we refer to this as soil respiration throughout, it also includes respiration from the ground surface vegetation defined as anything with a height of less than 2 cm above ground surface) was measured using a PP Systems SCR-1 respiration chamber (10 cm diameter) attached to an EGM-4 infrared gas analyser (IRGA, PP Systems; Hitchin, Herts, UK) on each sampling occasion. Soil respiration was measured adjacent to each forest chamber and adjacent to 14 chambers within the wetland, chosen to cover the perceived range of spatial variability. Vegetation within each chamber was recorded upon visual inspection.

A pair of cation and anion Plant Root Simulator (PRS)<sup>TM</sup> probes were deployed adjacent to each of the 60 chamber bases during both sampling campaigns. The PRS probes utilize ion-exchange resin membranes to provide an index of relative plant nutrient availability (Hangs et al., 2002), measured ions included total N, NO<sub>3</sub>-N, NH<sub>4</sub>-N, Ca, Mg, K, P, Fe, Mn, Zn, B, S, Pb, Al and Cd. During the summer campaign probes were deployed on 11 and 12 July, and recovered on 1 August. During the autumn campaign forest probes were deployed on 22 and 23 September and recovered between 13 and 15 October. As part of the standard analytical processing, concentrations from each probe are corrected for length of deployment. After recovery, probes were processed and cleaned with deionized water following the standard proce-

dures supplied by the manufacturers and returned to Western Ag Innovations Inc., Canada, for analysis.

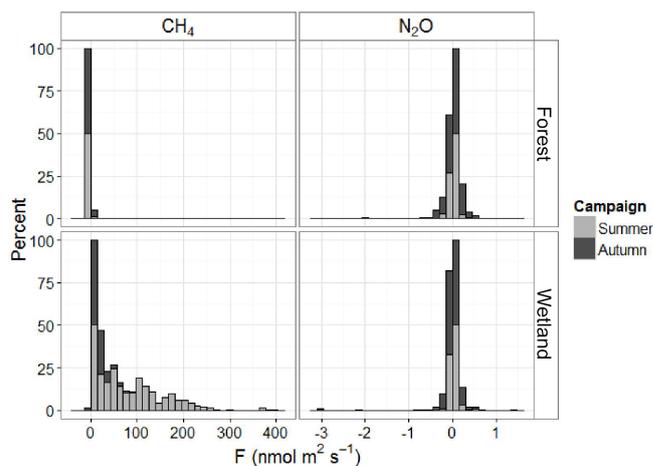
### 2.3 Data analysis

Fluxes and confidence intervals from static chambers were calculated using GCFlux, version 2, which calculates fluxes based on five methods before choosing the most appropriate fit for individual chamber sets (Levy et al., 2011). Reported CH<sub>4</sub> fluxes correlate to the best-fit model for individual chambers (either linear or asymptotic). Due to the larger uncertainty in calculated N<sub>2</sub>O concentrations which are often close to the GC detection limits, reported N<sub>2</sub>O fluxes were calculated from the linear model approach only. Instantaneous fluxes are presented in units of nmol m<sup>-2</sup> s<sup>-1</sup>. Confidence intervals include errors introduced by a combination of natural variability in the flux over the measurement period, methodological and analytical limitations and uncertainty in model fitting. When these range from negative to positive, no sign can be accurately attributed to the flux and therefore it is treated as indistinguishable from zero.

The data distribution of fluxes, from all chambers, and over the full study period, had a strong positive skew (Fig. 1). To summarize the data and account for the skewed distributions, geometric means were calculated across time points for all chambers. Where periods of uptake and emission were both present within a time series, geometric means were calculated for each flux direction independently. The presented geometric means are the frequency-weighted sum of emissions and uptake. The resulting spatial dataset had a distribution much closer to normal and is therefore summarized throughout using arithmetic means. Upscaled emission estimates are presented in units of either g C m<sup>-2</sup> h<sup>-1</sup> or g N m<sup>-2</sup> h<sup>-1</sup> for CH<sub>4</sub> and N<sub>2</sub>O, respectively.

In all further analysis, log transformations were applied where datasets displayed non-normal distributions; given the time between measurements, autocorrelation within datasets was never significant. To summarize the complex vegetation and soil data, principal component analysis (PCA) was performed using the princomp function within the R stats package (R version 3.1.1); this uses a spectral decomposition approach which examines the covariances and correlations between variables. Correlation analyses were carried out with principal components PC1, PC2 and PC3 against spatial CH<sub>4</sub> fluxes and the most appropriate component taken forward into subsequent explanatory models. No attempt to correlate vegetation or soil components was made with N<sub>2</sub>O fluxes given the large proportion of near-zero fluxes.

Spatial variability between chambers on all sampling occasions was large. To allow temporal variability to be considered it was necessary to group chambers. Rather than subjectively assign chambers to groups based on observed landscape features we carried out a cluster analysis (R, version 3.1.1) based on emission rates. This method produced independent groups which could also be used in further anal-



**Figure 1.** Frequency plot showing distribution of all fluxes across both campaign periods.

yses to consider the environmental controls of emissions. The total number of clusters was chosen to be five – after multiple cluster analysis runs this was considered the most appropriate number taking into consideration the complexity for further analyses and clear distinctions between groups. ANOVA and Tukey pairwise comparisons were used to explore the differences in environmental variables between clusters; tested variables included means of soil temperature, water table depth and soil respiration alongside vegetation principal component and soil principal component.

Optical remote sensing imagery was acquired by the Pleiades satellite on 28 August 2012. This provided data in the blue, green, red and near-infrared (NIR) part of the spectrum for the 2 km × 2 km region around the chamber sites, with 2 m resolution on the ground. From these data both the simple ratio (SR = NIR / Red) and normalized difference vegetation index (NDVI = [NIR – Red] / [NIR + Red]) were calculated. The optical data for each chamber location were extracted and related to the geometric mean of the CH<sub>4</sub> flux at that location. Multiple regression modelling was then carried out using R (version 3.1.1) to describe the CH<sub>4</sub> fluxes of individual chambers initially utilizing all four wavebands and the two calculated ratios. The best-fit model was used to upscale CH<sub>4</sub> fluxes to the full image domain (4 km<sup>2</sup>). Due again to large uncertainties in the flux estimates, the large proportion of fluxes indistinguishable from zero, and subsequent inability to accurately model the data, upscaling of N<sub>2</sub>O emissions was not carried out using satellite imagery.

### 3 Results

Confidence intervals calculated from each chamber measurement, which include errors introduced by a combination of natural variability in the flux over the measurement period, methodological and analytical limitations and uncertainty in

**Table 1.** Mean  $\pm$  SE CH<sub>4</sub> and N<sub>2</sub>O fluxes split by both campaign period (summer, autumn) and site (forest, wetland).

