

# Using freezing spectra characteristics to identify ice nucleating particle populations during the winter in the Alps

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**Abstract.** One of the least understood cloud processes is modulation of their microphysics by aerosols, specifically of cloud ice by ice nucleating particles (INPs). To investigate INP impacts on cloud ice and subsequent precipitation formation, measurements in cloud environments are necessary but difficult given the logistical challenges associated with airborne measurements and separating interstitial aerosol from cloud residues. Additionally, determining the sources of INPs is important given the dependency of glaciation temperatures on the mineral or biological components and diversity of such INP populations. Here, we present results from a comparison of INP spectral characteristics in air, cloud rime, and fresh fallen snow at the High Altitude Research Station, Jungfraujoch. The goal of the study was two-fold: (1) to assess variability in wintertime INP populations found in-cloud based on wind and air mass direction during snowfall and (2) to evaluate possible INP sources between different sample types using a combination of cumulative INP ( $K(T)$ ) and differential INP ( $k(T)$ ) spectra. INP freezing temperatures and concentrations were consistently higher on average from the southeast as compared to the northwest for rime, snow and especially aerosol samples which is likely a result of air mass influence from predominantly boundary layer terrestrial and marine sources in Southern Europe, the Mediterranean, and North Africa. For all three sample types combined, average onset freezing temperatures were  $-8.0$  and  $-11.3$  °C for southeasterly and northwesterly days, respectively, while  $K(T)$  were 3 to 20 times higher when winds arrived from the southeast. Southeasterly aerosol samples typically had a clear mode in the warm temperature regime (i.e.,  $\geq -15$  °C) in the  $k(T)$  spectra—indicating a putative influence from biological sources—while the presence of a warm mode in the rime and snow varied. Evaluating  $K(T)$  concert with  $k(T)$  spectra exhibited variable modality and shape—depending on the types of INPs present—and may serve as a useful method for comparing different sampled substances and assessing the possible relative contributions of mixed mineral and biological versus only biological INP sample populations.

## 1 Introduction

Aerosols are key players in the atmospheric radiation budget, cloud microphysics, and precipitation development. Aerosol-induced ice microphysical modifications influence cloud lifetime and albedo (Albrecht, 1989; Twomey, 1977; Storelvmo et al., 2011), as well as the production of precipitation (DeMott et al., 2010). Mixed-phase clouds (MPCs) are ubiquitous in the troposphere over the entire annual cycle yet are difficult to quantify globally in part due to an inadequate understanding of aerosol-cloud interactions in mixed-phase environments (Korolev et al., 2017). Thus, a close evaluation of aerosol-cloud processes is crucial to evaluating weather and climate processes. However, one of the most significant challenges with regard to aerosols is quantifying their impacts on cloud ice formation through serving as ice nucleating particles (INPs) (Boucher et al., 2013). Constraining aerosol-cloud impacts in models, specifically when parameterizing INPs in MPC systems, remains a significant challenge due to limited observations

40 (Cziczo et al., 2017; Coluzza et al., 2017; DeMott et al., 2010; Kanji et al., 2017; Korolev et al., 2017). Observations directly in-  
41 cloud are even more scarce—given the logistical costs and resources required by airborne platforms, caveats associated with  
42 aircraft probes and instrumentation, and instrumental artefacts caused by flying through clouds at high speeds (Cziczo et al.,  
43 2017)—but are useful for assessing the impacts of INPs on MPC microphysics as compared to most surface measurements which  
44 are geared towards evaluation of INP sources.

45 In the absence of conditions with  $-38\text{ }^{\circ}\text{C}$  and relative humidity with respect to ice above 140%, INPs are required for initiation of  
46 tropospheric cloud ice formation (Kanji et al., 2017). Aerosols such as dust and primary biological aerosol particles (PBAPs) are  
47 some of the most abundant and efficient INPs found in the atmosphere, respectively (Murray et al., 2012; Hoose and Möhler, 2012;  
48 DeMott et al., 1999; Conen et al., 2011; Creamean et al., 2013). PBAPs originating from certain bacteria, pollens, and vegetative  
49 detritus are the most efficient INPs known, capable of initiating freezing near  $-1\text{ }^{\circ}\text{C}$ , while most PBAPs (e.g., fungal spores, algae,  
50 and diatoms) tend to nucleate ice at temperatures similar to those of mineral dust (Despres et al., 2012; Murray et al., 2012; Tobo  
51 et al., 2014; Hader et al., 2014a; O'Sullivan et al., 2014; Hill et al., 2016; Tesson et al., 2016; Alpert et al., 2011; Knopf et al., 2010;  
52 Fröhlich-Nowoisky et al., 2015). In general, previous works collectively indicate that PBAP INPs that nucleate ice at temperatures  
53 greater than approximately  $-10\text{ }^{\circ}\text{C}$  are bacterial (Murray et al., 2012; Hu et al., 2018; Hoose and Möhler, 2012; Despres et al.,  
54 2012; Fröhlich-Nowoisky et al., 2016), but could also be pollen or certain fungal spores (von Blohn et al., 2005; Hoose and Möhler,  
55 2012; O'Sullivan et al., 2016), although the latter two are less likely. Plant bacteria such as *Pseudomonas syringae* are deemed  
56 omnipresent in the atmosphere and precipitation (Despres et al., 2012; Stopelli et al., 2017; Morris et al., 2014), and facilitate cloud  
57 ice formation up to  $-1\text{ }^{\circ}\text{C}$  (Despres et al., 2012). Only a few laboratory-based studies have reported known inorganic or mineral  
58 materials with ice nucleation activity at such temperatures (Ganguly et al., 2018; Atkinson et al., 2013). Mineral and soil dust  
59 serving as atmospheric shuttles for organic microbial fragments can be transported thousands of kilometres and serve as effective  
60 INPs, even from highly arid regions such as the Sahara (Kellogg and Griffin, 2006). The origin of the ice nucleation germ forming  
61 at the warmest temperatures is thought to be due to the ice binding proteins or macromolecules of the biological components in  
62 mixed mineral-biological INPs (O'Sullivan et al., 2014; O'Sullivan et al., 2016; Conen and Yakutin, 2018). In general, the previous  
63 studies on the climate relevance of PBAPs demonstrate the importance of such INPs at MPC temperatures and precipitation  
64 enhancement (Morris et al., 2004; Bergeron, 1935; Christner et al., 2008; Morris et al., 2014; Morris et al., 2017; Stopelli et al.,  
65 2014; Fröhlich-Nowoisky et al., 2016).

66 Although biological constituents, from cellular material to intact bacteria and spores, are thought to be omnipresent in the  
67 atmosphere (Burrows et al., 2009b; Burrows et al., 2009a; Jaenicke, 2005; Jaenicke et al., 2007), modeling studies constraining  
68 global emission estimates of biological INPs and PBAPs are very limited, subject to significant hurdles, and often yield conflicting  
69 results due to not having a sufficient set of observations and complexity of atmospheric PBAPs (Hummel et al., 2015; Burrows et  
70 al., 2013; Twohy et al., 2016; Fröhlich-Nowoisky et al., 2012; Despres et al., 2012; Hoose and Möhler, 2012; Morris et al., 2011).  
71 Yet, biological aerosols such as bacteria have been shown to cause significant perturbations in cloud ice in numerical weather  
72 prediction models, affording modulations in cloud radiative forcing and precipitation formation (Sahyoun et al., 2017). In addition,  
73 measuring and quantifying PBAPs is non-trivial—methodologies for counting, culturing, and nucleic acid sequencing of PBAPs  
74 and especially for those which fall in the warm temperature INP regime (i.e., INPs that nucleate ice  $> -15\text{ }^{\circ}\text{C}$ ) are: (1) time and  
75 labor intensive, (2) require specific expertise or at times substantial resources, (3) require substantial sample volumes, or (4) are  
76 species- or genera-specific or limited to viable microorganisms (Despres et al., 2012). Although such techniques are required to  
77 adequately assess the atmospheric microbiome and PBAP sources, a simpler approach could be applied to evaluate and even  
78 quantify warm temperature biological INP populations as compared to colder temperature PBAPs or mineral dust.

