



- **1** Spatial and Temporal Variation of Bulk Snow Properties in
- 2 North Boreal and Tundra Environments Based on
- 3 **Extensive Field Measurements**
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9 Abstract

10 In this paper, an extensive dataset of snow in situ measurements, collected in support of 11 airborne SAR-acquisitions in Sodankylä and Saariselkä test sites in northern Finland, is used 12 to analyse the heterogeneity of bulk snow properties (snow depth, density and water 13 equivalent) over different land cover types in northern taiga and tundra areas. In addition, the applicability of different spatial frequencies of snow sampling to estimate the true snow 14 15 conditions is investigated. Overall, the highest variability in bulk snow properties was found 16 over sparsely vegetated land cover groups, but the scale of variation was smaller in forested 17 areas, as these areas exhibited a low correlation length in snow depth. This implies that more 18 frequent measurements should be executed in forested (~ every < 5 m) than in open areas (~ 19 every 7.5-12.5 m) to catch the true variability in snow depth. The results also indicated that 20 the current spatial resolutions of space borne microwave radiometers and radars used for the 21 remote retrieval of bulk snow properties are all well above the limit to fully describe the 22 spatial variation of e.g. snow depth even in open areas. This conclusion supports the demand 23 of research investigating high-resolution parameter retrieval in remote sensing of snow, e.g. 24 using advanced SAR techniques.





25 1 Introduction

26 Snow is a temporally and spatially variable component of global climate and hydrological 27 systems. Due to its high reflectivity, insulation and water holding capacity, changes in snow 28 cover are crucial, for example, in water supply forecasts, and in ecological, climatic, and 29 meteorological studies (Vaughan et al., 2013). Accurate snow information is needed to succesfully 30 parametrisize the snow component in numerical weather prediction (NWP) models (de 31 Rosnay et al., 2014). The on- and offset of the annual snow cover is also linked to the carbon 32 balance in the northern latitudes via soil freezing and respiration processes (Grogan and 33 Jonasson, 2006).

Several studies have reported explicit changes in snow cover extent (SCE) and snow cover duration (SCD) over both Northern Hemisphere and Arctic snow cover in recent decades (e.g. Brown and Mote, 2009; Brown and Robinson, 2011; Choi et al., 2010). Many of these studies show explicit decreasing trends in the snow cover extent (e.g. Brown et al., 2010; Derksen and Brown, 2012) but with differing responses during the winter and spring months and in North America and in Eurasia (Brown, 2000).

40 Snow properties have been succesfully measured via satellites over several decades. Although 41 remote sensing (RS) methodologies themselves have changed little, the available imagery is 42 very different. Significant improvements have been achieved in the resolution of the retrieved 43 information (Nolin, 2010) and in our understanding of the snow cover as a part of the global 44 climate system. However, as even in flat areas snow properties vary in a number of different 45 scales (Derksen et al., 2010; Sturm and Benson, 2004), snow information retrieval via satellite 46 RS remains challenging. Typically one has to trade off spatial resolution for better temporal 47 resolution, and vice versa, while vegetation, topography, and later, simplified snow physics in 48 retrieval algorithms introduce error into the end products (Foster et al., 2005). These 49 uncertainties can significantly affect our understanding of the current snow cover changes and 50 could lead to biased evaluation of global climate models and erroneous input to NWP models 51 (Frei and Lee, 2010).

The lack of extensive ground data collected simultaneously with the RS data is often a limitation for further assessment and development of RS algorithms. Furthermore, sufficient resolution to describe the variation of different snow parameters is not always clear. At what scale can we measure accurately enough to catch the relevant snow characteristics and what, in general, is the effect of the scale on the interpreted output information? At the moment, the





57 best resolution achieved in the observation of snow parameters by optical sensors is in order 58 of 250-500 m (Hall et al., 2002; Notarnicola et al., 2013), whereas passive microwave 59 radiometers are limited to resolutions of tens of kilometres. Using synthetic aperture radar 60 (SAR), resolutions ranging from, for example, one meter (e.g. TerraSAR-X/TanDEM-X) up 61 to 50 km (ENVISAT/ASAR) can be achieved (Dietz et al., 2013). However, the revisit times 62 of space-borne radars are, even at best, typically limited to several days at high latitudes, whereas passive instruments, at the expense of resolution, can have daily coverage over a 63 64 large part of the Northern Hemisphere (Dietz et al., 2013). Understanding the signal response within a 625 km² footprint produced by radiometers is challenging (Foster et al., 2005; Nolin, 65 66 2010). Microwave methodologies are generally practical for monitoring SWE and SD, whereas optical instruments are suitable for SCE and albedo measurements. The optical 67 68 methods suffer from the lack of sufficient sun-light and frequent cloud cover in the northern 69 latitudes (Warren, 1982).