	Summer	Autumn	Full period
CH <sub>4</sub> (mg C m <sup>-2</sup> h <sup>-1</sup> )			
Forest	-0.06 $\pm$ <0.01	-0.03 $\pm$ <0.01	-0.04 $\pm$ <0.01
Wetland	3.35 $\pm$ 0.44	0.62 $\pm$ 0.09	1.56 $\pm$ 0.20
N <sub>2</sub> O ( $\mu$ g N m <sup>-2</sup> h <sup>-1</sup> )			
Forest	0.75 $\pm$ 0.33	1.29 $\pm$ 1.39	1.06 $\pm$ 0.44
Wetland	1.63 $\pm$ 0.64	-1.60 $\pm$ 1.18	0.73 $\pm$ 0.40

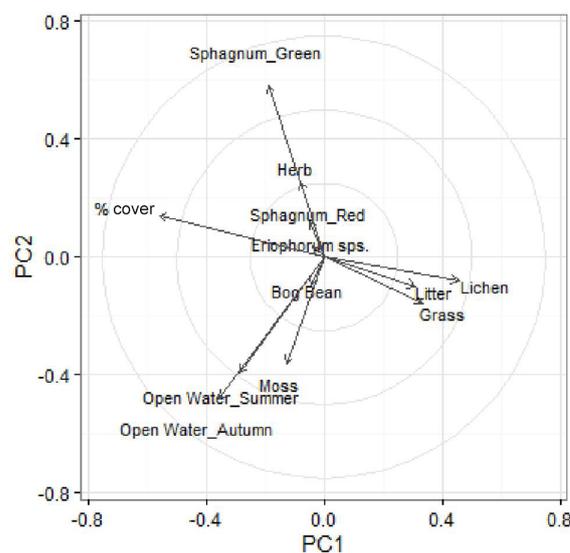
model fitting, show a high proportion of calculated fluxes which are indistinguishable from zero. Given the high relative variability in individual chambers and low fluxes in N<sub>2</sub>O, only 8 and 9 % of fluxes were significant in the wetland and forest, respectively. The proportion of chambers displaying significant N<sub>2</sub>O fluxes could not be linked to any measured environmental factors and were distributed randomly across the dataset. For CH<sub>4</sub>, whilst only 56 % of fluxes were significantly different from zero in the forest, the wetland was much clearer with zero excluded from the confidence range in 94 % of cases.

When separated by site (forest, wetland) and by campaign period (summer, autumn) the highest instantaneous CH<sub>4</sub> fluxes, greatest skew and largest range were all observed in the wetland chambers during the summer period (Fig. 1). These equated to a mean flux of 3.35  $\pm$  0.44 mg C m<sup>-2</sup> h<sup>-1</sup>, compared to only 0.62  $\pm$  0.09 mg C m<sup>-2</sup> h<sup>-1</sup> in the wetland during the autumn period. The mean CH<sub>4</sub> flux across the whole measurement period represented an emission of 1.56  $\pm$  0.20 mg C m<sup>-2</sup> h<sup>-1</sup> from the wetland chambers, compared to a mean uptake of 0.04  $\pm$  <0.1 mg C m<sup>-2</sup> h<sup>-1</sup> from the forest chambers (Table 1).

N<sub>2</sub>O fluxes had a mean emission across the full sampling period of 1.06  $\pm$  0.44 and 0.73  $\pm$  0.40  $\mu$ g N m<sup>-2</sup> h<sup>-1</sup> from forest and wetland chambers, respectively (Table 1).

### 3.1 Spatial variability

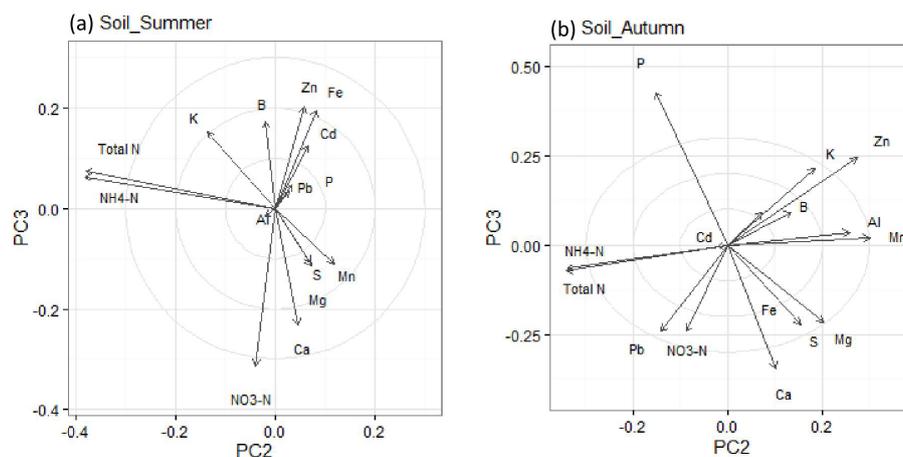
Surface cover data (vegetation and presence of standing water) was summarized using a PCA analysis; combined, the top three principal components explained 51 % of the total variation between chamber vegetation communities, with principal components PC1, PC2 and PC3 explaining 24, 15 and 11 %, respectively. PC1, PC2 and PC3 were subsequently tested for correlations with CH<sub>4</sub> fluxes. Spatial variability in CH<sub>4</sub> emissions among wetland chambers was best captured using PC2 ( $r = 0.40$ ,  $P < 0.01$ ). PC2 also correlated strongest with CH<sub>4</sub> emissions when all chambers (both wetland and forest) were included ( $r = 0.31$ ,  $P < 0.01$ ); however, PC1 showed the best correlation with forest chambers alone ( $r = 0.25$ ,  $P < 0.01$ ). PC2 was therefore used throughout fu-

**Figure 2.** Loading values for principal components 1 and 2 of the chamber vegetation analysis.

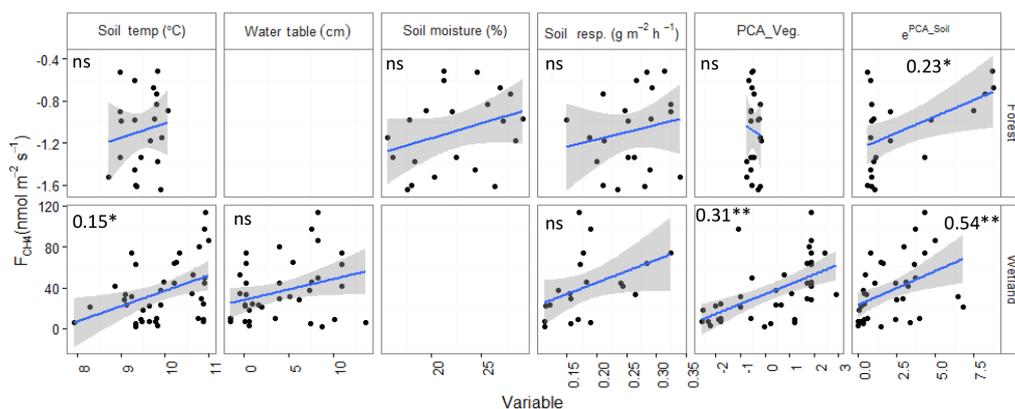
ture analysis to describe the spatial variability in CH<sub>4</sub> emissions.

