



A radar view of ice microphysics and turbulence in Arctic stratiform cloud systems

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Abstract. Ice microphysical processes are inherently complex because of their sensitivity to temperature and humidity, the diversity of ice crystal habits, and their interaction with supercooled liquid water (SCL) and turbulence. Long-term surface-based radar observations have been systematically used to unravel the different processes that affect ice particle growth. In this study, we present a statistical analysis of 6.5 years of Ka-band radar observations, combined with thermodynamic profiles derived from radiosonde measurements. For the first time, ice particle growth and sublimation—diagnosed from vertical gradients of radar reflectivity and mean Doppler velocity—are systematically mapped across a broad range of temperature and moisture conditions. These vertical gradients correspond closely with saturation levels relative to ice and exhibit a strong temperature dependence in supersaturated regions. Notably, distinct signatures near -15°C are indicative of dendritic growth. Turbulence, quantified via the eddy dissipation rate (EDR), is most frequently observed in regions containing SCL. When SCL is located near cloud base, it often appears decoupled from high EDR values, suggesting that latent heat release from SCL alone is insufficient to generate strong turbulence. Instead, the presence of turbulence appears to actively support the formation and maintenance of SCL. The co-occurrence of SCL and elevated turbulence results in significantly enhanced ice particle growth compared to conditions in which either is present alone.

This work provides new observational constraints that are critical for improving the representation of ice microphysics in atmospheric models.

1 Introduction

Ice clouds play a crucial role in Earth's radiation budget (Liou, 1986; Stephens et al., 1990; Lynch et al., 2002), and hydrological cycle since 70% of global precipitation originate from the ice phase (Heymsfield et al., 2020; Khain et al., 2015; Mülmenstädt et al., 2015). Ice particles can take many forms depending on the environment and the impact of complex microphysical processes. Accurately representing these processes in numerical models remains challenging due to the limited understanding of how ice particles evolve under different thermodynamic and dynamic conditions (Khain et al., 2015; Grabowski et al., 2019).

Ice particles develop different habits under varying environmental conditions primarily through the deposition of vapors (Korolev et al., 1999; Bailey and Hallett, 2009; Baker and Lawson, 2006; Kikuchi et al., 2013). Among these, dendritic crystals have attracted particular attention due to their maximum depositional growth rates (Takahashi, 2014; Korolev, 2007) and fragile



25 structure, which make them prone to break-up (Schwarzenböck et al., 2009; Rangno and Hobbs, 1998; Takahashi and Fukuta, 1995; Choularton et al., 1986; Vardiman, 1978). Observational evidence also suggests that secondary ice production frequently occurs at temperatures above -10°C (a Hallett-Mossop ice multiplication regime) and within the dendritic growth zone (DGZ) around -15°C in Arctic and mid-latitude regions (Oue et al., 2018; Luke et al., 2021; Kumjian et al., 2020). Although significant progress has been made through laboratory experiments, aircraft observations, and radar case studies, to our knowledge, a
30 systematic understanding of how environmental conditions shape ice microphysics in natural clouds, particularly from a long-term observational perspective, is limited.

In addition to atmospheric thermodynamic conditions, turbulence has also been recognized as a factor influencing ice nucleation and particle growth, yet observational studies investigating this interaction in natural cloud systems are extremely limited. Terrain-induced flow modifications result in turbulence and vertical updrafts, which significantly shape the ice microphysical
35 processes (Garrett and Yuter, 2014; Houze and Medina, 2005; Ramelli et al., 2021). Recent statistical analysis from 15-months of radar observations has revealed that the increased turbulence, quantified by the eddy dissipation rate (EDR), enhances aggregation and riming in Arctic low-level mixed-phase clouds (Chellini and Kneifel, 2024). While those distinct microphysical and dynamical signatures have been observed, their dataset could still be limited to investigate the generality of those features.

The U.S. Department of Energy (DOE) Atmospheric Radiation Measurement (ARM) North Slope of Alaska (NSA) observatory (Verlinde et al., 2016) provides multi-years ground-based observations for ice clouds including Ka-band ARM Zenith-pointing Radar (KAZR) measurements (Kollias et al., 2020) and radiosonde. The objective of our study is to characterize ice microphysical processes (i.e., depositional growth and sublimation) and in-cloud turbulence, based on long-term KAZR observations under a wide range of environmental conditions derived from radiosonde and examine their relationships. The presented analysis aims to improve our understanding of ice microphysics in Arctic clouds and provide observational constraints
45 for advancing the representation of ice microphysics in models.

2 Methodology

2.1 Data

The observations in this study are collected from the DOE ARM NSA ($71^{\circ}19'22.8''$ N, $156^{\circ}36'54''$ W) atmospheric observatory from January 2013 to May 2019. Radar reflectivity and mean Doppler velocity (MDV) from the Ka-band ARM Zenith
50 Radar (KAZR, Feng et al., 2011) are used, while temperature and moisture data from the radiosonde measurements (?, 2002) are utilized to characterize the environmental conditions. The vertical and time resolutions of the KAZR data are 30 meters and 3.7 seconds, respectively. Detailed descriptions of the KAZR radar and radiosonde instruments used at the NSA site are extensively covered in previous studies (Kollias et al., 2020; Luke et al., 2021).

To ensure adequate representativeness of the environmental conditions surrounding the radar profile at a given time, we
55 only analyze KAZR radar observations occurring within ± 15 minutes time and 4 km horizontal distance of a corresponding radiosonde measurement as the balloon ascends as shown in an example case in Fig. 1, following the approach used in (Luke et al., 2021). To ensure the focus remains on cold phase microphysical processes, we exclude the profiles containing warm



clouds, with temperatures above 0°C according to the radiosonde profile. This selection remains a large dataset, with over 39 million valid radar observation points.

