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3	for monitoring the water equivalent of snow cover (SM/E)
4 5	tor monitoring the water equivalent of show cover (SWE)
5	
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17	Abstract
10	Continuous and spatially distributed data of spaw mass (water equivalent of spaw
10	cover. SW(E) from automatic ground based measurements are increasingly required for
20	climate change studies and for hydrological applications (snow hydrological model
20	improvement and data assimilation) We present and compare four new-generation
$\frac{21}{22}$	sensors, now commercialized, that are non-invasive based on different radiations that
23	interact with snowpack for SWE monitoring: Cosmic Ray Neutron Probe (CRNP): Gamma
24	Ray Monitoring (GMON) scintillator; frequency-modulated continuous-wave radar
25	(FMCW-Radar) at 24 GHz; and Global Navigation Satellite System (GNSS) receivers
26	(GNSSr). All four techniques have relatively low power requirements, provide
27	continuous and autonomous SWE measurements, and can be easily installed in remote
28	areas. A performance assessment of their advantages, drawbacks and uncertainties are
29	discussed from experimental comparisons and a literature review. Relative uncertainties
30	are estimated to range between 9 and 15% when compared to manual in situ snow
31	surveys that are also discussed. <u>Results show: • CRNP can be operated in two modes of</u>
32	functioning: beneath the snow, it is the only system able to measure very deep
33	snowpacks (> 2000 mm w.e.) with reasonable uncertainty across a wide range of
34	measurements; CRNP placed above the snow allows SWE measurements over a large
35	tootprint ( $\sim 20$ ha) above a shallow snowpack; in both cases, CRNP needs ancillary
30	atmospheric measurements for SWE retrieval. • GIVION is the most mature instrument
20 20	Tor showpacks that are typically up to 800 mm w.e.; Both instruments, CRNP (above
30	snow donth mossurements for SWE retrieval and is not recommended for automatic
40	SWE monitoring (limited to dry snow) EMCW-radar is very sensitive to wet snow
41	making it a very useful sensor for melt detection (e.g. wet avalanche forecasts): • GNSSr
42	allows three key snowpack parameters to be estimated simultaneously: SWF (range: 0 -
12	1000 mm we have death and liquid water content, according to the retrieval

43 <u>1000 mm w.e.</u>), snow depth and liquid water content, according to the retrieval

44 <u>algorithm that is used. Its low cost, compactness and low mass suggest a strong</u>
 45 <u>potential for GNSSr application in remote areas.</u>

Key word: Snow Water Equivalent, electromagnetic wave sensors, Cosmic Ray Neutron
 Probe, Gamma Ray Monitoring, frequency-modulated continuous-wave radar, Global
 Navigation Satellite System, sensor performance review

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## 50 **1. Introduction**

51 Snow cover on the ground surface plays an important role in the climate system due to 52 its high albedo, heat insulation that affects the ground thermal regime, and its 53 contribution to snow runoff and soil moisture. Snow water equivalent (SWE, its mass 54 per unit area) is expressed in kg m<sup>-2</sup>, but also is commonly shown in units of mm of 55 water equivalent, mm w.e. It is an Essential Climate Variable (ECV) for monitoring 56 climate change, as recognized by the Global Climate Observing System (GCOS-WMO, 57 2016; https://gcos.wmo.int/en/essential-climate-variables.), which aligns with the 58 WMO-Global Cryosphere Watch Initiative (Key et al., 2016; 59 https://globalcryospherewatch.org). SWE monitoring is also of primary importance for 60 hydrological forecasting and preventing flooding risks over snowmelt-dominated basins 61 in mountainous and cold climate regions. Snow station distributions are generally sparse 62 in high latitude regions, remote areas and high mountains (Bormann et al., 2013; Key et 63 al., 2015, 2016; Pirazzini et al., 2018; Heberkorn, 2019; Brown et al., 2019, 2021; Royer 64 et al., 2021), given that monitoring is generally based upon expensive and occasional 65 (weekly to monthly) manual sampling. Automation of SWE measurement networks is an 66 essential medium-term prospect, especially since reliable and automatic instrument 67 alternatives exist (Dong, 2018; this study).

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69 Various in situ field devices and approaches for measuring the temporal dynamics of 70 SWE are available, all of which have their strengths and limitations (see the review by 71 Rasmussen et al., 2012; Kinar and Pomeroy, 2015; Pirazzini et al., 2018). Some are 72 invasive (i.e., destroying the snowpack or changing its properties), while others that are 73 based on different remotely sensed approaches are non-invasive. Here, we focus on a 74 new generation of radiation-based field sensors that directly measure SWE, i.e., 75 measuring a signal that is proportional to the snow mass per unit area. In this study, we 76 do not consider sensors that are based on pressure and load cell sensors (snow 77 pillows), snowmelt lysimeters, dielectric sensors (e.g., the SNOWPOWER system, 78 commercially available as the Snowpack Analyzer) or acoustic sensors (see Kinar and 79 <u>Pomeroy, 2015). Neither do we consider</u> indirect approaches, such as those based on 80 snow-depth monitoring, combined with a model of snow density evolution (Yao et al., 81 2018). We also exclude satellite-based approaches.

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The objective of this paper, therefore, is to present a performance review of four selected non-invasive sensors (Table 1), viz., the Cosmic Ray Neutron Probe (CRNP), the Gamma Ray Monitoring (GMON) scintillator, frequency-modulated continuous-wave

86 radar (FMCW-Radar) and Global Navigation Satellite System (GNSS) receivers (GNSSr).

87 All four approaches have common features: easy to install; low power (e.g., powered by 88 solar panels); provide continuous and autonomous SWE measurements; and deployable 89 in remote areas. The continuous or quasi-continuous SWE measurement capability is 90 defined here relative to the application, such as for seasonal SWE monitoring, for 91 hydrological model validation, or to follow an event of a short winter storm. Surface-92 based radar scatterometers and microwave radiometers have not been considered in 93 this study because 1) they are still in early stages of development or are currently not 94 operational, and 2) they have heavy maintenance demands (not autonomous) and are 95 still relatively expensive. These include, for example, scatterometers (Werner et al., 96 2010; Wiesmann et al., 2010; King et al., 2015; Werner et al., 2019), microwave 97 radiometers (Langlois, 2015; Roy et al., 2016, 2017; Wiesmann et al., 2021); radar 98 interferometers (Werner et al., 2010; Leinss et al., 2015; Pieraccini and Miccinesi, 2019; 99 GPRI brochure, 2021), and Stepped-Frequency Continuous Wave Radar (SFCW) 100 instruments (Alonso et al., 2021).

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102 Sect. 2 provides background information on the basic principles of each of the four 103 sensors that are presented in Table 1. Examples of SWE temporal series comparisons 104 from four different instruments that were acquired in Québec, Eastern Canada, are 105 given in Sect. 3.1 and 3.2: comparisons between EDF's CRNP (NRC sensor) and GMON on 106 one hand, and GNSSr, FMCW-Radar and GMON on the other hand. This permits 107 performance evaluations for each system, including uncertainty analysis, compared to 108 manual SWE measurements. We complement these uncertainty assessments with a 109 review of additional results from previous studies (Sect. 3.3, Table 2). Advantages and 110 drawbacks of these sensors are then discussed in Sect. 4 (Table 3).

- 111
- 112 **2.** <u>Radiation</u>-based SWE sensor review

113 The main characteristics of the four reviewed sensors are summarized in Table 1, with 114 the acronym that is used to denote them, together with their commercial names. There 115 are two operation modes for the Cosmic Ray Neutron Probe (CRNP); thus, five cases 116 were considered. All of these sensors allow quasi-continuous measurements throughout 117 the winter without maintenance, and are powered by solar panels and batteries. The 118 measuring principles of each of the instruments are illustrated in Fig. 1 and shown in Fig. 119 2. In this section, we only recall the main principles of functioning and the key elements 120 of SWE retrieval, given that all sensors are well described in detail in the cited 121 references.

- 122
- Aspects that are related to the measurement scale of each sensor are critical to SWE measurements, since SWE is generally highly variable spatially, depending upon the ecosystem and terrain (Kinar and Pomeroy, 2015; Dong, 2018). These questions are discussed in Sect. 4
- 126 discussed in Sect. 4.
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- 128

129 Table 1. SWE sensors that were studied and acronyms that were used. FMCW: 130 frequency-modulated continuous-wave radar; GNSS: Global Navigation Satellite System, 131 including GPS (USA), GLONASS (Russia), Galileo (Europe) and Beidou (China) satellite 132 constellations. The frequency (Freq.) of the electromagnetic (EM) wave that was used 133 and their approximate maximum Snow Water Equivalent (SWE<sub>max</sub>) measurement limit 134 capabilities are given. <u>SD: snow depth.</u> See Fig. 1 for <u>measurement principle</u> 135 <u>conceptualization</u> and Fig. 2 for photos.