70 In this paper, an extensive field measurement dataset acquired in Finland is used to quantify 71 the temporal and spatial heterogeneity of different bulk snow parameters in the northern taiga 72 and tundra environments. A large collection of *in situ* snow data was collected in support of 73 ESA SnowSAR airborne acquisitions in Northern Finland during the winter of 2011-2012 74 (Lemmetyinen et al., 2014). During the measurement campaign, the mission concept of the proposed ESA CoReH2O (Cold Regions Hydrology High-resolution Observatory, ESA 2012; 75 76 Rott et al., 2010) mission, at that time a candidate for the ESA Earth Explorer-7 satellite, was 77 demonstrated. The main objectives of this study are 1) to characterize the temporal and spatial 78 heterogeneity of bulk snow properties by calculation and comparison of land cover specific 79 statistics of snow depth (SD), snow water equivalent (SWE), and snow density, 2) to 80 investigate the temporal changes in snow stratigraphy over different types of land cover by 81 description of snow stratigraphy changes, and 3) give an estimate of an optimal sample 82 frequency for SD measurements by autocorrelation analysis and investigate the applicability 83 of different sampling frequencies to estimate the true snow conditions.

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84 2 Data and methods

85 2.1 Study sites

86 The *in situ* data used in this study were collected in support of ESA SnowSAR airborne 87 acquisitions, which occurred over three sites during the winter of 2011-2012. Most 88 acquisitions were located at the primary site, an approximately 7 by 10 km area close to the 89 FMI Arctic Research Centre (FMI-ARC) located in Sodankylä northern Finland. Each 90 airborne mission attempted to cover the entire area using a mosaic of up to 30 flight transects. 91 Acquisitions were timed to correspond closely to the planned CoreH2O revisit times during 92 the two proposed phases of the mission (3 and 15-day revisit time). The main site represents a 93 typical boreal forest/taiga environment dominated by spruce/scots pine forests of varying 94 density, as well as open peatbogs (wetlands) (Fig. 1 left). The elevation in the area varies 95 between 180 m and 240 m above sea level and is relatively flat. The area covered by the 96 acquisitions also included several rivers and lakes.

97 The second site was situated ~150 km north of the primary site in Saariselkä region (Fig. 1 98 right), representing an upland tundra environment. The area is mainly treeless, but the ground 99 vegetation is characterized by lichen, mosses, sprigs and some larger shrubs, which result in a 100 more varying distribution of snow cover due to wind effects. The general topography was also 101 more variable with several low-lying tundra hills situated along the acquisition path. This site 102 was visited twice during the season; a single ~ 20 km transect was covered. The aim was to 103 provide data for CoReH2O retrieval performance testing over the tundra land cover type, 104 which was not well represented at the main site. A third site of acquisitions was located over 105 sea ice in the Gulf of Bothnia, but these data are not covered here.

106 **2.2 Data collection**

The airborne acquisitions were aimed to follow a 15-day repeat period between December and mid-February, corresponding to the repeat-pass time of CoReH2O during the second phase of the mission. For a period between February 22 and March 9, a three-day repeat period was planned, corresponding to the planned CoReH2O repeat pass time during the first phase of the mission (See dates in Table 1). A total of ten airborne acquisitions, as well as one dedicated calibration mission, were flown at the main site. Two acquisitions were flown at the Saariselkä tundra site. Ground sampling at the main site took place on most occasions during





the day of the airborne acquisitions. On occasion, sampling was continued on the day following a flight, if the snow conditions remained stable. In Saariselkä, ground data was collected only on the dates of the airborne acquisitions.

117 Manual sampling of SD and SWE along flight transects formed the core of the *in situ* data 118 collection in support of each SnowSAR acquisition. Figure 1 shows the locations of the 119 collected ground measurements at the Sodankylä and the Saariselkä test sites. The basic 120 concept was to, at minimum, cover at least two 5 km transects for each flight. Snow depth 121 was sampled every 100 m while SWE was sampled every 500 m. As a goal, the sampling of 122 designated tracks was designed to take place within 200 meters (across-track) from the 123 planned centrelines of the flight transects. Sampling teams moved either on foot (snowshoes), 124 by skis, or by snowmobiles. At each sampling site, snow depth was recorded at minimum 125 from three representative locations in a 10 m radius, while the SWE measurement was taken 126 from one representative location. An automated geolocated snow depth measuring tool 127 ('Magnaprobe') was also used on all sampling days. For transects where the Magnaprobe was 128 employed, SD measurements were considerably more frequent in distance (approximately 129 every 2-10 meters).

130 On individual tracks, the measurements were conducted at approximately the same locations for every SnowSAR mission, to minimize the disturbance of the snowpack in the 131 132 measurement area. The main objective of the distributed measurements was to obtain a 133 maximal amount of SD/SWE samples for comparison with the airborne observations. Around 134 600 SWE, 22 100 SD measurements were collected during a total of 19 days between 135 December 2011 and March 2012 (Table 1). Additionally, the manual snow measurement program of FMI-ARC provided snow pit observations at three sites in the Sodankylä area, 136 137 enabling to construct a time series of the physical evolution of snow over dry mineral soil, 138 wetlands and lake ice during the campaign (Leppänen et al., 2015).