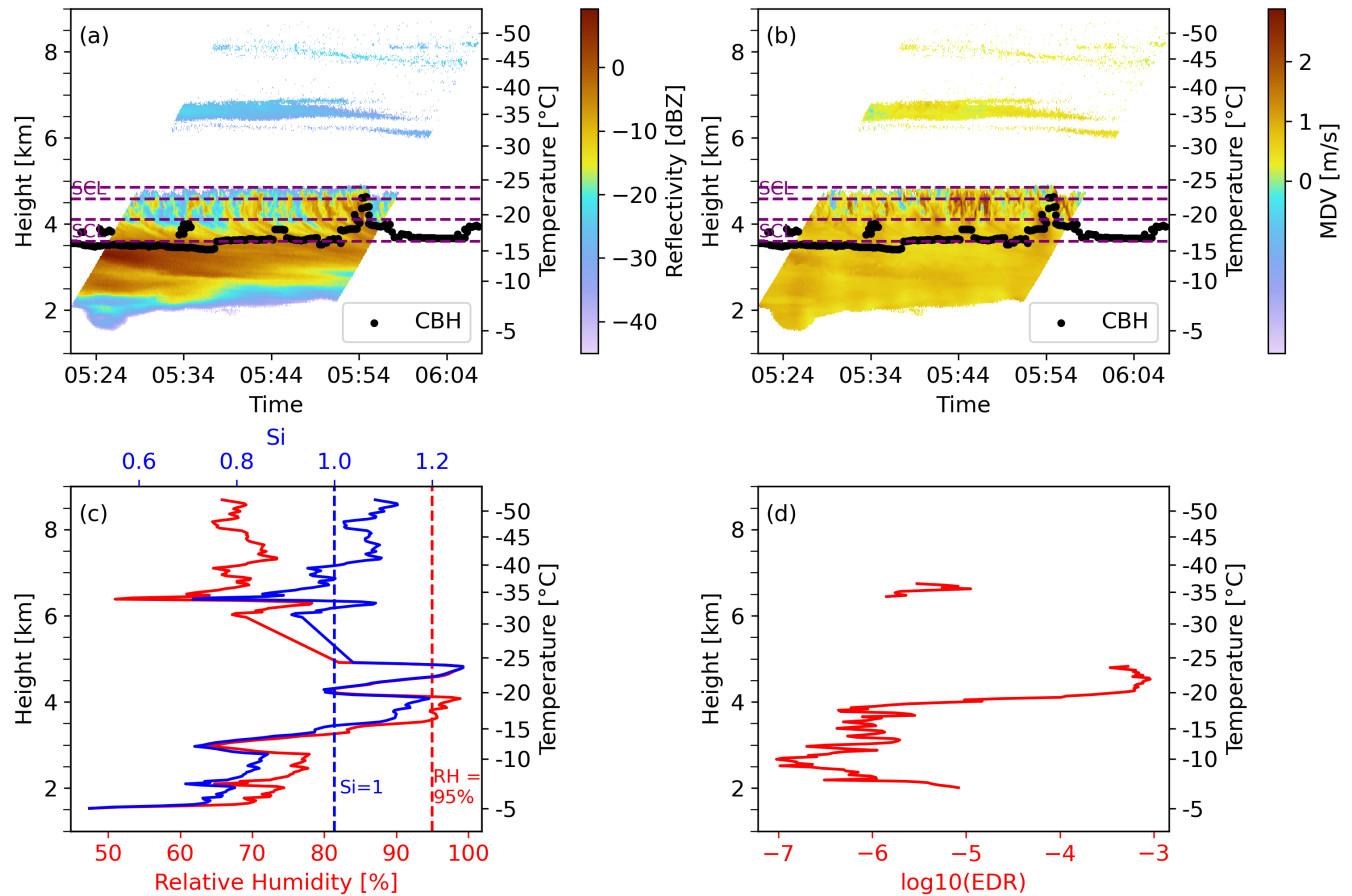


Figure 1. A case occurring on February 18, 2015 at NSA site. The selected KAZR observations occurring within ± 15 minutes time and 4 km horizontal distance of the corresponding radiosonde measurement, with (a) radar reflectivity (dBZ) and (b) mean Doppler velocity (MDV) shown as time-height plots. (c) Profiles of water vapor saturation ratio with respect to ice (Si) and relative humidity from radiosonde observations. (d) The in-cloud energy dissipation rate (EDR) calculated from both radiosonde and radar observations. In (a-b), the dashed purple lines depict the top and bottom boundaries of two supercooled liquid water layers (SCL) recognized by radiosonde, and the black points depict the cloud base height from ceilometer (Zhang et al., 1997). In (c), the dashed red line depicts the relative humidity of 95%, which is used as the threshold to classify SCL, and the dashed blue lines depict the Si of 1.

60 2.2 Moisture conditions

The saturation ratio with respect to ice (Si) is calculated from temperature, relative humidity (RH), and pressure obtained from the radiosonde measurements. This is a good indicator to identify layers where ice hydrometers grow ($Si > 1.0$) or sublimate



($Si < 1.0$). In the example case on February 18, 2015, shown in Fig. 1, the layers with $Si > 1.0$ show good agreement with the cloud signals shown by radar reflectivity, except for altitudes below 3 km. The high reflectivity with $Si < 1.0$ below 3 km suggests that sublimation is dominant there.

Previous research shows that high relative humidity ($> 95\%$ overall and $> 98\%$ for temperatures around -5°C) observed by radiosonde agrees with the presence of supercooled liquid droplets (SCL) (Silber et al., 2021; Luke et al., 2021) at subfreezing temperatures. In this study, we use the relative humidity threshold of 95% to indicate the potential existence of SCL. We define three moisture regimes: SCL conditions ($RH > 95\%$, $Si > 1.0$), favoring the persistence of SCL; ISO (ice supersaturated only) conditions ($RH < 95\%$, $Si > 1.0$), where deposition is possible but the occurrence of liquid water is highly unlikely; and ice-subsaturated conditions ($Si < 1.0$), where neither liquid water nor depositional growth is expected.

As shown in Fig. 1, the cloud base heights observed by the ceilometer, which is the lowest altitude of liquid, exhibit good agreement with the base of the first SCL layer above the surface, identified by the radiosonde observations (i.e., RH exceeding 95%). And the second SCL layer recognized by $RH > 95\%$ is located near the top of the radar-detected cloud layer. SCL-topped clouds with ice precipitation below is a typical structure of mix-phase clouds in Arctic (Morrison et al., 2012).

2.3 EDR calculation

The eddy dissipation rate (EDR), used to characterize turbulence intensity, is calculated from mean Doppler velocity observations from KAZR and horizontal wind data from radiosondes following the velocity time-series variance method described in Borque et al. (2016). A 30-minute window centered on the radiosonde profile is used to extract mean Doppler velocity time series at each altitude. These time series are Fourier-transformed to obtain the velocity spectrum. EDR is then estimated by integrating the spectrum over multiple subranges within the inertial subrange using scaling relations derived from Kolmogorov's theory, incorporating the mean horizontal wind speed and assuming local isotropy. The mean horizontal wind speed, interpolated from radiosondes, is used to convert temporal frequencies to spatial scales. To identify valid inertial subranges, several predefined frequency intervals are tested, and a power-law fit is performed for each. Only intervals with spectral slopes within $-5/3 \pm 1/3$ are retained, and the final EDR is computed as the average over these accepted estimates. If fewer than 300 mean Doppler velocity measurements are available within this window, EDR is not computed for that altitude, as shown in Fig. 1(d).