PC2 (which best described CH<sub>4</sub> fluxes) showed a strong dependence on the proportion of green *Sphagnum* species within the chamber with positive PC2 values indicating a high prevalence (Fig. 2). Due to the strongly non-normal distribution of the data, *Sphagnum* sp. alone could not be correlated with emissions, thus the principal component method provides an indirect measure of the relationship. Low PC2 scores indicate a higher abundance of non-*Sphagnum* moss species and high proportion of open water within the chambers. Of the measured environmental variables relating to spatial variability (soil temperature, soil moisture, water table depth and soil respiration), PC2 only correlated significantly with water table depth ( $r = 0.17$ ,  $P < 0.01$ ) with PC2 scores increasing with water table depth.

A similar PCA analysis was carried out to summarize the available soil nutrient availability data from the PRS probes. The first three principal components combined explained 56 % of total variation with PC1, PC2 and PC3 individually



**Figure 3.** Loading values for principal components 2 and 3 of the chamber soil concentration analysis.



**Figure 4.** Relationships between geometric mean CH<sub>4</sub> flux ( $\text{nmol m}^{-2} \text{s}^{-1}$ ) against measured environmental variables across full sampling period. Text refers to the results from statistical correlations, where “ns” refers to a non-significant results \* and \*\* represent  $P < 0.05$  and  $P < 0.01$ , respectively.

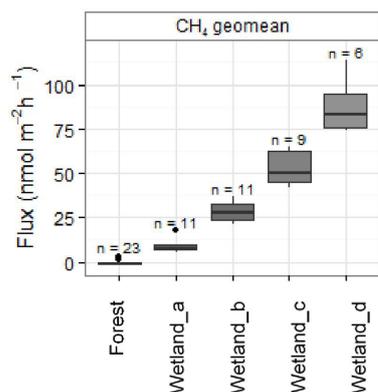
accounting for 31, 15 and 10% of variability, respectively. PC1 gave the best correlation with CH<sub>4</sub> emissions when all data were combined and for forest chambers alone. PC2 gave a better correlation with wetland chambers alone (PC2:  $r = 0.40$ ,  $P < 0.01$ ). PC2 was therefore utilized throughout the remainder of the analysis due to the greater magnitude of wetland versus forest CH<sub>4</sub> emissions, and their subsequent importance to landscape scale emissions.

PC2 was influenced strongly by total N and NH<sub>4</sub><sup>+</sup> concentrations with high concentrations resulting in a low PC2 score (Fig. 3). The only environmental variable significantly correlated with PC2 was water table depth ( $r = 0.19$ ,  $P < 0.01$ ) with high PC2 scores indicating a deep water table. However, when wetland chambers were considered alone soil respiration also showed a significant positive correlation with PC2 ( $r = 0.31$ ,  $P < 0.01$ ).

Spatial variability in GHG emissions were tested against the measured environmental variables as well as the most appropriate PCA score for both vegetation and soil, as de-

scribed above. CH<sub>4</sub> flux was not statistically correlated to water table depth in the wetland chambers (Fig. 4). However, a relatively strong positive correlation was seen between CH<sub>4</sub> flux and the PCA score from the vegetation analysis; a high score from the vegetation principal component represented a deep mean water table depth. Positive correlations were also found between CH<sub>4</sub> flux, mean soil temperature and the principal component from the soil analysis when the wetland chambers were considered alone. Within the forest chambers, only the soil principal component was statistically correlated to CH<sub>4</sub> flux.

To further summarize the CH<sub>4</sub> data and provide a method for both upscaling and consideration of temporal variability, chambers were grouped independently based on net emissions. Data distributions within each cluster group are shown in Fig. 5. The cluster identified with the lowest emissions contained all the forest chambers and an additional two low emitting wetland chambers; for explanatory purposes this cluster is subsequently referred to as the “forest” cluster.



**Figure 5.** Chambers clustered based on emissions with  $n$  indicating the number of chambers within each group.

The remaining clusters, with sequentially increasing emissions, are labelled wetland\_a, wetland\_b, wetland\_c and wetland\_d, respectively.

ANOVA showed significant between cluster variability in all tested environmental variables (soil temperature, water table depth, soil respiration, vegetation principal component and soil principal component) with the exception of water table depth (Fig. 6). The patterns in soil temperature, PCA\_veg and PCA\_soil are in line with the previously discussed correlation analysis. When the components of PCA\_veg are considered independently the results highlight the importance of *Sphagnum* cover and open water in controlling the CH<sub>4</sub> emissions within the wetland clusters; however, this relationship is complicated by the high variability shown by large standard deviations from the mean cluster values (Table 2). Wetland clusters “a” and “b”, which represent the two lowest emitting wetland groups, had the lowest proportions of *Sphagnum* moss species and the greatest proportion of chambers containing open water.

Between-group differences in soil nutrient concentrations were also considered using ANOVA; only nutrients which displayed significant between-group differences are displayed in Fig. 7. The strongest between-group difference was evident in the soil Fe concentrations, with high Fe linked to high CH<sub>4</sub> emitting chambers ( $F = 62.0$ ,  $P < 0.01$ ); positive correlations with mean group CH<sub>4</sub> emissions were also seen for B ( $F = 49.2$ ,  $P < 0.01$ ), Zn ( $F = 39.0$ ,  $P < 0.01$ ) and Mg ( $F = 49.2$ ,  $P < 0.01$ ). Negative correlations were seen between mean group CH<sub>4</sub> emission and K ( $F = 10.6$ ,  $P < 0.01$ ), NO<sub>3</sub>-N ( $F = 6.38$ ,  $P < 0.01$ ), and NH<sub>4</sub>-N ( $F = 6.36$ ,  $P < 0.01$ ). Within the wetland, total-N was lowest in groups with the highest CH<sub>4</sub> emission; however the pattern is less clear when forest chambers are included as these displayed a wide range of total-N but a low CH<sub>4</sub>. Only the forest had distinct soil Ca concentrations.

