1 Spatial variation of surface soil carbon in a boreal forest – the role of historical

2 fires, contemporary vegetation, and hydro-topography

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4 Vilde L. Haukenes^a, Lisa Åsgård^a, Johan Asplund^a, Line Nybakken^a, Jørund

- 5 Rolstad^b, Ken Olaf Storaunet^b, Mikael Ohlson^a
- ⁶ ^aFaculty of Environmental Sciences and Natural Resource Management, Norwegian
- 7 University of Life Sciences, P.O Box 5003, 1432 Ås, Norway
- 8 ^bDepartment of Forest Genetics and Biodiversity, Norwegian Institute of Bioeconomy
- 9 Research, P.O. Box 115, 1431 Ås, Norway
- 10 Corresponding author: Vilde Haukenes, Email: <u>vilde.haukenes@nmbu.no</u>
- 11 Tel: +47 91771985

12 Abstract

13 Knowledge about the spatial variation of boreal forest soil carbon (C) stocks is limited, but crucial for establishing management practices that prevent losses of soil C. Here, we 14 quantified the surface soil C stocks across small spatial scales, and aim to contribute to an 15 improved understanding of the drivers involved in boreal forest soil C accumulation. Our 16 study is based on C analyses of 192 soil cores, positioned and recorded systematically 17 within a forest area of 11 ha. The study area is a south-central Norwegian boreal forest 18 19 landscape, where the fire history for the past 650 years has been reconstructed. Soil C stocks ranged from 1.3 to 96.7 kg m⁻² and were related to fire frequency, ecosystem 20 21 productivity, vegetation attributes, and hydro-topography. Soil C stocks increased with soil 22 nitrogen concentration, soil water content, Sphagnum- and litter-dominated forest floor vegetation, and proportion of silt in the mineral soil, and decreased with fire frequency in site 23 1, feathermoss- and lichen-dominated forest floor vegetation and increasing slope. Our 24 results emphasize that boreal forest surface soil C stocks are highly variable in size across 25 26 fine spatial scales, shaped by an interplay between historical forest fires, ecosystem productivity, forest floor vegetation, and hydro-topography. 27

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Key words: Organic surface carbon stocks, forest fire history, hydro-topography, spatial fine scale variation

31 1. Introduction

32 Boreal forest soils store approximately 20% of the terrestrial carbon (C) stock (Scharlemann et al., 2014), and thus play an important role in the global C dynamics (Pan et al., 2011). The 33 large build-up of C in boreal forest soils are mainly due to low temperatures that lead to low 34 decomposition rates (Malhi et al., 1999; DeLuca & Boisvenue, 2012). Even so, these stocks 35 can be highly variable on fine spatial scales (Kristensen et al. 2015), which imply that 36 additional drivers are involved. Specifically, boreal forest soil C stocks are controlled by: I) 37 38 Temperature and humidity which drives primary production, decomposition and respiration 39 (Jobbágy & Jackson, 2000; Pan et al., 2011); II) Fire regimes which impact the soil structure, 40 nutrient pools and biochemistry (Andrieux et al., 2018; McLauchlan et al., 2020; Palviainen 41 et al., 2020; Mack et al., 2021); III) Climate- and fire interactions, which alter boreal forest vegetation composition and hence litter quality, root distribution, and above-belowground 42 allocation patterns (Zackrisson et al., 1996; Jobbágy & Jackson, 2000; Nilsson & Wardle, 43 2005); and IV) Soil texture and topography that determine hydrological conditions and build-44 45 up of organic matter, where coarse-texture soils favour faster organic matter decomposition (Harden et al., 1997; Harden et al., 2000; Olsson et al., 2009; Zajícová & Chuman, 2020). 46

47 Forest ecosystems are experiencing alterations in fire regimes as climate is changing (Flannigan et al., 2000; Whitlock et al., 2003; Seidl et al., 2020). This will impact the boreal 48 forest soil C stocks significantly as the proportion of fire-consumed C is determined by both 49 fire intensity and frequency (Williams et al., 2016). Typically, higher fire intensities and 50 increased frequencies result in larger C losses and longer soil C stock recovery times 51 (Alcaniz et al., 2018; Pellegrini et al., 2018), which both have been found to be variable in 52 boreal forests (Hume et al., 2016; Palviainen et al., 2020; Li et al., 2021). Yet, a general 53 54 trend in the boreal forest C stock recovery process is that an initial period with fast accumulation of organic matter is followed by slow and continuous increases of the soil C 55 56 stocks. This can go on for several hundreds, or even thousands of years, related to vegetation attributes of the forest ecosystem (Wardle et al., 2012; Andrieux et al., 2018; 57 58 Mack et al., 2021). However, despite a growing body of research on how fire impacts soil C 59 stocks in boreal forests, we lack information about relationships between occurrences of 60 historical fires and contemporary soil C stock sizes, as both figures are known to be spatially 61 variable in boreal forests (Zackrisson, 1977; Niklasson & Granström, 2000; Pellegrini et al., 62 2018; McLauchlan et al., 2020).