79 The objectives of the study presented here are: (1) to conduct an comparison of INP measurements of aerosol, cloud rime, and  
80 snow directly in-cloud and (2) evaluate different types of INP spectra in a manner such that we can estimate the relative contribution  
81 from biological INPs in the warm temperature regime relevant to MPCs. A secondary goal is to assess the variability in INP spectra  
82 and possible sources from different dominant air mass transport directions observed during sample collection under the current  
83 study. Sampling was conducted at the High Altitude Research Station Jungfraujoch (JFJ), a unique location for evaluating  
84 populations of INPs that affect winter storms in the European Alps, and where MPCs are particularly common (Lohmann et al.,  
85 2016). Recent studies at JFJ have provided valuable insight into INP concentrations, sources, and removal processes under a variety  
86 of conditions and during various times of the year. Conen et al. (2015) measured INPs at  $-8^{\circ}\text{C}$  over the course of a year at JFJ,  
87 and found a strong seasonality in such INPs, with two order of magnitude higher concentrations observed during the summer. They  
88 also suggested INPs measured at this temperature may be limited most of the year by microphysical processing during transit.  
89 Stopelli et al. (2015) verified this removal mechanistic process through INP measurements and isotopic composition of fresh fallen  
90 snow at JFJ, concluding that warm temperature INPs are rapidly depleted by precipitating clouds at lower elevations. Stopelli et  
91 al. (2016) expanded their INP analyses to 2-years of data at JFJ, concluding that a high abundance of INPs at  $-8^{\circ}\text{C}$  is to be expected  
92 whenever high wind speed coincides with air masses having experienced little or no precipitation prior to sampling, yet a separate  
93 study by Stopelli et al. (2017) found that only a small fraction of the INPs were cultivable cells of *Pseudomonas syringe*. In contrast,  
94 Lacher et al. (2018a; 2018b) conducted an interannual synopsis of INP measurements at JFJ and found anthropogenic influence  
95 on INP concentrations but only during boundary layer intrusion (BLI) and at relatively cold temperatures (i.e., approximately  $-30$   
96  $^{\circ}\text{C}$ ), and higher INP concentrations during Saharan dust events (SDEs) and marine boundary layer air arriving at JFJ. Eriksen  
97 Hammer et al. (2018) characterized ice particle residuals and concluded that silica and aluminosilicates were the most important  
98 ice particle residuals at JFJ during the mixed-phase cloud events during Jan – Feb 2017, while carbon-rich particles of possible  
99 biological origin were a minor contribution.

100 Here, we demonstrate how variable sources influence INP populations depending on air mass transport and direction, and spectral  
101 modality between the rime, snow, and aerosols can help explain the exchange of INPs from air into cloud then into precipitation.  
102 Our results expand upon previous studies by evaluating INPs via a combination of aerosol, rime, and snow, and at a temperature  
103 range that comprises common biological and mineral INPs.

## 104 **2 Methods**

### 105 **2.1 Aerosol, cloud rime and snow collection at Jungfraujoch**

106 Collocated collection of snow, cloud rime, and aerosol samples for the Ice Nucleation Characterization in the Alps of Switzerland  
107 (INCAS) study took place 15 Feb – 11 Mar 2018 in the Sphinx observatory at JFJ ( $46.55^{\circ}\text{N}$ ,  $7.98^{\circ}\text{E}$ ; 3580 m above sea level (m  
108 a.s.l.); <https://www.hfsjg.ch/en/home/>). Snow was collected as described by Stopelli et al. (2015) using a Teflon-coated tin (0.1  
109  $\text{m}^2$ , 8 cm deep) for a duration of 1 – 18 hours, but typically for 1 – 4 hours. Collection quantities and time of collection were  
110 dependent upon snowfall rates but additionally on winds blowing snow out of the collection pans. Because of this possibility, we  
111 cannot determine actual snowfall rates with certainty. Cloud rime was collected using a slotted plexiglass plate placed vertically  
112 during snow sample collection (Lacher et al., 2017; Mignani et al., 2018). Sample collection times were at times longer than the  
113 duration of in-cloud conditions (see section 2.3) and were dependent on when manually changing the sampling tin and plate was  
114 possible. Daily size-resolved aerosol samples were collected using a Davis Rotating-drum Universal-size-cut Monitoring (DRUM)  
115 single-jet impactor (DA400, DRUMAir, LLC.) (Cahill et al., 1987; Bukowiecki et al., 2009; Creamean et al., 2018a) from a 1-m

116 long inlet constructed of 6.4-mm inner diameter static-dissipative polyurethane tubing (McMaster-Carr®) leading to outside of the  
117 Sphinx and connected to a funnel covered with a loose, perforated plastic bag to prevent rime ice build-up or blowing snow from  
118 clogging the inlet. The DRUM collected aerosol particles at four size ranges (0.15 – 0.34, 0.34 – 1.20, 1.20 – 2.96, and 2.96 – >12  
119  $\mu\text{m}$  in diameter) and sampled at 27.7 L  $\text{min}^{-1}$  (volumetric flow), equalling 39888 total L of air per sample. Such size ranges cover  
120 a wide array of aerosols—particularly those that serve as INPs (DeMott et al., 2010; Fridlind et al., 2012; Mason et al.,  
121 2016)—while the large volume of air collected promotes collection of rarer, warm temperature biological INPs, but may represent  
122 a lower fraction of overall INP concentrations (Mossop and Thorndike, 1966). Samples were deposited onto 20 x 190 mm strips  
123 of petrolatum-coated (100%, Vaseline®) perfluoroalkoxy plastic (PFA, 0.05 mm thick) substrate secured onto the rotating drums  
124 (20 mm thick, 60 mm in diameter) in each of the four stages at the rate of 7 mm per day (5 mm of sample streaked onto the PFA  
125 followed by 2 mm of blank). It is possible local sources of aerosol, such as tobacco smoke or emissions from touristic infrastructure,  
126 were collected by the DRUM (Bukowiecki et al., 2016), but did not likely affect the 2.96 – >12  $\mu\text{m}$  particles which we focus on  
127 herein. Intervals in which snow, rime, and aerosol were sampled did not fully overlap during a day because conditions were  
128 changing often unpredictably between out-of-cloud and in-cloud conditions, the latter with or without precipitation. At the same  
129 time we intended to collect enough material from either component for a robust analysis of warm temperature INPs. Consequently,  
130 the combined data of a day integrate over a larger air mass, including clouds and cloud-free regions. Comparing data from snow,  
131 rime, and aerosol samples still makes sense as long as wind direction and the influence of planetary boundary layer did not change  
132 substantially during a day.

## 133 2.2 Ice nucleation measurements

134 All samples were analysed immediately after collection for INPs using a drop freezing cold plate system described by Creamean  
135 et al. (2018b; 2018a). Briefly, snow and cloud rime samples were melted into covered 50-mL glass beakers for analysis, resulting  
136 in approximately 10 mL of liquid per sample. Samples were manually shaken prior to analysis. Aerosols deposited onto the PFA  
137 were prepared for drop freezing by cutting out each daily sample and placing in a 50-mL glass beaker with 2 mL of molecular  
138 biology reagent grade water (Sigma-Aldrich®). Beakers were covered and shaken at 500 rpm for 2 hours (Bowers et al., 2009). In  
139 between sampling, beakers were cleaned with isopropanol (99.5%), sonicated with double-distilled water for 30 minutes, and then  
140 heated at 150 °C for 30 minutes.

141 Copper discs (76 mm in diameter, 3.2 mm thick) were prepared by sonicating in double-distilled water for 30 minutes, cleaning  
142 with isopropanol, then coated with a thin layer of petrolatum (Tobo, 2016; Bowers et al., 2009). Following sample preparation, a  
143 sterile, single-use syringe was used to draw 0.25 mL of the suspension and 100 drops were pipetted onto the petrolatum-coated  
144 copper disc, creating an array of ~2.5- $\mu\text{L}$  aliquots. Drops were visually inspected for size; however, it is possible not all drops were  
145 the same exact volume, which could lead to a small level of uncertainty (Hader et al., 2014b; Bigg, 1953; Langham and Mason,  
146 1958; Creamean et al., 2018b). The copper disc was then placed on a thermoelectric cold plate (Aldrich®) and covered with a  
147 transparent plastic dome. Small holes in the side of the dome and copper disc permitted placement of up to four temperature probes  
148 using an Omega™ thermometer/data logger (RDXL4SD; 0.1 °C resolution and accuracy of  $\pm (0.4\% + 1\text{ }^\circ\text{C})$  for the K sensor types  
149 used). During the test, the cold plate was cooled at 1 – 10 °C  $\text{min}^{-1}$  from room temperature until around –35 °C. Control experiments  
150 at various cooling rates within this range show very little discernible dependency of drop freezing on cooling rate (Creamean et  
151 al., 2018b), akin to previous works (Wright and Petters, 2013; Vali and Stansbury, 1966).

152 A +0.33 °C correction factor was added to any temperature herein and an uncertainty of 0.15 °C was added to the probe accuracy  
153 uncertainty based on DFCP characterization testing presented in Creamean et al. (2018b), to account for the temperature difference

154 between the measurement (i.e., in the plate centre) and actual drop temperature. Frozen drops were detected visually but recorded  
 155 through custom software. The software records the time, probe temperature, and cooling rate for every second of the test. When a  
 156 drop is identified as frozen, a button is clicked on the software graphical user interface so that it records that exact time, probe  
 157 temperature, and cooling rate of that drop in a separate file. The test continued until all 100 drops were frozen. Each sample was  
 158 tested three times with 100 new drops for each test. The fraction frozen was calculated from all detected drops frozen combined  
 159 from the three tests (typically, > 90% of the drops were detected). The results from the triplicate tests were then binned every 0.5  
 160 °C to produce one spectrum per sample. Cumulative INP concentrations were calculated using the equation from Vali (1971):

$$161 \quad K(T) = -\frac{1}{V_{drop}} \times \ln[1 - f(T)]$$

162 Where  $V_{drop}$  is the volume of each drop and  $f(T)$  is the fraction of drops frozen at temperature  $T$ . Aerosol cumulative INP  
 163 concentrations were corrected for the total volume of air per sample ( $K(T) \times \frac{V_{suspension}}{V_{air}}$ ) while melted rime/snow residual  
 164 cumulative INPs were adjusted to the total used during analysis ( $K(T) \times V_{suspension}$ ), where  $V_{suspension}$  and  $V_{air}$  represent the total  
 165 liquid volume analyzed per sample (0.75 mL for the three tests) and total volume of air drawn per sample (39888 L), respectively.