2.4 Radar variables and their vertical gradient

Reflectivity is proportional to number concentration and the sixth power of diameter (D^6), thereby reflecting particle size and/or number. The mean Doppler velocity (MDV, downward motion is positive) can be used to infer both particle fall speed and vertical air motion. Assuming that vertical air motion is negligible relative to particle fall speed in large statistical samples, we interpret the median MDV values as representative of hydrometeor fall speeds. To account for the effect of air density on fall speed, a density correction was applied to the MDV.

Vertical gradients of reflectivity (in dB scale) and MDV are calculated in the downward direction (i.e., toward the surface) using a five-point central difference method, providing more stable estimates while preserving meaningful small-scale variations. This approach yields positive gradients when the variable increases toward the surface and helps capture particle



changes during falling. For simplicity, we refer to these variables as the dBZ gradient and MDV gradient, though more detailed descriptions (e.g., vertical gradient of reflectivity) may also be used in context. The effectivity of vertical gradient variables in representing ice growth or sublimation processes will be discussed in Sect. 3.1.

3 Results and Discussions

100 3.1 Statistical cloud properties from radar observations across various moisture and temperature conditions

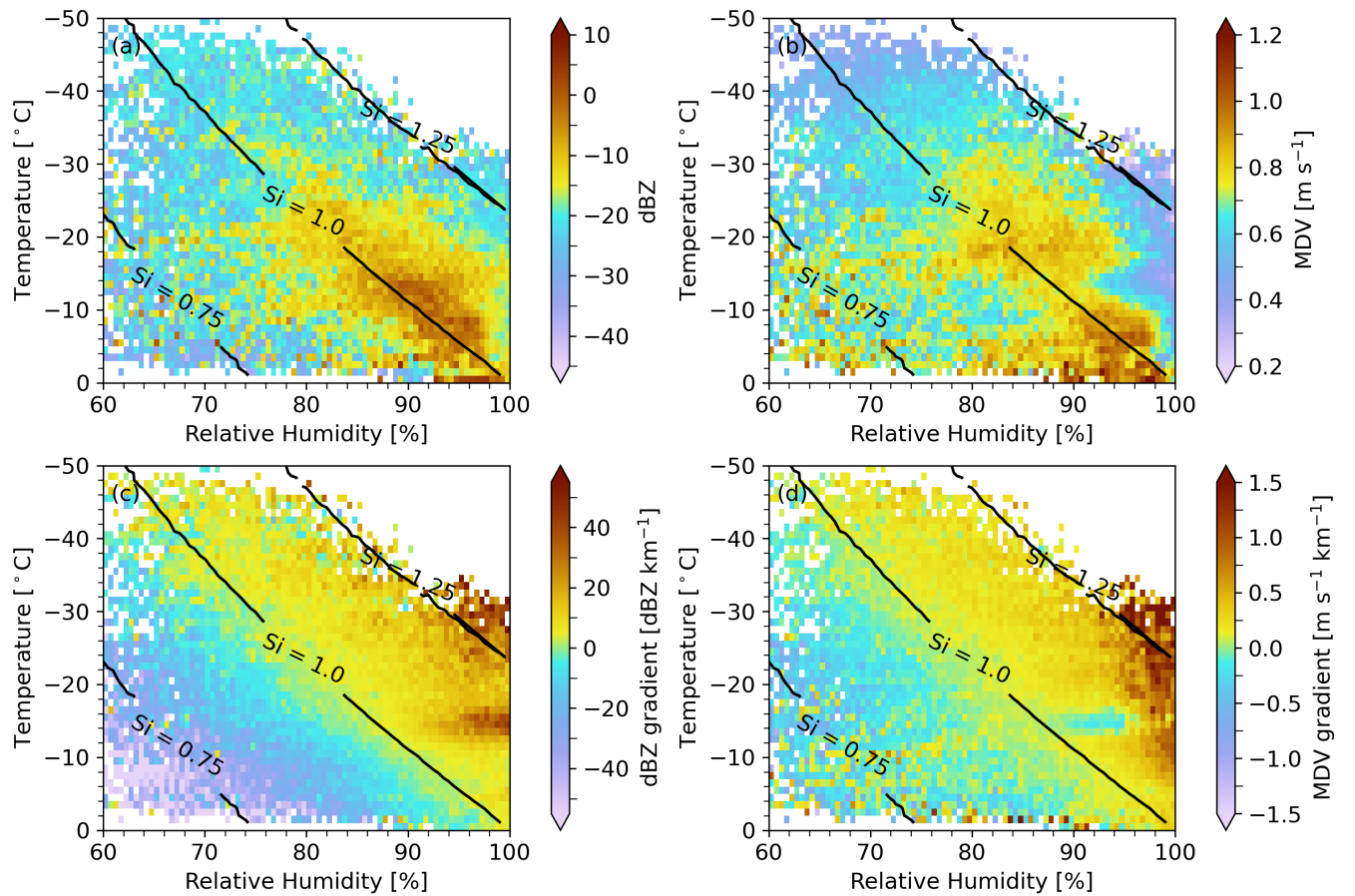


Figure 2. Median values of key variables as a function of relative humidity (%) and temperature (°C), including (a) radar reflectivity, (b) mean Doppler velocity, (c) the vertical gradient of dBZ, and (d) the gradient of MDV. The black contour lines indicate different saturation levels with respect to ice ($S_i = 1.25$, 1.0 , and 0.75).

The median values of the large number of radar observations of cold clouds are mapped under various temperature and relative moisture conditions as shown in Fig. 2, with a temperature resolution of 1°C and relative humidity resolution of 0.5% .



The median for each grid obtained from less than 1000 samples is dropped, and most medians remained are calculated from more than 10^5 samples, which ensures the reliability of our analysis.