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Sensor	Acronym	Approach	Freq. GHz	SWE <sub>max</sub> (mm)	Comments	Commercial Name	Main recent references	
	CRNP	Sensor	- <u>-</u>	<u>up to</u> 2000	Measures total snow, ice and water amount	SnowFox	https://hydroinnova.com	
Cosmic Ray		beneath snowpack				<u>Hydroinnova</u> <u>CRS-1000/B</u>	https://hydroinnova.com Bogena et al., 2020	
Probe		Sensor		~ 150- 300		NRC EDF-Fr	<u>Gottardi et al., 2013</u>	
		above snowpack				<u>Cosmic Ray</u> Detector (CRD)	<u>Geonor Inc.</u>	
Gamma Ray scintillator	GMON	Sensor above snowpack	3.53 10 <sup>11</sup> 6.31 10 <sup>11</sup>	<u>up t</u> o <u>6</u> 00 <u>-</u> <u>800</u>	Measures total snow, ice and water amount	CS725 Campbell Sci.	Choquette et al., 2013 Smith et al., 2017 http://www.campbellsci.ca	
Frequency- modulated continuous- wave Radar	FMCW- Radar	Active sensor above snowpack	24	~1000	Requires <u>SD</u> measurements Also measures stratigraphy	Sentire™ sR-1200 IMST Inc.	Pomerleau et al., 2020 https://shop.imst.de Henkel et al., 2019 Koch et al., 2020 https://www.vista- geo.de/en/snowsense/	
Global Navigation Satellite System receivers	GNSSr	2 antennas above/ beneath snowpack	1.575 - 1.609	<u>Up to</u> 1500	Measures also Liquid Water Content <u>and SD</u> <u>estimates</u>	SnowSense		

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 $\begin{array}{c} 140 \\ 141 \end{array}$ Figure 1 Diagram of radiation paths for the five approaches (see Table 1). In all figures, black arrows 142 correspond to natural (a, b, c) or emitted (d, e) signals and dotted red arrows to rays interacting with 143 snow (the lower the signal reaching the sensor, the higher the SWE). a) Cosmic Ray Neutron Probe (CRNP) 144 below the snow, buried in the ground. In this case, black arrows are ambient neutrons generated 145 primarily by interactions of secondary cosmic ray neutrons with terrestrial and atmospheric nuclei. Dotted 146 red arrows are neutrons interacting with snow, which decrease when SWE increases. Dotted blue arrows 147 are neutrons interacting with soil moisture. b) CRNP above the snow, looking downward. Same as (a) for 148 the arrow meanings, but dotted blue arrows are neutrons interacting with soil and atmospheric moisture. 149 c) Gamma Ray Monitor (GMON) sensor. Same as (a) for the arrow meanings. d) Frequency-modulated 150 continuous-wave radar (FMCW-Radar) looking downward above the snow. Black arrow is the radar-151 emitted wave at 24 GHz. e) Global Navigation Satellite System (GNSS) receivers. The two antennas receive 152 signals emitted by all of the GNSS satellites in the antennas' field of view and at all incidence angles: only 153 one incident ray (black arrow) at one angle is shown. According to the inversion algorithm, different rays 154 that interact with the snow (dotted red arrows) are used. For the SnowSense system, independent 155 measurements at antenna 1 and antenna 2 are analyzed.



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158 Figure 2. Photographs of sensors that were analyzed. a) Cosmic Ray Neutron Probe (CRNP) from the EDF 159 French network (Nivomètre à Rayon Cosmic, NRC) at the Lac noir station in Ecrins-Pelvoux massif, France. 160 One can see the neutron probe buried in the ground (also shown in inset) and the mast, which carries 161 ancillary meteorological sensors. Credit: Delunel et al. (2014). b) SnowFox CRNP set at ground level 162 beneath the snow cover. Similar to (a), the system requires measurements of atmospheric conditions. 163 Credit: Hydroinnova SnowFox manual. c) Same sensor as in (b), but the Hydroinnova CRS-1000/B sensor is 164 placed above the snow, measuring ambient and upward neutron counts, with the latter being attenuated 165 by the snowpack. Crédit: Philip Marsh, Wilfrid Laurier University, Waterloo, ON, Canada; sensor in the 166 tundra at Trail Valley Creek, Changing Cold Regions Network http://ccrnetwork.ca). d) GNSSr installed at 167 the Université de Sherbrooke SIRENE site. The antenna that was placed on the ground (beneath the snow) 168 was made visible at 3 m from the mast, on top of which a second antenna was affixed. Credits: Alain 169 Royer. e) The FMCW-Radar (on the left) and the GMON (on the right) at the NEIGE-Forêt Montmorency 170 site. A metallic plate on the ground in the field-of-view of the radar substantially increases radar echoes. 171 In the background of photo (e), one can see the solid precipitation gauge, which is known as the Double 172 Fence Intercomparison Reference (DFIR). Credits: Alain Royer. f) Meteorological and snow (GMON) 173 automatic station at the LeMoyne James-Bay, Québec, Canada site in a sub-arctic environment (Prince et 174 al., 2019). Credits: Alain Royer. g) The GMON at the NEIGE-Forêt Montmorency site set up to boost <sup>40</sup>K 175 counts with pipes filled with potassium fertilizer. Credit: Sylvain Jutras.

#### 176 2.1 Cosmic Ray Neutron probe (CRNP)

177 CRNP measurement is based on the moderation of ambient neutrons by hydrogen in 178 water, snow and ice. The intensity of natural low-energy cosmic ray neutron emission is 179 inversely correlated with the amount of hydrogen in the soil (Zreda et al. 2008; 180 Andreasen et al., 2017) or snow cover (Desilets et al. 2010; Gottardi et al., 2013; Sigouin 181 and Si, 2016; Gugerli et al., 2019; Bogena et al., 2020). Even though the principle of this 182 approach has been known since the 1970s, it attained a level of operational maturity in 183 the 2000s, especially with the use of commercialized soil moisture probes. Électricité de 184 France (EDF) successfully used a network of cosmic-ray probes (denoted Nivomètre à 185 Rayon Cosmigue, NRC; this sensor is composed of two neutron detector tubes filled 186 with Helium 3, <sup>3</sup>He) that were buried under the snowpack to measure SWE for more 187 than a decade in the French Alps and in the Pyrenees (Fig. 2a, sensor placed at 3.5 m 188 from a 6 m mast) (Paquet and Laval, 2006; Paquet et al., 2008; Gottardi et al., 2013; 189 Delunel et al., 2014). Ephemeral, shallow snow cover across the UK is monitored by the 190 COSMOS-UK network of 46 sites equipped with the CRNP Hydroinnova CRS-2000 or CRS-191 1000/B models (https://cosmos.ceh.ac.uk; Evans et al., 2016).

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193 There are two experimental approaches for CRNP-based SWE monitoring (Fig. 1a,b): 1) 194 with the probe at the ground level beneath the snow (such as EDF' NRC, Fig. 2a, and the 195 SnowFox sensor for Hydroinnova, Fig. 2b), or 2) with the probe placed a few meters 196 above the snow surface (Fig. 1b), such as the one proposed by Hydroinnova (Fig. 2c) 197 (CRS-1000/B, Hydroinnova, Albuguergue, NM, USA; http://hydroinnova.com/ 198 snow\_water.html). Using dual-channel, the system is composed of two detector tubes 199 filled with  ${}^{10}BF_3$ ; one is sensitive to neutrons with a maximum energy of ~0.025 eV, 200 whereas the second is sensitive to moderated energy neutrons from  $\sim 0.2$ eV to 100 keV. 201 The cosmic ray probe above the snowpack (Fig. 1b) is an attractive SWE measurement 202 tool because it can provide direct estimates of SWE within a 20 to 40 ha footprint (20 ha 203 corresponds to a circle of 252 m radius) (Desilets and Zerda, 2013; Schattan et al., 2017). 204 In contrast, the footprint of a probe that is installed under the snow is limited to a spot 205 measurement above the sensor (Fig. 1a). While approach (1a) permits measurements of 206 very thick snow cover (> 1000 mm SWE) (Gugerli et al., 2019), the drawback of approach 207 (1b) is that it is limited to low SWE measurements (typically < 150 mm SWE) over 208 homogeneous flat terrain. However, in the Austrian Alps, contrary to previous studies, 209 Schattan et al. (2017) claim not to have measured saturation for a snowpack of the 210 order of 600 mm SWE, over an estimated footprint with 230 m radius.

211 212 The CRNP method requires creating a function for converting neutron counts to snow 213 water equivalent (Paquet et al., 2008; Gottardi et al., 2013; Sigouin and Si, 2016; 214 Andreasen et al., 2017; Schattan et al., 2017; Delunel et al., 2014; Bogena et al., 2020). 215 Desilets (2017) provides the calibration procedure in detail. Neutron counts must be 216 accumulated over a specified period of time (e.g., from 6 h to 24 h). The CRNP method 217 requires that the counting rate must first be known (calibrated) and that disturbance 218 effects on measured cosmic rays at the site location have to be taken into account. 219 Disturbance effects that need to be corrected include temporal variations in the natural 220 cosmic-ray flux and variations in air pressure and atmospheric water vapor on site 221 measurements during the count time. Temporal variation in cosmic-ray flux can be 222 determined from the NMDB database (Real-Time Database for high-resolution Neutron 223 Monitor measurements; www.nmdb.eu), thereby providing access to reference neutron 224 monitor measurements from stations around the world. Corrections for air pressure 225 (linked to the altitude of the station) and atmospheric water vapor variations require 226 ancillary standard meteorological sensors, which measure atmospheric pressure, air 227 temperature and relative humidity.

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229 While accuracy losses that are linked to atmospheric disturbances (pressure and 230 humidity corrections) are relatively weak (a few percent), this is not the case for primary 231 variations in the natural cosmic-ray flux (Andreasen et al., 2017), which may drastically 232 change the results of SWE estimation. This flux can vary up to 30% over long periods 233 (weeks to months), thereby causing errors up to 50% in SWE estimates when they are 234 not considered (Paquet and Laval, 2006). Therefore, it is important to correct the 235 measured signal using the closest world reference station in the vicinity of the 236 measurement site. If not available, a second cosmic-ray sensor is required to produce 237 accurate SWE estimates using normalized signals (above and beneath snow) as done by 238 the Cosmic Ray Detector commercialized by Geonor Inc. (www.Geonor.com).

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In the case of the second approach, where the probe is installed above the ground surface (Fig. 1b), the probe must be calibrated for soil moisture. If soil moisture correction is not applied on the winter signal measurements, retrieved SWE values will be systematically overestimated. This bias can be corrected using measurements of CRNP signal without snow, just prior to <u>the onset of snow cover</u>, or using soil moisture probe during the winter (see Sect. 4).

