



1 Bridging the polarimetric structure and lightning activity of an isolated
2 thunderstorm during the cloud life cycle

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30 **Abstract**

31 Cloud microphysics and dynamics produce lightning flashes, which can be detected as polarimetric
32 structures by radar. Many studies have indicated that differential reflectivity (Z_{DR}) and specific
33 differential phase (K_{DP}) columns, which serve as proxies for updraft strength, are related to lightning
34 activity; moreover, the quantities of ice and supercooled liquid water strongly influence the
35 occurrence of lightning flashes via noninductive charging. However, few studies have focused on
36 clarifying the sequence or interactions among these factors from the perspective of the cloud life
37 cycle. Here, we establish the ‘3D mapping columns’ method, which is based on the Cartesian grid
38 datasets; this method is sensitive for identifying and quantifying the Z_{DR} columns in the early phase
39 of cloud formation. Our study bridges the polarimetric structure and lightning activity within an
40 isolated thunderstorm during the cloud life cycle. The results indicate that i) the parameter most
41 relevant to total flashes/cloud-to-ground flashes is the content of supercooled rainwater/graupel. ii)
42 The onset of the Z_{DR} column can be used to forecast lightning initiation in advance. iii) The
43 signatures of the Z_{DR} and K_{DP} columns should be complementary and used to retrieve dynamic
44 information instead of lightning activity. Notably, the variation in the Z_H intensity within Z_{DR}
45 columns has high potential for predicting lightning activity during the cloud life cycle, which is
46 valuable for exploration in the future. Our study improves the overall understanding of cloud
47 microphysics and lightning activity, and suggestions for using these multiple polarimetric signatures
48 to forecast severe weather are provided.

49 **Short summary**

50 Lightning activity is highly related to the signatures of polarimetric radar on the basis of cloud
51 electrification physics. However, few studies have focused on bridging the polarimetric structure
52 and lightning activity during the cloud life cycle. Here, we evaluated the sequence and interactions
53 of polarimetric parameters for indicating lightning activity from the perspective of the cloud life
54 cycle, and the cloud microphysics of the polarimetric structure was explored.

55 **Keywords:** thunderstorm; lightning activity; cloud microphysics; polarimetric radar

56

57 **1.Introduction**

58 Lightning is a traditional indication of severe weather (e.g., tornado, hail, microbursts, etc.).
59 Trends in lightning activity are useful for determining the severity of a thunderstorm (e.g., Gatlin



60 and Goodman, 2010; Goodman, et al., 2005; Williams, et al., 1999; Zhang et al., 2009). Lightning
61 activity is the electrical response to dynamic conditions (updraft or turbulence) and cloud
62 microphysics during storm evolution, which is supported by both theoretical and field observational
63 studies of dynamics, microphysics and lightning activity (lightning initiation or total lightning flash
64 rate) (e.g., Baker, et al., 1999; Baker, et al., 1995; Carey and Rutledge, 2000; Mitzeva and Saunders,
65 1990; Souza and Bruning, 2021; Williams, et al., 1989; Zhang et al., 2004a; Zhao, et al., 2021).
66 Notably, many studies have focused on the relationship between lightning activity and cloud updraft
67 or microphysics (e.g., Carey and Rutledge, 1996, 2000; Deierling and Petersen, 2008; Lang and
68 Rutledge, 2011; López and Aubagnac, 1997; Sharma, et al., 2024; Sharma, et al., 2021).

69 Polarimetric radar can provide observations to improve our understanding of the coupling
70 between convective dynamics and storm microphysics (e.g., Sharma, et al., 2024). Lightning
71 location technology can be used to monitor the occurrence of lightning flashes in real time (e.g.,
72 Rison, et al., 1999). In this way, radar and lightning observations can be used to link cloud updrafts
73 and microphysics with lightning activity.