Here we focus on the interplay between contemporary and historical drivers of forest organic
surface soil C stock sizes (hereafter termed soil C). Our main aim is to increase the
understanding of processes involved in forest soil C dynamics and improve the knowledge

66 about size variation over fine spatial scales. To do this, we utilized a detailed 67 dendrochronology-based study of fire history (Storaunet et al., 2013) to establish a study design that allow us to investigate if and how the size of boreal forest soil C stocks varies 68 across different historical fire regimes. We used this set up to address the following 69 questions. (I) To which extent does historical high-resolution fire data (i.e., time since last fire 70 and fire frequency) relate to present soil C stock sizes? (II) Does hydro-topography and 71 contemporary vegetation attributes play a more important role than fire history in shaping the 72 spatial variation in soil C stock sizes? We focused on the organic surface soil C layer since it 73 74 is strongly affected by forest fires (Li et al., 2021; Hanes et al., 2022), and a key determinant of the C dynamics in the boreal forest soil (Högberg et al., 2001; Lindahl et al., 2007). 75

⁷⁶ 2. Materials and methods

⁷⁷ 2.1 Study sites

The study area consisted of two forest sites located in Trillemarka-Rollagsfjell Nature 78 79 Reserve in south-central Norway (60°2'N, 9°25'E). With an area of 147 km², Trillemarka-80 Rollagsfjell Nature Reserve is one of the largest forested areas in south-central Norway with 81 little influence of modern clearcutting practices. It belongs to the mid-boreal vegetation zone, with an intermediate oceanic and continental climate, experiencing mean annual 82 precipitation of 800-900 mm and mean annual temperature of 5°C, with monthly means 83 varying from -5.6°C in January to 16.3°C in July. Climate data are averages from Veggli, 84 located 15 km W of the study area, 275 m a.s.l., and Sigdal – Nedre Eggedal, located 11 km 85 NNE from the study area, 143 m a.s.l. (https://seklima.met.no/observations/). The 86 topography is characterized by north-south ridges of Precambrian rocks that constitute a 87 bedrock of acid granites and gneisses, as well as east-facing slopes of rich moraine 88 89 material.





Fig. 1 Location of the two study sites (site 1 and site 2) and positions of plots for soil sampling and
 vegetation analyses in Trillemarka-Rollagsfjell Nature Reserve, south-central Norway. Topographic
 contour line distance=5 m. Data retrieved from The Norwegian Mapping Authority (2017).

93 Two approximately 5.5 ha study sites were selected within a 360-ha area of the Nature 94 Reserve at elevations ranging from 400 (site 2, Langkloppdalen) to 550 m a.s.l. (site 1, 95 Heimseteråsen) (Fig. 1). The forests were nutrient-poor and dominated by Scots pine (*Pinus* sylvestris), with sparse occurrences of Norway spruce (Picea abies), downy birch (Betula 96 pubescens), and rowan (Sorbus aucuparia). The two study sites were placed in order to 97 represent a broad range of differences in time since last fire and fire frequency (Fig. 2) as 98 outlined in Storaunet et al. (2013) (see below / Section 2.2.2), while avoiding open 99 unforested peatland areas. 100

101 2.2 Data collection

102 2.2.1 Organic surface soil sampling

103 In September-October 2020 we collected a total of 195 soil samples at plots that were located systematically 24 m apart across both sites (Fig. 1). At each soil sample plot, we 104 sampled the entire organic surface soil horizon including a few centimetres of the 105 underlaying mineral layer with a sharp-edged cylindric soil corer (ø 58 mm). The soil 106 samples were divided in the field into organic layer and mineral layer and stored in separate 107 sealed plastic bags. We used soil depth and corer inner area to calculate sample volume. 108 Hence, soil sample depth and volume varied with thickness of the organic surface soil. We 109 relocated plots on bare bedrock (n=8, starting one meter north and moving 90 degrees 110 clockwise until a suitable location was achieved) and used a metal rod to measure the 111 thickness of the organic surface soil in a few plots (*n*=18), where the depth of the organic soil 112 exceeded the length of the soil corer (40 cm). Thus, our estimates cover organic soil depths 113 ranging from 2 to 110 cm, averaging 21.3±1.6 cm (±SE). All soil samples were brought back 114 to the lab, weighed, and dried at 40°C until mass was constant. Prior to further analyses, the 115 116 dry soil was weighed, and the organic soil homogenized by a rotary mill (Brabender Rotary Mill, Germany). 117

118 2.2.2 Fire history

The fire history data originated from Storaunet et al. (2013), who delineated 57 individual forest fires in the landscape over the past 650 years by their high-resolution sampling and cross-dating of fire scars. A strong anthropogenic signal was found in the fire regime from 1600 and onwards, with an increased fire frequency during 16-1700s and an almost cessation of fires after 1800. From these fire historical data, we extracted the variables "Time since last fire" and "Fire frequency" for each soil sample plot across our study sites (Fig. 2) (see Storaunet et al. 2013 for methodological details).