105 This analysis attempts to gain insights into the processes that govern ice particle growth and sublimation under different temperature and moisture conditions. Results show that the region near the ice saturation threshold ($S_i = 1.0$) is associated with relatively larger reflectivity values (0-10 dBZ, Fig. 2a) and larger MDV values (generally $> 0.7 \text{ m s}^{-1}$, Fig. 2b) compared to both of ice supersaturated region ($S_i > 1.0$) and sublimation region ($S_i < 1.0$) at temperatures above -30°C . Notably, the regions where the dBZ gradients (Fig. 2c) or MDV gradients (Fig. 2d) approach zero closely coincide with $S_i \approx 1.0$. This
110 alignment supports the expected physical interpretation: when $S_i < 1.0$, sublimation dominates (negative dBZ gradient and MDV gradient), and when $S_i > 1.0$, ice particle growth is favored (positive dBZ gradient and MDV gradient). These findings suggest that the vertical gradients of dBZ and MDV can serve as process indicators for ice growth and sublimation. This framework also explains why ice particles tend to reach their maximum size and/or density near $S_i = 1.0$, under specific temperature conditions. Ice particles in the balanced region between growth and sublimation may have experienced growth
115 in super-saturated regions; and, in environments favorable for ice growth ($S_i > 1.0$), particles are often still in the process of growing when observed, thus not arriving at their maximum size and density.

At lower temperatures (below -30°C), even when particles are in equilibrium ($S_i \approx 1.0$), both reflectivity (typically below -5 dBZ , Fig. 2a) and MDV (generally lower than 0.5 m s^{-1} , Fig. 2b) remain relatively lower than those at warmer temperatures. Reduced heterogeneous nucleation in this cold temperature range may lower the number concentration and potentially
120 allow existing individual particles to grow larger. However, we observe reductions in particle size and fall speed indicated by reflectivity and MDV, which suggests that the reduction in available SCL plays a more significant role in preventing particles from reaching larger sizes and higher densities, due to the absence of growth processes involving supercooled water (such as riming). However, it should be also noted that the S_i estimation in this cold temperature has a large uncertainty.

In ice supersaturated regions ($S_i > 1.0$), the vertical gradient shows a dependence on temperature (Figs. 2c-d). The dBZ
125 gradient is relatively larger at around -5°C , -15°C , and -25°C compared to other temperatures, while MDV gradient is relatively lower at temperatures above -5°C and around -15°C compared other temperatures. Interestingly, these observed features align with the maximum mass growth rate of ice particles and their apparent density minima near -5°C and -15°C reported in vertical supercooled cloud tunnel studies (Takahashi et al., 1991; Takahashi and Fukuta, 1988). An increase in the reflectivity (dBZ) gradient and a decrease in the MDV gradient are observed around -15°C (Fig. 2c-d), which corresponds to significant minima
130 in MDV (Fig. 2b). These phenomena have been frequently reported in previous observations (e.g., Schrom and Kumjian, 2016; von Terzi et al., 2022).

When examining the frequency distributions for each grid point in Fig. 2, multimodal patterns are observed in reflectivity and MDV. Figure 3 shows the normalized frequency distributions of reflectivity and MDV at different temperatures in the SCL ($\text{RH} > 95\%$, $S_i > 1.0$) and ISO ($\text{RH} < 95\%$, $S_i > 1.0$) conditions. Results show that the medians of reflectivity and MDV in SCL
135 conditions are smaller than the medians in ISO conditions. It is consistent with suggestions from Fig. 2 that ice particles in the ISO conditions may have experienced the growth in SCL conditions for balanced regions ($S_i \approx 1.0$), and thus their reflectivity and MDV are larger than those in SCL region. In addition, the smaller MDV in the SCL condition can also be partly due to



the presence of SCL droplets coexisting with primary ice particles, in which situation MDV could be smaller than the situation where ice particles exist only.

140 The reflectivity in the SCL condition is multi-modal as shown in Fig. 3a with temperatures warmer than -15°C , possibly because the reflectivity (size) is also affected by differences in their growth processes determined by different particle trajectories. For example, the reflectivity with the SCL condition has multiple modality at a given temperature warmer than -15°C . The population with weaker reflectivity suggests the dominance of small pristine ice crystals. The other population with larger reflectivity suggests the dominance of larger particles such as large pristine ice crystals, aggregates, and rimed particles. This
145 is consistent with previous studies that showed active aggregation in the dendritic growth zone (Bechini et al., 2013; Andrić et al., 2013), and active rimming at around -10°C (Takahashi et al., 1991). In addition, we also suggest that at around -15°C , the size of ice particles may have dependence on its duration time in its favorable conditions because of its slow fall speed indicated by low MDV.

Notable multimodality in MDV under the SCL condition is shown at temperatures warmer than -5°C in Fig. 3b, where there
150 are two populations with MDV at around 1.2 m s^{-1} and 0.0 m s^{-1} . The slower MDV population indicates supercooled liquid droplets, corresponding to the reflectivity peak at about -25 dBZ in Fig. 3a. At -7 to -12°C , the peak is of a larger downward MDV compared to other temperatures. The MDV-temperature diagram in the ISO condition in Fig. 3d exhibits a unimodal pattern with a significant decrease in MDV at around -15°C corresponding to the dendritic growth zone.

3.2 Microphysics in Dendritic growth regions

155 To further explore the particle size dependence in the observed patterns in the dendritic growth regions, Fig. 4 examines the dBZ gradient and MDV gradient as a function of dBZ and temperature for SCL conditions and ISO conditions. In SCL conditions, Fig. 4a clearly shows the significant increase in dBZ gradient at around -15°C at reflectivity from -40 to 10 dBZ . The relative small and even negative MDV gradient is significant at smaller reflectivity $< -28\text{ dBZ}$. For ISO conditions, the small MDV gradients coexist with large positive dBZ gradients ($>30\text{ dBZ km}^{-1}$, Fig. 4a) when reflectivity $< -5\text{ dBZ}$. The small MDV
160 gradient ($< 0.2\text{ m s}^{-1}\text{ km}^{-1}$) at around -15°C extends to reflectivity of 20 dBZ , while the large dBZ gradients ($> 20\text{ dBZ km}^{-1}$) are limited to small reflectivity $< -5\text{ dBZ}$. The difference between the two conditions might be from that the increases in reflectivity and mean fall speed by heavy riming might be dominant in the radar sampling volume in SCL conditions. The pattern at around -15°C (the small or negative MDV gradients coexisting with large dBZ gradients at relative small reflectivity) supports the hypothesis of new ice particle formation with preexisting particles as follows. When preexisting ice particles are
165 small (small reflectivity), an increase in the number of new ice particles rather than size contributes to an increase in reflectivity significantly and hence smaller MDV gradient. If preexisting ice particles are relatively large (large reflectivity), an increase in the number of new ice particles cannot contribute to an increase in reflectivity significantly (proportional to D^6) and cannot contribute to decreasing mean fall speed (reflectivity weighted mean) significantly, thus a small increase in reflectivity with nearly 0 MDV gradient.