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247 2.2 Gamma Ray scintillator (GMON)

248 Monitoring snow water equivalent by using natural soil radioactivity is a well-known 249 approach (Bissell and Peck, 1973). Since 1980, an airborne snow survey program using 250 this technology has successfully collected areal mean SWE data for operational flood 251 forecasting over the whole of northwestern North America, including the Rocky 252 Mountains, Alaska and Great Plains (National Operational Hydrologic Remote Sensing 253 Center, https://www.nohrsc.noaa.gov/snowsurvey/). The mean areal SWE value is 254 based on the difference between gamma radiation measurements over bare ground and 255 snow-covered ground, the latter being attenuated by the snowpack (Carroll, 2001).

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257 The principle of SWE measurements that are based on the Gamma Monitor (GMON) ray scintillator is the absorption by the water, regardless of its phase (liquid, snow or ice), of 258 259 the natural radioactive emission of Potassium-40 (<sup>40</sup>K) from soils (Ducharme et al., 260 2015). This naturally occurring radioactive isotope of potassium has a gamma emission 261 of 1.46 MeV. The GMON probe also measures the emission of Thallium-208 (<sup>208</sup>Tl), 262 which emits gamma rays at a slightly higher energy (2.61 MeV) that originate from the 263 decay of Thorium 232 (Choquette et al., 2013; Wright, 2013; Stranden et al., 2015). Both 264 of these elements are common to almost all types of surfaces, regardless of whether 265 these are organic or non-organic soils. However, we observed that the isotope associated with the higher count (i.e., <sup>40</sup>K) is generally the most reliable. 266

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268 The GMON, which is manufactured by Campbell Scientific (Canada) (CS7525; 269 <u>http://www.campbellsci.ca/cs725)</u>, is composed of a tube 62 cm long, and 13 cm in 270 diameter, weighing 9 kg. The experimental set-up, which is illustrated in Fig. 1c, is based 271 on the initial, snow-free measurement of the number of counts for <sup>40</sup>K or <sup>208</sup>Tl per

272 period of time, which would be later decreased by the presence of the snowpack. Typically, 300 000 and 60 000 counts per 24 hours for <sup>40</sup>K and <sup>208</sup>Tl, respectively, are 273 274 suggested as minimal values to provide accurate SWE measurements (CS725 Snow 275 Water Equivalent Instruction Manual, 2017, Campbell Scientific [Canada] Corporation, 276 Edmonton, AB; https://s.campbellsci.com/documents/ca/manuals/cs725 man.pdf). The 277 observed rate of soil emission at each site allows the operator to define the minimum 278 sampling time frequency. Seeding experiments conducted using potassium fertilizer 279 show the potential for increasing potassium counts that are measured by the CS725 by 280 up to 80% at sites where low counts are found (Wright et al., 2011). As is the case for 281 ground-pointing CRNP, measuring the base-line signal of the radiation energy emanating 282 from the ground prior to the first snowfall is a critical step in signal processing, given 283 that it also depends upon soil moisture (SM) during the winter and spring periods. SM 284 attenuates the natural dry-ground emission, resulting in an overestimate of SWE during 285 signal processing when SM increases (Choquette et al., 2013) (see Sect. 4).

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287 The CS725-Campbell GMON sensor has been the subject of a detailed performance 288 analysis within the framework of the WMO Solid Precipitation Intercomparison 289 Experiment (Smith et al., 2017). Moreover, since the device is sensitive to water 290 contained in soils, it can be successfully used to estimate soil moisture during snow-free 291 seasons. An operational GMON network, with a sampling frequency of 6 h, is actually 292 deployed across the southern part of Québec and Labrador, northeastern Canada (45-293 55°N); it accounts for 116 stations that are operated by Hydro-Québec (87), Rio-Tinto 294 (13), Ministère de l'Environnement et de la Lutte contre les changements climatiques of 295 the Québec Government (10), Parks Canada (4), and the Government of Newfoundland 296 and Labrador (2), and which are dedicated to water resource forecasting (Alexandre 297 Vidal, Hydro-Québec, personal communication, November 2020). Also, these 298 continuous measurements from the GMON Quebec network are demonstrably very 299 useful for validating the assimilation of microwave observations into a snow model 300 (Larue et al., 2018). Recently, GMON had also demonstrated its robustness in a research 301 project on seasonal snow monitoring from a station that was installed at 4962 m asl in the Nepalese Himalayas (Langtang Valley) to quantify the evolution of SWE (Kirkham et 302 303 al., 2019).

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### 305 2.3 FMCW radar (FMCW-Radar)

306 The principle of frequency-modulated continuous-wave (FMCW) radar has been well 307 known since the 1970s (see the reviews by Peng and Li, 2019 and by Pomerleau et al., 308 2020) and has been popularized for snow studies since Koh et al. (1996), Marshall et al. 309 (2005), and Marshall and Koh (2008), among others, were published. FMCW-Radar is an 310 active system design for distance measurements. The radar emits a wave at variable 311 frequencies that are centered on a reference frequency. When the radar receives a 312 return from a target, the frequency difference between the emitted and reflected 313 signals is measured (Fig. 1d). Since the frequency change rate is known, the time 314 between the emission and the reception of the echo can be measured, from which the 315 radar-target distance is calculated.

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The principle of SWE retrieval is based on the time measurement of wave propagation in the snowpack that is proportional to the snow refractive index (square of permittivity), which changes the wave-speed propagation. As the refractive index of snow can be linked to its density (Tiuri et al., 1984; Matzler, 1996; Pomerleau et al., 2020), SWE can be retrieved knowing the snow depth. The experimental set-up is shown in Fig.\_1d and illustrated in Fig.\_2e.

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324 Two main FMCW-radar specifications are required for SWE measurement: the radar 325 central frequency and its bandwidth that is scanned. The central frequency specifies 326 three parameters: a) the loss in signal strength of an electromagnetic wave that would 327 result from a line-of-sight path through free space (the higher the frequency, the greater 328 the loss); b) its penetration depth (the higher the frequency, the less penetration power 329 it has); and c) its sensitivity to liquid water content in the snowpack. The bandwidth 330 specifies the distance resolution and, thus, the precision: the wider the bandwidth, the 331 lower the resolution. There is negligible frequency dependency of the snow refractive 332 index (n'), which governs wave propagation in the snowpack. The refractive index (n') is 333 linked to snow density ( $\rho$ ) by a linear relationship:  $n' = 8.6148 \cdot 10^{-04} \rho + 9.7949 \cdot$ 334  $10^{-01}$  (Pomerleau et al., 2020).

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336 For snow studies, several FMCW radars with different frequencies and resolutions are 337 used, such as those common at the X-band (10 GHz), operating over 8-12 GHz 338 (Ellerbruch and Boyne, 1980; Marshall and Koh, 2008). They provide a vertical resolution 339 on the order of 3 cm. In contrast, L-Band FMCW radar (1.12–1.76 GHz) allows greater 340 penetration but suffers from reduced vertical resolution (Yankielun et al., 2004). 341 Multiband band FMCW radars have also been developed (Rodriguez-Morales et al., 342 2014), such as an L/C-band (2–8 GHz) that was used to successfully retrieve snow depth 343 (Fujino et al., 1985), a C/Ku (8–18 GHz) large wideband FMCW radar that is capable of 344 detecting crusts as thin as 0.2 mm within the snowpack (Marshall and Koh, 2005), or the 345 improved (C-, X-, and Ka-band) radar (Koh et al., 1996). Operating frequencies of 346 commercial, low-cost radar systems, such as those that are adopted for automotive 347 radar systems (Schneider, 2005), are now available for K-band (24 GHz) and W-band (77 348 GHz) applications.

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350 The availability of such new types of lightweight and very compact 24-GHz FMCW radar 351 systems has motivated our research group to assess their ability to monitor the SWE 352 continuously and autonomously (Fig. 2e) (Pomerleau et al., 2020). The FMCW-Radar 353 that is used, which is centered on 24 GHz (K-band), is manufactured by IMST (IMST 354 sentire<sup>™</sup>, IMST, Kamp-Lintfort, Germany; http://www.radar-sensor.com/); its housing 355 module is very compact (114.0 mm × 87.0 mm × 42.5 mm) and weighs 280 g. This 356 FMCW-Radar has a bandwidth of 2.5 GHz, scanning over 23–25.5 GHz, which provides a 357 resolution of 6 cm in the air. These specifications appear to be a good compromise 358 between penetration and resolution capabilities for SWE estimation, while keeping the 359 sensor affordable, light and compact, with low power consumption. The radar 360 penetration depth ( $\delta$ Pr) of dry snow significantly decreases with density following a 361 power law, which varies with temperature (see Fig. A2, Pomerleau et al., 2020). At T = 0 362 °C,  $\delta$ Pr decreases from 6.78 to 4.81, 3.26 and 2.05 m for respective snow densities of 363 150, 200, 275 and 400 kg m<sup>-3</sup> (Pomerleau et al., 2020). Wet snow drastically reduces 364  $\delta Pr$ , given that liquid water strongly absorbs the radar signal, leading to high reflectivity 365 at the air/wet snow interface and weak transmissivity. For example, the two-way radar 366 penetration depth decreases abruptly from 2 m for dry snow at a density of 400 kg m<sup>-3</sup> 367 to 0.05 m for wet snow with 0.5% of liquid water content (as a volume fraction). It 368 should be noted that this strong sensitivity to wet snow allows the radar to precisely

detect the onset of snowpack <u>surface</u> melt, a benefit that is discussed in Sect.\_4.