139 2.3 Data analysis

140 2.3.1 Data processing and analysis of snow heterogeneity

Erroneous data points (e.g. snow depths smaller than 1 cm) and duplicates were removed from the dataset. Based on GPS coordinates, for each measurement point, land cover class was determined. The land cover information was available through the European Commission programme to COoRdinate INformation on the Environment (Corine). An updated dataset





145 (CLC2012) was used. Analogously to former airborne data analysis from the site 146 (Lemmetyinen et al., 2015) the original 44 CLC2012 land cover classes were generalized into nine land cover groups (Table 2). The spatial coverages of different land cover groups within 147 148 a 7 km x 10 km area in the both test sites, used later in the analysis, are also shown. Forested 149 areas were divided based on both the tree canopy closure (>30 % dense/ <30% sparse) and the 150 soil type (mineral/peat or organic). Different types of open areas were also separated 151 (wetlands, meadows, barren surfaces, water systems). The ninth group included all artificial 152 surfaces, such as roads and buildings, and were excluded from the analysis.

153 The division of the measurements based on canopy closure as well as the overall land cover 154 class is justifiable because canopy closure has been observed to be one of the main factors to affect snow accumulation (e.g. Dobre et al., 2012; Storck et al., 2002). This applies especially 155 156 to flat areas, such as the Sodankylä region, where elevation and aspect have little effect 157 (D'Eon 2004). In addition, RS of snow cover has proven to be problematic in forested regions 158 (e.g. Foster et al., 2005; Heinilä et al., 2014). In the boreal forest zone, the vegetation itself 159 has large effect on the RS measurements and needs to be taken into account (Cohen et al., 160 2015; Derksen, 2008; Metsämäki et al., 2012) whereas in tundra regions the high proportion 161 of frozen lakes, local scale variability due to wind effects, and stratigraphically complicated 162 snowpack introduces different kinds of problems (Derksen et al., 2010).

Density information for each snow depth measurement point was determined based on the 163 164 distributed SWE measurements. Since fewer SWE than SD measurements were available, the 165 density was calculated per day per land cover group. If more than one SWE points were 166 measured within the same land cover group during the same day, an average of these measurements was used. In case no density information for a distinct land cover group was 167 168 available, data from the previous or the subsequent measurement day was used, if no 169 precipitation events or drastic temperature changes had occurred. The variation of air 170 temperature and the daily precipitation amount at FMI-ARC in Sodankylä during the 171 measurement campaign are shown in Fig. 2. After the density determination, SWE for each 172 SD data point was calculated. For some data points no density and thus SWE information 173 could be determined. The number of SD and SWE measurements within each generalized land cover group during each measurement day is represented in Table 1. Finally, a boxplot 174 175 for each land cover group for each measurement day was created to describe the temporal 176 variation in the snow properties during the measurement campaign.





The evolution of snow physical properties (grain size, density, stratigraphy, and temperature)was analysed from snow pit information collected from three sites (sparse forest on dry

179 mineral soil (SFm), wetland (OB), and lake ice (LR)).

180 2.3.2 Autocorrelation of snow depth measurements

The statistical variability of SD over different types of land cover was investigated by means of analysing the autocorrelation of measured SD values over distance. Snow depths measured with the Magnaprobe instrument were applied, as these provided the necessary high spatial sampling frequency. The goal was to estimate the optimal sampling frequency for snow cover in different land cover conditions, informing future planning of snow sampling campaigns in the region, and to identify deficiencies of the relatively sparse sampling approach applied elsewhere during the campaign (SD every 100 meters, SWE every 500 meters).

188 In order to harmonize the analysis, multiple transects of 500 meters were chosen from the 189 collected data, representing each investigated land cover group. Autocorrelation was 190 calculated as a function of lag distance. An exponential fit was applied to the autocorrelation, 191 deriving the exponential (auto) correlation length (L_{ex}). However, the data did not cover all 192 land cover groups for all SnowSAR acquisitions with a sufficient amount of samples to 193 conduct the autocorrelation analysis. The autocorrelation analysis was applied only for SD as 194 SWE was estimated for each SD measurement point via land cover type fixed density and 195 would have produced same results as the previous analysis.

196 2.3.3 Effect of sampling frequency

197 To further investigate the effect of sampling frequency, the average SD obtained via the 198 frequently executed Magnaprobe measurements and, the more sparsely executed 199 measurements with a snow ruler (henceforth called conventional SD measurements), were 200 statistically compared. The goal was to assess if the different sampling frequencies 201 (Magnaprobe, potential over-sampling / conventional, potential under-sampling) lead to a 202 statistically significant difference in the mean SD. Three land cover groups (DFm/OB/LR), 203 characterized by different average SD, and measurement days comprising a sufficient amount 204 of both Magnaprobe and conventional measurements were chosen for the comparison.

For the analysis, each sub-group of the measurements was tested for normality by histograms and by the Kolmogorov-Smirnov test for later selection of appropriate statistical analysis. For







207 part of the groups the assumption of normality did not hold. The equality of variances 208 between the groups was tested as well by executing both the Levene's and the Bartlett's tests. 209 If the test results were inconsistent, the histograms were investigated to assess, which result 210 could hold better. As the assumption of equal variances also did not hold between all the 211 compared groups, and the sample sizes varied, finally, both the Welsch's t-test for unequal 212 variances (assumes normality but not equal variances) as well as the Mann-Whitney U-test 213 (MWU) (assumes equal variances but not normality) were chosen to test the statistical 214 difference of means.