170 According to Fukuta and Takahashi (1999), the increase in size growth and the reductions in fall speed growth may result from the specific shapes (needles at -5°C , dendrites at -15°C) of lower particle density and greater air resistance. This can also

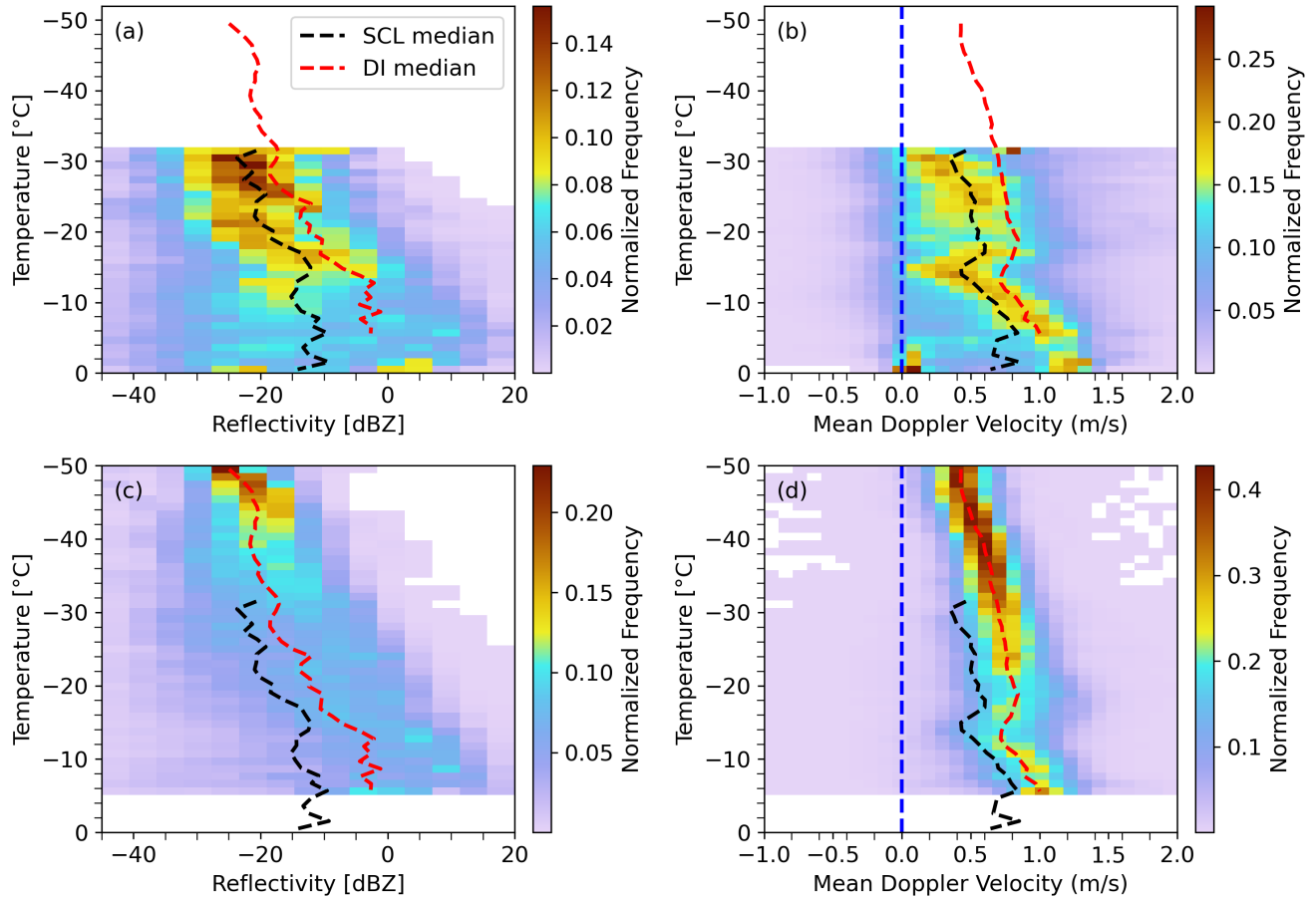


Figure 3. Normalized frequency distribution of reflectivity (dBZ, panels (a-b)) and mean Doppler velocity (MDV, m s^{-1} , panels (c-d)) as a function of temperature ($^{\circ}\text{C}$) under different moisture conditions. Panels (a) and (b) correspond to SCL conditions, while panels (c) and (d) correspond to ISO conditions. The dashed black and red lines represent the median profiles for SCL conditions and ISO condition, respectively. The blue dashed line indicates the reference line for MDV = 0 m s^{-1} . The color shading indicates the normalized frequency of observations within each temperature-MDV or temperature-reflectivity bin.

explain why negative MDV gradient and positive dBZ gradient patterns are observed together in the dendritic growth layer (DGL). Newly formed small ice particles with lower fall speeds in the Doppler spectrum (Schrom and Kumjian, 2016) can decrease the average of MDV, reduce the MDV gradient, and create a positive dBZ gradient as the ice number concentration increases. This suggests that secondary ice production can be a possible explanation for the creation the new slowly-falling ice particles. The particles with low fall speed, typically dendrites, appear mainly in this temperature region (Takahashi, 2014; Takahashi et al., 1991) can also be the newly occurring particle compared the above altitude. When the faster-falling particles catch up with the dendrites, the population of the ice particles at that temperature is likely to increase because of the coexistence