370 One of the main interests of this approach is its potential capacity to estimate SWE from 371 a small remotely piloted aircraft (RPA). Over the Arctic, snow cover can generally be 372 characterized as a two-layer snowpack structure, which is composed of a dense wind-373 slab layer overlaying a less-dense hoar at depth (Rutter et al., 2019; Royer et al., 2021). 374 Thus, assumptions can be made regarding the mean refractive index of each of these 375 layers, thereby allowing SWE to be estimated (Kramer et al., 2021). Hu et al. (2019) also 376 showed the usefulness of imaging FMCW synthetic aperture radar onboard the RPA. 377 Several studies have also shown the potential of FMCW radar for different applications, 378 such as avalanche studies (Vriend et al., 2013; Okorn et al., 2014; Laliberté et al., 2021), 379 snow stratigraphy based on successive FMCW echo analyses (Marshall and Koh, 2005; 380 Marshall et al., 2007), snowpack tomography (Xu et al., 2018), and ice thickness 381 monitoring (Yankielun et al., 1993; Gunn et al., 2015). Pomerleau et al. (2020) obtained 382 highly accurate measurements of lake ice thickness using the 24 GHz FMCW radar, with 383 a root-mean-square difference (RMSD) of 2 cm accuracy up to  $\approx 1$  m ice thickness 384 (derived from 35 manual in situ measurements).

## 385 2.4 GNSS receivers (<u>GNSSr</u>)

386 The principle of SWE retrieval based on Global Navigation Satellite System (GNSS) 387 receivers is to use the signals that are emitted at 1.575 and 1.609 GHz. by the GNSS 388 satellite constellations. SWE can be related to the carrier phase change that is induced 389 by the delay caused by the snowpack at ground level. With two static receivers 390 (standard GNSS antennas), i.e., one placed under the snow and the other above the 391 snow, carrier phase measurements of both receivers can be compared and SWE derived 392 using the onboard measurement hardware (Fig. 1e) (Henkel et al., 2018). Comparing 393 GNSS signal attenuation measurements between the two antennas (below and above 394 the snowpack) also permits the retrieval of Liquid Water Content (LWC) of the wet snow 395 (Koch et al., 2019). Snow depth retrieval has been operational for longer, based on 396 interferometric reflectometry of GNSS signals (see Larson et al. 2009; Larson, 2016). 397 Steiner et al. (2019) used a slightly simplified retrieval algorithm based on the path delay 398 estimates of the GPS signals while propagating through the snow cover due to both 399 refraction at the air-snow interface and decrease in wave velocity in the medium.

401 This relatively recent and novel approach has been validated (Henkel et al., 2018; 402 Steiner et al., 2018; Koch et al., 2019; and Appel et al., 2020). A system has now been 403 commercialized by VISTA Remote Sensing in Geosciences GmbH, Munich, Germany 404 (SnowSense<sup>©</sup>, https://www.vista-geo.de/en/snowsense/). The experimental set-up is 405 described in Fig. 1e, based on a low cost and lightweight system. In this study, we used 406 the SnowSense system for monitoring SWE and LWC throughout a winter, together with 407 other sensors (see Results Sect. 3). We also developed our own system, shown in Fig. 408 2d.

409

410 Another promising way to monitor SWE, which is based on the same principle of GNSS, 411 is the use of powerful satellite transmissions as illumination sources for bistatic radar. 412 This so-called "Signals-of-opportunity (SoOp)" approach covers a wide range of 413 frequencies, such as emissions from United States Navy Ultra High Frequency (UHF) 414 Follow-On (UFO) communication satellites in P-Band frequencies (between 240-270 415 MHz). From two P-band antennas (one direct and one reflected), Shah et al. (2017) 416 demonstrated the feasibility of retrieving SWE using the phase change in reflected 417 waveforms, which is linearly related to the change in SWE. These methods were not 418 included in this review since they are still in the development stage and not sufficiently 419 mature to be operational.

420

# 421 **3. Results**

422

423 Continuous and simultaneous recordings of different instruments on different sites 424 were analyzed to evaluate their behavior in terms of their temporal evolution. Manual 425 measurements were used to compare the data between them. First (Sect. 3.1 and 3.2), 426 two experiments we conducted were compared: GMON and CRNP (Sect. 3.2.1); and 427 GMON, Radar and GNSSr (Sect.3.2.2). A comprehensive literature review and 428 evaluations of similar sensors are then presented in Sect. 3.3. This later section also 429 includes uncertainty estimates of our experiments and from this review, which are 430 synthesized in Table 2.

431

# 432 3.1 Experimental sites and methods

433 We compared four instruments at two snow research stations that were located in 434 Québec (Canada). The first was the SIRENE site (Site Interdisciplinaire de Recherche en 435 ENvironnement Extérieur), which is situated on the main campus of the Université de 436 Sherbrooke in a temperate forest environment (45.37°N, -71.92°W, 250 m asl) (Fig. 2d). 437 The second site is the NEIGE-Forêt Montmorency (NEIGE-FM) research station. The 438 instruments were located in an open area (Fig. 2e) of the Montmorency experimental 439 forest (47.32° N; -71.15° W, 640 m asl) of Université Laval (Quebec City), which is in the 440 boreal forest. The NEIGE-FM snow research station is part of the World Meteorological 441 Organization (WMO) Global Cryosphere Watch (GCW) Surface Network CryoNet 442 (http://globalcryospherewatch.org/cryonet/sitepage.php?surveyid=191).

444 Two methods were used to obtain in situ manual SWE measurements in the vicinity of 445 the four SWE-systems: the snowpit (SP) approach; and snow-tube core samplers (see 446 Kinar and Pomeroy, 2015; López-Moreno et al., 2020). The SP-based SWE values (in mm = kg m<sup>-2</sup>) were derived from vertical continuous density profiles, which were determined 447 448 by weighing snow samples at a vertical resolution of 5 cm (height of the density cutter). 449 Assuming an accuracy of density cutter measurements of about 9% (Proksch et al., 450 2016), the mean relative SWE accuracy from snowpit can be estimated to be of 6-12%. 451 SWE estimates were also obtained by weighing the extracted core sample of known 452 diameter ( $\emptyset$ ) and snow depth using a coring tube. In this study, the core sampling was 453 performed using three different snow tube models, which were averaged: "Carpenter" 454 (Federal standard sampler, 3.7 cm  $\emptyset$  tube), the Hydro-Quebec snow tube (12.07 cm  $\emptyset$ ), 455 and an in-house Université Laval snow tube (15.24 cm Ø). The uncertainties of tube core 456 sampling that we carried out on snowpack up to 600 mm SWE with large tubes is on the 457 order of 6%, but can be higher, up to 12%. Such uncertainty is difficult to define, as 458 discussed in Sect. 3.3 and in discussion contained in the Appendix. Furthermore, as 459 manual measurements cannot be taken at the same location throughout a given winter 460 period, this could generate uncertainty when compared to a fixed instrument, due to 461 small-scale spatial variability of SWE and surface roughness (López-Moreno et al., 2020). 462

463 The snowpack properties were derived from GMON and CRNP systems throughout the 464 entire winter season of 2008-2009 (Fig. 3) and from GMON, FMCW-Radar and GNSSr 465 systems in 2017-2018 (Fig. 4). The CRNP probe that was used was the same as the 466 French EDF probe that was placed on the ground (Paguet et al., 2008) and installed at 467 about 5 m distance from the GMON footprint. The GMON was installed on a 2 m mast 468 above the surface, located in a slight depression in comparison with the terrain where 469 the CRNP was buried. The CRNP counts were accumulated over 1 hour and normalized 470 against an identical probe that was installed nearby, just above the snow surface. The 471 GMON counts were accumulated over 6 hours, and only <sup>40</sup>K counts were considered (TI 472 counts were similar, but not shown). The GMON sensor was adjusted to take into 473 account the soil moisture prior to snowfall accumulation, but not afterwards.

474

475 In addition to SWE measurements, continuous automatic snow depth measurements 476 were performed using an <u>ultrasonic ranging sensor</u> (Campbell Scientific, SR50AT-L), and 477 manually with a graduated probe around the sampling sites. LWC measurements were 478 derived from GNSSr (Fig. 4). Air temperature (T) at 2 m height and total daily 479 precipitation (tipping bucket rain gauge) were recorded at the SIRENE site; a threshold 480 of T = 0 °C was used to separate solid and liquid phases.

In this section, we present comparisons between these sensors with <u>manual snowpit</u>
 validation data <u>that were</u> measured as close as possible to the automatic instruments.
 <u>The uncertainty of measurements, including</u> other measurements that we carried out
 (not shown), is <u>reported</u> in Table 2.

485

486 3.2 Validation of measurements

487 <u>3.2.1</u> Comparison of GMON- and CRNP-derived SWE seasonal evolution

Figure 3 shows the SWE evolution of a shallow snowpack (maximum snow depth of 56 cm) at the SIRENE site that was derived from <u>daily mean values of the</u> GMON and CRNP data throughout the winter season of 2008-2009.

491

492 Results show that GMON and CRNP evolve similarly over the winter, with GMON SWE 493 being slightly higher after the first winter month (SWE > 50 mm). This difference 494 occurred after a pronounced melting spell (29-30 December 2008) and is explained by 495 the water that has accumulated on the ground under the GMON and not on the CRNP, 496 due to the local terrain configuration. The moisture beneath the GMON formed a 497 significant ice layer that lasted all winter. As this ice layer was not present in snowpits 498 (the amount of water in an ice crust being otherwise difficult to measure), this could 499 possibly explain differences between GMON and manual measurements. Precipitation 500 (snowfall and rain) is also plotted, showing how GMON and CRNP develop with each 501 event. For that given winter, rain-on-snow events were frequent, leading to moisture 502 accumulation on the ground. Note also that at the end of the winter, there was ice that 503 had not yet melted and water accumulation under the GMON, leading to a significant 504 GMON overestimation in terms of snow w.e. but not in terms of total water. There was 505 no more snow on the ground after 20 March 2009. The accuracy measurements are 506 discussed in Sect. 4.2. 507

- -SWE\_GMON SWE\_CRNP 📮 SWE\_In-situ SD 🔳 SD\_In-situ Snow fall -Rain Precip. (mm) 0 200 SWE (mm) and Snow Depth (cm) 20 150 100 50 0 28-11-08 27-01-09 16-02-09 08-03-09 18-12-08 07-01-09 28-03-09 Date (JJ-MM-YY)
- 508

Figure 3. GMON- and CRNP-derived snow water equivalent (SWE, mm), snow depth (SD, cm), and recorded daily solid and liquid precipitation (Precip., mm, right hand scale), in comparison to validation data (in situ) at the SIRENE site for the winter season of 2008-2009. Continuous SD measurements (purple line) are from SR-50 and SD\_in situ measurements (purple square) are from snowpits. Open yellow squares correspond to manual in situ SWE measurements.