**Table 2.** Mean  $\pm$  SD ground cover data for wetland clusters. Only variables which showed significant between cluster variability are included. Test statistic refers to the  $F$  value with \* and \*\* indicating  $P$  values of  $< 0.05$  and  $< 0.01$ , respectively.

	<i>Sphagnum</i> sp.	Open water
Wetland_a	39.3 $\pm$ 46.0	59.5 $\pm$ 62.0
Wetland_b	68.6 $\pm$ 47.4	11.4 $\pm$ 18.6
Wetland_c	95.7 $\pm$ 11.3	5.71 $\pm$ 9.32
Wetland_d	50.0 $\pm$ 70.7	20.0 $\pm$ 28.2
ANOVA test statistic	4.62**	3.59*

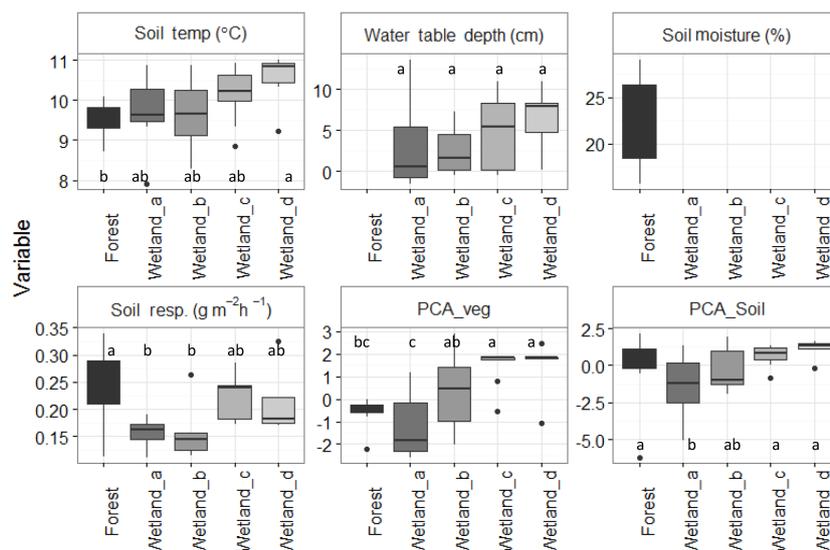
### 3.2 Temporal variability

Temporal variability, summarized by cluster, is displayed in Fig. 8 for both the summer and autumn campaign periods. CH<sub>4</sub> emissions remain relatively constant throughout both campaign periods despite a significant drop in emissions between them. Despite the low temporal variability, emissions appear to peak around mid-July in the higher emitting chamber clusters (e.g. wetland\_c and wetland\_d).

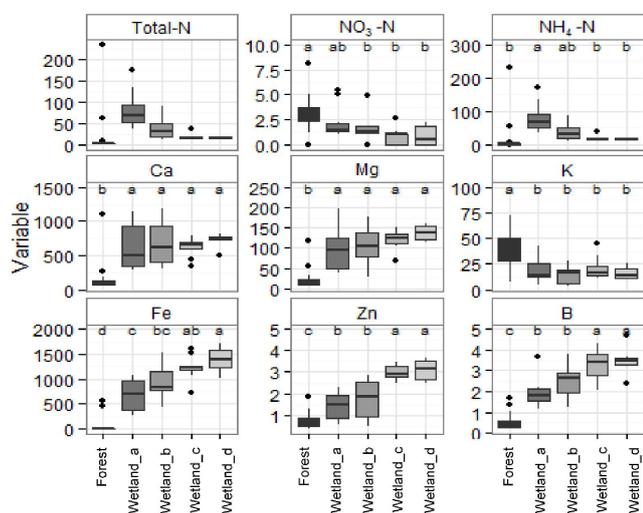
CH<sub>4</sub> emissions did not follow linear relationships with the measured environmental variables (soil temperature, air temperature, water table depth and soil respiration) (Fig. 9). CH<sub>4</sub> emissions peaked at a soil temperature of approximately 12 °C and an air temperature of approximately 15 °C, after which they began to fall. The time series suggests a general decrease in CH<sub>4</sub> emissions with rising water table; however, the relationship appears to be chamber specific and non-linear suggesting a greater complexity than is usually accounted for. In the high-emitting chambers, there is a peak in CH<sub>4</sub> emissions as the water level reaches the surface, the emissions drop until water tables of approximately 5 cm depth and then rise again as the water level deepens further. Chamber clusters associated with lower total CH<sub>4</sub> emissions did not show this peak associated with surface water tables but instead followed a smoother, but still non-linear, increase in emissions with increasing water table depth. No relationship was observed between soil temperature and water table depth, ruling out a potential interaction as the cause of the peaks associated with particular water table depths or soil temperatures.

### 3.3 Spectral analysis and upscaling

A multiple regression model including blue, green, red, NIR, SR and NDVI explained 45 % of the variance in the spatial CH<sub>4</sub> flux. Transformations of the data and more complex models were explored, but did not substantially improve the model fit. A simpler model containing only SR, NDVI and the blue and NIR wavebands performed equally as well as the full model also explaining 45 % of the spatial variation (Table 3); this simpler model was therefore used in subsequent analysis. To predict mean CH<sub>4</sub> flux over our



**Figure 6.** Box plots showing range of measured environmental variables within each of the CH<sub>4</sub> clusters. Letters represent results from the Tukey family test statistic where clusters with similar letters are not significantly different from one another at 95% confidence level. Clusters Wetland\_a to Wetland\_d represent groups with sequentially increasing CH<sub>4</sub> emissions. Note that water table was not measured within the forest plots; therefore the water table values given in the “forest” cluster actually represent only the two wetland chambers which have quantitatively been assigned to this cluster and have therefore been excluded.