Fig. 2 Fire history characteristics of the study sites 1 and 2 (a. and b.). Numbers in left panels denote number of years since the last fire. Right panels depict number of recurring fires since AD 1350. Data extracted from Storaunet et al. (2013). Black dots in left panels denote soil sample locations, whereas white dots in right panels denote fire scarred wooden samples.

130 2.2.3 Vegetation

Quadrat vegetation sampling plots of 50x50 cm were located around the center of all soil sampling positions. We recorded percentage forest floor vegetation cover according to these vegetation categories: *Sphagnum* mosses; feather mosses (mainly *Pleurozium schreberi* and *Hylocomium splendens*); lichens (mostly *Cladonia* species and *Cetraria islandica*); litter (field layer vegetation, but no forest floor vegetation); naked (bare ground without any vegetation), plots on bare bedrock were relocated in the sampling procedure (*n*=8). In addition, we estimated the forest stand basal area of *P. sylvestris*, *P. abies* and deciduous
trees using a relascope (factor 1) at every soil sample plot.

139 2.2.4 Topography and wetness

We defined microtopography of the 50x50 cm sample plot as convex (i.e., well drained hills), 140 concave (i.e., terrain depressions), or flat, and registered aspect and slope using a compass 141 and a clinometer (referred to as 'plot' in analyses). We also derived topography for the soil 142 sampling plots from a 0.25x0.25 m resolution digital terrain model (DTM) (The Norwegian 143 Mapping Authority, 2017). We retrieved elevation, slope and aspect using QGIS 3.16.7 144 (QGIS.org, 2022), and averaged slope and aspect over a 24x24 m area around each 145 sample plot (referred to as 'terrain' in analyses). Further, we defined soil water content as 146 sample dry weight divided by sample wet weight, subtracted from one. As rainfall conditions 147 varied prior to sampling, the soil wetness variable was centred and scaled by subtracting the 148 149 mean and dividing by the SD per sampling date.

150 2.3 Soil analyses

Total C and nitrogen (N) concentrations (%) of the organic surface soil were determined by 151 automated dry combustion in an elemental analyser (vario MICRO cube, Elementar, 152 Germany). The dry matter mass was used to determine bulk density (BD; g cm⁻³) of the 153 organic and mineral soil fraction. C and N stocks (kg m⁻²) in the soil were thereafter 154 calculated by multiplying C (%) or N (%) with BD (g cm⁻³) and soil depth (cm) and scaled to 155 kg m⁻². Soil texture of 21 mineral soil samples were determined. The 21 samples were 156 chosen based on a stratified random procedure where samples first were grouped by soil C 157 stock size (i.e., largest, median, and smallest). For each category, we included the 14 top-158 159 ranked samples from which we randomly drew 7 samples. Samples without mineral soil 160 were excluded. The selected samples were carefully sieved through a 2 mm sieve before 161 they were analysed by a laser diffraction particle size analyzer (Beckman Coulter LS 13 320, United States). 162

163 2.4 Data analyses

Prior to statistical analyses, data were explored visually by boxplots, dotplots, and pairplots to identify patterns in the data, potential outliers, and covariation. We identified three outliers using a Bonferroni outlier test. These samples had unrealistically low C% values due to contamination with mineral soil, and were thus removed, reducing the sample size to 192. A principal component analysis (PCA) was performed on the 5 forest floor vegetation categories outlined above (Appendix A, Fig. A.1). We did this to identify forest floor vegetation gradients with contrasting properties. We give an overview of all response- andpredictor variables in Appendix A, Table A.1.

To test the effects of predictor variables, we used linear mixed effect models. The two sites 172 were included as random effects to deal with potential site-specific difference introduced by 173 the study design. However, site was not significant in explaining overall soil C stock 174 variation. As we selected the study sites to cover a range of differences in fire history, 175 interaction terms between site and fire frequency as well as site and time since last fire were 176 177 included in the models. The model assumptions of normality and homoscedasticity of residuals were visually inspected. As the normality assumption was violated, we applied a 178 log_e-transformation of soil C stocks to improve the fit of the data. 179

We used information-theoretic model averaging based on Akaike information criterion (AIC) 180 to assess the relative importance of each predictor variable in relation to soil C stocks 181 182 (Burnham & Anderson, 2002). Strongly correlated variables ($|r| \ge 0.5$) were not allowed in 183 the same model (see Appendix A Fig. A.2 for covariation plot). We calculated variable 184 importance score of each predictor variable by summing the Akaike weights over all models including the relevant term. Corresponding estimated coefficients were averaged over the 185 186 same models and weighted according to the probability of each model. Soil texture (i.e., sand, silt, and clay) in relation to soil C stocks were modelled in separate mixed effect 187 models due to small sample size (n=21). We did all statistical analyses in R version 4.1.1 188 (RStudio Team, 2020), using the packages 'vegan', 'emmeans', 'nlme' and 'MuMIN'. All 189 maps were created using QGIS 3.16.7 (QGIS.org, 2022). 190