- 515
- 516 3.2.2 Comparison of GMON-, Radar- and GNSSr-derived SWE seasonal evolution

Figure 4 shows the SWE evolution that was measured by the three instruments: GMON
 (<sup>40</sup>K counts only), FMCW-Radar and GNSSr, which had been placed in close proximity to
 one another at the NEIGE-FM research station for the winter season of 2017-2018. <u>A</u>
 <u>maximum snow depth of 120 cm was measured during the season</u>, corresponding to
 500 mm SWE maximum at the end of April.

522

532 533

523 The three instruments were compared to manual in situ measurements that had been 524 derived from SP (red squares) and core (red triangles) approaches in Fig. 4. We 525 distinguished the two methods (SP and snow core) because they exhibit significant 526 differences, with a RMSD of 33 mm (12%). These discrepancies are the result of two 527 problems: 1) SWE spatial variability, mainly due to snow depth variability (López-528 Moreno et al., 2020); and 2) the method that was used, since the design of snow tubes 529 and cutters has some influence on sampling errors and bias (Goodison et al., 1987). 530 Therefore, uncertainty analyses (Sect. 3.3) were performed considering manual SP as 531 the reference because the SP approach was used for both experiments.



534

542

Figure 4. GMON- (blue line), FMCW Radar- (black closed circles) and GNSSr-derived (green line) snow water equivalent (SWE, mm), snow depth (orange line for SR50AT-L data and orange open squares for in situ data) (SD, cm) and GNSSr-derived Liquid Water Content (LWC, % volumetric, purple line, right scale), in comparison to in situ snowpit (open red square) and snow core (open red triangle) SWE measurements at the NEIGE-FM site for the winter season of 2017-2018. For FMCW-Radar data (in black), plain circles are for dry snow, while open squares correspond to wet snow.

543 The continuous simultaneous recordings from the different instruments permit 544 temporal evolution analysis (Fig. 4). <u>During the accumulation period, GMON shows</u> 545 relatively smooth and consistent evolution in SWE leading to a maximum of 465 mm on

546 19 April 2018, while the FMCW-Radar time series is more erratic and requires filtering to 547 remove low SWE outliers. These points are mainly due to incorrect detection of the 548 peak of the radar echo on the ground (snow-ground interface), sometimes with low 549 amplitude, and which can be filtered with improved data quality processing of raw 550 recording (Pomerleau et al., 2020). In particular, all data that were acquired under wet 551 snow conditions (open black squares, Fig. 4), which correspond to melting periods with 552 measured air temperature above 0° C, are obviously underestimated as expected, 553 because of radar wave absorption by liquid water in the snowpack. Compared to the 554 GMON, the GNSSr signal increases with values that are lower than the GMON until mid-555 March at which point it continues to evolve with similar values, as the GMON SWEmax 556 of 499 mm w.e. was reached on 23 April 2018. The behavior of the three instruments, 557 showing different patterns of snow evolution, always remains close to in situ 558 observations (RMSE compared to the snowpit for GMON and GNSSr are respectively 34 559 mm and 32 mm; Table 2). It should be noted that in Fig. 4, there is a small difference (+4 560 days) between the disappearance of snow cover that was recorded with GNSSr (11 May 2018) compared to GMON (14 May 2018). The GNSSr sensor is not sensitive to soil 561 562 moisture, while GMON is, despite the instruments being located on a well-drained 563 sandy site (NEIGE-FM site). In the case shown here, the end of snowmelt is well captured by both instruments. The accuracy between instruments is analyzed in Sect. 564 565 3.4, including a second winter season of continuous measurements at the NEIGE-FM site 566 (2016-2017, Pomerleau et al., 2020).

567

568 GNSSr also measures the Liquid Water Content (LWC) of snow (purple line in Fig. 4). The 569 non-zero LWC values correspond well to positive air temperatures that were recorded 570 at this site, and also to the drop in FM-Radar measurements (open black squares).

571

## 572 3.<u>3 Analysis of measurement uncertainty</u>

573 It is challenging to compare the accuracy of several instruments, given that there is no 574 absolute reference for estimating SWE (see Kinar and Pomeroy, 2015). In situ manual measurements are themselves subject to error, with varying precision depending upon 575 the method that is being used. Errors are incurred that depend upon the types of 576 577 density cutter, tube diameter, sampling quality that is operator dependent, and ice 578 lenses in the snowpack, among other sources. This is a long-debated topic, with no 579 actual established international standard protocol (Work et al., 1965; Goodison et al., 580 1981, 1987; Kinar and Pomeroy, 2015, López-Moreno et al., 2020). Commonly, the 581 relative uncertainty for SWE measurement using snow core varies from 6% for shallow 582 snowpack (0-300 mm w.e.), to 8% (300 – 1000 mm w.e.) for medium snowpack to 10-12 583 % for deeper snowpack (> 1000 mm w.e.) (see discussion in supplementary data). 584 Moreover, because manual measurements cannot be taken at the same location during 585 a given winter period, uncertainty can be introduced by well-known local spatial 586 variability of snow depth that can occur at fine scales around the sensors. Such 587 variability depends upon several factors, such as the region and the environment (Arctic 588 area, aspect and slope in mountainous areas, for example), the micro-topography and 589 roughness, the vegetation, and snow redistribution by the wind (Clark et al., 2011; Bormann et al., 2013; Rutter et al., 2014; Meloche et al., 2021; Royer et al., 2021).
Furthermore, temporal variability of snowpack <u>snow depth and SWE</u> during the winter
requires regular validation measurements throughout the season.

593 The sensor uncertainties were evaluated from results of our experiments (Sect. 3.2) and 594 from published studies at other experimental comparison sites (this section). These 595 other sites are: the Weissfluhjoch high-alpine site near Davos, Switzerland (46.83° N, 596 9.81° E, 2 536 m asl); Sodankylä, Finland (67.37° N, 26.63° E, 185 m asl); Caribou Creek, 597 SK, Canada (53.95° N, -104.65°W, 519 m asl); and Fortress Mountain ski area, Kananaskis 598 Country, Canadian Rocky Mountains, AB (50.82° N, -115.20° W, 2 330 m asl). We also 599 conducted a series of manual FMCW-radar measurements (e.g., instrument operated by 600 hand, rather than automatically) over dry snowpack and compared them with in situ 601 SWE measurements over a wide range of conditions (snow depth and density) in boreal 602 forest (47° N, 18 points), subarctic taiga (54–56° N, 32 points) and Arctic tundra (69° N, 603 28 points) environments along a northeastern Canadian transect (Pomerleau et al., 604 2020).

Note that we only consider here the differences between instruments in the field and
 do not address accuracies that were derived from instrument calibration by the
 manufacturer.

608 609 Table 2 summarizes the uncertainties of each instrument and protocol (five cases: CRNP in and above ground, GMON, FMCW-Radar and GNSSr) in relation to in situ manual 610 611 measurements (snowpit method), as well as against snow pillow and snow scale data 612 that were considered as reference measurements by the authors of the publications 613 consulted. The results from the COSMOS-UK network (Wallbank et al., 2021) were not 614 included in the overall uncertainty analysis, because, in this study, depth-based SWE 615 estimate of fresh snow was used to assess the uncertainty of CRNP (R<sup>2</sup> of 0.53, in the 616 range of 0-40 mm w.e.). Moreover, soil moisture is usually high and variable in UK,

- 617 which acts to increase uncertainties in the SWE estimate (Wallbank et al., 2021).
- 618 Even if the mechanical method is well known and has been proven over many years, the 619 snow pillow can sometimes generate large errors when bridging processes occur that 620 are linked to freeze-thaw cycles leading to disconnection of the weighing mechanism of 621 the overlying snowpack and the surrounding snowpack (Kinar and Pomeroy, 2015). 622 However, to compare measurements at a daily scale, they are worth looking at. In Table 623 2, the <u>uncertainty that relates to the characterization of measurement dispersion</u> 624 compared to a reference was defined, when known. We used the root-mean-square 625 difference (RMSD) between an instrument and a given reference, and by a linear 626 regression over the whole range of measured SWE data that was defined by the 627 coefficient of determination ( $R^2$ ), the slope and the intercept. The number of points is 628 also given.
- 629

### 630 <u>Table 2 here</u>

- 631
- 632 <u>Uncertainty</u> analysis does not allow us to determine the <u>"best"</u> instrument, due to the 633 diversity of experimental conditions, including the range of SWE, the number of

634 experimental sites and point measurements, and the analyses that are performed over 635 one or several seasons. It appears that all five methods show a RMSD in the range of 14 636 to 48 mm (mean 33 ± 11 mm) against in situ snowpit manual measurements (Table 2). 637 This represents a relative value of around 12% on average, depending on the 638 instruments. The mean coefficient of determination for the linear regression is also 639 substantially high (mean  $R^2 = 0.92 \pm 0.07$ ). Calculated average slope is 0.976  $\pm$  0.13, 640 meaning that in general, the instruments slightly underestimate SWE for higher SWE 641 values compared to in situ measurements, even if this is not always the case (Table 2). 642 RMSD increases slightly when the analysis was performed over a deep snowpack (0-643 1000 mm w.e.) and decreases when compared to another continuous instrument 644 instead of manual data (instrument vs GMON and instrument vs snow pillow, average 645  $RMSD = 23 \pm 10 mm$ , Table 2).