215 Furthermore, as *in situ* data is often averaged over the field of view of RS observations for 216 validation purposes, it was investigated, if different measurement frequencies lead into 217 different outcomes when a weighted average, based on land cover proportions within a typical 218 RS observation grid cell, is calculated. For this purpose a 7 km x 10 km area was cut out from 219 the generalized CLC2012 land cover data and percentual coverages of each generalized land 220 cover group, both in the Sodankylä and in the Saariselkä test sites, were determined (Table 2). 221 This area was approximately equivalent to the spatial extent of the ground measurements in 222 the Sodankylä test site. In the Saariselkä test site, the ground sampling occurred on a slightly 223 smaller area, but for the comparison purposes, areas of same sizes were chosen. Four 224 campaign days with a high amount of measurements were chosen for the analysis; three days 225 from the Sodankylä test site and one day from the Saariselkä test site, as enough 226 measurements were available from Saariselkä only from the second acquisition day. The 227 distances between all the consequent measurements were calculated and three different cases of measurement frequencies were compiled; one with maximum sampling frequency (~ every 228 1-10 m), one with medium sampling frequency (~ every 100 m), and one with sparse 229 230 sampling frequency (~ every 500 m). However, as the measurement distances varied and were 231 not always exactly e.g. every 100 m, it was not possible to produce withholded data with the 232 exact sampling frequencies; the sampling frequencies, for example, in the 100 m case may 233 actually vary between ~70-150 m. However, the sampling frequencies of the three cases were 234 still clearly different. A proportionally weighted average for both SD and SWE were 235 calculated separately for each case of measurement frequency.





236 3 Results

237 3.1 Land cover specific variation of snow properties

238 The median SD of the lakes and rivers was distinctly lower than those of the other surface 239 type groups during the whole measurement campaign (Fig. 3). The deviation of snow depth in 240 the lakes and rivers was also generally lower (or during few days, as high as) the deviation in 241 the other land cover groups. An exception occurs in the beginning of March when 242 comparatively high deviation in the measured SD was seen. One possible explanation for this is that in the beginning of March, most of the measurements were taken on river ice whereas 243 244 during the other days the measurements were mainly on lake ice. The narrow creeks might have larger SD variation than open lakes. Another possible reason is the imprecision in 245 246 retrieving the CLC2012 data for the measurement points. The resolution of the CLC2012 is 247 20 m and the handheld GPS devices used during the ground data collection may have inaccuracies of several meters. This could have led to an incorrect classification of, for 248 249 example, adjacent forest measurements as lake and river measurements in the narrow creek 250 areas.

251 Another distinctive group was the open bogs, also with lower median SD values. The 252 difference between the open bogs and the other groups was more significant in the beginning 253 and in the end of the measurement campaign than in the middle. In the forest groups, the 254 median SD of the dense forests on mineral soil was lower than the median SD of the dense 255 forests on peat soil during most of the campaign period. One possible explanation for this could be a different canopy structure in the forests on mineral and peat/organic soils. The 256 257 relationship between the sparse forests on mineral and peat soils was similar, but the 258 differences in the median SD were smaller and the relationship was not as clear as between 259 the dense forest groups. The median SD of the fields and meadows and the barren land were 260 not clearly lower or higher than that of the forest groups (DFm/DFp/SFm/SFp). Overall the 261 median SD of the fields and meadows and the barren land cover groups was slightly lower 262 than the median SD in the forest cover groups and a bit higher than that on the open bogs. The highest deviation in SD was measured during the Saariselkä measurement day (29Feb). This 263 264 indicates well the effect of elevation changes and wind on the SD variation on open tundra 265 site in relation to the taiga forest site in Sodankylä. Regarding the median and deviation of the SWE measurements in the different land cover groups (Fig. 4), very much similar results than 266





with the SD values were obtained, but the differences, for example, between the two denseand sparse forest groups were slightly easier to detect.

269 For the density calculations fewer measurements were available and on some days a single 270 measurement might represent the snow density value in a land cover group (Fig. 5). The 271 median density was highest in the field and meadows and the barren lands measured in the 272 Saariselkä test site. This is explained by the wind effect which packs the snow and easily 273 introduces larger densities than in the taiga test site. The effect of wind and elevation changes 274 were also seen in the high deviation in the measurements made in February 29th. The 275 deviation of snow density on the lakes and rivers was very large when looking both the 276 median density values and the difference between the minimum and the maximum values; on 277 some days, the density of this group was lower, and on some days much higher than in any 278 other land cover group. The wind also played a role in the open water areas but probably even 279 more, the high density variation was related to water which might rise to the ice surface on 280 mild air temperatures. The comparatively thin snow layer also thaws easily during warm days 281 in spring. For the density values, the relationship between the values of the land cover groups 282 was different from those of SD and SWE, as densities were typically higher in the open areas 283 than in the forested areas. The relationship between the different forested land cover groups 284 was not clear, the dense forests on mineral soil exhibited lower densities than the other 285 forested land cover groups. It was also notable that the variation in density between the 286 different land cover groups did not stay constant but as environmental factors changed, snow 287 bulk density in the different land cover groups reacted differently; on some days all the measured densities of the land cover groups were very close to each other, and on other days 288 289 large differences existed.