191 3. Results

C stocks in the organic layer ranged from 1.3 kg m⁻² to 96.7 kg m⁻² across the study sites 192 and averaged 9.1±0.9 kg m⁻². The relative importance of the different drivers of C soil stocks 193 are given in Fig. 3a, and the predictor variables included in the best model explained half of 194 the variation in soil C stocks (marginal R²=0.51, see Appendix B, Table. B.1 for all models 195 with \triangle AIC < 2). N-rich organic surface soil had larger C stocks (Fig. 3b, Fig. 4a). Further, soil 196 C varied with vegetation attributes. Plots with a larger proportion of litter compared to lichen 197 198 (forest floor vegetation PC2) and peatmoss compared to feathermoss (forest floor vegetation 199 PC1) had larger soil C stocks (Fig. 3b, Fig. 4b, d, see Appendix A Fig. A.1 for PCA plot). 200 Fine-scale spatial variation in hydro-topography (i.e., soil water content and slope) also 201 influenced the soil C stocks. Wetter areas had larger soil C stocks compared to drier, and soil C stocks decreased with increasing slope (Fig. 3b, Fig. 4c, e). Lastly, a significant 202 interaction term between fire frequency and site implied that soil C decreased with 203 increasing fire frequency at site 1: areas with a low fire frequency (i.e., 3-4 fires) during the 204 past 650 years had larger soil C stocks compared to areas with a high fire frequency (i.e., 6-205 7 fires). There was no effect of fire frequency at site 2 (Fig. 4f). In addition, areas with a 206 higher proportion of silt in the mineral soil had larger soil C stocks (separate mixed effect 207 model estimate: 0.16, CI: 0.02-0.31, *n*=21). Proportion of silt in the mineral soil varied from 208 13% to 61% across our study sites and was highly correlated with sand content (r=-0.99). 209



Fig. 3 (a) Relative variable importance scores, and (b) corresponding significant coefficient estimates 210 211 from model average analysis of predictors of boreal forest soil C stocks. The variable importance 212 scores can be interpreted as the probability of that variable being a part of the best model and can 213 therefore be used to rank the predictors in order of importance. Model average coefficients were 214 averaged across all models and means, 95% CI are shown where CI's crossing zero are nonsignificant. All continuous predictor variables are centered and scaled to be directly comparable. 215 216 Forest floor vegetation PC1 is a vegetation gradient going from feathermoss- to peatmoss-dominated sampling plots, and forest floor vegetation PC2 a vegetation gradient going from lichen- to litter-217 218 dominated sampling plots. Interacting terms between site and fire history have site 1 as reference 219 level.



Fig. 4 (a) Soil N concentration (%), (b) forest floor vegetation PC2, (c) soil water content, (d) forest floor vegetation PC1, (e) slope of the plot, and (f) fire frequency per site, site 1 is in light orange (significant) and site 2 in dark orange (non-significant), as drivers of boreal forest soil C stocks (logescale). Significant model fits from the best model based on the model average analysis are shown for each driver as a solid line with 95% CI. Soil C data are presented as open black dots in all panels except for f, where soil C data are coloured according to site.

226 4. Discussion

We show that soil C stocks are highly variable across fine spatial scales in boreal Scots pine 227 forests, averaging 9.1±0.9 kg m⁻². This is higher than averages from other comparable study 228 areas in Sweden (2.8±0.1 kg m⁻², Olsson et al. (2009)) and Denmark (3.9±0.7 kg m⁻², Vejre 229 et al. (2003)). However, both these studies report shallower organic surface soil layers than 230 what we found across our study area, which is a key-explanation for the discrepancy. Our 231 study provides evidence that the variation in soil C stock sizes is partly attributed to historical 232 233 forest fires, but even more to contemporary ecosystem productivity, vegetation composition, 234 and fine-scale hydro-topography.

4.1 Role of historical fires

Typically, increased fire frequency results in larger C losses (Alcaniz et al., 2018; Pellegrini et al., 2018). A significant interaction term revealed that the effect of fire frequency on soil C was not consistent between the two study sites. At the western site 1, soil C expectedly decreased with fire frequency, whereas no such effect was present at the eastern site 2. We propose that the lack of impact of forest fires at site 2 may be explained by: I) low intensity fires; II) organic soil recovery due to long time since last fire events; and III) discrepancies in spatial precision between soil C stock estimates and fire history data.

243 First, many of the fires in the area may have been low-intensity and anthropogenic 244 prescribed burns, especially after AD 1600 (Storaunet et al., 2013; Rolstad et al., 2017). Historically, summer dairy farmers were known to set fires in spring and early summer to 245 remove old field vegetation while leaving the organic soil layer intact (Larsson, 1995; 246 Niklasson & Drakenberg, 2001). This fire management was to enhance the guality of forest 247 248 pastures without reducing the long-term productivity of the land. Likewise, a Finnish experimental study, reporting raw humus layers to be remarkably resistant to drought due to 249 strong water-holding capacity (Lindberg et al., 2021). Therefore, many of the fires at site 2 250 may have had negligible effect on soil C, whereas several large, natural fires may have 251 252 depleted more of the soil C at site 1.