74 Carey and Rutledge (2000) utilized a C-band polarimetric radar to study the relationship
75 between precipitation and lightning during tropical island convection events; their results indicated
76 that lightning activity and the surface electric field are strongly correlated with the mixed-phase ice
77 mass and rainfall properties during the mature phase of convection. Cloud-to-ground (CG) lightning
78 was associated with the production and subsequent descent of graupel and frozen drops from the
79 -10 to -20°C region; moreover, peaks in the CG lightning flash rate typically lagged behind peaks
80 in the graupel mass aloft (Carey and Rutledge, 2000). This observational phenomenon reflects the
81 noninductive charging between ice-phase hydrometeors, mainly graupel and ice crystals (e.g.,
82 Latham and Dye, 1989; Reynolds, et al., 1957; Saunders, 2008; Takahashi, 1978).

83 Before the formation of ice particles (e.g., graupel), the supercooled raindrops present in the
84 mixed-phase zone throughout the developing and mature phases play crucial roles in storm
85 kinematics, microphysics, and electrification. During freezing, supercooled raindrops likely provide
86 (i) an instantaneous and abundant supply of millimetre-sized ice, (ii) a potential source of secondary
87 ice particles, and (iii) an invigoration in the updraft due to the latent heat of freezing (Carey and
88 Rutledge, 2000; Rosenfeld, et al., 2008; Zhao, et al., 2024; Zhao, et al., 2022). Moreover, millimetre-



89 sized ice and secondary ice particles contribute to cloud electrification (Bringi, et al., 1996; Sharma,
90 et al., 2024). The intensity of convective updrafts through the modulation of microphysical factors,
91 the collision efficiency of ice particles, and the electrification temperature influence the charge
92 structure of storms (Liu, et al., 2024; Marshall, et al., 1995; Qie, et al., 2000; Yan et al., 1996a, b;
93 Zhang, et al., 2004b), the flash size (Bruning and MacGorman, 2013; Zheng and Zhang, 2021), and
94 the associated lightning flash rate (Deierling and Petersen, 2008; Deierling, et al., 2008; Fridlind, et
95 al., 2019; Souza and Bruning, 2021; Zhao, et al., 2021).

96 Moreover, supercooled raindrops produce a differential reflectivity (Z_{DR}) column, one of the
97 most notable polarimetric radar signatures of convective storms. High Z_{DR} values (e.g., >1 dB)
98 above the 0°C isotherm height (freezing level) are associated with large supercooled raindrops and
99 wet hail suspended in deep convective updrafts (e.g., Krause and Klaus, 2024; Kumjian, et al., 2014;
100 Snyder, et al., 2015; Zhao, et al., 2020). Depending on the intensity of the updraft, the region of high
101 Z_{DR} can extend several kilometres above the 0°C isotherm height. This narrow vertical extension of
102 high Z_{DR} values above the environmental 0°C level associated with updrafts in strong convective
103 storms is called the Z_{DR} column (Krause and Klaus, 2024; Kumjian, et al., 2014; Zhao, et al., 2020).

104 The Z_{DR} columns, due to the vertical size sorting of drops in warm-rain precipitation processes,
105 encompass the signals of both microphysical features and updrafts; however, these signals are not
106 present throughout the life cycle of strong convective storms, except in the early phase of cloud
107 development. During the initial phase of a thunderstorm, the Z_{DR} column above the freezing level
108 indicates the presence of a low concentration of large raindrops (>2 mm); in addition, the Z_{DR}
109 column expands downwards from above due to the collision and coalescence of drops and the
110 accretion of droplets, resulting in the formation of larger raindrops (>4–5 mm) (Kumjian, et al.,
111 2014). During the mature phase of a thunderstorm, the Z_{DR} column above the freezing level may
112 continue expanding upwards and outwards because stronger updrafts loft raindrops upwards into
113 the mixed-phase layer, but smaller drops reach their nucleation temperature and begin to freeze
114 while ascending to higher altitude. As these supercooled raindrops begin to freeze and mix with
115 water-coated graupel and hail, the corresponding Z_{DR} values decrease, denoting top of the Z_{DR}
116 column. As updrafts subsequently weaken and large ice particles (high-density graupel or hailstones)
117 increase in abundance, the Z_{DR} column starts to collapse; however, lightning activity may exhibit



118 an inverse trend compared with that of the Z_{DR} column at this moment.