646

647 For the GNSSr instrument that allows the operator to differentiate dry from wet snow, 648 Koch et al. (2020) have shown that SWE RMSD is about 2.4-fold higher for wet snow 649 than for dry snow. They did not provide information on LWC uncertainty. In late winter 650 2021, for very wet melting snow, we did a validation measurement using the WISe A2 651 Photonic probe (snow liquid-water content sensor that is based on snow microwave 652 permittivity measurements; https://a2photonicsensors.com/wise/). The GNSSr LWC was 653 of 0.44 % (in volume) (the retrieved GNSSr SWE was 149 mm w.e) and the LWC from the 654 in situ probe was of 0.47 % for the upper half of the snowpack. The snowpack SWE that 655 was measured manually was 133 mm. The lower half of the snowpack was saturated 656 with water. The uncertainty in wet SWE retrieval could result from approximations in 657 the retrieval algorithm that is used. For example, the wet snow refractive index varies 658 linearly with LWC, with a slope significantly dependent of the snow density (see the 659 appendix of Pomerleau et al., 2020). This aspect could probably be addressed further by 660 improved inversion.

661

662 The uncertainty comparison in Table 2 must be weighted according to the analysis 663 conditions. The accuracy estimates can actually depend upon the number of points 664 being used and their distribution over time. High inter-annual variability of the 665 snowpack state (see Bormann et al., 2013; Lejeune et al., 2019) ideally would 666 necessitate several years of measurements over the winter. The uncertainties of each 667 GMON and CRNP instrument were derived from huge data sets that were based on 668 operational networks from the GMON Hydro-Quebec network in Canada and the Alps' 669 EDF network for the CRNP, respectively, with a very large number of samples taken over 670 several years of experiments and from multiple sites. The accuracy of the GMON that is 671 given by the manufacturer is ± 15 mm for SWE < 300 mm and ± 15% for SWE of 300-600 672 mm, which is probably rather conservative. When SWE reference data and site 673 adjustment process are well done, the GMON is able to report SWE with an error as low 674 as 5% (Wright, 2011; Choquette et al., 2013; Wright et al., 2013). The accuracy of the 675 SnowFox sensor (CRNP) that has been provided by the manufacturer (5-10%) must be 676 confirmed. The GNSSr approach has recently been the subject of two different 677 comparative analyses showing very promising results (Henkel et al., 2018; Koch et al.,

678 20<u>19</u>), which were confirmed by our own results. Over a full season, we obtained an 679 excellent relationship between GNSSr and in situ manual measurements (<u>relative</u> RSMD 680 = 11%, Table 2) and compared with GMON (RMSD = 34 mm, 12%, SWE<sub>GNSSr</sub> = 1.126 681 SWE<sub>GMON</sub> - 59.3,  $R^2$  = 0.97, 153 days).

682

684

#### 683 **4. Strengths and Weaknesses of Instruments**

685 In this section, we review the advantages and drawbacks of each of the instruments that 686 are presented, summarized in Table 3. This analysis is based on our experience on 687 instruments and their performances, and a literature review on experimental results of 688 measurements that were carried out with the same approaches. We only consider these 689 field sensors for SWE measurements in terms of their continuous and autonomous 690 capacities, from the perspective of an operational networking context, including criteria 691 regarding low maintenance and relatively easy installation without requiring heavy 692 infrastructure. The four instruments that we analyzed are: CRNP with two experimental 693 setups, i.e., instrument in the ground and above the snow; GMON; 24-GHz FMCW-694 Radar; and GNSSr (see Table 1 for acronyms and Fig. 1 for the experimental setup). They 695 are all capable of working on batteries and solar panels, by adjusting, if necessary in 696 certain cases, the measurement protocol, i.e. by reducing the frequency of acquisition 697 and on-board data processing. Ten criteria were considered (Table 3): - the SWEmax 698 capability; - other measured parameters; - whether ancillary data were required for SWE 699 retrieval; - the temporal sampling rate, i.e., whether they were capable of quasi-700 continuous SWE measurement capability, although the notion of continuous SWE 701 measurements is relative to the application; - the footprint of the sensor, i.e. taken here 702 in the sense of the area from which emanates the measured radiation having interacted 703 with the snow; - the power consumption; - the main strength of the approach; - their 704 critical drawbacks; - the price of the instrument itself, knowing that the cost of the 705 system may vary in case additional instruments are required for the SWE 706 measurements. Also, the cost that is associated with on-site maintenance during winter 707 should be considered here, but in our case, the 4 instruments are considered on the 708 same basis, i.e., autonomous, with no need for intervention; - and the possibility of 709 other applications.

The cost criterion is a very relative argument, which can influence the choice of decision-makers or researchers, depending upon the intended application (e.g., large network, in remote areas, among others) and also on the purchasers.

- 713
- 714

### 715 <u>Table 3 here</u>

716

To complement the main criteria that are presented in Table 3, we include the following additional considerations, which are reported in the literature, by order of presentation

- 719 rather than order of merit.
- 720

The CRNP approach is based on neutron component that has absorption mean free path about an order of magnitude larger than that for gamma radiation. This makes it the most efficient system for very deep snowpack analysis (Paquet et al. 2008). Measurements over a snowpack of up to 2000 mm SWE were performed using the SnowFox sensor at the UC Berkeley Central Sierra Snow Lab in Soda Springs, CA (2 120 m asl; https://vcresearch.berkeley.edu/research-unit/central-sierra-snow-lab).

727

Regarding CRNP above the snow, Schattan et al. (2017) estimated the theoretical winter
 footprint over snow, which they defined as the distance from where neutrons originate.
 They found that 86%, 63% and 50% of neutrons originate within respective distances of
 273, 102, and 49 m. In practice, the authors found that the average footprint during the
 season, based on measurements over almost three snow seasons, was estimated to be
 around 230 m, possibly more.

734

735 Moreover, CRNP is inherently weakly sensitive to interference from vegetation 736 compared to systems that are based on EM low frequencies (GMON, FMCW-Radar and 737 GNSSr). This is in part because the attenuation coefficient for fast neutrons ( $\sim 0.01 \text{ m}^{-2}$ 738 kg in water, Murray and Holbert, 2020) is an order of magnitude smaller than the 739 analogous attenuation coefficient in vegetation for GNSS microwaves (1.5 GHz) (e.g., 740 Wigneron et al., 2017). Also, vegetation can itself be a significant source of 741 electromagnetic emissions (Larson et al., 2014; Wigneron et al., 2017). The CRNP is 742 affected by all sources of hydrogen within its measurement footprint. As Biomass 743 increases the hydrogen concentration in the CRNP's footprint, it is possible to monitor 744 changes in biomass (Vather et al., 2020).

745

746 The instruments pointing toward the soil, CRNP and GMON above the surface, are 747 sensitive to soil moisture. This can be a relatively large source of error with these 748 measurement principles, given that these sensors are interpreting near-surface soil 749 liquid content as SWE. This is especially the case during spring freshets and mid-season 750 thaw cycles (see Fig. 3 and Smith et al., 2017). Heavy rainfall on snow also leads to 751 erroneous SWE estimates due to the occurrence of water ponding beneath the snow 752 (Fig. 3). Installation on well-drained soils can mitigate these effects, as shown in Fig. 4. 753 By assuming that soil moisture levels remain stable throughout winter, which can be the 754 case when soil remains frozen (see Gray et al., 1985, 2011), this soil moisture-induced 755 bias can be adjusted prior to the first snowfall or one must apply a correction based on 756 soil moisture conditions that are otherwise known. Based upon 10+ years of experience 757 with a large GMON network that is deployed in Quebec, Canada, over northern organic 758 boreal soil, it has been shown that in most cases, SM does not vary substantially during 759 the winter season (Choquette et al., 2013; Ducharme et al., 2015). To consider SM as 760 constant, mathematical equations that are used in calculating SWE can be simplified. If 761 the goal is to measure the total water that is available for hydrological purpose, this 762 aspect can become an advantage.

Counter-based sensors such as CRNP and GMON need to accumulate enough counts for reliable SWE estimates. Thus, it may be necessary to accumulate the counts over an adjusted period of time (several hours, depending on the case), so that the measurement is not strictly continuous. This can prevent accurate detection of short events, sudden heavy snowfalls, for example.

769

770 For the GMON, depending on the type of soil at the measurement site, gamma ray 771 emissions may not be sufficient and could require a longer integration period, as is the 772 case for sites with thick organic soil layers. It is possible to enrich gamma emissions by 773 using bags or pipes of potassium-rich fertilizer, thereby maintaining a shorter 774 integration time. Wright et al. (2011) achieved success with this approach, which yielded 775 significantly higher count strengths. Such a protocol is illustrated in Fig. 2g (data not yet 776 processed). Over glaciers, GMON requires such an enriched gamma emission setup. The 777 size of the area that is effectively monitored by the GMON ("footprint") extends to 10 m 778 from the detector when there is no snow or water on the ground (Ducharme et al., 779 2015). The size of the sensed area exponentially decreases with increasing SWE and is 780 estimated to be of the order of 5 m radius  $(50 - 100 \text{ m}^2)$  for 150-300 mm w.e. (Martin et 781 al., 2008; Ducharme et al., 2015). This relatively large foot print is an advantage of this 782 sensor.

783

With FMCW-Radar technique, as previously stated, penetration depth strongly depends on the measurement frequency. Generally, high frequency instruments result in higher resolution measurements, but these are also affected by greater signal attenuation, i.e., by a reduced depth of penetration. A disadvantage of this approach is that it requires the measurement of snow height as close as possible to the radar sensor. Also, the algorithm for thresholding the radar echo peaks must be developed as well as the calculation of the SWE (see Pomerleau et al., 2020).

791

792 GNSS electromagnetic waves can be attenuated under the forest canopy, as the forest 793 transmittivity at 1.5 GHz is not negligible (Wigneron et al., 2017). Yet, because we 794 normalized the signal beneath the snow against the one acquired above the snowpack, 795 when both antennas were placed under the canopy, this effect should not alter 796 retrieval. GNSSr is not well suited to very steep mountainous terrain (e.g., deep-valley 797 bottoms), given that a rather wide sky-view factor is needed by the instrument, and that 798 this view can be limited in such environments, depending on slope and location (Koch et 799 al., 2019, Steiner et al., 2018).