Second, no fires have been recorded at site 2 over the past 250-300 years, and in addition, after AD 1600 the fire sizes and intensity went significantly down (Storaunet et al., 2013). This suggests that the forest soil C stocks were only lightly depleted and thereafter partly or fully recovered in the time period after last fires. Our finding is consistent with previous studies on soil C recovery time, which have been investigated across chronosequences (Harden et al., 2012; Hume et al., 2016; Palviainen et al., 2020) and differences in fire frequencies in boreal forests (Pellegrini et al., 2018). 260 On the other hand, studies have also found the recovery of boreal forest soil C stocks to be 261 impacted by historical fire regimes for hundreds to several thousands of years (Wardle et al., 262 2012; Andrieux et al., 2018). As our record of fires was limited to the last 650 years, soil C stocks may have been more influenced by earlier Holocene fire activity, masking possible 263 264 effects of more recent fires. Furthermore, besides a direct effect of fire, i.e., that fire consumes organic matter, and removes soil C stocks partly or totally, these studies also 265 found that fire had indirect effects on soil C stocks, through fire driven changes in plant 266 diversity, composition (Wardle et al., 2012), and soil pH (Andrieux et al., 2018). 267

Third, and possibly most likely, the lack of influence of past fire events at site 2 can be 268 attributed to a mismatch in terms of spatial resolution. Even though Storaunet et al. (2013) 269 270 have documented the spatiotemporal fire history of the study sites in detail, we have a considerably higher spatial resolution in the present study. Many of the fires may also have 271 burnt the ground vegetation only partially, resulting in a fine-scaled mosaic pattern of burnt 272 273 and unburnt areas. Such spatial discrepancies could obscure potential relationships between 274 fire occurrences in the past and contemporary soil C stock sizes as the impact of historical 275 fires may be overshadowed by other variables that operate on finer spatial scales. In 276 addition, the dendroecological records of fire events may have missed several low-intensity 277 fires that did not produce fire scars in the trees. Likely, the fire history of our study sites, as well as of most boreal forests, is more spatially complex than can be revealed by standard 278 dendrochronological studies as their spatial precision is directly dependent on the number 279 280 and distribution of fire scarred trees, see e.g. (Parisien & Moritz, 2009; Rolstad et al., 2017).

4.2 Role of nitrogen and soil texture

Boreal forests are strongly N limited (Tamm, 1991; DeLuca et al., 2008; Maaroufi et al., 282 2015), and soil N availability is thus an important indicator of productivity. Our soil total N 283 measures do not necessarily reflect availability. Nonetheless, total N concentration in the soil 284 samples was clearly the most important driver of soil C stock sizes in our study. Results from 285 a long-term N addition experiment give support for a positive relationship between N 286 availability and amount of C in the organic surface soil as N treatments resulted in increasing 287 C pools in the soil O-horizon (Maaroufi et al., 2015). However, the relationship between N 288 289 availability and C sequestration in boreal forest soils is complex (Hume et al., 2016; Högberg et al., 2017; Mayer et al., 2020), and it is worth noting that the N treatment levels in Maaroufi 290 et al. (2015) was generally high, with yearly doses of 12.5 or 50 kg N ha⁻¹, over 16 years. 291

Productivity and soil C stocks of the boreal forest was also mediated by soil drainage, which
have for long been considered a primary control on boreal forest soil C stocks (Harden et al.,
1997). In-depth investigation of soil drainage was beyond the scope of this study. Even so,

295 our results suggest that differences in soil texture, especially proportion of silt in the mineral 296 soil, constitutes an important regulator of build-up of organic matter. Moreover, we found 297 differences in slope of each sampling plot to be more important than the slope of the general 298 terrain, highlighting how fine-scale differences need to be accounted for in soil C stock 299 estimations.

300 4.3 Role of contemporary vegetation and hydro-topography

It is well known that vegetation composition is important in shaping forests and soil C accumulation on wide forest type spatial scales (Jobbágy & Jackson, 2000; Nilsson & Wardle, 2005; Jonsson & Wardle, 2010). Our study adds a further perspective to this context by revealing a strong fine-scale spatial relationship between vegetation composition and soil C stock size within a single and widely distributed boreal forest type, i.e., nutrient poor Scots pine forests with feathermosses and ericaceous dwarf shrubs as dominants in the field- and forest floor vegetation (see Kielland-Lund (1981) for forest type definition).