119 On the other hand, in the specific differential phase (K_{DP}) column, high values ($>0.75^\circ/\text{km}$, the
120 value reported by Loney et al. (2002)) above the freezing level occur and are strongly associated
121 with a high concentration of water-coated ice (e.g., water-coated graupel and hail with a non-
122 spherical shape) and raindrops (1–2 mm) that shed from hailstones growing in a wet regime (Bringi,
123 et al., 1996; Hubbert, et al., 1998; Loney, et al., 2002). Thus, the formation of a K_{DP} column is tied
124 to cold cloud microphysics, usually occurring later in the life cycle of a thunderstorm.

125 van Lier-Walqui et al. (2016) attempted to determine the constraints of cloud-resolving models
126 on the basis of ground-based remote sensing observations, namely, polarimetric radar data. In their
127 study, the K_{DP} column (specifically, the column volume) was strongly related to the updraft mass
128 flux, lightning activity, and rainfall intensity in four deep convection events observed during the
129 Midlatitude Continental Convective Clouds Experiment. Recently, Sharma et al. (2024) utilized
130 polarimetric radar observations of three severe storms during the VORTEX-Southeast field
131 campaign to quantify the correlation between the volumes of Z_{DR} and K_{DP} columns (representative
132 of mixed-phase microphysics as well as updraft intensity and size) and total lightning flash rates.
133 They indicated that the volume of the K_{DP} columns exhibited high co-variability with the total flash
134 rate in three such cases (a tornadic supercell embedded in a stratiform precipitation system, a non-
135 tornadic supercell, and a supercell embedded within a quasilinear convective system).

136 Sharma et al. (2024) conducted a study on the basis of hypotheses, namely, that the deeper and
137 wider the Z_{DR} and K_{DP} columns were in cases with robust and wide updrafts (e.g., Homeyer and
138 Kumjian, 2015; Snyder, et al., 2017), the more an increase in the volumes of the Z_{DR} and K_{DP}
139 columns would correspond to an increase the mixed-phase ice mass flux, resulting in an increase in
140 the total flash rate; therefore, the correlation coefficient ($-0.47\sim 0.37$ for the Z_{DR} column; $0.54\sim 0.74$
141 for the K_{DP} column) between Z_{DR} or K_{DP} columns and lightning activity was not high. In addition,
142 the effect of the time lag may decrease this correlation coefficient. As reported by Carey and
143 Rutledge (2000), they obtained a very high one-lag (7 minutes) correlation coefficient ($\rho = 0.9$)
144 between the graupel mass within the mixed-phase zone and the CG lightning flash rate, suggesting
145 that the directly related microphysics with noninductive charging have a greater correlation
146 coefficient with lightning activity.



147 In summary, four parameters derived from polarimetric radar can provide forecasting
148 information about lightning activity on the basis of noninductive charging: i) the precipitation-sized
149 (e.g., graupel) ice mass within the mixed-phase zone; ii) the content of supercooled raindrops; and
150 iii) the quantified Z_{DR} and K_{DP} columns (e.g., the column volume or height). Our goal in this study
151 is to link these four parameters for forecasting lightning activity within isolated thunderstorm cells
152 during the cloud life cycle over South China, determine of whether the best proxy among these four
153 parameters is used to forecast lightning activity, and determine how the cloud microphysics related
154 to these four parameters should be assessed. Notably, the close relationship between these four
155 parameters and lightning activity has been noted in many studies (e.g., Carey and Rutledge, 2000;
156 Hayashi et al., 2021; Sharma et al., 2024; Sharma, et al., 2021; Snyder, et al., 2015; van Lier-Walqui,
157 et al., 2016; Woodard et al., 2012); thus, we believe that this study is sufficient for connecting these
158 four parameters and lightning activity via an isolated storm cell during the cloud life cycle.