166 Differential INP spectra—which as the name indicates, correspond to the differential of the cumulative spectra (Vali et al., 2015)—  
 167 were used early in earlier studies (Vali, 1971; Vali and Stansbury, 1966). Spectra from these previous studies only reached a  
 168 minimum of  $-20$  °C due to the limitations of background artifacts in the water used at that time. Recent work by Vali (2018) and  
 169 Polen et al. (2018) revisits the use of differential spectra, expanding to lower temperatures. We employ the calculation for  
 170 differential INP concentrations from Vali (2018):

$$171 \quad k(T) = -\frac{1}{V_{drop} \times \Delta T} \times \ln\left(1 - \frac{\Delta N}{N(T)}\right)$$

172 where  $N$  is the number of unfrozen drops and  $\Delta N$  is the number of freezing events observed between  $T$  and  $(T - \Delta T)$ . Differential  
 173 concentrations were divided by the maximum concentration per sample (i.e., to normalize) then smoothed using a moving average.

### 174 **2.3 Supporting meteorological and source analysis data**

175 Auxiliary surface meteorological observations, including but not limited to hourly mean air temperature measured 2 m above  
 176 ground level (a.g.l.) (°C), relative humidity measured 2 m a.g.l. (%), scalar wind speed ( $\text{m s}^{-1}$ ) and direction (degrees), and incoming  
 177 longwave radiation ( $\text{W m}^{-2}$ ) were acquired from MeteoSwiss (<https://gate.meteoswiss.ch/idaweb/>). From the longwave  
 178 measurements, in-cloud conditions were determined by calculating the sky temperature and comparing to air temperature measured  
 179 at the station, per the methodology of Herrmann et al. (2015) from a 6-year analysis of JFJ observations. There were no in situ  
 180 measurements of cloud presence or extent. For the current work, each hourly measurement was categorized as out-of-cloud or in-  
 181 cloud based on such calculations and averaged to obtain daily cloud coverage percentage.

182 Radon ( $^{222}\text{Rn}$ ) concentrations have been continuously measured at JFJ since 2009. Details on the detectors themselves and the  
 183 measurements can be found in Griffiths et al. (2014). Briefly, 30-minute radon concentrations were measured using a dual-flow-  
 184 loop two-filter radon detector as described by Chambers et al. (2016). Calibrated radon concentrations were converted from activity  
 185 concentration at ambient conditions to a quantity which is conserved during an air parcel's ascent: activity concentration at standard

186 temperature and pressure (0 °C, 1013 hPa), written as  $\text{Bq m}^{-3}$  STP (Griffiths et al., 2014). Time periods with BLI were classified  
187 as radon concentrations  $> 2 \text{ Bq m}^{-3}$  (Griffiths et al., 2014). Particle concentrations from approximately 0.3 to  $> 20 \mu\text{m}$  in diameter  
188 were measured with a 15-channel optical particle sizer (OPS 3300; TSI, Inc.) at a 1-minute time resolution (Bukowiecki et al.,  
189 2016). Due to operational complications, OPS data were not collected prior to 23 Feb during INCAS. Air was drawn through a  
190 heated total aerosol inlet (25 °C) which, besides aerosol particles, enables hydrometeors with diameters  $< 40 \mu\text{m}$  to enter and to  
191 evaporate, at wind speeds of  $20 \text{ m s}^{-1}$  (Weingartner et al., 1999). SDEs were determined from existing methodology using various  
192 aerosol optical properties, but specifically, the Ångström exponent of the single scattering albedo ( $\tilde{a}_{\text{SSA}}$ ), which decreases with  
193 wavelength during SDEs (Collaud Coen et al., 2004; Bukowiecki et al., 2016). SDEs are automatically detected by the occurrence  
194 of negative  $\tilde{a}_{\text{SSA}}$  that last more than four hours. Based on previous work, most of the SDEs do not lead to a detectable increase of  
195 the 48-h total suspended particulate matter concentrations at JFJ (Collaud Coen et al., 2004). Additionally, we consider these events  
196 probable SDEs, but may have influences from other sources in addition.

197 Air mass transport analyses were conducted using the HYbrid Single Particle Lagrangian Integrated Trajectory model with the  
198 SplitR package for RStudio (<https://github.com/rich-iannone/SplitR>) (Draxler, 1999; Draxler and Rolph, 2011; Stein et al., 2015).  
199 Reanalysis data from the National Centers for Environmental Prediction (NCEP) National Center for Atmospheric Research  
200 (NCAR) (2.5° latitude-longitude; 6-hourly; [https://www.ready.noaa.gov/gbl\\_reanalysis.php](https://www.ready.noaa.gov/gbl_reanalysis.php)) were used as the meteorological fields  
201 in HYSPLIT simulations. Air mass transport directionality and frontal passages were verified by NCEP/NCAR reanalyses of wind  
202 vectors and geopotential height at 600 mb (i.e., approximate pressure at the altitude of JFJ;  
203 <https://www.esrl.noaa.gov/psd/data/composites/day/>). Trajectories were initiated at 10, 500, and 1000 m a.g.l. every 3 hours daily,  
204 but only the 500-m trajectories are shown. Trajectories were only simulated for each northwesterly, southeasterly, SDE, and BLI  
205 case study day (i.e., Table 1). It is important to note that “northwesterly” is a contribution of north, west, and northwest winds,  
206 while “southeasterly” includes south, east, and southeast winds. SDE and BLI days were predominantly (not entirely) southeasterly.

## 207 **3 Results and discussion**

### 208 **3.1 Directional dichotomy of air masses arriving at JFJ during INCAS**

209 Local surface meteorology was variable at JFJ during INCAS, with air temperatures ranging from  $-27.5$  to  $-4.8$  °C (average of  $-$   
210  $13.7$  °C)—temperatures relevant to heterogeneous nucleation of cloud ice—and relative humidity ranging from 18 to 100% (Figure  
211 1a). All days contained some fraction of in-cloud conditions that varied between 12% and 100%, on average. Due to the topography  
212 surrounding JFJ, predominant wind directions were northwest followed by southeast, with the fastest winds recorded originating  
213 from the southeast (Figure 2). Such conditions are typical for JFJ during the winter (Stopelli et al., 2015; Collaud Coen et al.,  
214 2011). Out of the entire study, several days were classified as northwesterly (5 days) or southeasterly (2 days) conditions when a  
215 combination of aerosol, cloud rime, and snow samples were collected (i.e., a full 24 hours of northwesterly or a full 24 hours of  
216 southeasterly winds during snowfall; Table 1), which are herein focused on as the case study days (indicated by the blue and red  
217 in Figure 1b, respectively). These days were also deemed days with “storm” conditions since clouds and snow were both present  
218 at JFJ. There were 4 days that maintained predominantly southerly wind directions as indicated in green in Figure 1b and Table 1  
219 and were characterized as days influenced by SDEs or BLI as discussed herein. Rime and snow were only collected on one of these  
220 days, while remaining SDE or BLI cases had only aerosol collected. Aside from 22 Feb (missing data), the remaining days in the  
221 study were characterized as FT and did not exhibit influences from warm temperature INPs (see section 3.2 and 3.3).

222 Most southeasterly case days (and 06 Mar) apart from the SDE days experienced longer residence times in what was likely the  
223 boundary layer (i.e., 1000 m or less) compared to northwesterly cases, which is supported by radon data (Figure 1c). Griffiths et  
224 al. (2014) determined that radon concentrations  $> 2 \text{ Bq m}^{-3}$  signify BLI, which in the current work was clearly observed on 23 Feb,  
225 27 Feb, 28 Feb, 06 Mar, and 11 Mar case days, indicating samples collected on these days were likely influenced by continental  
226 boundary layer sources. Relatively low radon concentrations were observed the remaining case study days, indicating these samples  
227 were predominantly affected by free tropospheric (FT) air and thus, lower aerosol concentrations and/or more distant, including  
228 marine, sources. Although OPS data were missing until 23 Feb, source information can be gleaned from the available data. For  
229 example, 23 Feb had episodic high concentrations of particles (maximum of  $9.6 \text{ cm}^{-3}$ ) towards the beginning of the day coincident  
230 with the largest spike in radon, with a steady decrease as time transpired, indicating the boundary layer was an ample source of  $>$   
231  $0.3 \mu\text{m}$  particles. A similar episode with the OPS and radon concentrations was observed 27 – 28 Feb, where the highest  
232 concentrations of each were observed during the entire study period. Selected days were subject to diurnal winds (not shown), such  
233 as 06 Mar, where boundary layer air reached JFJ and a midday maximum in OPS particle concentrations was observed, indicating  
234 lower elevations were the dominant source of aerosol. Although, diurnal variations in aerosol from local sources have been shown  
235 to not be common in the winter at JFJ (Baltensperger et al., 1997). In contrast, 11 Mar was exposed to boundary layer air based on  
236 radon observations, but particle concentrations were low (average of  $0.2 \text{ cm}^{-3}$  compared to a study average of  $3.0 \text{ cm}^{-3}$ ), signifying  
237 that although BLI occurred at JFJ, it was not a substantial source of aerosol. These relationships corroborate the ice nucleation  
238 observations, as discussed in detail below.