290 The evolution of snow stratigraphy over dry mineral soil, wetlands and lake ice during the campaign are depicted in Fig. 6. Snow structure evolved from December to March by addition 291 292 of new fine-grained snow layers on the surface (deep blue in the Fig. 6) and grain growth in 293 the lower half of the snowpack (from light blue through green and yellow to orange). These 294 effects were also visible in the snow density profiles: new snow on the surface was very light, 295 and the density of the bottom layers increased throughout the winter. Snow structure in the forest on mineral soil and over the open bog was very similar, at least compared to snow on 296 297 the lake ice; similar layers could be detected from the forest and the open bog profiles, even 298 though from different heights. Typically snow depth on the bog was smaller than in the forest,





but the heavy snowfall in February (between 8 and 22 Feb) evened out the difference. Temperature profiles reflect the fact that air temperature was the same at all pits measured on the same day; the differences in the snow surface temperatures can be explained by the differing measurement times. The disparity between the temperature profiles in e.g. 9 Jan is due to differing snow depths.

304 3.2 Analysis of snow depth autocorrelation

The autocorrelation of the measured SD values over distance was analysed to statistically describe the variability of SD. Examples of the autocorrelation of the measured SD over representative transects are shown in Fig. 7 for the forested areas (DFm) and the wetlands (OB). An exponential fit to the autocorrelation is shown. The correlation length (in meters) derived from the fit is also displayed, providing a measure of the degree of variability in snow depth over distance. The forested sample exhibited the lowest L_{ex} , while autocorrelation remained high over longer distances over the wetland transect.

312 The mean and standard deviation of L_{ex} , derived for the different land cover groups, is 313 summarized in Table 3. The values were calculated from representative 500 m transects 314 selected from all Magnaprobe sampling campaigns at the main site, as well as the second 315 Saariselkä campaign. The barren land cover type represents data collected from the second 316 Saariselkä campaign (average and standard deviation of L_{ex} from 21 transects), while only one 317 suitable transect was available from the main site representing the sparse forests on peat soil. 318 On average, the forested areas exhibited a low correlation length in snow depth, while values 319 collected over lake ice and wetlands exhibited correlation lengths in excess of 15 meters. Over 320 the barren landscape in Saariselkä, the average autocorrelation was in excess of 20 meters. 321 This can be explained by the influence of the forest canopy, which affected the spatial 322 distribution of snow accumulation on the forest floor, inducing a large variability over short 323 distances. However, when the mean coefficient of variation (CV) for each land cover group, 324 representing the whole campaign period, was calculated (Table 4), the dispersion of SD was highest on the lakes and rivers and on the barren lands and remained low in the forested land 325 326 cover groups and on the fields and meadows.

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327 3.3 Effect of sampling frequencies

328 The results from the statistical analysis of the difference of means in SD are represented in 329 Table 5. Both of the statistical tests gave similar results when the means of frequent Magnaprobe measurements and the sparse conventional measurements were compared. Only 330 on 26Feb in the dense forests on mineral soil the Welch's test estimated the difference to be 331 332 significant whereas MWU-test estimated it insignificant (at a 0.05 level of confidence). 333 During most of the days, difference of SD means was significant in the dense forests on 334 mineral soil. This supports the result of the autocorrelation analysis, where snow depth varied 335 in short distances due to e.g. forest canopy effects. Two days with measurements from the lakes and rivers were analysed and during both days the difference in SD means was 336 337 statistically significant. The results from the comparisons of the open bogs were not 338 consistent; during the first two days compared, the results were not statistically significant but 339 during rest of the days, they were.

340 The weighted averages of SD and SWE for the 7 km x 10 km areas are presented in Table 6. 341 A consistent effect of the measurement frequency could not be determined; during the first 342 two days investigated, the weighted averages increased slightly as the sampling frequency 343 was decreased. However, during the second last day investigated (23Feb), the weighted SD 344 and SWE values decreased slightly between the most frequent and the 100m sampling case. 345 The 500m sampling case did not introduce change in these average values. In the Saariselkä 346 test site (29Feb), the differences between the three cases of sampling frequency were larger 347 and were first decreasing and then increasing along the sparser measurement frequency. The 348 last two dates had the most frequently measured snow parameters and the measurement 349 frequency could be most accurately manipulated. Overall, the averaged SWE values changed 350 more along with the sampling frequency than the values of SD. As SWE values were retrieved by using the land cover specific density values, an additional source of error in the 351 352 frequent SWE dataset existed. For any robust conclusion, a more comprehensive analysis of 353 the effects of the sampling frequency needs to be done with a dataset, in which frequency 354 changes are optimised for this kind of study.