159 This paper is organized as follows. In Section 2, an overview of the radar and lightning data is
160 given, and the analysis methods and the approach for quantifying the Z_{DR}/K_{DP} columns are described.
161 Section 3 presents the results of Z_{DR}/K_{DP} column quantification and the microphysical
162 characteristics of the Z_{DR} column; additionally, the variation in the ice/water content within the
163 mixed-phase zone with cloud development is illustrated, and the relationship between lightning
164 activity and these polarimetric characteristics is presented. Finally, we summarize the results in
165 Section 4.

166 **2.Data and methodology**

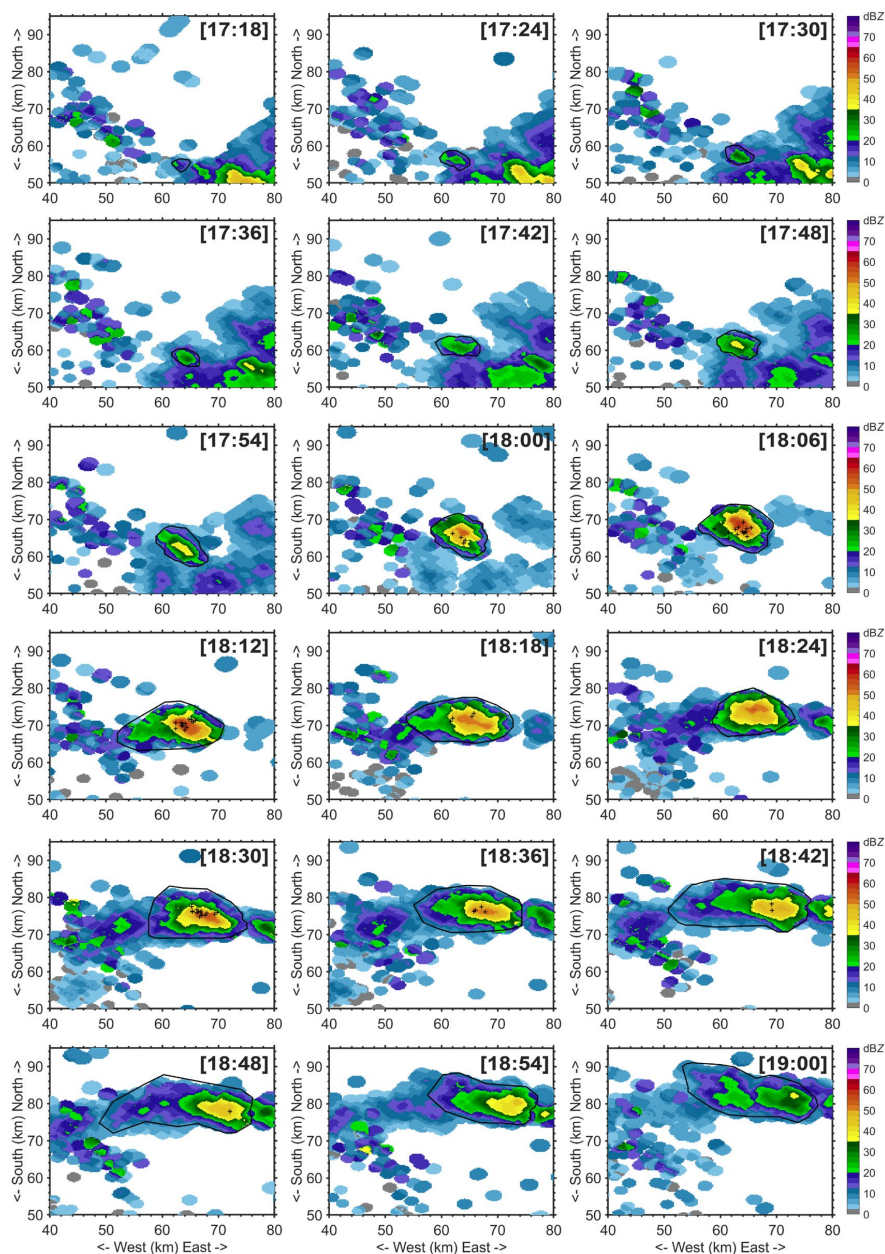
167 **2.1. Radar and lightning observations**

168 On 20 June 2016, one isolated thunderstorm cell was observed via an S-band dual-polarization
169 radar deployed in Guangzhou city (GZ radar) (Figure 1). The composite reflectivity data revealed
170 that this thunderstorm (the boundary was determined via manual inspection; the black lines in Figure
171 1) was nearly stationary and that the cloud life cycle lasted approximately two hours. Lightning
172 activity occurred when values of composite reflectivity >35 dBZ were present; this phenomenon
173 seemingly supported the results of Hayashi et al. (2021), highlighting the importance of graupel in
174 cloud electrification.