239 Extending past local conditions, air mass transport 10 days back in time prior to reaching JFJ on case study days was, as expected,  
240 dissimilar between northwesterly (Figure 3) and southeasterly/SDE/BLI (Figure 4) conditions. The main distinctions between  
241 northwesterly and southeasterly/SDE/BLI days are: (1) northwesterly days originated from farther west, with some days reaching  
242 back to North America, while air masses on southeasterly/SDE/BLI days predominantly hovered over land and oceanic sources  
243 closer to Europe, (2) southeasterly/SDE/BLI air masses travelled closer to the surface relative to northwesterly days, while  
244 northwesterly air masses were typically transported from higher altitudes (i.e., more FT exposure), and (3) aside from 6 Mar (which  
245 is discussed in more detail in the following section), northwesterly air masses did not travel over the Mediterranean and northern  
246 Africa, whereas the southeasterly/SDE/BLI air masses above JFJ arrived from over such regions within less than 2 days before  
247 arriving to JFJ. One obvious inconsistency is that the air mass trajectories on 24 Feb do not indicate transport occurred from  
248 Northern Africa even though this day was characterized as an SDE. Collaud Coen et al. (2004) reported that in 71% of all cases  
249 they evaluated at JFJ, 10-day back-trajectories were able to reveal the source of Saharan dust and that back trajectories cannot  
250 always explain SDEs. Boose et al. (2016) reported similar transport pathways for JFJ during multiple consecutive winters and  
251 concluded that marine and Saharan dust served as dominant sources of INPs at  $-33 \text{ }^\circ\text{C}$ . Reche et al. (2018) also reported similar  
252 pathways and sources for bacteria and viruses, but during the summer in southern Spain. These disparate sources and transport  
253 pathways of air support the variability in the ice nucleation observations as discussed in more detail in the following section.

### 254 **3.2 Variability in INP spectra based on air mass source**

255 Out of the 25 aerosol, 30 rime, and 39 snow samples collected, 7 aerosol, 19 rime, and 23 snow were collected northwesterly or  
256 southeasterly storm case study days, while 4 aerosol, 1 rime, and 2 snow were collected on SDE or BLI days (Table 1). Most mixed  
257 wind direction days were excluded, as sources from both directions would contribute to the daily aerosol sample. Figure 5 shows  
258 the cumulative ( $K(T)$ ) and differential ( $k(T)$ ) INP concentrations from aerosol, snow, and rime samples on the case days. The use  
259 of  $k(T)$  demonstrates the presence of 1 – 2 INP populations by having a mode in the warm regime (i.e., warm mode or likely  
260 biological) and enables us to intercompare between the different types of samples from different air mass sources at JFJ.

261 In addition to containing higher concentrations of warm temperature INPs, most southeasterly and SDE/BLI samples contained a  
262 clear mode in the warm temperature regime compared to northwesterly samples which typically did not contain such a mode in  
263 the  $k(T)$  spectra. This warm mode, or “bump” at temperatures above approximately  $-15\text{ }^{\circ}\text{C}$  has been observed in a wide range of  
264 previous immersion mode ice nucleation studies including but not limited to some of the earliest studies of total aerosol (Vali,  
265 1971), residuals found in hail (Vali and Stansbury, 1966), sea spray aerosol (McCluskey et al., 2017; DeMott et al., 2016), soil  
266 samples (Hill et al., 2016), agricultural harvesting emissions (Suski et al., 2018), and in recent reviews of aerosol (Kanji et al.,  
267 2017; DeMott et al., 2018) and precipitation (Petters and Wright, 2015) samples. Most previous studies that show spectra with the  
268 warm mode typically: (1) report a wide range of freezing temperatures such that it can be observed relative to the steady increase  
269 of INPs at colder temperatures or (2) are of samples that include a mixture of biological and mineral or other less efficient INP  
270 sources. For example, several previous studies report INP concentrations down to only  $-15\text{ }^{\circ}\text{C}$  (e.g., Conen and Yakutin, 2018;  
271 Hara et al., 2016; Kieft, 1988; Schnell and Vali, 1976; Vali et al., 1976; Wex et al., 2015), namely because the goal was to target  
272 efficient, warm-temperature biological INPs. However, the warm mode may not be evident in such studies, given it cannot be  
273 visualised next to the drastic increase in INPs with temperatures below  $-15\text{ }^{\circ}\text{C}$ . In contrast, studies conducting INP measurements  
274 on known mineral dust samples also are not able to observe the warm mode (e.g., Price et al., 2018; Atkinson et al., 2013; Murray  
275 et al., 2012). Recently, Beydoun et al. (2017) demonstrate that mixtures of biological and mineral particles can be resolved through  
276 careful analysis based on their controlled experimentation using known Snowmax and illite mineral mixtures. Together, it is  
277 apparent that a mixed biological and mineral (or less efficient biological INPs) sample is needed to assess the modal behaviour in  
278 the INP spectra. However, we note the tentative nature of characterizing these modes based on the previous body of literature and  
279 that more controlled, quantitative experiments of mixed biological-mineral INPs is needed in the future.

280 Only the largest size range of the aerosol is shown because the remaining size ranges (i.e.,  $< 2.96\text{ }\mu\text{m}$ ) were not distinct with respect  
281 to wind direction. The fact that size, alone, exhibited directionally-dependent results and that such dependencies were only  
282 observed in the coarse mode aerosol indicate: (1) the sources were indeed different between northwesterly, southeasterly, and  
283 SDE/BLI transport—supporting the air mass source analyses—and (2) the coarse mode aerosols were likely from a regional source  
284 as opposed to long-range transported thousands of kilometres. This is because gravitational settling typically renders transport of  
285 coarse particles inefficient especially within the boundary layer (Creamean et al., 2018a; Jaenicke, 1980). Previous work by Collaud  
286 Coen et al. (2018) concludes that the local boundary layer infrequently influences JFJ in the winter, supporting the current work  
287 (i.e., more FT days (17 of 25 days); Table 1).

288 Generally, INPs from southeasterly and SDE/BLI days were higher in concentration and more efficient (i.e., were warm  
289 temperature INPs that facilitated ice formation  $> -15\text{ }^{\circ}\text{C}$ ) than northwesterly samples. Our results are parallel to those by Stopelli  
290 et al. (2016), who also observed higher  $K(T)$  in snow samples collected during southerly conditions at JFJ from Dec 2012 to Oct  
291 2014 (Figure 6a). However,  $K(T)$  reported here were generally higher than those reported by Stopelli et al. (2016), especially for  
292 the northwesterly samples. Unlike Stopelli et al. (2016), there was no clear correlation between  $K(T)$  with air temperature and wind  
293 speed in the current work (not shown).

294 Onset freezing temperatures (i.e., the highest temperature in which the first drop in each sample froze) were typically higher for  
295 southeast/SDE/BLI samples as compared to the northwest (Figure 6b), indicating influences from sources that produce warm  
296 temperature INPs on these days. The temperatures in which 10% ( $T_{10}$ ) and 50% ( $T_{50}$ ) of the samples froze were also typically  
297 higher for the southeast/SDE/BLI as compared to the northwest samples, especially for the aerosol samples, indicating higher  
298 concentrations of more efficient warm temperature INPs.



299 Regarding the snow, it is possible that surface processes generate airborne ice particles, which contribute to a snow sample collected  
300 at a mountain station (Beck et al., 2018). However, snow that is re-suspended during a snowfall event largely consists of the most  
301 recently fallen snow crystals covering wind-exposed surfaces. These particles are unlikely to be different from concurrently falling  
302 snow. Hence, their contribution will not change INP abundance or spectral properties of the collected sample. Another matter are  
303 hoar frost crystals, which can be very abundant in terms of number, but because of their small size (i.e.,  $< 100 \mu\text{m}$  (Lloyd et al.,  
304 2015)) can only make a minor contribution to the mass of solid precipitation depositing in a tin placed horizontally on a mountain  
305 crest. The majority of small crystals will follow the streamlines of air passing over the crest. All that an increased influence of hoar  
306 frost particles would do to our observations is to decrease measured differences between snow and rime samples, because additions  
307 of hoar frost, a form of rime, would render the collected snow sample a bit more similar to rime.

### 308 **3.3 Potential components of INP populations at JFJ**

309 Taking the spectral characteristics in the context of air mass direction and transport can help elucidate the possible sources of INPs  
310 at JFJ during INCAS. Quantitative evaluation of the warm mode, or likely, the relative contribution of warm temperature biological  
311 INPs, are calculated and shown in Figure 6e – g. Additionally, normalizing such spectra affords a qualitative comparison of spectra  
312 signatures between aerosols and residuals found in cloud rime and snow. We offer some possible explanations for the observed  
313 variability between the samples. Naturally, the boundary layer more frequently than not contains higher concentrations of warm  
314 temperature INPs—and INPs in general—as compared to the free troposphere given the proximity to the sources (e.g., forests,  
315 agriculture, vegetation, and the oceans) (Burrows et al., 2013; Despres et al., 2012; Frohlich-Nowoisky et al., 2016; Wilson et al.,  
316 2015; Burrows et al., 2009a; Burrows et al., 2009b; Frohlich-Nowoisky et al., 2012; Suski et al., 2018). Although, microorganisms  
317 and nanoscale biological fragments are episodically lofted into the free troposphere with mineral dust and transported thousands  
318 of kilometres (Creamean et al., 2013; Kellogg and Griffin, 2006).