355 4 Discussion

356 There are three often-mentioned generalizations about the spatial variability of snow. 357 According to the first one, seasonal snowpacks are more heterogeneous than perennial snowpacks due to higher amount of acting agents (Sturm and Benson, 2004). In addition to 358 359 wind and water percolation effects, vegetation and topographic changes affect seasonal 360 snowpacks whereas in perennial snow, the first two factors are the most important. Secondly, 361 it is generally thought that snow is less spatially variable in forested than in open areas (in 362 arctic and subarctic), as in open areas the wind redistribution effectively increases the 363 heterogeneity (Derksen et al., 2014; Essery and Pomeroy, 2004). Thirdly, slightly 364 contradictory to the second generalization, variation of SD and SWE is often thought to be higher in forested areas, where complicated canopy structure affects the snow accumulation 365 366 on the ground, than, for example, in open areas (Dobre et al., 2012; Storck et al., 2002). In 367 this study, the heterogeneity of bulk snow properties (SD, density and SWE) was analysed 368 from three different perspectives; by statistical description of bulk snow properties in different 369 land cover groups, by autocorrelation analysis (for SD only), and by the determination of an 370 averaged CV for each land cover group investigated.

371 According to the statistical description of bulk snow properties (e.g. Fig. 3 and 4), deviations 372 in snow depth between the land cover groups were often small, being in the order of 1-3 cm. 373 In addition, the relative differences did not remain constant (e.g. deviation in the forested 374 areas was not always higher than in the open areas), but varied even during the mid-winter. 375 Only the bulk snow properties measured at the Saariselkä test site had consistently higher 376 deviations in the measured values of SD, density and SWE than the values at the main test site in Sodankylä. This supports the earlier results of the variation of snow properties over tundra 377 378 (e.g. Derksen et al., 2014). However, the autocorrelation analysis presented in the Sect. 3.1.2, 379 revealed that the snow properties tended to vary more on short distances in forests, although, 380 on average the deviation in forests was no higher than over sparsely vegetated land cover 381 groups. This supports the third generalization mentioned in the previous section. Lastly, the 382 mean values of CV revealed an opposite phenomenon as the lowest CV values were observed 383 in the forested land cover groups (Table 4). This implies that although the absolute variation in snow depth was largest in the sparsely vegetated groups, this heterogeneity appeared on 384 385 scales larger than that in the forested groups. By analysing the autocorrelation of measured 386 SD values over distance in different land cover groups, the proper sampling frequency







387 capturing the true variation in the measured quantity, can be determined. The L_{ex} averages for 388 the different land cover groups shown in Table 3 indicated that in open areas a measurement 389 frequency of 7.5-12.5 m for SD was adequate. Ideally, the sampling should be executed at 390 least twice more frequently than L_{ex} so that the true variance could be captured. In forested 391 areas, the snow depth should be measured every < 5 m to catch the true variation of SD. 392 These results, however, show that the sampling frequency used usually in the conventional 393 snow course measurements (e.g. SD every 50 m, SWE every 500 m for Finnish Environment 394 Institute snow course measurements) is not optimal for the full spatial description of SD. 395 Explicit improvement in the data quality could be achieved by following the presented 396 measurement guidelines for the spatial sampling frequency. With respect to RS applications, 397 instruments measuring at resolutions higher than the land cover group specific L_{ex} do not 398 provide meaningful statistical information compared to instruments whose resolutions are 399 close to the values of L_{ex} .

400 The need for higher sampling frequency in the forested areas was supported by the analysis 401 presented in the Sect. 3.1.3, where with only one exception, the difference in mean SD 402 obtained via the Magnaprobe and the conventional measurements, was statistically significant 403 in the dense forests on mineral soil. On the lakes and rivers the differences were also 404 statistically significant during the both days investigated. This could be related to the overall 405 high variation of SD on lakes and rivers (Table 4). On the open bogs, the differences became 406 statistically significant towards the end of the campaign with increasing snow depth. It is 407 hypothesized that this is because the overall deviation in SD tends to increase along with 408 snow depth, and as such, different sampling frequencies might have more effect.

409 The variation of all bulk snow parameters at the Saariselkä test site was very high. This 410 indicates that retrieval of snow parameters in a tundra region with only mild elevation 411 changes (highest fells were usually around 500 m), and where the vegetation effect is almost 412 non-existent, can still be very complex. Furthermore, factors such as aspect and elevation, 413 which were not considered in this study, should be taken into account. The effect of different 414 sampling frequencies on the spatially averaged values of SD and SWE was not clear (Table 415 6). The analysis gives some robust references that the effect might be more significant in SWE than in SD measurements and that the effect increased as the SD increased along the 416 417 snow season. One could also hypothesize that the sampling frequency might affect more in 418 the tundra site, as the bulk snow property variation in tundra is generally very high and the





obtained differences in this analysis were larger than the ones obtained in the Sodankylä test
site. However, a more sophisticated analysis needs to be done to properly evaluate the effect
of different sampling frequencies on the spatially averaged bulk snow property values, which
are often used for RS data validation purposes.

The temporal changes in snow stratigraphy in the different types of land cover (Fig. 6) revealed that the evolution was rather similar between the sparse forest on mineral soil and on the open bog; the main differences were seen in the bottom of the snowpack where the local microtopography can significantly increase the spatial and temporal heterogeneity of the snowpacks (Sturm and Benson, 2004). The snowpack stratigraphy on the lake ice was very different from the other two snowpacks with lower SD and fewer snow layers.