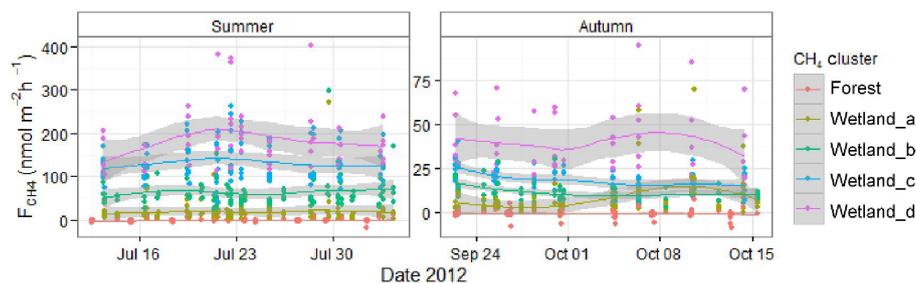
**Figure 7.** Box plots showing range of soil variables within each of the CH<sub>4</sub> clusters. Units represent probe supply rate ( $\mu\text{g}$  per  $10\text{ cm}^2$  across burial period). Letters represent results from the Tukey family test statistic where clusters with similar letters are not significantly different from one another at 95% confidence level. Clusters Wetland\_a to Wetland\_d represent groups with sequentially increasing CH<sub>4</sub> emissions.

sampling period at landscape scale, we applied the regression model to the optical data over the whole  $2\text{ km} \times 2\text{ km}$  domain. This predicted high CH<sub>4</sub> fluxes in the wetland areas in the northeast and at forest edges (Fig. 10). Using

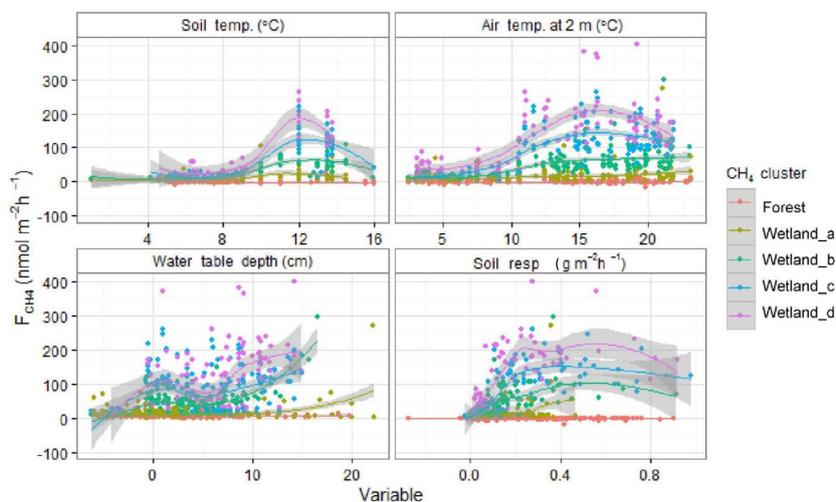
**Table 3.** Model summary utilizing spectral data to estimate CH<sub>4</sub> emissions.

	Estimate	<i>t</i> value	<i>p</i> value
Intercept	−233	0.00002	<0.01
SR	354	0.00002	<0.01
NDVI	−283	0.03883	<0.05
Blue	0.99	0.00365	<0.01
NIR	−0.91	0.00022	<0.01
Model-adjusted $r^2$	0.45		
Model <i>p</i> value	<0.01		

the optical data to scale up the chamber measurements, the mean CH<sub>4</sub> flux over the whole domain between 12 July and 14 October is estimated to be  $47.4 \pm 14.1\text{ nmol CH}_4\text{ m}^{-2}\text{ s}^{-1}$  or  $2.05 \pm 0.61\text{ mg C m}^{-2}\text{ h}^{-1}$ . By comparison, if the flux over the whole spatial domain were estimated simply as the arithmetic mean of the individual chamber measurements (geometric mean to summarize temporal variability) the value would be significantly lower ( $23.0 \pm 3.78\text{ nmol CH}_4\text{ m}^{-2}\text{ s}^{-1}$ ). If we account for the differences between wetland and forest alone using an appropriate area weighting factor (61% wetland; 32% forest), ignoring variability within these landscape units, estimated emissions are  $21.6 \pm 2.85\text{ nmol CH}_4\text{ m}^{-2}\text{ s}^{-1}$ , also substantially lower than our modelled approach.



**Figure 8.** Temporal variability across the two field campaigns in CH<sub>4</sub> emissions, separated by clusters, with shaded area representing loess smoothing. Clusters Wetland\_a to Wetland\_d represent groups with sequentially increasing CH<sub>4</sub> emissions.



**Figure 9.** Drivers of temporal variability in CH<sub>4</sub> fluxes, separated by clusters, with shaded area representing loess smoothing. Clusters Wetland\_a to Wetland\_d represent groups with sequentially increasing CH<sub>4</sub> emissions.

## 4 Discussion

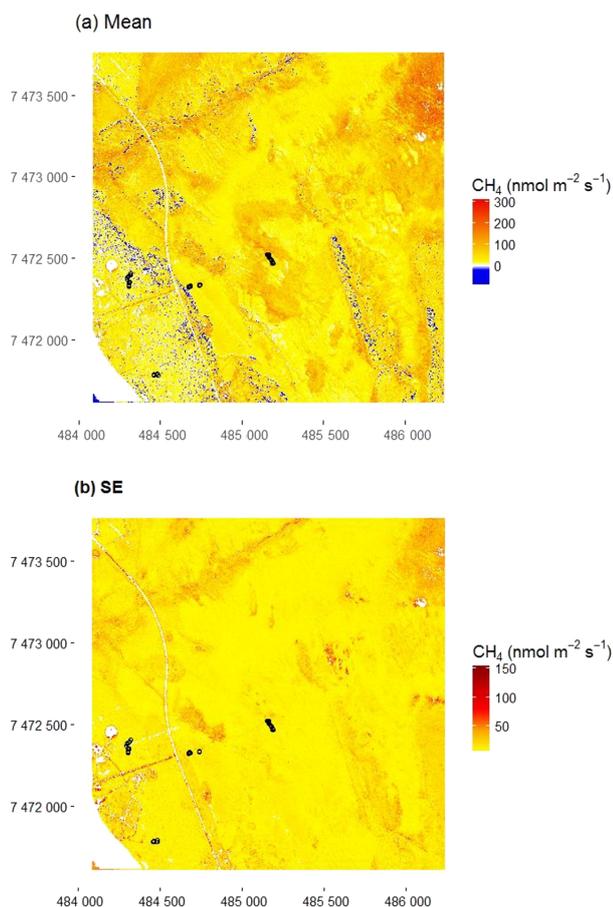
Fluxes of CH<sub>4</sub> from the forest and wetland areas within the landscape were significantly different at  $-0.06 \pm 0.01$  and  $3.35 \pm 0.44 \text{ mg C m}^{-2} \text{ h}^{-1}$ , respectively. Whilst the error displayed here suggests confidence in the forest as a net sink for CH<sub>4</sub>, when individual chamber measurements are considered, only 56.3 % of the measured fluxes had an error bar that did not cross the zero line. Hence we can only be confident that the sign of the flux is correct in just over half of our forest data. On removal of all fluxes with an uncertain sign, the mean remains negative in the forest chambers. This gives confidence that whilst the calculated flux is very small, it is a small sink rather than a source. In the wetland however, 94.4 % of the measured fluxes differed significantly from zero, so we can be confident that the wetland represented a strong source of CH<sub>4</sub>.