319 Air arriving at JFJ on 15 and 16 Feb originated from the farthest away and were not heavily exposed to boundary layer air, as  
320 evidenced by the air mass trajectory analysis (Figure 3) and radon (Figure 1c), indicating long-range transport in the free  
321 troposphere. This could explain why the warm mode (and higher  $T_{10}$  and  $T_{50}$ ) was observed for the rime and snow, but not the  
322 aerosol—the aerosol had sufficient time to nucleate ice during free tropospheric transport and especially the warm temperature  
323 INPs that would likely become depleted in-cloud first (Stopelli et al., 2015), assuming the clouds formed along the air mass  
324 transport pathways. Cloud fraction was relatively low (12.5 to 25%), but air temperatures were relatively high ( $-8.4$  to  $-7.1$  °C),  
325 suggesting conditions were amenable for long-range transported warm temperature INPs to nucleate cloud ice. However, from the  
326 available data, we cannot determine with certainty if the local conditions were the same as those when nucleation initially occurred.  
327 For 19 and 20 Feb, air temperature was cold ( $-16.4$  and  $-19.6$  °C, respectively) cloud fraction was high (92 and 54%, respectively),  
328 and not all samples contained a warm mode. One possible explanation is that any warm temperature INPs that were present in the  
329 clouds had already snowed out prior to reaching the sampling location, as observed by Stopelli et al. (2015) at JFJ. Although, given  
330 the low radon concentrations and erratic transport pathways, it is possible such air masses did not contain a relatively large  
331 concentrations of warm temperature INPs due to deficient exchange with the boundary layer. It was not until the southeasterly  
332 cases that the aerosol samples exhibited a warm mode. Specifically, on 23 Feb local winds shifted to southeasterly (147 degrees  
333 on average) and air masses arrived from over the eastern Alps, Eastern Europe, Scandinavia, and earlier on in time, the Atlantic  
334 Ocean. Thus, these samples were predominantly influenced by the continental (mostly over remote regions) and marine boundary  
335 layers, where sources of warm temperature INPs are more abundant (Frohlich-Nowoisky et al., 2016).

336 The northwesterly case of 06 Mar is somewhat interesting in that the local wind direction was clearly from the northwest, but air  
337 mass source analyses show brief transport in the boundary layer (radon) from the south, when looking farther back in time, traveling  
338 over the Mediterranean and North Africa. The aerosol sample had a high onset temperature for INPs relative to other northwest  
339 samples (Figure 6b) and snow samples exhibited a warm mode (Figure 6g). It is the only one of the northwesterly case samples  
340 that encountered boundary layer exposure according to the radon observations. Combined, these results suggest a somewhat mixed-  
341 source sample, and that 06 Mar may not be directly parallel to the other northwesterly cases. Transitioning back to a southeasterly  
342 case on 11 Mar, only the rime and snow unveiled a warm mode from air transported from similar regions as the 06 Mar sample.  
343 Additionally, OPS concentrations were very low (Figure 1c). These results suggest the aerosols already nucleated cloud ice prior  
344 to reaching JFJ on 11 Mar (i.e., low ambient aerosol), where the aerosol did not contain a warm mode, but rime and snow did.

345 When evaluating the SDE and BLI days, there is a bit of variability. On 24 Feb, clouds were present at JFJ (a cloud fraction of  
346 37.5%), but riming was insufficient to collect enough quantity for INP analysis and no snowfall occurred. Interestingly, the warm  
347 mode was the second highest for the aerosol sample, indicating a relatively large contribution of warm temperature INPs as  
348 compared to the other samples from the study. Air mass transport was very similar to 23 Feb signifying similar INP sources even  
349 though this day was characterized as an SDE, but it is probable that a slightly warmer ( $-6.0$  as compared to  $-9.8$  °C air temperature),  
350 drier (79 versus 89% relative humidity), and higher pressure (649 versus 645 mb) postfrontal system moved over JFJ on 24 Feb,  
351 inhibiting removal of warm temperature INPs during transport relative to the day prior (corroborated by reanalysis from  
352 NCEP/NCAR of geopotential height at 600 mb). The BLI case of 28 Feb was very similar to 24 Feb in that: (1) only an aerosol  
353 sample was collected and (2) the warm mode was much higher in concentration ( $k(T)$ ) than the remaining samples. As compared  
354 to 27 Feb where a warm mode was not observed, 28 Feb was warmer ( $-20.0$  as compared to  $-26.2$  °C), drier (52 versus 62%),  
355 higher pressure (635 versus 630 mb), and had a warmer onset temperature ( $-6.8$  versus  $-14.8$  °C). Wind direction was slightly  
356 different: southeasterly (153 degrees) on 27 Feb as compared to southwesterly on 28 Feb (221 degrees). However, conditions were  
357 cloudier than the 23 – 24 Feb coupling and completely cloudy on 27 Feb (100 and 66.7% cloud fraction on 27 Feb and 28 Feb,  
358 respectively). Additionally, radon and OPS concentrations were the highest on 27 – 28 Feb as compared to the rest of the days  
359 during INCAS (Figure 1c). Combined, these results suggest a very local, boundary layer source of INPs started on 27 Feb, but  
360 were quickly depleted in the very cloudy conditions. Once clouds started to clear and a shift in frontal characteristics occurred, a  
361 similar source of very efficient warm temperature INPs affected JFJ but were able to be observed in the aerosol.

#### 362 **4 Conclusions and broader implications**

363 Aerosol, cloud rime, and snow samples were collected at the High Altitude Research Station Jungfrauoch during the INCAS field  
364 campaign in Feb and Mar 2018. The objectives of the study were to assess variability in wintertime INP sources found in cloudy  
365 environments and evaluate relationships between INPs found in the different sample materials. To directly compare air to liquid  
366 samples, characteristics of differential fraction frozen and INP spectra were compared in the context of cumulative INP spectra  
367 statistics, air mass transport and exposure to boundary layer or free tropospheric conditions, and local meteorology. Distinction  
368 between northwesterly and southeasterly conditions yielded differing results regarding INP efficiency and concentrations,  
369 biological versus non-biological sources, and meteorological conditions at the sampling location. In general, cumulative INP  
370 concentrations were 3 to 20 times higher for all sample types when sources from the southeast infiltrated JFJ, while the INP spectra  
371 of the aerosol contained a warm mode but the presence of a warm mode was variable for the rime and snow depending on  
372 meteorological context.

373 In general, comprehensive measurements of INPs from aerosol, and rime and snow when possible, affords useful information to  
374 compare and explain exchange between aerosols, clouds, and precipitation in the context of local and regional scale meteorology  
375 and transport conditions. Assessment of different INP spectral types, modality, and spectra statistics adds another dimension for  
376 qualitative and semi-quantitative intercomparison of sampling days and evaluation of associations between aerosol, cloud, and  
377 precipitation sampling. Extending INP analyses past reporting cumulative concentrations affords more detailed information on the  
378 population of INPs and enables comparison between samples from aerosols, clouds, precipitation, and beyond (e.g., seawater, soil,  
379 etc.). Using auxiliary measurements and air mass simulations, in addition to context provided by previous work at JFJ, we have  
380 addressed possible sources for INCAS. However, more detailed source apportionment work should be imminent to  
381 comprehensively characterize INP sources based on spectral features. Future studies should ideally use such statistical analyses in  
382 tandem with focused chemical and biological characterization assessments to provide direct linkages between INP spectral  
383 properties and sources. Such investigations could yield valuable information on INP sources, and aerosol-cloud-precipitation  
384 interactions, which could then be used to improve process-level model parameterizations of such interactions by rendering  
385 quantitative information on INP source, efficiency, and abundance. Improving understanding of aerosol impacts on clouds and  
386 precipitation will ultimately significantly enhance understanding of the earth system with respect to cloud effects on the surface  
387 energy and water budgets to address future concerns of climate change and water availability.

#### 388 **Author contributions**

389 JMC collected the samples, conducted the DFA sample analysis, conducted data analysis, and wrote the manuscript. CM and FC  
390 also contributed to collecting rime and snow samples. JMC, CM, and FC designed the experiments. NB provided quality controlled  
391 OPS data. CM, NB, and FC helped with manuscript feedback and revision prior to submission.