800

The main conclusions that emerge from Table 3 and the aforementioned remarks are the following, recalling that each approach has its own advantages and limitations (by order of presentation rather than by order of merit):

 The CRNP approach is based on measurements of natural cosmic ray fluxes, which are variable in time, unfortunately requires complementary atmospheric measurements (temperature, pressure and atmospheric humidity) at each site for correcting the signal and must be normalized against a nearby reference site 808 (available worldwide). CRNP on the ground: This is the most efficient system for very 809 deep snowpack (> 2000 mm w.e., perhaps up to 7000 mm w.e.), as is the case in 810 mountain environments or northerly areas that are witness to winter lake-effect 811 snowfall. The most advantageous aspect of the CRNP is its ability to measure SWE 812 through complex snow layers from shallow to deep snow conditions. This is a robust 813 and mature approach, as demonstrated by the French EDF experience (Gottardi et 814 al., 2013; Lejeune et al., 2019); however, the EDF's sensor is based on a system that 815 is not exploited commercially. The alternative sensors are the CRNP-based sensor 816 that is manufactured by Hydroinnova (SnowFox or CRS-1000/B, Hydroinnova, 817 Albuquerque, NM) (https://hydroinnova.com) and the CRD manufactured by Alpine 818 Hydromet (www.alpinehydromet.com) and marketed by Geonor Inc. These 819 sensors are relatively new and still need to demonstrate their robustness. The cost 820 of Hydroinnova system is about 11000 US\$ for sensor only. As previously 821 mentioned, ancillary sensors (atmospheric humidity and barometric pressure 822 sensors) must be added, and the actual price could be up to 17 000 US\$ for full 823 setup. The cost of the Geonor Inc. system is 15 000 US\$.

- <u>CRNP above the snow</u>: The most interesting system for measuring SWE over a large footprint, but it is limited to shallow snowpacks. It is the only approach that can provide an integrated spatial measurement. This approach also needs <u>appropriate</u> adjustment for each site in terms of soil moisture corrections, which can be difficult over a large area.
- 829 GMON: This is one of the most mature instruments for snowpacks that are not too 830 deep (600 mm w.e. according to manufacturer specifications, but up to 800 mm w.e. 831 based on our experience ), with a medium footprint (10 m). Yet, it needs systematic 832 site adjustment for soil moisture-induced error, which can increase the bias of 833 measurements, particularly at the end of the winter when the soil becomes 834 potentially saturated during snowmelt. It is the most expensive of the four 835 instruments (around 16 600 US\$, 20 000 \$CAD). This system has proved its 836 robustness and accuracy within the operational Hydro-Quebec Canadian network 837 over a wide variety of environments for almost 10 years (Choquette et al., 2013).
- FMCW-Radar: This approach requires the measurement of the snow depth to be
   able to retrieve SWE. Its weak point is its limitation in measuring the SWE of wet
   snow. Yet, the instrument is very useful for dry snowpack characterization, in terms
   of stratigraphy or for avalanche studies, and also for detection of snowmelt events.
   Moreover, it is not expensive (1 000 US\$, 800 €). As it is very light weight and
   compact, one of its strengths is its potential capability to retrieve SWE from
   remotely piloted aircraft above arctic snowpacks.
- <u>GNSSr</u>: The potential of the GNSSr approach, <u>which is a light and compact system</u>, is strong, given its capability of measuring SWE and LWC with high accuracy, <u>and to derive snow depth</u>. For SWE retrieval, its performance remains very good (<u>relative RSMSD of</u> ~10% in the range of 0-1000 mm) and has the capacity <u>to measure deep snowpack</u> (up to <u>1</u> <u>500 mm w.e.</u>). <u>SWE accuracy for wet snow has yet to be improved, as it depends upon the GNSS signal processing. Its cost is 8 550 US\$ (7 000
  </u>

Euros). The station includes the software/license and processing is performed
 onboard of the station. The Station comes with 1 year of Iridium communication for
 retrieved product SWE/LWC (via VISTA). VISTA supports customer to find
 operational way to retrieve data in operational use for future. The license alone for
 processing the raw data can also be directly purchased at ANavS
 (https://anavs.com/) for 2 370 US\$ (2 000 €).

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# 858 **5.** Conclusions859

860 In this paper, we evaluated four types of non-invasive sensors that have all reached a 861 certain level of maturity enabling deployments of autonomous networks for monitoring 862 water equivalent of snow cover (SWE). These include the Cosmic Ray Neutron probe 863 (CRNP), the Gamma Ray Monitoring (GMON) sensor, the frequency-modulated 864 continuous-wave radar at 24 GHz (FMCW-Radar), and the Global Navigation Satellite 865 System receiver (GNSSr) (see Table 1). This new generation of light and practical systems 866 that are based on radiation-wave measurement is now commercially available. The 867 GMON is already operationally used in Québec, Canada, for hydrological purposes 868 (Hydro-Québec, Rio-Tinto, and governments).

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870 The analysis of their performances that are summarized in Tables 2 (uncertainties of 871 measurement) and 3 (pros and cons) show that each approach has its strengths and 872 weaknesses. The synthesis of their advantages/disadvantages shows that the overall 873 uncertainties remain in the range of manual measurements, i.e., 9 to 15%. CRNP that is 874 placed in the ground beneath the snow is the only system capable of measuring very 875 deep snowpacks, while the GNSSr sensor is limited to SWE up to  $\sim 1500$  mm w.e., and 876 the two others up to  $\sim 800 \text{ mm}$  w.e.. Both CRNP and GMON approaches need 877 systematic site adjustments for soil moisture characterization. In addition to SWE, an 878 advantage of the sensor to be considered is their ability to measure other parameters, 879 such as snowpack stratigraphy for the FMCW-Radar, and the liquid water content for 880 the GNSSr. The GNSSr approach, which has relatively low cost and is light and very 881 compact, appears to have a great potential in remote and difficult to access areas.

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883 The requirement of automatic instrumentation networks for SWE measurements to 884 improve seasonal snowpack monitoring is important for several applications, such as 885 where spatially distributed SWE instruments are needed in remote and mountainous 886 areas, for operational water resource and flood management over snow-driven 887 watersheds. Networks of continuous SWE measurements are also required for 888 calibrating satellite-derived SWE information, or for winter transportation safety. This 889 review of continuous-monitoring SWE sensors is intended to help researchers and 890 decision makers choose the one system that is best suited to their needs.

- 891
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# 942 **Conflicts** of interest:

The authors declare absolutely no conflicts of interest or business relationships with any of the manufacturers that are mentioned in this article. The mention of commercial companies or products does not constitute a commercial endorsement of any instrument or manufacturer by the authors.

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Table 2 <u>Uncertainty</u> analysis for the 4 systems <u>that were</u> considered. The Range measurement indicates the highest SWE (mm) value on which the analysis was performed. RMSD: Root Mean Square Difference. R<sup>2</sup> is the determination coefficient of the linear regression analysis. Pts: number of in situ manual samples. "-" means no information available.

Sensor	Reference data	SWEmax	Uncertainty RMSD (mm) (relative	Potoroncos, sitos, number of points	
561301	Reference data	(mm)	RMSD), R <sup>2</sup> (slope, intercept)	References, sites, number of points	
	Manual snowpit	200	14 mm, R2 = 0.96 (0.78, 8.5 mm)	This study (Fig. 3), 7 pts	
	GMON	200	28 mm, <i>R</i> <sup>2</sup> = 0.89 (0.79, -3.9 mm)	This study (Fig. 3), 2008-2009 season	
	Manual snownit	1700	$- P^2 - 0.08 (0.00, 2.8 mm)$	Gottardi et al. (2013) EDF system, Alps and Pyrénées	
CRNP in the ground			-, K = 0.38 (0.33, 2.8 mm)	320 year.sites, 1037 pts.	
	Snow core	2500	-(2% + 13%) B2 = 0.943 ()	Gugerly et al. (2019), Glacier de la Plaine Morte,	
	511000 6016	2300	(270 ± 1370), 12 = 0.543 ( , )	Switzerland, 9 pts (2 winters)	
	-	-	5 - 10%	Hydroinnova snowFox <sup>1</sup>	
CRNP above snow	_	_	5 – 10%	Hydroinnova CRS-1000/B <sup>2</sup>	
	Manual snowpit	500	34 mm (12%), <i>R</i> <sup>2</sup> = 0.93 (0.997, 17.1 mm)	This study (Fig. 3 and 4) and Pomerleau et al. (2020), SIRENE et NEIGE-EM, 64 pts	
	Snow core	200	40 mm, $R^2$ = 0.92 (1.16, 16.8 mm)	Smith et al., 2017, Sodankylä, Finland, 30 pts	
GMON	Snow core	125	23 mm, $R^2$ = 0.90 (0.904, 27.5 mm)	Smith et al., 2017, Caribou Creek, Canada, 19 pts	
	Snow core	700	48 mm, $R^2$ = 0.92 (0.881, 32.4 mm)	Smith et al., 2017, Fortress Mountain, Canada, 8 pts	
		0-300	±15 mm	Campbell Scientific CS725 manual <sup>3</sup>	
	_	300-600	±15%		
				This study (Fig. 4) and Domorleau at al. 2020, 46 pts	
FRACIAL Deday 24 Cite	Manual snowpit	500	38 mm (14%), <i>R</i> <sup>2</sup> = 0.73 (0.80, 65.0 mm)	dry snow	
FIVICW-Radar 24 GHZ	Manual snownit	750	59 mm (30%) $B^2 = 0.87 (0.98.0)$	Pomerleau et al., 2020, manual measurements, multi	
	Manual Showpit		35 mm (3678), W = 0.07 (0.50, 0)	sites Northern Québec, Canada, 78 points dry snow	
	Manual snowpit	500	32 mm (11%). R <sup>2</sup> =0.93 (1.057.9 mm)	This study (Fig. 4), 18 points	
	Manual snowpit	2000	± 15 mm	SnowSense Vista Inc. manual <sup>4</sup> , good conditions	
	Manual snowpit	700	23 mm, <i>R</i> <sup>2</sup> = 0.995 (0.98, 5.52 mm)		
01/00	Snow-pillow	700	11 mm, $R^2$ = 0.999 (1.01, 1.97 mm)	Henkel et al. 2018, Weissfluhjoch, Switzerland (CH)	
GNSSr	Combined data	800	66 mm, $R^2$ = 0.99 (1.1, -26 mm)	Steiner et al., 2018, Weissfluhjoch, CH, 633 pts	
		1000	45 mm, R <sup>2</sup> = 0.98 (0.98, 31.4 mm)	Koch et al., 2019 dry snow, Weissfluhjoch, 3 winters	
	Manual snowpit	1000	103 mm, <i>R</i> <sup>2</sup> = 0.86 (0.88, 67.3 mm)	Koch et al., 2019 wet snow, Weissfluhjoch, 3 winters	
	Snow-pillow and	1000	30 mm, R <sup>2</sup> = 0.99 (0.97, 30.5 mm)	Koch et al., 2019 dry snow, Weissfluhjoch	
	snow scale	1000	72 mm, <i>R</i> <sup>2</sup> = 0.93 (0.92, 65.0 mm)	Koch et al., 2019 wet snow, Weissfluhjoch	