308 Whether the forest floor was dominated by feathermosses or Sphagnum peatmosses turned 309 out as an important driver of the soil C stocks across fine spatial scales, and peatmoss dominated areas stored the largest amounts of soil C. We attribute this to hydro-topography, 310 and the habitat preferences and ecophysiological characteristics of the different functional 311 groups of mosses. Feathermosses generally prefer drier habitats and have a relatively high 312 decomposability and low productivity compared to peatmosses (Lang et al., 2009), resulting 313 in less C accumulation. In contrast, peatmosses prefer waterlogged habitats, in which they 314 outcompete other vegetation (Van Breemen, 1995; Bisbee et al., 2001). Such wet habitats 315 create an anoxic soil environment with low decomposition rates, resulting in accumulation of 316 organic matter, and thereby C (Ohlson & Halvorsen Økland, 1998). The importance of moss 317 cover and water availability for the C stocks in boreal forests is known from previous studies 318 e.g., (Olsson et al., 2009; Andrieux et al., 2018; Zajícová & Chuman, 2020) and our results 319 320 underline the general importance of the forest floor vegetation as a driver of the spatial 321 variation in C stocks across fine scales.

Nitrogen availability, which is an important driver soil C stocks (Maaroufi et al., 2015), is also known to be significantly affected by hydro-topographic variability. For example, Woo and Kumar (2017) have shown that both the distributions of concentrations and age of different inorganic nitrogen species including nitrate, ammonia, and ammonium in the soil is linked to micro-topographic variability.

327 4.4 Conclusion

We conclude that boreal forests soil C stocks, which appear homogenous on large spatial scales, are highly heterogenous across fine spatial scales. Variation in soil C stocks was partly attributed to historical forest fires, but more so to contemporary ecosystem productivity, vegetation composition, and fine-scale hydro-topography. These results highlight the importance of high spatial resolution, as well as controlling for various edaphic and biotic factors when investigating soil C stocks and its drivers.

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- 339 Declaration of interest
- 340 The authors report there are no competing interests to declare.
- 341 Data statement

342 Data associated with this manuscript are deposited in the NMBU Open Research Data

343 database <u>https://doi.org/10.18710/FJWV6X</u>.

344 References

- Alcaniz, M., Outeiro, L., Francos, M., & Ubeda, X. (2018). Effects of prescribed fires on soil properties:
 A review. *Science of The Total Environment*, *613*, 944-957.
 doi:10.1016/j.scitotenv.2017.09.144
- Andrieux, B., Beguin, J., Bergeron, Y., Grondin, P., & Paré, D. (2018). Drivers of postfire soil organic carbon accumulation in the boreal forest. *Global Change Biology*, *24*(10), 4797-4815.
- Bisbee, K. E., Gower, S. T., Norman, J. M., & Nordheim, E. V. (2001). Environmental controls on
 ground cover species composition and productivity in a boreal black spruce forest.
 Oecologia, 129(2), 261-270.
- Burnham, K. P., & Anderson, D. R. (2002). A practical information-theoretic approach. *Model selection and multimodel inference, 2.*
- 355 DeLuca, T. H., & Boisvenue, C. (2012). Boreal forest soil carbon: distribution, function and modelling.
 356 Forestry, 85(2), 161-184.
- DeLuca, T. H., Zackrisson, O., Gundale, M. J., & Nilsson, M.-C. (2008). Ecosystem feedbacks and
 nitrogen fixation in boreal forests. *Science*, *320*(5880), 1181-1181.
- Flannigan, M. D., Stocks, B. J., & Wotton, B. M. (2000). Climate change and forest fires. *Science of The Total Environment*, 262(3), 221-229.
- Hanes, C. C., Wotton, M., Woolford, D. G., Martell, D. L., & Flannigan, M. (2022). Mapping organic
 layer thickness and fuel load of the boreal forest in Alberta, Canada. *Geoderma*, 417,
 115827.
- Harden, J., Manies, K. L., O'Donnell, J., Johnson, K., Frolking, S., & Fan, Z. (2012). Spatiotemporal
 analysis of black spruce forest soils and implications for the fate of C. *Journal of Geophysical Research: Biogeosciences, 117*(G1).
- Harden, J., O'neill, K., Trumbore, S. E., Veldhuis, H., & Stocks, B. (1997). Moss and soil contributions
 to the annual net carbon flux of a maturing boreal forest. *Journal of Geophysical Research: Atmospheres, 102*(D24), 28805-28816.
- Harden, J., Trumbore, S. E., Stocks, B., Hirsch, A., Gower, S., O'neill, K., & Kasischke, E. (2000). The
 role of fire in the boreal carbon budget. *Global Change Biology*, 6(S1), 174-184.
- Hume, A., Chen, H. Y. H., Taylor, A. R., Kayahara, G. J., & Man, R. Z. (2016). Soil C:N:P dynamics
 during secondary succession following fire in the boreal forest of central Canada. *Forest ecology and management, 369*, 1-9. doi:10.1016/j.foreco.2016.03.033
- Högberg, P., Nordgren, A., Buchmann, N., Taylor, A. F., Ekblad, A., HoÈgberg, M. N., ... Read, D. J.
 (2001). Large-scale forest girdling shows that current photosynthesis drives soil respiration. *Nature*, 411(6839), 789-792.
- Högberg, P., Näsholm, T., Franklin, O., & Högberg, M. N. (2017). Tamm Review: On the nature of the
 nitrogen limitation to plant growth in Fennoscandian boreal forests. *Forest ecology and management*, 403, 161-185.
- Jobbágy, E. G., & Jackson, R. B. (2000). The vertical distribution of soil organic carbon and its relation
 to climate and vegetation. *Ecological applications, 10*(2), 423-436.
- Jonsson, M., & Wardle, D. A. (2010). Structural equation modelling reveals plant-community drivers
 of carbon storage in boreal forest ecosystems. *Biology letters, 6*(1), 116-119.
- 385 Kielland-Lund, J. (1981). Die Waldgesellschaften SO-Norwegens. *Phytocoenologia*, 53-250.
- Lang, S. I., Cornelissen, J. H., Klahn, T., Van Logtestijn, R. S., Broekman, R., Schweikert, W., & Aerts, R.
 (2009). An experimental comparison of chemical traits and litter decomposition rates in a
 diverse range of subarctic bryophyte, lichen and vascular plant species. *Journal of Ecology*,
 97(5), 886-900.
- Larsson, B. (1995). Svedjebruk och röjningsbränning i Norden: terminologi, datering, metoder:
 Nordiska museet.
- Li, J., Pei, J., Liu, J., Wu, J., Li, B., Fang, C., & Nie, M. (2021). Spatiotemporal variability of fire effects
 on soil carbon and nitrogen: a global meta-analysis. *Global Change Biology*.