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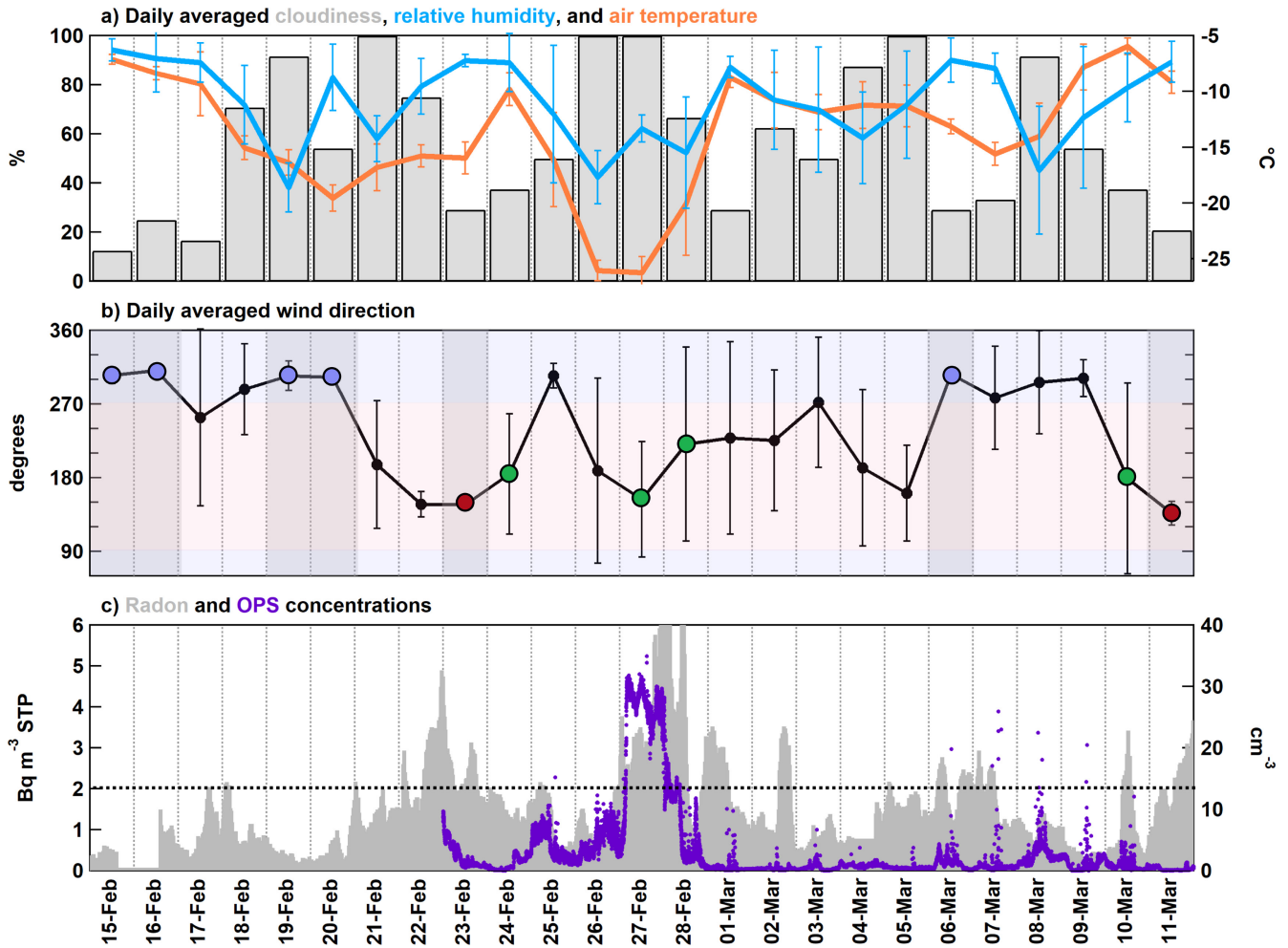
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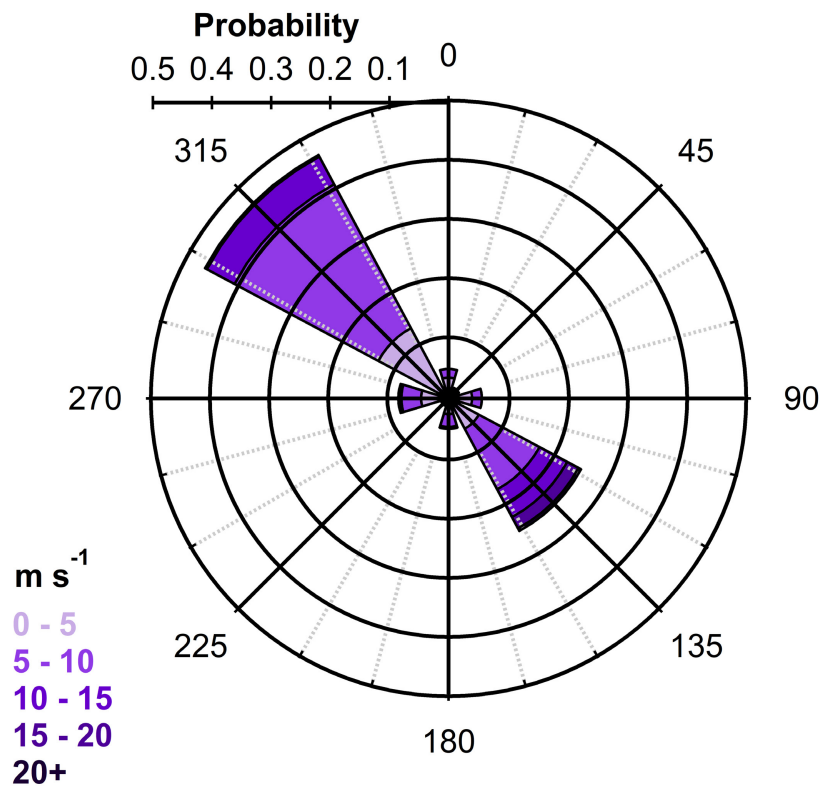
695 **Table 1. Dates and times for cloud rime, snow, and aerosol samples collected during the 2018 winter INCAS study at Jungfraujoch. Also**  
 696 **shown are the dominant air mass sources (free troposphere or FT or boundary layer intrusion of BLI) for each day based on radon data.**  
 697 **Samples highlighted in blue and red are the northwest and southeast case studies, respectively. Samples highlighted in green represent**  
 698 **predominantly southerly days that were classified as Saharan dust events (SDEs) or BLI days.**

Date	Air mass	Cloud rime		Snow			Aerosol				
		Sample	Start (UTC)	Duration (hh:mm)	Sample	Start (UTC)	Duration (hh:mm)	Sample	Start (UTC)	Duration (hh:mm)	Stages
15-Feb	FT	Rime1	06:30	03:07	Snow1	07:15	01:15	DRUM1	10:00	12:00	A/B/C/D
		Rime2	09:37	02:13	Snow2	08:40	01:30	DRUM2	22:00	24:00	A/B/C/D
		Rime3	11:50	03:55	Snow3	10:10	01:35				
		Rime4	15:45	03:35	Snow4	12:45	02:30				
		Rime5	19:20	13:55	Snow5	15:20	04:00				
16-Feb	FT	Rime6	07:15	02:10	Snow6	07:15	02:02	DRUM3	22:00	24:00	A/B/C/D
		Rime7	09:29	02:41	Snow7	09:23	02:37				
					Snow8	14:00	17:50				
17-Feb	FT	Rime8	12:08	01:16	Snow9	07:50	02:23	DRUM4	22:00	24:00	A/B/C/D
		Rime9	13:24	02:23	Snow10	10:16	01:10				
		Rime10	15:47	03:12	Snow11	11:35	00:33				
		Rime11	18:59	06:48	Snow12	12:20	01:04				
					Snow13	13:42	01:00				
					Snow14	14:45	00:55				
					Snow15	15:54	02:54				
			Snow16	18:52	05:50						
18-Feb	FT	Rime12	00:47	08:22	None			DRUM5	22:00	24:00	A/B/C
19-Feb	FT	Rime13	21:00	10:50	Snow17	21:00	08:50	DRUM6	22:00	24:00	A/B/C
20-Feb	FT	Rime14	05:50	04:14	Snow18	05:50	04:14	DRUM7	22:00	24:00	A/B/C
		Rime15	12:08	02:17	Snow19	12:08	02:14				
21-Feb	FT	None		None			DRUM8	22:00	24:00	A/B/C/D	
22-Feb	BLI	None		None			DRUM9	22:00	24:00	A/B/C/D	
23-Feb	BLI	Rime16	20:00	14:30	Snow20	07:49	02:51	DRUM10	22:00	24:00	A/B/C/D
					Snow21	10:55	03:35				
					Snow22	14:40	02:42				
					Snow23	20:00	12:11				
24-Feb	FT, SDE	None		None			DRUM11	22:00	24:00	A/B/C	
25-Feb	FT	None		None			DRUM12	22:00	24:00	A/B	
26-Feb	FT	None		None			DRUM13	22:00	24:00	A/B/C	
27-Feb	BLI	None		None			DRUM14	22:00	24:00	A/B/C	
28-Feb	BLI	None		None			DRUM15	22:00	24:00	A/B/C	
01-Mar	BLI	None		None			DRUM16	22:00	24:00	A/B/C	
02-Mar	FT	None		None			DRUM17	22:00	24:00	A/B/C	
03-Mar	FT	None		None			DRUM18	22:00	24:00	A/B/C	
04-Mar	FT	None		None			DRUM19	22:00	24:00	A/B/C	
05-Mar	FT	Rime17	16:43	15:32	Snow24	21:52	08:16	DRUM20	22:00	24:00	A/B/C
06-Mar	BLI	Rime18	06:15	03:03	Snow25	06:15	02:50	DRUM21	22:00	24:00	A/B/C
		Rime19	09:18	05:42	Snow26	09:14	05:26				
		Rime20	15:00	02:08	Snow27	14:54	01:56				
		Rime21	17:08	04:41	Snow28	17:26	04:04				
		Rime22	22:38	21:40	Snow29	22:38	07:35				
07-Mar	BLI	Rime23	06:19	03:58	Snow30	06:19	01:19	DRUM22	22:00	24:00	A/B/C
		Rime24	10:17	05:40	Snow31	07:50	02:00				
		Rime25	15:57	08:31	Snow32	12:49	02:59				
		Rime26	22:28	06:34	Snow33	16:00	05:19				
					Snow34	22:28	06:27				
08-Mar	FT	None		None			DRUM23	22:00	24:00	A/B/C	
09-Mar	FT	None		None			DRUM24	22:00	24:00	A/B/C	
10-Mar	FT, SDE	Rime27	11:00	21:46	Snow35	06:00	04:00	DRUM25	22:00	24:00	A/B/C
					Snow36	10:10	01:56				
11-Mar	BLI	Rime28	06:46	02:59	Snow37	05:48	04:03	None			
		Rime29	09:56	03:49	Snow38	09:54	03:51				
		Rime30	13:45	04:48	Snow39	13:48	02:28				