429 5 Conclusions

430 In this study an extensive dataset of *in situ* snow measurement, collected in support of ESA 431 SnowSAR airborne acquisitions in Northern Finland during the winter of 2011-2012, was 432 used to describe the temporal and spatial heterogeneity of bulk snow properties in different types of land cover in tundra and taiga test sites. The optimal sampling frequency for SD 433 434 measurements was investigated by means of an autocorrelation analysis of measurements 435 with a high sampling rate. The applicability of different sampling frequencies to estimate the 436 true snow conditions was analysed. This can also be useful to inform the development of RS 437 methodologies, as the spatial and temporal heterogeneity of snow is one of the main 438 challenges for correct RS information retrieval.

439 The results revealed that although, on average, the deviation of bulk snow properties in the 440 forest land cover groups was not higher than in the open land cover groups, snow properties 441 tended to vary more over short distances in forests. On the other hand, the absolute variance, 442 described by the averaged coefficient of variation for each land cover group, showed the 443 highest dispersion of the measurement values in the open land cover groups. This indicates 444 that although the absolute variance in forests was lower than in the other groups, more frequent sampling procedure should be applied to fully catch the bulk snow property variation 445 446 in the forested types of land cover. A measurement frequency of 7.5-12.5 m is adequate in 447 open bogs and lakes and rivers. In forested areas the snow depth should be measured around 448 every < 5 m to catch the true variation of SD.





With respect to remote sensing applications, the results showed that the current spatial resolutions of the space borne radiometers and radars used for remote SD retrievals are all well above the limit to fully describe the spatial variation of snow depth even in open areas. The conclusion supports the demand of research investigating high-resolution parameter retrieval in RS of snow, e.g. using advanced SAR techniques.

454 In the future work this extensive snow ground dataset will be further analysed and utilized 455 together with simultaneously observed airborne and space-borne RS observations, with the 456 goal of developing novel retrieval algorithms for snow geophysical properties.

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553 Table 1: The *in situ* measurement dates, the number of snow depth and SWE/density measurements, and the snow pit observations

554 (* + Mar13) in the different generalized land cover groups. Dates marked in **bold** indicate measurements days conducted in the

Land	Dec	Dec	Jan	Jan	Jan	Jan	Feb	Feb	Feb	Feb	Feb	Feb	Feb	Feb	Feb	Mar	Mar	Mar	Mar	
cover group	19 SD SWE	20	9	10	23	24	7	8	9	22	23	24	25	26	29	1	5	8	23	Total
	SWE																			Total
DFm	91	х	195	х	172	218	86	20	17	587	1018	177	658	116	11	1238	22	58	23	4887
	4	х	4	х	7	8	7	6	3	13	13	1	1	12	х	16	7	6	5	113
DFp	30	x	25	х	24	72	23	23	5	193	209	98	58	55	x	134	7	41	11	1008
	3	х	5	х	2	4	1	2	2	4	4	х	х	2	х	1	2	1	3	36
SFm*	95*	x	3*	x	74	81	22*	45*	13	241*	126	53	44	32	16	179	15	36*	13*	1120
	4	x	2	x	4	2	1	2	4	6	2	х	х	4	х	6	2	4	3	46
SFp	19	х	46	x	17	38	34	11	3	141	92	78	73	63	х	201	8	53	7	884
	1	х	2	x	2	2	3	1	x	4	1	2	1	5	x	4	5	3	1	37
FM	17	11	35	x	37	7	37	28	x	138	146	7	10	45	3154	111	x	х	5	3788
	х	3	1	x	2	2	1	4	x	10	х	1	1	1	60	3	х	х	х	89
в	x	5	x	x	2	x	х	2	х	x	х	х	x	х	588	x	x	х	х	597
	х	1	х	x	х	х	x	х	х	х	х	х	х	х	11	х	х	х	х	12
OB*	331*	х	333*	262	123	69	281	55*	45	598*	407	791	2761	380	х	1052	60	300*	92*	7940
	14	х	25	7	23	5	11	5	9	27	8	8	13	23	х	23	9	18	20	248
LR*	x*	x	42*	x	375	3	32	254*	1*	1098*	1	x	x	х	х	6	4	10	57*	1883
	x	х	1	х	10	х	2	10	1	8	1	х	x	х	х	1	1	2	4	41

555 Saariselkä test site.





- 557 Table 2: Generalization of the field measurements based on the CLC2012 land cover classes
- analogously to Lemmetyinen et al. (2015), and the spatial coverage (%) of each land cover group

559 within a 7 km x 10 km area in the Sodankylä and the Saariselkä test sites.

Acronym for generalized land cover group	Description	CLC2012 classes	7x10 km area coverage (%)	
			Sodankylä	Saariselkä
DFm	Dense forests (mineral soil type)	22,24,26,27,29	33.37	30.80
DFp	Dense forests (organic/peat soil type)	23,25,28	10.06	0.72
SFm	Sparse forests (mineral soil type)	33,35,36	7.85	5.32
SFp	Sparse forests (organic/peat soil type)	34	6.08	0.28
FM	Fields and meadows	16,17,18,19,20,21,30,31,32	4.84	50.40
В	Barren	37,38,39	0.02	10.94
OB	Open Bogs	40,41,42,44,45	25.68	1.22
LR	Lakes and rivers	46,47,(48)	10.81	0.06
0	Other (roads and urban areas)	1-15,43	1.29	0.25





- 560 Table 3: The mean and standard deviation of exponential autocorrelation length (L_{ex}) of snow depth
- 561 over the land cover groups, calculated from representative transects during the snow sampling
- 562 campaigns between Dec 19, 2011 and March 23, 2012.