- Lindahl, B. D., Ihrmark, K., Boberg, J., Trumbore, S. E., Högberg, P., Stenlid, J., & Finlay, R. D. (2007).
 Spatial separation of litter decomposition and mycorrhizal nitrogen uptake in a boreal forest.
 New phytologist, *173*(3), 611-620.
- Lindberg, H., Aakala, T., & Vanha-Majamaa, I. (2021). Moisture content variation of ground
 vegetation fuels in boreal mesic and sub-xeric mineral soil forests in Finland. *International Journal of Wildland Fire, 30*(4), 283-293.
- Mack, M. C., Walker, X. J., Johnstone, J. F., Alexander, H. D., Melvin, A. M., Jean, M., & Miller, S. N.
 (2021). Carbon loss from boreal forest wildfires offset by increased dominance of deciduous
 trees. *Science*, *372*(6539), 280-283.
- Malhi, Y., Baldocchi, D., & Jarvis, P. (1999). The carbon balance of tropical, temperate and boreal
 forests. *Plant, Cell & Environment, 22*(6), 715-740.
- Mayer, M., Prescott, C. E., Abaker, W. E., Augusto, L., Cécillon, L., Ferreira, G. W., ... Laclau, J.-P.
 (2020). Tamm Review: Influence of forest management activities on soil organic carbon
 stocks: A knowledge synthesis. *Forest ecology and management, 466*, 118127.
- McLauchlan, K. K., Higuera, P. E., Miesel, J., Rogers, B. M., Schweitzer, J., Shuman, J. K., . . .
 Adalsteinsson, S. A. (2020). Fire as a fundamental ecological process: research advances and
 frontiers. *Journal of Ecology*.
- Maaroufi, N. I., Nordin, A., Hasselquist, N. J., Bach, L. H., Palmqvist, K., & Gundale, M. J. (2015).
 Anthropogenic nitrogen deposition enhances carbon sequestration in boreal soils. *Global Change Biology*, *21*(8), 3169-3180.
- Niklasson, M., & Drakenberg, B. (2001). A 600-year tree-ring fire history from Norra Kvills National
 Park, southern Sweden: implications for conservation strategies in the hemiboreal zone.
 Biological conservation, 101(1), 63-71.
- Niklasson, M., & Granström, A. (2000). Numbers and sizes of fires: long-term spatially explicit fire
 history in a Swedish boreal landscape. *Ecology*, *81*(6), 1484-1499.
- Nilsson, M.-C., & Wardle, D. A. (2005). Understory vegetation as a forest ecosystem driver: evidence
 from the northern Swedish boreal forest. *Frontiers in Ecology and the Environment, 3*(8),
 421 421-428.
- 422 Ohlson, M., & Halvorsen Økland, R. (1998). Spatial variation in rates of carbon and nitrogen
 423 accumulation in a boreal bog. *Ecology*, *79*(8), 2745-2758.
- Olsson, M. T., Erlandsson, M., Lundin, L., Nilsson, T., Nilsson, Å., & Stendahl, J. (2009). Organic
 carbon stocks in Swedish Podzol soils in relation to soil hydrology and other site
 characteristics. *Silva Fennica*, 43(2), 209-222.
- Palviainen, M., Laurén, A., Pumpanen, J., Bergeron, Y., Bond-Lamberty, B., Larjavaara, M., . . . Chen,
 H. (2020). Decadal-Scale Recovery of Carbon Stocks After Wildfires Throughout the Boreal
 Forests. *Global Biogeochemical Cycles*, 34(8), e2020GB006612.
- Pan, Y., Birdsey, R. A., Fang, J., Houghton, R., Kauppi, P. E., Kurz, W. A., . . . Canadell, J. G. (2011). A
 large and persistent carbon sink in the world's forests. *Science*, *333*(6045), 988-993.
- Parisien, M.-A., & Moritz, M. A. (2009). Environmental controls on the distribution of wildfire at
 multiple spatial scales. *Ecological Monographs*, *79*(1), 127-154.
- Pellegrini, A. F., Ahlström, A., Hobbie, S. E., Reich, P. B., Nieradzik, L. P., Staver, A. C., . . . Randerson,
 J. T. (2018). Fire frequency drives decadal changes in soil carbon and nitrogen and ecosystem
 productivity. *Nature*, *553*(7687), 194-198.
- 437 QGIS.org. (2022). QGIS Geographic Information System. *QGIS Association*. Retrieved from
 438 <u>http://www.qgis.org</u>
- Rolstad, J., Blanck, Y. I., & Storaunet, K. O. (2017). Fire history in a western Fennoscandian boreal
 forest as influenced by human land use and climate. *Ecological Monographs*, *87*(2), 219-245.
- 441 RStudio Team. (2020). RStudio: integrated development for R. RStudio, PBC, Boston. In.
- Scharlemann, J. P., Tanner, E. V., Hiederer, R., & Kapos, V. (2014). Global soil carbon: understanding
 and managing the largest terrestrial carbon pool. *Carbon Management*, 5(1), 81-91.