175 The beam width of the GZ radar is $\leq 1^\circ$, and the azimuth and range resolutions are 1° and 250
176 m, respectively. A full radar volume scan lasted 6 minutes at nine elevation angles. The GZ radar



177 data were processed via the Python ARM Radar Toolkit (Py-ART), including quality control
178 (Helmus and Collis, 2016; Li, et al., 2023; Li, et al., 2024). The Z_{DR} offset of the raw data was
179 corrected via drizzle, and the calibration accuracy was expected to be 0.1–0.2 dB (Bringi and
180 Chandrasekar, 2001). The radar data were gridded via Py-ART gridding routines on a Cartesian grid
181 with a 0.25-km horizontal resolution and a 500-m vertical resolution (“Barnes2” method).



182

183 Figure 1. The composite reflectivity of the isolated thunderstorm cell on 20 June 2016, which initiated at 17:18 and

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ended at 19:00 (China Standard Time, CST). The black lines indicate the boundary of this thunderstorm. The black

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crosses indicate the lightning flashes, and the location of once lightning flash is represented by the location of the

186

first discharge pulse event.



187 The lightning flashes within this thundercloud were detected via a low-frequency E-field
188 detection array (LFEDA), which is a 3-D mapping detection system for intracloud and CG lightning,
189 with 10 sensors. Previous studies (Fan, et al., 2018; Shi, et al., 2017) utilized information from
190 triggered lightning flashes to evaluate LFEDA detection results; the results show the detection
191 efficiency of the LFEDA can reach 100%, and the mean location error is 102 m. Discharge pulse
192 events were grouped into a lightning flash via the same method as described by Liu et al. (2020). If
193 any source within one lightning flash is below the 2-km height, this lightning flash was regarded as
194 one cloud-to-ground flash, as suggested by Zhao et al. (2021).

195 The lightning flashes were assigned to the isolated thunderstorm on the basis of the boundary
196 of the thunderstorm, as well as a constraint every 6 minutes (according to the duration of a full radar
197 volume scan). The life cycle of this isolated thunderstorm initiated from the first radar echo (i.e.,
198 the presence of a maximum $Z_H \geq 5$ dBZ in a full radar volume scan within this cloud was first
199 detected by the GZ radar, as suggested by Zhao et al. (2021, 2022, 2024)) and ended when the
200 maximum Z_H started to decrease and Z_H reached ≤ 40 dBZ. The distributions of these detection
201 systems, including radar and lightning location system, were illustrated by in Zhao et al. (2024).

202 **2.2. Cloud microphysical parameter retrieval methods**

203 To estimate the precipitation-sized ice mass (e.g., graupel, hail, and frozen drops) and the
204 content of supercooled raindrops within the mixed-phase zone, an approach on the basis of
205 difference reflectivity (Z_{DP} , dB) is applied (Carey and Rutledge, 2000). Pruppacher and Klett (1997)
206 assumed that precipitation-sized ice particles were more spherically symmetrical or tumble. The low
207 dielectric constant and significant canting behaviour of ice particles likely result in a near-zero Z_{DR}
208 (e.g., Seliga and Bringi, 1976). Therefore, the horizontal reflectivity and vertical reflectivity are
209 equal for ice particles, as “effective spheres”, and Z_{DP} is solely influenced by raindrops.