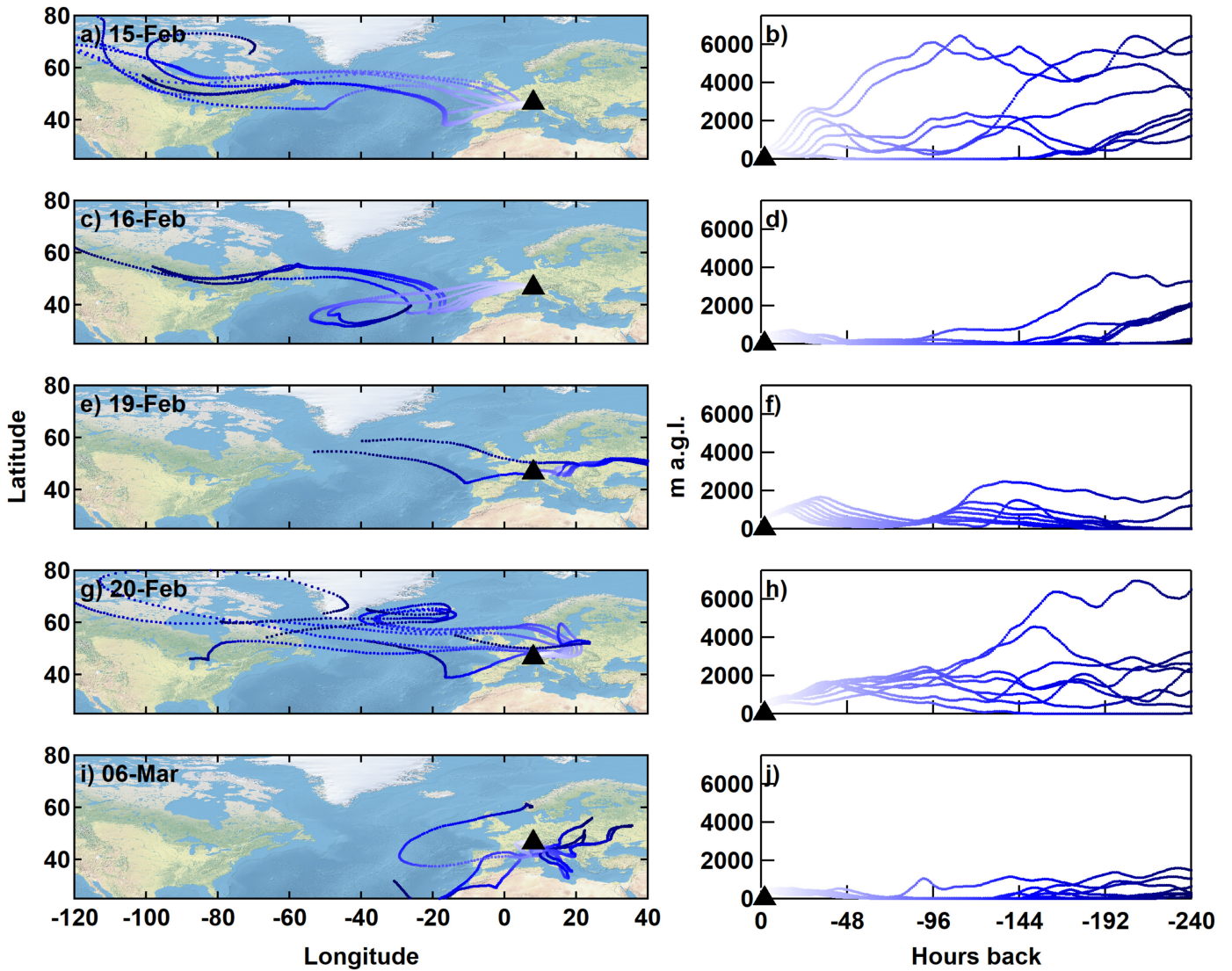
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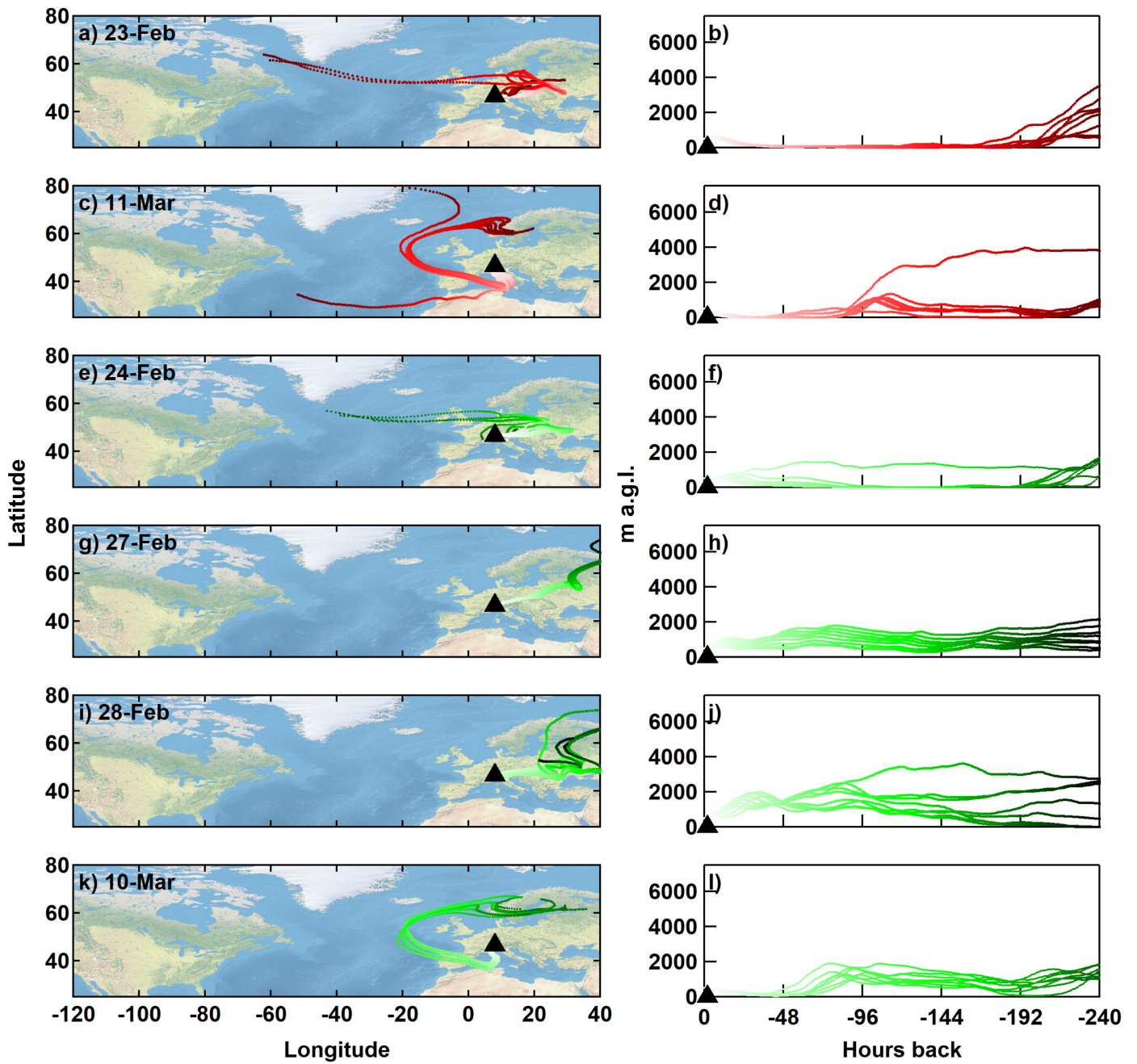
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 702 **Figure 1.** Daily averaged meteorological data at JFJ from INCAS, including a) percentage of cloudiness in the vertical profile over JFJ  
 703 per the estimation by Herrmann et al. (2015), station relative humidity (%), and station air temperature (°C) and b) station wind  
 704 direction. The background of b) is shaded horizontally by north (light blue) or south (light red) directions. Additionally, days with  
 705 combined aerosol, cloud rime, and snow collections are vertically shaded grey. Blue and red markers for wind direction represent case  
 706 study storm days that were entirely northwesterly or southeasterly, respectively. Green markers represent predominantly southerly days  
 707 that were classified as Saharan dust events (SDEs) or heavy boundary layer influence days. c) Time series of radon (<sup>222</sup>Rn) corrected for  
 708 standard temperature and pressure and OPS particle concentrations. The black dashed line indicates a threshold of 2 Bq m<sup>-3</sup> whereby  
 709 boundary layer intrusion likely occurred at JFJ. OPS data were missing prior to 23 Feb. Error bars represent standard deviation.