A similar analysis was carried out on the N<sub>2</sub>O flux data and here due to very high uncertainties in the sign of individual flux measurements (only 8.68 and 7.79 % of measurements in the forest and wetland, respectively, did not have error bars crossing the zero line) we cannot differentiate either the for-

est or wetland as being a net sink or source over the campaign period. We can simply state that N<sub>2</sub>O fluxes in both landscape units were near-zero. N<sub>2</sub>O fluxes were therefore not an important component of this study area. Whilst minimal, the near-zero result is still an important finding given the lack of N<sub>2</sub>O emissions reported in the current literature. Assuming these near-zero fluxes are similar across the region we have an important baseline from which to monitor change related to future climate or land-use practices. However, due to consistently near-zero fluxes little could be concluded about the drivers of N<sub>2</sub>O emissions within our landscape area.

### 4.1 Drivers of CH<sub>4</sub> emissions

The relationship between CH<sub>4</sub> emissions and water table position was not straightforward. Considering the mean CH<sub>4</sub> flux for each chamber and testing this against the mean water level position of that chamber showed no significant relationship (Fig. 4), suggesting that water table was not an important factor in controlling spatial variability in emissions across the site. Furthermore, when chambers were clustered based on their CH<sub>4</sub> emissions, there was high within-group variability



**Figure 10.** Mean (a) and SE (b) of CH<sub>4</sub> fluxes extrapolated over a 2 km × 2 km area predicted from chamber flux measurements (black circles), and satellite spectral data. Coordinates are in WGS84.

in water table and subsequently no significant differences in water table between groups (Fig. 6). Whilst much of the previous literature suggests water level as the primary driver of CH<sub>4</sub> (Aerts and Ludwig, 1997; Hargreaves and Fowler, 1998; Waddington et al., 1996) due to its role in controlling the oxic/anoxic boundary, there is a growing body of evidence which suggests this is true only in drier ecosystems (Hartley et al., 2015; Olefeldt et al., 2013; Turetsky et al., 2014). The water levels used in this analysis only represented the water level during the campaign periods, with no consideration of longer term means. Due to the presence of alternative electron acceptors and the delay in returning to favourable redox conditions, fluctuations in the water level can result in a reduced population and a subsequent reduction in CH<sub>4</sub> production, even after water levels and anoxic conditions recover (Freeman et al., 1994; Kettunen et al., 1999). Hence whilst soil conditions may appear suitable for CH<sub>4</sub> production at the time of measurement, an unfavourable water table in the days to weeks prior to the measurement can limit methanogenesis and mask the expected relationship.

CH<sub>4</sub> in the wetland correlated positively and significantly with a component from the vegetation PCA analysis. The vegetation component that best described CH<sub>4</sub> emissions (PC2) related primarily to *Sphagnum* cover within the chambers and also linked low scores to a high proportion of open water. *Sphagnum* is an indicator of long-term near-surface water table position, hence whilst the directly measured water table did not correlate significantly with CH<sub>4</sub> emissions, the vegetation analysis suggests that longer-term water level conditions do correlate with spatial variability in CH<sub>4</sub>. Several other studies have also highlighted the importance of vegetation as an indirect indicator of CH<sub>4</sub> flux as it integrates across multiple ecological variables (e.g. Bubier et al., 1995; Davidson et al., 2016; Gray et al., 2013; Oquist and Svensson, 2002). It is also this link to vegetation that makes upscaling such as that described below possible as the spectral data are primarily picking up spatial variability in above-ground plant community cover. Vegetation can also play an important direct role in GHG emissions via plant-mediated transport and the supply of labile substrate, thought to be particularly important for methanogenesis (e.g. McEwing et al., 2015; Ström et al., 2005). *Sphagnum* mosses can be additionally important in controlling CH<sub>4</sub> emissions through their association with methanotrophic bacteria, an association that has been shown to exist across the globe and across a range of microtopographic features (Kip et al., 2010). Here we find no correlation between CH<sub>4</sub> emissions and soil respiration and a positive influence of *Sphagnum* cover. This suggests that the role of vegetation as an indirect indicator of other environmental factors is more important to CH<sub>4</sub> emissions in this landscape than methanotrophic associations or substrate availability.

The water table relationship is further complicated by the presence of standing water which related to low emitting chambers. This may be a consequence of reduced diffusion from the soil to the atmosphere rather than a result of reduced production. If standing water remains for long periods of time, the sustained anoxic conditions can alter the vegetation and soil chemistry. For example reduced nitrification, an oxic process, can lead to a build-up of NH<sub>4</sub><sup>+</sup> in water-logged conditions. Soil PCA component 2, which correlated positively with CH<sub>4</sub> emissions, showed a strong link to the concentration of NH<sub>4</sub><sup>+</sup>; high concentrations were linked to low PCA scores and low CH<sub>4</sub> emissions. NH<sub>4</sub><sup>+</sup> in this case may be acting as an indicator of the chambers which were inundated with surface water for sustained time periods.

Our chambers were not specifically designed to measure emissions from water surfaces and as a result cut out all wind-driven turbulence which is likely to be an important driver of the evasion flux (MacIntyre et al., 1995). It is therefore difficult to identify whether standing water produced a decrease in CH<sub>4</sub> production, a real decrease in flux due to low diffusivity through the water column, or if our results were a consequence of our methodology artificially reduc-

ing gas transfer across the water–air boundary. A previous study showed an increase in CH<sub>4</sub> emissions along a water table gradient from 35 cm depth to 5 cm above the soil surface. Above 5 cm the relationship with increasing water level was negative (Pelletier et al., 2007). Whilst our results are not as clear as those presented by Pelletier et al. (2007) a similar mechanism of reduced CH<sub>4</sub> diffusion through standing water may be responsible in both cases.

Figure 7 shows a clear positive relationship between Fe, Zn and CH<sub>4</sub> emissions, with high-emitting clusters also displaying the highest concentrations. These cations reflect the redox potential of the soil with increasing concentrations indicating a lowering of the redox potential. The CH<sub>4</sub> water table relationship is indirect, with water table used as a proxy for soil oxygen content and redox potential. Here we find that cation concentrations have a greater explanatory power than water table hence they may represent a more appropriate indicator of soil redox status and methanogenic potential.