- Seidl, R., Honkaniemi, J., Aakala, T., Aleinikov, A., Angelstam, P., Bouchard, M., . . . Gauthier, S.
 (2020). Globally consistent climate sensitivity of natural disturbances across boreal and
 temperate forest ecosystems. *Ecography*, *43*(7), 967-978.
- Storaunet, K. O., Rolstad, J., Toeneiet, M., & Blanck, Y.-l. (2013). Strong anthropogenic signals in
 historic forest fire regime: a detailed spatiotemporal case study from south-central Norway. *Canadian Journal of Forest Research*, 43(9), 836-845.
- Tamm, C. O. (1991). Nitrogen in terrestrial ecosystems: questions of productivity, vegetational
 changes, and ecosystem stability: Springer Science & Business Media.
- The Norwegian Mapping Authority. (2017). NDH Modum-Sigdal 5pkt 2017 (DTM). Retrieved from
 https://hoydedata.no/LaserInnsyn/. https://hoydedata.no/LaserInnsyn/.
- 454 Van Breemen, N. (1995). How Sphagnum bogs down other plants. *Trends in ecology & evolution*,
 455 10(7), 270-275.
- Vejre, H., Callesen, I., Vesterdal, L., & Raulund-Rasmussen, K. (2003). Carbon and nitrogen in Danish
 forest soils—contents and distribution determined by soil order. *Soil Science Society of America Journal, 67*(1), 335-343.
- Wardle, D. A., Jonsson, M., Bansal, S., Bardgett, R. D., Gundale, M. J., & Metcalfe, D. B. (2012).
 Linking vegetation change, carbon sequestration and biodiversity: insights from island
 ecosystems in a long-term natural experiment. *Journal of Ecology*, *100*(1), 16-30.
- Whitlock, C., Shafer, S. L., & Marlon, J. (2003). The role of climate and vegetation change in shaping
 past and future fire regimes in the northwestern US and the implications for ecosystem
 management. *Forest ecology and management*, *178*(1-2), 5-21.
- Williams, C. A., Gu, H., MacLean, R., Masek, J. G., & Collatz, G. J. (2016). Disturbance and the carbon
 balance of US forests: A quantitative review of impacts from harvests, fires, insects, and
 droughts. *Global and Planetary Change*, *143*, 66-80. doi:10.1016/j.gloplacha.2016.06.002
- Woo, D. K., & Kumar, P. (2017). Role of micro-topographic variability on the distribution of inorganic
 soil-nitrogen age in intensively managed landscape. *Water Resources Research*, *53*(10),
 8404-8422.
- 471 Zackrisson, O. (1977). Influence of forest fires on the North Swedish boreal forest. *Oikos*, 22-32.
- Zackrisson, O., Nilsson, M.-C., & Wardle, D. A. (1996). Key ecological function of charcoal from
 wildfire in the Boreal forest. *Oikos*, 10-19.
- Zajícová, K., & Chuman, T. (2020). Spatial variability of forest floor and topsoil thicknesses and their
 relation to topography and forest stand characteristics in managed forests of Norway spruce
 and European beech. *European Journal of Forest Research*, 1-14.
- Zuur, A., Ieno, E. N., Walker, N., Saveliev, A. A., & Smith, G. M. (2009). *Mixed effects models and extensions in ecology with R*: Springer Science & Business Media.

479