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711 **Figure 2.** Rose plot for wind data during INCAS. Values correspond to wind direction binned by 45 degrees and wind speeds binned by  
712 **5 m s<sup>-1</sup>. The probability for wind speed to fall within these bins is plotted.**

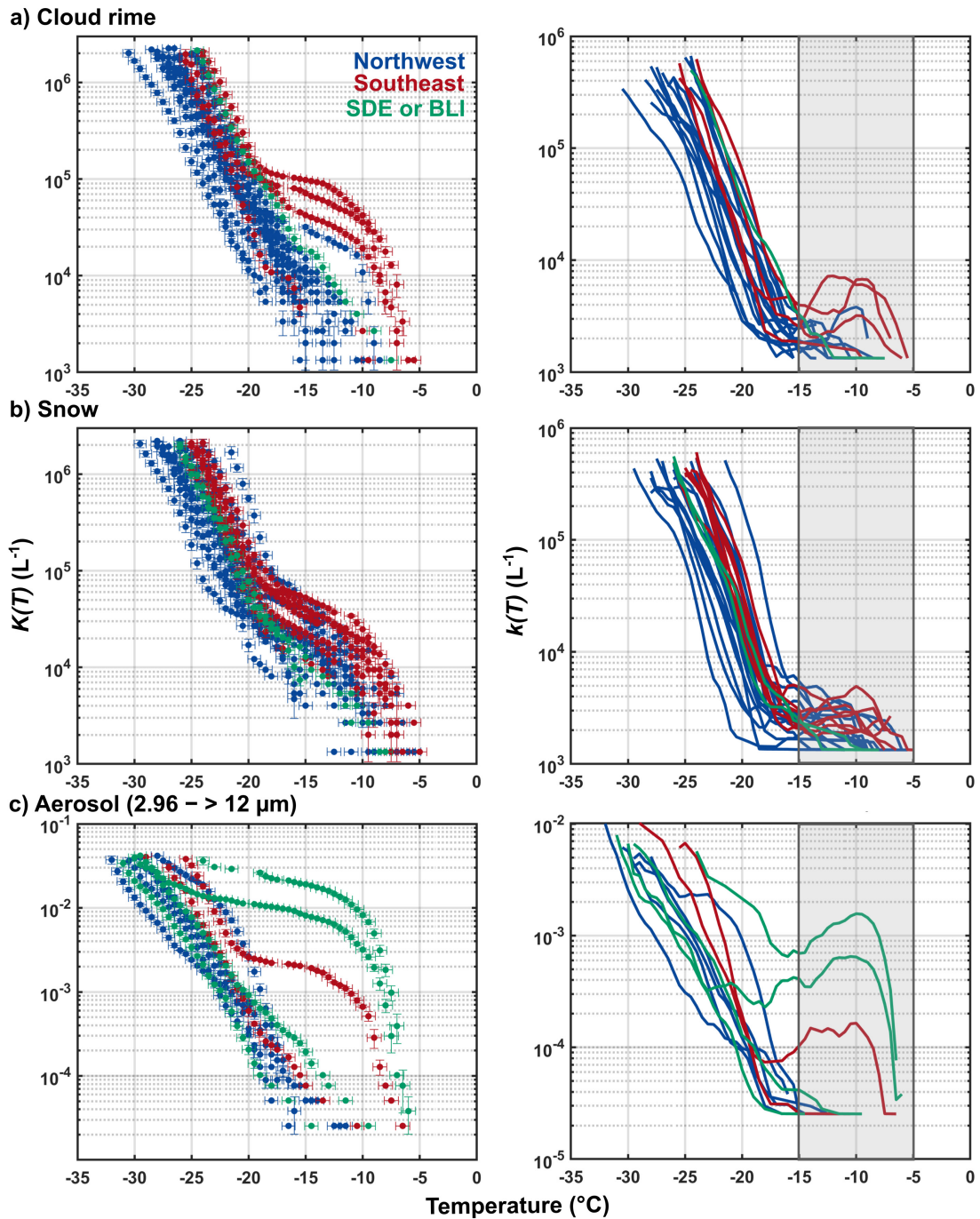


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 714 Figure 3. 10-day air mass backward trajectories initiated every 3 hours during sample collection for northwesterly case days ending at  
 715 500 m above ground level (a.g.l.). Trajectories are plotted by latitude-longitude (left) and altitude-time (right) profiles for 15 Feb (a, b),  
 716 16 Feb (c, d), 19 Feb (e, f), 20 Feb (g, h), and 06 Mar (i, j). Darker shades of blue represent trajectory points farther back in time.



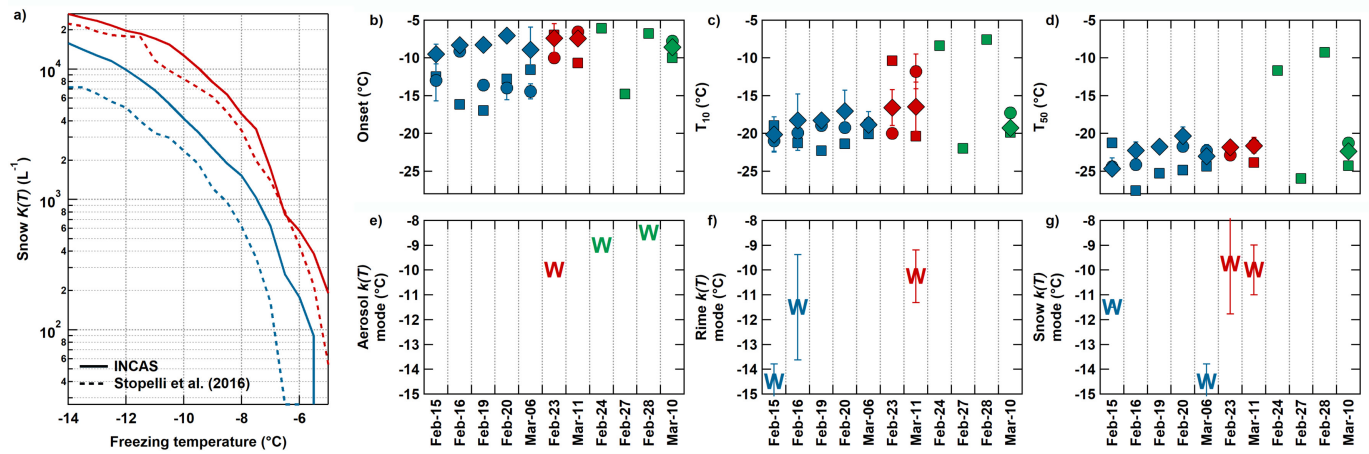
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Figure 4. Same as Figure 3, but for southeasterly (23 Feb and 11 Mar), SDE (24 Feb and 10 Mar), and BLI (27 and 28 Feb) case days.



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Figure 5. Cumulative INP spectra ( $K(T)$ , on left) and differential INP spectra ( $k(T)$ , on right) for the same samples of a) cloud rime, b) snow, and c) aerosol for the size range  $2.96 - > 12 \mu\text{m}$  in diameter. Spectra shown are for samples from the northwest (blue) and southeast (red) case study dates, in addition to SDE and boundary layer intrusion (BLI) case days (green). Multiple cloud rime and snow samples were collected while one aerosol sample from each size range was collected on northwest and southeast case study days (see Table 1). The warm mode region is indicated by the dark grey shading in the  $k(T)$  spectra. Note the axes are not all the same ranges.



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Figure 6. a) Comparison of INCAS cumulative snow INP concentrations for northwest (blue) and southeast (red) within the same range of those reported by Stopelli et al. (2016) for measurements at JFJ during the 2012/13 winter season. Summary of INCAS INP concentrations from aerosol (squares), cloud rime (circles), and snow samples (diamonds), including b) freezing onset temperatures, c) the temperature in which 10% of drops froze, and d) the temperature in which 50% of the drops froze calculated from fraction frozen. From the  $k(T)$  spectra, warm mode temperatures are shown for e) aerosol, f) rime, and g) snow samples. Blue, red, and green markers represent northwesterly cases, southeasterly cases, and SDE and BLI case days, respectively. Some data points overlap and thus plots may appear to not have the same number of points per sample.