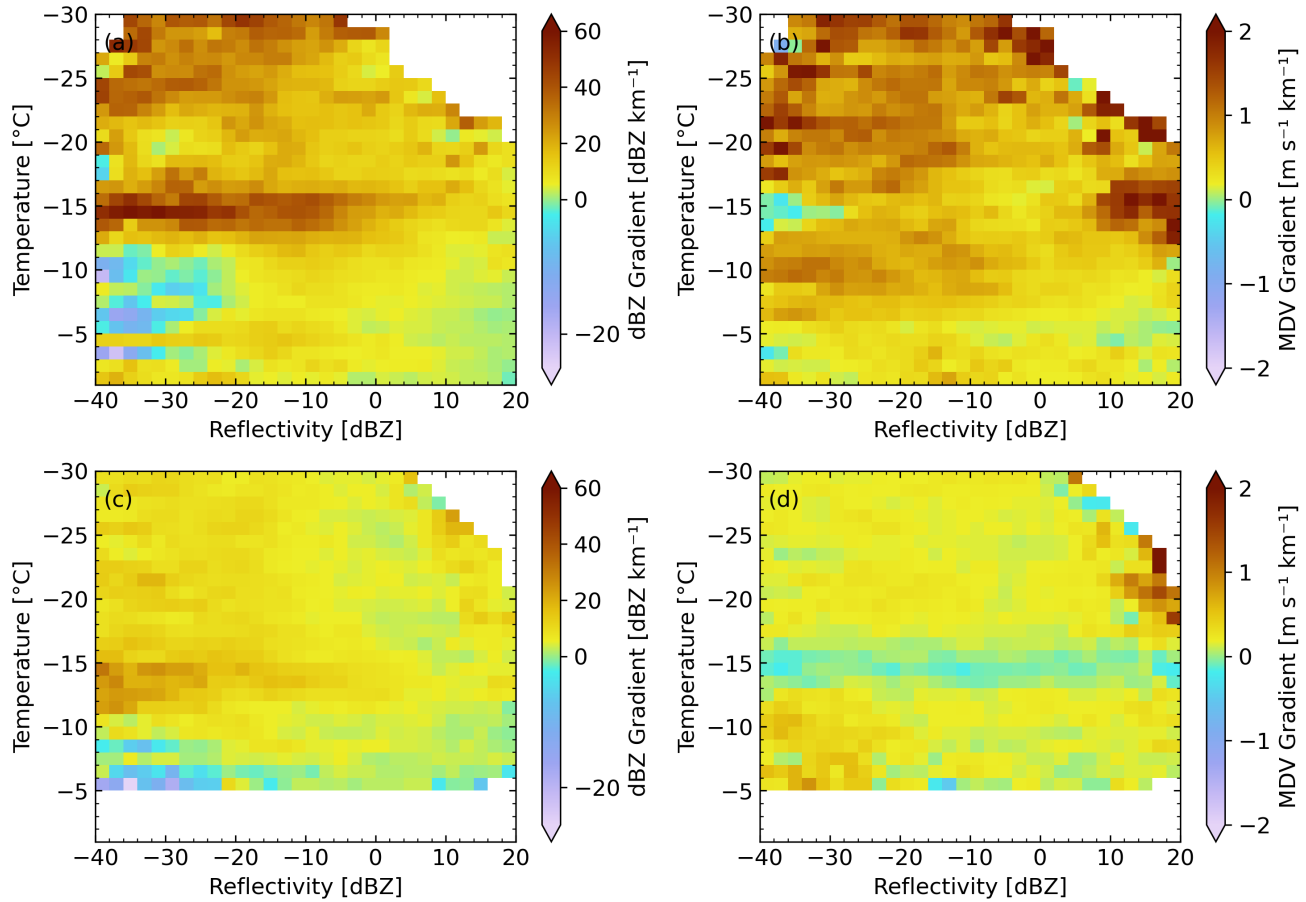


Figure 4. Median values of dBZ gradient and MDV gradient as a function of temperature (°C) and reflectivity (dBZ) under different conditions: (a) SCL conditions: dBZ gradient (dBZ km⁻¹). (b) SCL conditions: MDV Gradient (m s⁻¹ km⁻¹). (c) ISO conditions: dBZ Gradient (dBZ km⁻¹). (d) ISO conditions: MDV Gradient (m s⁻¹ km⁻¹).

two types of ice particles, thus increasing the net reflectivity of the radar observations. This was also observed by polarimetric
 180 radars as an increase in specific differential phase (Schrom and Kumjian, 2016; Oue et al., 2018). Additionally, the latent
 heat released during rapid growth in the dendrite growth zone may generate local updrafts that reduce the MDV near that
 temperature (Schrom and Kumjian, 2016). However, the spectrum analysis by von Terzi et al. (2022) has shown that while this
 mechanism exists, it is not a primary contributor to the observed phenomenon.

Notably, a less pronounced pattern of MDV gradient minima and reflectivity maxima is observed around -22°C for SCL
 185 conditions for small particles (around -40 dBZ) in Fig. 4 c-d. This suggests that another ice particle type transition is happening
 around that temperature, possibly the transition from polycrystalline to single crystals mentioned in Bailey and Hallett (2009).



3.3 The relationship between turbulence, SCL, and ice microphysics

Figure 5a illustrates the distribution of the turbulence, represented by the EDR, under varying temperature and moisture conditions. A threshold of $10^{-5} \text{ m}^2 \text{ s}^{-3}$, corresponding to the local minimum between two peaks in the EDR distribution (Fig. 5), was used to separate turbulence regimes in the local context. Hereafter, we refer turbulent condition as $\text{EDR} > 10^{-5} \text{ m}^2 \text{ s}^{-3}$ (high EDR), and non-turbulent condition as $\text{EDR} \leq 10^{-5} \text{ m}^2 \text{ s}^{-3}$ (low EDR). As shown in Fig. 5a, most of the medians of the