563		land cover class	DFp	DFm	SFp	SFm	OB	FM	В	LR
	T	mean	6.8	5.6	4.0	1.5	15.5	9.2	21.1	15.8
	L _{ex}	stdev	3.6	1.9	-	0.7	7.8	6.2	15.0	5.3





- Table 4. The averaged coefficient of variation for snow depth within each land cover group during
- the measurement campaign.

Land	Coefficient of
cover	variation
group	SD
DFm	0.16
DFp	0.13
SFm	0.13
SFp	0.13
FM	0.17
В	0.33
OB	0.20
LR	0.36





Table 5: The statistical difference of means between the Magnaprobe and the conventional measurements within the dense forests on mineral soil, the open bogs, and the lakes and rivers. The p-value is marked with * if the result is statistically significant at a significance level of 0.05. The test type considered more appropriate for each individual group is marked in **bold**.

570	Date	Land	n		Mean		Welch's	t-test		Mann-Whitney U		
		cover class	Magna	conv	Magna	conv	Df	t- statistic	р	Df	MWU- statistic	р
	19Dec	DFm	71	20	28.43	32.30	29.16	2.596	0.014*	89	445.5	0.011*
		OB	233	98	23.00	22.99	225.34	-0.021	0.983	329	9993.0	0.073
	23Jan	DFm	151	21	46.37	50.30	25.55	2.547	0.017*	170	1000.0	0.006*
		LR	305	70	18.52	21.72	88.19	3.031	0.003*	373	8224.0	0.003*
	Jan24	DFm	191	27	44.84	47.97	34.04	2.188	0.036*	216	1841.5	0.016*
		OB	46	23	46.21	41.70	34.97	-2.068	0.046	67	372.0	0.046
	7Feb	DFm	54	32	48.54	53.84	68.85	3.730	0.000*	84	457.0	0.000*
		OB	209	72	48.23	45.22	105.87	-2.506	0.014*	279	5563.0	0.001*
	8Feb	DFm	129	71	45.62	51.64	179.14	5.524	0.000*	198	2545.5	0.000*
		LR	173	81	19.65	22.14	153.93	4.559	0.000*	252	4561.0	0.000*
	22Feb	DFm	550	37	69.48	70.71	48.99	1.065	0.292	585	9742.5	0.665
		OB	446	152	66.10	57.38	291.35	-8.591	0.000*	596	19659.5	0.000*
	26Feb	DFM	94	22	65.21	69.44	53.18	2.284	0.026*	114	828.0	0.148
		OB	308	72	57.38	50.86	120.08	-5.317	0.000*	378	6883.0	0.000*





- 571 Table 6: The proportionally weighted averages (WA) of SD and SWE for the 7 km x 10 km land
- 572 areas in the Sodankylä and the Saariselkä test sites for the three different cases of measurement
- 573 frequency.

	SD			SWE					
	Magnaprobe	100 m	500 m	Magnaprobe	100 m	500 m			
	WA	WA	WA	WA	WA	WA			
19Dec	25.07	25.05	25.35	50.13	52.62	52.89			
23Jan	38.50	40.48	43.01	67.40	76.41	84.06			
23Feb	68.82	66.65	66.62	133.74	129.73	129.73			
29Feb	50.06	40.74	47.45	135.91	110.33	129.43			





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575 Figure 1: Snow depth, SWE, and snowpit measurements (three different sites) collected in the 576 Sodankylä (left) and the Saariselkä (right) test sites during the SnowSAR acquisitions.







577 Figure 2: Daily average temperature, daily precipitation sum, and average daily wind speed during

- 578 and between the different field measurement days observed by the automatic weather station at
- 579 FMI-ARC.

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580 Figure 3: The boxplots of measured snow depth within each land cover group during the different 581 field measurement days. Measurement days conducted in the Saariselkä test site are indicated in 582 bold.







Figure 4: The boxplots of measured SWE within each land cover group during the different field measurement days. Measurement days conducted in the Saariselkä test site are indicated in **bold**.







Figure 5: The boxplots of measured snow density within each land cover group during the different
field measurement days. Measurement days conducted in the Saariselkä test site are indicated in
bold.







Figure 6: The description of snow stratigraphy during the measurement campaign in three different land cover types; sparse forest on mineral soil (SFm), open bogs (OB), and lake ice (LR). Upper: Bar charts characterize detected snow layers, the maximum diameter of a typical snow grain (E) within each snow layer is indicated with colour. White indicates ice layers where individual snow grains were not detected. Middle: snow temperature profiles. Lower: snow density profiles.







593 Figure 7: Typical exponential fits to the calculated autocorrelation lengths of snow depth measured

594 over forests (DFm, top) and wetlands (OB, bottom) on 1Mar 2012.