When we consider the temporal patterns in CH<sub>4</sub> emissions across the two campaign periods we see a similar response as in the spatial analysis, with emissions falling as the water level rises between approximately 15 and 5 cm depth. No relationship was found between water table and soil temperature, ruling out an interaction as the primary cause of the water table relationship. Tupek et al. (2015) measured increasing CH<sub>4</sub> emissions in response to a rising water table until a peak at approximately 20 cm depth in a central Finnish mire, after which the relationship changed with emissions decreasing as the water table approached the surface. Water table depths measured in this study covered a smaller range and therefore we can assume that similar dynamics may be apparent if the water level was to drop below 20 cm. Similarly a recent synthesis (Turetsky et al., 2014) involving 71 wetlands found the optimum water table depth for CH<sub>4</sub> emissions to be  $23.6 \pm 2.4$  cm for bog ecosystems, again suggesting that the negative water table relationship observed here is due to water table depth being consistently above the optimum. Potential explanations for the inhibition of CH<sub>4</sub> emissions at high water levels given by Turetsky et al. (2014) include limited diffusion of CH<sub>4</sub> through standing water as discussed above, reduced CH<sub>4</sub> production due to lower plant biomass and associated labile C inputs, or unfavourable redox conditions resulting from inputs of oxygen-rich water potentially containing alternative electron acceptors. Whilst we saw no clear correlations between the percentage of bare soil and that of open water in our chambers, a reduction in plant activity may have occurred during submersion so reduction in C inputs for methanogenesis cannot be ruled out to explain the temporal changes in CH<sub>4</sub> emissions across the growing season. Neither do we have the data to rule out a change in redox potential due to water flow. A more detailed analysis under controlled conditions would be required to accurately explain the mechanism for high-water CH<sub>4</sub> limitation at this site.

As the water table rose between 5 cm depth and the soil surface, emissions appear to increase again peaking at approximately the soil surface and then decreasing with increasing water depth above the soil surface. This could be due to physical forcing of CH<sub>4</sub> out of the soil pore space as it reaches the soil surface. Importantly, what our results clearly show is that there are a number of driver mechanisms interacting to produce the observed CH<sub>4</sub>–water table relationship.

A significant positive spatial relationship was seen between soil temperature and CH<sub>4</sub> (Figs. 4 and 6). The relationship between CH<sub>4</sub> emission and temperature is a well-established one often observed in the literature (Segers, 1998) as a result of the greater sensitivity of methanogenesis than methanotrophy; however, most studies focus on the implications of temporal variation rather than the spatial pattern. The spatial variability in soil temperature is likely to be linked to a combination of soil water content and the surface reflectance of the vegetation cover. Changing soil temperature therefore represents an important by-product of other environmental changes that needs to be accounted for in predictive mechanistic models.

The temporal relationship between CH<sub>4</sub> emissions and temperature showed a Gaussian response curve typical of microbial control. Peak CH<sub>4</sub> emission occurred at a soil temperature of  $\sim 12$  °C. A similar pattern was observed in a central Finland mire by Tupek et al. (2015), who recorded a peak in emissions corresponding to 14 °C.

## 4.2 Upscaling

The wetland CH<sub>4</sub> fluxes calculated here ( $3.35 \text{ mg C m}^{-2} \text{ h}^{-1}$  during the summer season and  $1.56 \text{ mg C m}^{-2} \text{ h}^{-1}$  when the autumn period is included) are similar in magnitude to those described in a multisite analysis by Turetsky et al. (2014) for subarctic ( $3.51 \pm 0.19 \text{ mg C m}^{-2} \text{ h}^{-1}$ ) and boreal wetlands ( $2.27 \pm 0.04 \text{ mg C m}^{-2} \text{ h}^{-1}$ ). However, given the large differences between fluxes calculated within the forest and wetland, and the heterogeneous mix of these two primary ecosystem types across the subarctic/boreal system, landscape-scale emissions are of greater importance in understanding global CH<sub>4</sub> source estimates than wetland emissions alone. By extending our sampling site to a  $2 \text{ km} \times 2 \text{ km}$  landscape we can calculate emissions which are more relevant to the region as a whole. Based on a weighted average of fluxes from the forest and wetland within the landscape, and assuming CH<sub>4</sub> emissions from the other landscape units are zero, we can calculate average landscape scale emissions of  $0.93 \pm 0.12 \text{ mg CH}_4\text{-C m}^{-2} \text{ h}^{-1}$ .

Whilst calculations at this level of detail have previously been shown to give good agreement with more top-down methodologies (O'Shea et al., 2014), significant information is lost regarding spatial variability which we have already shown to be large, especially within the wetland. Utilizing spectral data across the  $2 \text{ km} \times 2 \text{ km}$  landscape and a multiple regression model, we calculated average CH<sub>4</sub> flux

over the growing season as  $47.4 \pm 14.1 \text{ nmol CH}_4 \text{ m}^{-2} \text{ s}^{-1}$  or  $2.05 \pm 0.61 \text{ mg C m}^{-2} \text{ h}^{-1}$ . This is significantly higher than the  $100 \text{ km}^2$  landscape scale CH<sub>4</sub> flux of  $1.1$  to  $1.4 \text{ g CH}_4 \text{ m}^{-2}$  during the May to October growing season ( $0.19$  to  $0.23 \text{ mg C m}^{-2} \text{ h}^{-1}$ ) calculated by Hartley et al. (2015). The Hartley et al. (2015) study was based on field measurements collected approximately  $240 \text{ km}$  north of our study site, up-scaled using aerial imagery and satellite data. Even when utilizing data presented from only July–September, Hartley et al. (2015) still recorded much lower landscape scale fluxes (approximately  $0.24 \text{ mg C m}^{-2} \text{ h}^{-1}$ ) than this study due to the different landscape units and proportions of vegetation communities. Whereas we carried out our upscaling over an area characterized by  $61 \%$  wetlands and  $32 \%$  forest, the landscape unit measured by Hartley et al. (2015) contained only  $\sim 22 \%$  wetland (classified as both mire and mire edge) and  $60 \%$  forest. Heikkinen et al. (2004) also upscaled chamber-based CH<sub>4</sub> emissions to the landscape, in this instance a  $114 \text{ km}^2$  catchment in the eastern European Russian tundra, concluding a mean summer CH<sub>4</sub> emission rate of  $0.43 \text{ mg C m}^{-2} \text{ h}^{-1}$ . CH<sub>4</sub> emissions from areas classified as peaty tundra (including intermediate flarks, *Carex* + *Sphagnum* and hummocks), which ranged from  $0.15$  to  $4.25 \text{ mg C m}^{-2} \text{ h}^{-1}$ , were similar to those presented here. However, again it is the proportion of wetland within the landscape ( $16.1 \%$ ) and to a lesser extent the distribution of emissions within the wetland that appears to be most important in defining the landscape scale flux.