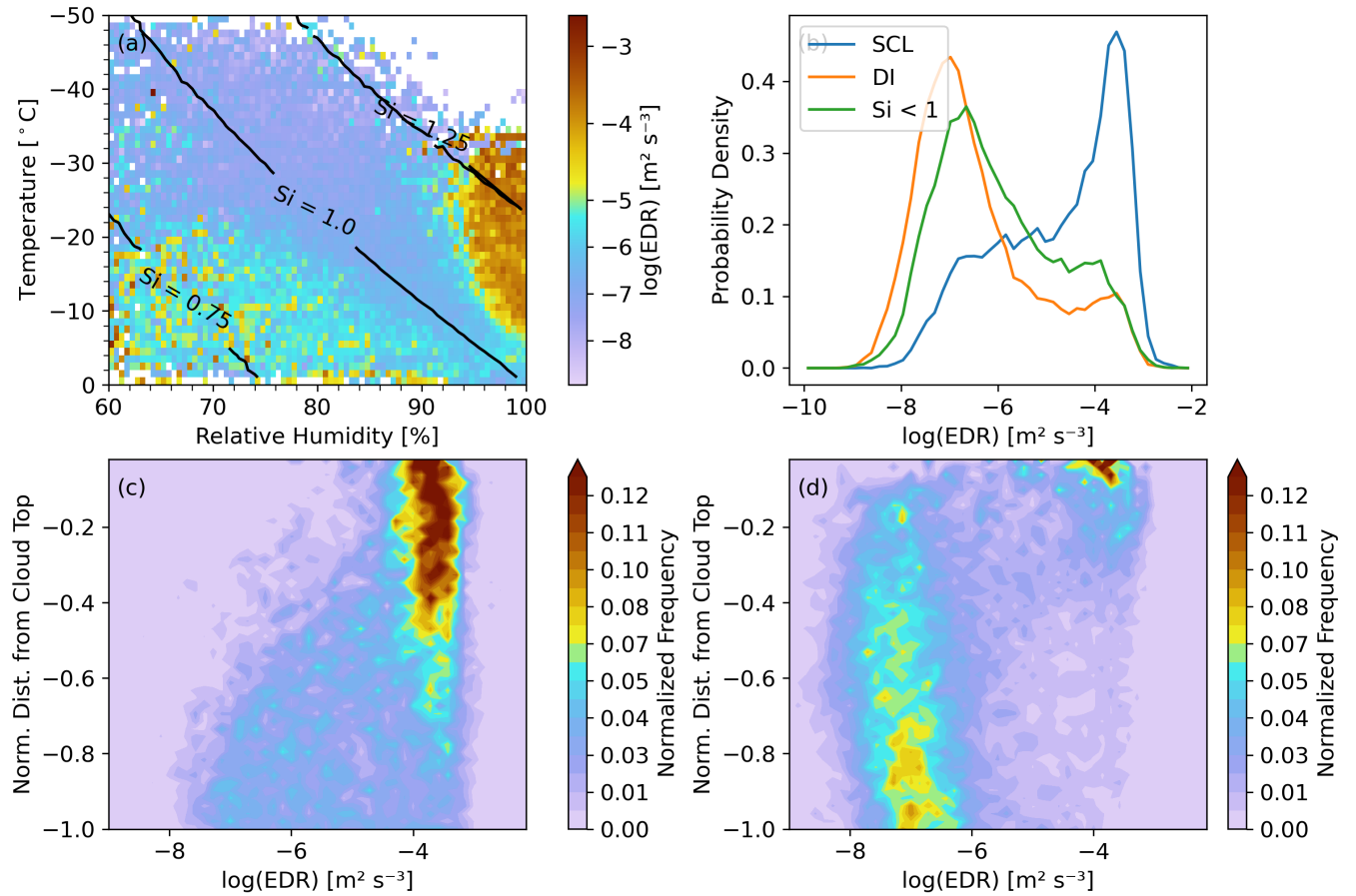


Figure 5. (a) Median values of EDR as a function of relative humidity (%) and temperature ($^{\circ}\text{C}$), the black contour lines indicate different saturation levels with respect to ice ($\text{Si} = 1.25, 1.0$, and 0.75); (b) PDF of EDR under SCL conditions (blue line), ISO conditions (orange line), and $\text{Si} < 1.0$ conditions (green line).). Vertical distribution of in-cloud EDR under (c) SCL conditions and (d) ISO conditions.

EDR in SCL conditions are of the value greater than $10^{-5} \text{ m}^2 \text{ s}^{-3}$, and larger than other regions saturated with respect to ice. Previous researches (Schrom and Kumjian, 2016; von Terzi et al., 2022) suggest that turbulence might be induced by the latent heat released during ice particle growth. However, high EDR tends to be more concentrated in the SCL conditions, rather than being uniformly distributed across all supersaturated with respect to ice areas ($\text{Si} > 1.0$) as shown in Fig. 5a-b. This suggest



Table 1. Median and skewness of dBZ and MDV gradients under six thermodynamic–turbulence conditions. Units: dBZ gradient in dBZ km⁻¹, MDV gradient in m s⁻¹ km⁻¹, EDR in m² s⁻³.

Condition	Variable	Median	Skewness
SCL,	dBZ Gradient	12.99	1.00
High EDR	MDV Gradient	0.96	-0.41
SCL,	dBZ Gradient	8.17	0.96
Low EDR	MDV Gradient	0.25	-0.82
DI,	dBZ Gradient	9.90	1.11
High EDR	MDV Gradient	0.48	-0.59
DI,	dBZ Gradient	6.34	0.33
Low EDR	MDV Gradient	0.14	-0.55
Ice-subsaturated,	dBZ Gradient	-9.44	0.61
High EDR	MDV Gradient	0.18	-0.74
Ice-subsaturated,	dBZ Gradient	-6.45	-0.71
Low EDR	MDV Gradient	-0.04	-0.61

that turbulence may play an active role in maintaining favorable humidity conditions for SCL, and the formation of SCL in turn enhances turbulence through latent heat release, creating a positive feedback loop.

The median MDV gradient is large ($> 0.7 \text{ m s}^{-1} \text{ km}^{-1}$) in the SCL conditions as shown in Fig. 2d, and high EDR also distribute in SCL conditions as shown in Fig. 5a. Their distributions almost overlap by comparing the Fig. 2d and Fig 5a.

200 Either of SCL or turbulence are suggested to enhance the ice growth in previous research. To explore the role of turbulence and SCL on ice particle growth respectively, we classify the environments of saturated with respect to ice into six groups: high EDR with SCL, SCL only, high EDR only, ISO with low EDR, high EDR in ice-subsaturated condition, and low EDR in ice-subsaturated condition. The order of the median of MDV gradient and dBZ gradient under ice-supersaturated conditions ($Si > 1.0$) from large to small are: SCL with high EDR, high EDR only, SCL only, ISO with low EDR (Table 1). That means

205 that from the vertical gradient point of view, turbulence alone can enhance particle growth, which is consistent with previous studies (Chu et al., 2018; Chellini and Kneifel, 2024). The appearance of SCL alone can enhance ice growth, presumably via riming. When turbulence and SCL are coupled together, the MDV gradient and dBZ gradient are much larger than either alone (Table 1), which suggests that the potential positive feedback loop between SCL and turbulence might enhance the growth of ice particles.

210 In ice-subsaturated conditions ($Si < 1.0$), a more variable EDR is observed at temperatures above -22°C , varying from 10^{-9} to $10^{-2} \text{ m}^2 \text{ s}^{-3}$. High EDR only appears in warm regions, which likely correspond to lower altitudes, suggesting that turbulence in low Si regions is likely induced by boundary layer processes. As shown in Table 1, the dBZ gradient under high EDR is smaller than that under low EDR in this region, possibly due to turbulence-induced entrainment of dry air and enhanced sublimation in low-relative-humidity environments. In contrast, the MDV gradient is larger in high EDR region.