1 https://hydroinnova.com/\_downloads/snowfox\_v1.pdf, Hydroinnova, Albuquerque, NM

2 Hydroinnova, Albuquerque, NM; http://hydroinnova.com/snow\_water.html

3 Campbell Scientific (Canada) Corporation, CS725 manual, https://s. campbellsci.com/documents/ca/manuals/cs725\_man.pdf.

4 https://www.vista-geo.de/en/snowsense/

Table 3 Pro and Cons of the four systems that were considered for SWE monitoring. SM: Soil Moisture. FOV: Field-of-View. The approximate price is given (2021), subject to change according to exchange rate fluctuations.

Sensors	Sensors CRNP		<b>6140</b> 1		GNSSr	
	CRNP on the ground	RNP on the ground CRNP above the snow		FMCW-Radar 24 GHz		
SWEmax	<u>Up to</u> 2000 mm	~150-300 mm	<u>6</u> 00 mm (possibly 800 mm)	~1000 mm	<u>Up to</u> 1500 mm	
Other measured parameters	Other measured _ SM		SM	Melt detection	<u>LWC, SD (estimated)</u>	
Other sensors needed	Dither sensors needed P, T <sub>air</sub> , RH P, T <sub>air</sub> , RH		-	SD	-	
Typical sampling rate	Discontinuous <sup>a</sup>	Discontinuous <sup>a</sup>	Discontinuous <sup>a</sup>	Continuous	Not strictly continuous <sup>b</sup>	
<b>Footprint</b> ~1 - 2 m <sup>2</sup>		20-40 ha (300 000 m²)	FOV 60° Typically, 50-100 m <sup>2*</sup>	FOV $\pm 32.5^{\circ}$ azimuth and $\pm 12^{\circ}$ elevation, 0.4 m <sup>2</sup> *	~1 m <sup>2</sup>	
Price (US\$, 2021)	2021) Hydroinnova: 11 000 (sensor only) EDF: Not marketed (on request) <sup>c</sup>		16 600 (sensor only)	1 000 (radar and software <sup>d</sup> )	8 550 (complete station <sup>e</sup> )	
Power consumption	<u>0.02 W</u> ,	<u>, 12 V DC</u>	<u>0.18 W, 12 V DC</u>	Operating: 8.14 W, 15 V DC	Operating 5 W, 12 V DC	
Main advantage	ain advantage Very deep snowpack Large footprint		Medium footprint	Snowpack microstructure Very light and compact Low cost	Light SD and LWC Low cost <u>(license only)</u>	
Main inconvenience	ain inconvenience SM issue SM known issue Needs ancillary measurements Shallow		SM knowledge needed	Dry snow only	Large sky view factor required	
Other drawbacks	ther drawbacks EDF system not commercially available <u>Need further</u> validation		<u>Cost</u>	Not turnkey Issue with ice crust	SWE for wet snow must be improved Retrieval algo. issue	
Main applications, Capability (see text) Comments	ain applications,     Hydrology       bability (see text)     Network operational     Hydrology, SM       Comments     by EDF <sup>c</sup>		Hydrology, SM Network operational by Hydro-Québec	SM, Stratigraphy, Avalanche, Melting monitoring Lake ice thickness RPA capability <sup>f</sup>	Hydrology, SM Avalanche, Melt monitoring	

a: Counts must be accumulated over a specified period, e.g. 6h, 12h, or longer. b: GNSS signals must be averaged over a period of time for noise reduction; the typical measurement cycle: 1 per day (possibly up to 6 per day). c: System based on a sensor that is not commercialized. d: Software for sensor settings and reading/recording data, but not for SWE retrievals. e: Subscription license required. f: Remotely Piloted Aircraft capability.

\* Depending on the height of the sensor on its support mast above snow, Field-of-View (FOV) given for 3 m mast.

#### Appendix or Supplementary data

#### Estimating the uncertainty of in-situ field measurements

In situ field measurements of Snow Water Equivalent (SWE) <u>are accompanied by</u> uncertainties from a variety of sources, which include: 1) instrumental: size and type of sampling tube according to snow depth, weight scale; 2) sampling technique, extracting <u>the</u> snow core; 3) error <u>that is</u> induced by observer; 4) snow conditions: local natural variability, ice lens<u>es</u> and hard snow crust<u>s</u> within the snowpack; 5) soil conditions: irregular soil surface, identification of snow-ground interface. Snow depth is sometimes difficult to estimate over <u>a</u> thawed organic snow-ground interface because surface organic material is often taken into account in the snowpack depth estimate using a snow height probe.

In general, the uncertainty in the SWE depends mainly upon the diameter of the snow core according to the snow depth (the deeper the snow, the smaller the snow core that is required). Few studies discuss the accuracy of in-situ SWE measurements comprehensively over a large range of conditions, from 100 to more than 2 000 mm w.e. For example, the standard protocol that is implemented by Environment and Climate Change Canada is to attain five to ten measurements along a pre-determined survey line of about 150 to 300 m using a translucent plastic ESC-30 sampler (6.2 cm Ø, which is commonly employed in Canada) (Brown et al., 2019). Each study is generally focused on one type of snowpack. Commonly, relative uncertainty varies from 6% for shallow snowpack (0-300 mm w.e.) to 8% (300 – 1000 mm w.e.) for medium snowpack to 10-12 % for deeper snowpack (> 1000 mm w.e.) (see references in the recent review by López-Moreno et al., 2020; also see Work et al., 1965; Turcan and Loijens, 1975; Peterson and Brown, 1975; Goodison et al., 1981 and 1987; Sturm et al., 2010; Berezovskaya and Kane, 2007; Dixon and Boon, 2012; Stuefer et al., 2013; Steiner et al., 2018; Gugerli et al., 2019; Brown et al., 2019). Among recent studies, Stuefer et al. (2013) and López-Moreno et al. (2020) are limited to shallow Arctic snowpack, Steiner et al. (2018) to medium snowpack (up to 1200 mm w.e.), while Gugerli et al. (2019) discuss the problem across a large SWE range of alpine snowpacks over a glacier from 200 to 2300 mm w.e., but with the same snow core (Fig. A1).

In summary, it is well known that SWE uncertainty decreases for shallow snowpack with a larger snow core diameter (typically above 6 cm diameter), given that a larger volume of snow is sampled, <u>Yet</u>, on the other <u>hand</u>, the coring technique is more difficult when snow depth increases. For thicker snowpack, it requires the digging of a pit, because a larger <u>core</u> diameter impeded the retrieval of the snow sample directly from the top of the snow surface. Thus, <u>a</u> large snow core<u>r</u> is limited to shallow snowpack<u>s</u> (snow depth less than 1.5 - 2 m). Moreover, commonly remarks from <u>both</u> our experience and the above cited studies agree <u>in</u> that uncertainties in SWE estimates increase with thicker snowpacks. <u>A small</u> diameter snow core is required for thick snowpack<u>s</u> (snow depth above 2 m).

Figure A<sup>2</sup> illustrates the underestimation of SWE with a large diameter snow core<u>r</u> when SWE increases, from a large dataset <u>that was</u> derived from our International Polar Year experiments (Langlois et al., 2010).



Figure A1 Relationship between the standard deviation (%) of SWE measurements as a function of SWE (mm) based on snow core, derived from Gugerli et al. (2109) (data from Glacier de la Plaine Morte, Switzerland,). Results show an uncertainty of 6 % for SWE of the order of 250 – 500 mm, about 10% for SWE between 1000 and 1500 mm, and 12% for SWE between 2000 – 2500 mm.



Figure A2. Comparison between SWE measurements (in mm) from snow core and snowpit methods. Red squares are for small diameter snow core (ESC-30 type core: 6.2 cm) and black points are for large diameter snow cores (9.5 cm). The black line is Y=X. Measured SWE Core values are clearly underestimated above 250-300 mm SWE. Unfortunately, no measurements with small diameter snow cores above 280 mm SWE are present in this example. The database (94 points) is derived from the International Polar Year project (Langlois et al., 2010), including sampling sites at Sherbrooke (SIRENE, 45.37° N; -71.92° W), Sept-Iles (50.30° N; -66.28° W), Schefferville (54.90° N; -66.70° W) and Kuujjuaq (58.06° N; -71.95° W) (also see Royer et al., 2021).

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