Open water has not been included in this study as it was not an important feature in the  $2 \text{ km} \times 2 \text{ km}$  study area. However, given the large proportion of lakes and ponds across subarctic and boreal ecosystems, and the potential increase in surface water as the changing climate alters subsurface hydrology, this is something that will become more important both in the future and as we scale to larger or regional landscapes. Methane emissions from Arctic lakes are estimated to total  $11.86 \text{ Tg yr}^{-1}$ , varying spatially over high latitudes from  $3.46 \text{ mg C m}^{-2} \text{ h}^{-1}$  in Alaska to  $0.40 \text{ mg C m}^{-2} \text{ h}^{-1}$  in northern Europe (Tan and Zhuang, 2015); this puts lake fluxes in the same order of CH<sub>4</sub> emissions as northern high-latitude wetlands and comparable to the values measured in this study.

There is still considerable uncertainty in extrapolating to our  $2 \text{ km} \times 2 \text{ km}$  landscape despite optical remote sensing data having complete coverage and a reasonably well-defined relationship with CH<sub>4</sub> flux. Greatest emissions and subsequently the greatest uncertainty are observed in an area to the northeast of our landscape which represents an area of yellow/green *Sphagnum*. Further flux measurements are required to reduce the uncertainty in this area. Therefore, in addition to providing upscaled emission estimates, this spectral approach could also potentially be applied to define specific areas for future research focus, maximizing the potential explanatory power of future campaigns.

We were unable to carry out a similar upscaling exercise for N<sub>2</sub>O; however, given the near-zero fluxes across the majority of study chambers, a detailed spatial method is not required to say with a large degree of certainty that N<sub>2</sub>O emissions are not currently a major component of the growing season GHG balance of our landscape. Whilst potentially subject to changes in temperature and hydrology as a result of climate, our site was not underlain by permafrost and therefore is not going to be affected by thaw-related processes. Recent studies have shown potentially large increases in N<sub>2</sub>O emissions related to permafrost thaw (Elberling et al., 2010; Abbott and Jones, 2015); thus, whilst negligible here, N<sub>2</sub>O emissions across the wider northern boreal and subarctic zone may become increasingly important to the total GHG balance of the landscape and should therefore continue to be monitored in future research.

### 4.3 Conclusions

Our results showed a significant proportion of measured N<sub>2</sub>O fluxes, across both wetland and forest, and CH<sub>4</sub> fluxes within the forest, were not distinguishable from zero. Considering only those fluxes that did differ significantly from zero we can be confident that the wetland represented a strong source of CH<sub>4</sub>, especially during the summer peak growing season ( $3.35 \pm 0.44 \text{ mg C m}^{-2} \text{ h}^{-1}$ ), and the forest a small CH<sub>4</sub> sink (summer:  $-0.06 \pm <0.01 \text{ mg C m}^{-2} \text{ h}^{-1}$ ). We conclude that N<sub>2</sub>O fluxes were near-zero across the landscape in both forest and wetland. Despite the small magnitude of N<sub>2</sub>O fluxes this is still an important result given the current lack of data available for N<sub>2</sub>O across northern boreal, subarctic regions, and the potential for future increases in relation to climate and land use.

We did not observe a direct water table control on spatial variability in CH<sub>4</sub> emissions but instead found a relationship with vegetation communities, in particular the presence of *Sphagnum* mosses, and with soil chemistry which we attribute to redox potential. Both these parameters suggest that water table level and water table variability over a longer timescale prior to flux measurements is required to accurately predict CH<sub>4</sub> emissions. When temporal variability across the campaigns was considered we found a decrease in CH<sub>4</sub> emissions as water table approached the soil surface and the soil became fully saturated. We attribute this apparent reversal of the literature described relationship between CH<sub>4</sub> and water table to the water table depth being consistently above the optimum. As water levels continue to rise beyond this point diffusion becomes restricted and the flux diminished. We also found a temporal relationship between CH<sub>4</sub> emissions and soil temperature with peak emissions at approximately  $12 \text{ }^\circ\text{C}$ .

To upscale the chamber measurements of CH<sub>4</sub> to a  $2 \text{ km} \times 2 \text{ km}$  landscape area we utilized PLEIADES PA1 satellite imagery and could account for  $45 \%$  of spatial variability in CH<sub>4</sub> flux using SR, NDVI, Blue and NIR spec-

tral data. Applying this model to the full area gave us an estimated CH<sub>4</sub> emission of  $2.05 \pm 0.61 \text{ mg C m}^{-2} \text{ h}^{-1}$ . This was higher than landscape estimates based on either a simple mean or weighted by forest/wetland proportion alone ( $0.99 \pm 0.16$ ,  $0.93 \pm 0.12 \text{ mg C m}^{-2} \text{ h}^{-1}$ , respectively). Hence whilst there are clearly uncertainties associated with the modelled approach, excluding spatial variability as with the latter two methods is likely to lead to underestimations in total emissions. This approach therefore has considerable potential for increasing the accuracy of future landscape scale emission estimates and making better use of the wide variety of chamber measurements currently presented in the literature. When compared to similar upscaling studies our landscape estimate showed significantly higher CH<sub>4</sub> emissions, even when individual chamber scale fluxes were similar. Whilst spatial variability within the wetland area was important, the primary difference was the proportion of ecosystem units within the measurement landscape, e.g. the proportion of wetland vs forest or tundra. It is therefore not applicable to take the results presented here and simply apply the landscape mean to a larger area given that the proportion of wetland will change substantially with scale; however, with the addition of further ground-truthing and a larger spectral image, larger areas could be similarly modelled.

## 5 Data availability

Data will be made available through the Environmental Information Data Centre (EIDC; Dinsmore et al., 2017), a Natural Environment Research Council data centre hosted by the Centre for Ecology & Hydrology (CEH), UK.

*Author contributions.* Ute M. Skiba, designed the field experiment, Julia Drewer, Kerry J. Dinsmore and Ute Skiba and carried out the field experiments and subsequent laboratory analysis. Annalea Lohila and Mika Aurela hosted the field sites, provided help with the field site selection, the experimental set-up and local knowledge. Peter E. Levy and Charles George analysed the spectral data and developed the model for upscaling chamber emissions to landscape. Kerry J. Dinsmore carried out the remainder of the analysis and prepared the manuscript with contributions from all co-authors.

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

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