215 This indicates that while turbulence or entrainment in ice-subsaturated regions (as seen in Fig. 5a) contributes to particle size reduction (i.e., negative dBZ gradient), it may simultaneously enhance particle density (i.e., positive MDV gradient) potentially through morphological changes during sublimation, as reflected in the statistics.

Low EDR is mainly observed near the $Si = 1.0$ line. At $Si = 1.0$, ice deposition and sublimation are balanced, stabilizing the local environment and minimizing turbulence. However, when turbulence does occur, it can disrupt this equilibrium by
220 vertically displacing ice particles into regions of differing saturation, enhancing local imbalances.

The RH threshold for identifying SCL and the EDR threshold for identifying high EDR regions were adjusted within a reasonable range (RH: from 95% to 99%, EDR: from $10^{-6} \text{ m}^2 \text{ s}^{-3}$ to $10^{-4} \text{ m}^2 \text{ s}^{-3}$) to verify the robustness of the results above. Although the specific values vary, the main results previously described remain unchanged despite these variations, confirming their reliability.

225 The normalized frequency of the EDR as a function of normalized distance from cloud top under SCL and ISO conditions are shown in Fig. 5c and d, respectively. For each layer, the normalized distance to cloud top is calculated as the vertical distance from the point to the cloud top, divided by the total cloud depth, representing the relative vertical location within the layer. As expected, for every normalized distance to cloud top height bin, the distribution of EDR under SCL conditions (Fig. 5c) is toward higher values of EDR than that under ISO conditions (Fig. 5d). Although high EDR is more likely to appear in
230 the upper part of the cloud under both conditions, there is a difference in the depth of the high-frequency high-EDR region. For ISO conditions, low EDR accounts for more than half of the percentage from normalized distance from cloud top of -0.3 to cloud base. For SCL conditions, the high EDR is more prevalent in the whole upper region in a cloud. However, when the SCL appear near the base of the cloud, although the median EDR for this situation (Fig. 5c) is still significant larger than the median EDR of snow without SCL (Fig. 5d) at cloud base, those SCL at cloud base are not more possible to be with high EDR.
235 The distribution of EDR with SCL near cloud base suggests that the SCL below ice or other higher SCL tend to be decoupled with high EDR. The potential positive feedback loop between SCL and turbulence is indicated to be weak or be broken there. This suggests that the radiation cooling near the cloud top is shown to be a stronger factor for the formation and maintenance of turbulence than the effect of latent heat release from SCL formation. By combining the pattern shown in Fig. 5a, we believe that this is a evidence for that turbulence actively supports the formation of SCL.

240 4 Conclusions

This study provides a comprehensive investigation into ice microphysical processes and their interaction with turbulence in Arctic stratiform clouds using 6.5 years of ground-based radar and radiosonde observations at the DOE ARM North Slope of Alaska site. By combining Ka-band radar data with thermodynamic profiles, we leverage radar reflectivity and MDV, along with their vertical gradients to trace the state and the evolution of ice particles under varying temperature and moisture conditions.

245 The results reveal clear links between water vapor saturation ratio with respect to ice and ice particle evolution: ice super-saturated conditions ($Si > 1.0$) exhibit positive vertical gradients of radar variables (i.e., reflectivity and MDV), indicating ice particle growth, while ice-subsaturated conditions ($Si < 1.0$) exhibit negative gradients of radar variables, indicating sublima-



tion. The vertical gradients of reflectivity and mean Doppler velocity directly reflect ice growth processes, making them more closely tied to environmental conditions. Our observational insights provide a potential perspective for evaluating ice-growth processes, which remain a major source of uncertainty in cloud-resolving models. Rather than relying solely on relationships such as mass–diameter (M–D) or terminal velocity–diameter (V–D) for different types of ice particles for the transition of mass and number concentrations between predefined categories (Grabowski et al., 2019), an alternative approach might be to consider size growth rate and density growth rate, determined by microphysical processes, as functions of the environment.

Temperature dependence of ice growth are observed in ice supersaturated regions, which is consistent with previous laboratory studies. In the dendritic growth zone (around -15°C), positive dBZ gradients are accompanied by negative Doppler velocity gradients, particularly pronounced for small ice particles (as indicated by low dBZ values). This pattern suggests the transitions from fast-falling to slow-falling ice particles near this temperature, or the emergence of newly-formed, slowly-falling ice particles through secondary ice production. A similar pattern is observed around -22°C , although it is not as significant as -15°C .

Turbulence, quantified by EDR, is strongest and most concentrated in SCL regions compared to ISO conditions and ice-subsaturated conditions. Notably, SCL located near cloud bases often decouples from high EDR, indicating that latent heat release from SCL alone is insufficient to generate strong turbulence, and that turbulence actively contributes to the formation of SCL. The coexistence of SCL and high EDR substantially enhances ice particle growth, as indicated by pronounced vertical gradients. The median vertical gradient of reflectivity in these regions is $12.99 \text{ dBZ km}^{-1}$, and the median gradient of MDV is $0.96 \text{ m s}^{-1} \text{ km}^{-1}$, both significantly higher than in SCL only regions (8.17 dBZ km^{-1} and $0.25 \text{ m s}^{-1} \text{ km}^{-1}$, respectively) and turbulence only regions (9.9 dBZ km^{-1} , $0.48 \text{ m s}^{-1} \text{ km}^{-1}$). While either SCL or high EDR alone can promote ice growth, their individual contributions are 24–37% lower in reflectivity gradient and 50–74% lower in MDV gradient, compared to regions where both coexist. High EDR in ice-subsaturated regions at temperatures above -22°C is possibly driven by boundary layer processes, which tends to reduce particle size but enhance particle density as indicated by vertical gradient of reflectivity and MDV.

Our study provides a map of ice particle growth and sublimation—diagnosed from vertical gradients of radar reflectivity and mean Doppler velocity—across a broad range of temperature and moisture conditions based on long-term radar observations. It confirms and extends previous findings on temperature-dependent ice growth from short-term observations and laboratory experiments by providing statistical quantification over a multi-year dataset. In addition, our results enhance understanding of the role of turbulence in ice microphysics and underscore the importance of incorporating both environmental conditions and turbulence to improve the representation of ice microphysical processes in models.

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- 285 *Data availability.* Data from KAZR radar, radiosonde, and ceilometer (DOIs: <https://doi.org/10.5439/1976090>, <https://doi.org/10.5439/1595321>, <https://doi.org/10.5439/1181954>) are available from the ARM Data Discovery website (<https://www.archive.arm.gov/discovery/>). The processed dataset is available on Zenodo under the.



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