210 If the relationship between horizontal reflectivity and Z_{DP} (raindrops) is known, the horizontal
211 reflectivity of raindrops can be derived, and the residual difference in the observed horizontal
212 reflectivity can be regarded as being associated with ice particles. The standard error for the
213 relationship between horizontal reflectivity and Z_{DP} is consistently approximately 1 dB (Carey and
214 Rutledge, 2000). The estimated ice mass from the horizontal reflectivity of ice particles is
215 proportional to the actual ice mass and depends on the variability in the intercept parameter of an



216 assumed inverse exponential distribution for ice and the ice density; thus, the trends of the estimated
217 ice mass are deemed sufficient to investigate lightning activity.

218 The estimated ice masses are assigned to graupel masses on the basis of scattering properties,
219 namely, where the Z_H values exceed 35 dBZ (Carey and Rutledge, 2000; Kumjian, 2013a, b; Zhao,
220 et al., 2021). The rain water content above the freezing level (0°C isotherm height; sounding data
221 from the Qingyuan meteorological observatory are used to obtain the environmental temperature)
222 is defined as the supercooled raindrop mass.

223 Z_{DR} columns are associated with low concentration of large raindrops (>2 mm); thus, the
224 median volume diameter D_0 of raindrops is retrieved via the method described by Hu and Ryzhkov
225 (2022) to provide supporting evidence for identifying Z_{DR} columns. The fractional standard
226 deviation of the D_0 estimation is approximately 10% (Hu and Ryzhkov, 2022).

227 **2.3. Previous automatic identification and quantification methods for Z_{DR}/K_{DP} columns**

228 Currently, a few methods are available to automatically identify and quantify Z_{DR}/K_{DP} columns
229 (e.g., Woodard et al., 2012; Krause and Klaus, 2024; Sharma, et al., 2024; Snyder, et al., 2015; van
230 Lier-Walqui, et al., 2016). These methods are constructed on the basis of the morphology of the
231 Z_{DR}/K_{DP} columns and/or the high values (e.g., $Z_{DR} > 1$ dB; $K_{DP} > 1^\circ/\text{km}$) above the freezing level.

232 In the stage of cloud formation, high Z_{DR} values above the freezing level are simply used to
233 identify Z_{DR} columns; however, these high values are not always associated with the Z_{DR} columns.
234 Notably, three-body scatter signatures (Zrníc, 1987), depolarization streaks associated with the
235 canting behaviour of ice in regions of strong electrification (Kumjian, 2013c), and oblate ice
236 particles can lead to enhanced positive Z_{DR} values (Kumjian, 2013a). Thus, additional requirements
237 were imposed to avoid identification errors, e.g., the reflectivity threshold value ($Z_H \geq 40$ dBZ)
238 (Woodard et al., 2012) and the height should be below the homogeneous freezing level, and the
239 maximum height of the Z_{DR} column should be associated with the height at which Z_{DR} displays a
240 negative vertical gradient (van Lier-Walqui, et al., 2016).

241 Recently, Krause and Klaus (2024) utilized the hotspot technique to identify the base of the
242 Z_{DR} column on the basis of constant altitude plan projection indicators (CAPPIS). Although their
243 results indicated an improvement in the plan region identified on the basis of the Z_{DR} column
244 approach over the results of two different existing algorithms (Thunderstorm Risk Estimation from



245 Nowcasting Development via Size Sorting algorithm and the algorithm introduced by Snyder et al.
246 (2015)), the depth and volume information for Z_{DR} columns was lost, which was not beneficial for
247 forecasting lightning activity. In addition, the reflectivity threshold value ($Z_H > 25$ dBZ) was required
248 in this algorithm. Sharma et al. (2024) used an algorithm in the “scikit-image” Python package to
249 identify Z_{DR}/K_{DP} columns from Cartesian grid data via threshold values ($Z_{DR} \geq 1$ dB; $K_{DP} \geq 1^\circ/\text{km}$);
250 they restricted the Z_H values to exceed 20 dBZ, and any instances of obvious data contamination or
251 unrealistic values during the gridding process were manually removed prior to analysis. They
252 focused on three supercells during lightning activity, and violent convection in such case will ignore
253 the formation of Z_{DR}/K_{DP} columns at weak echo intensities, i.e., in the initiation stage of convective
254 clouds.

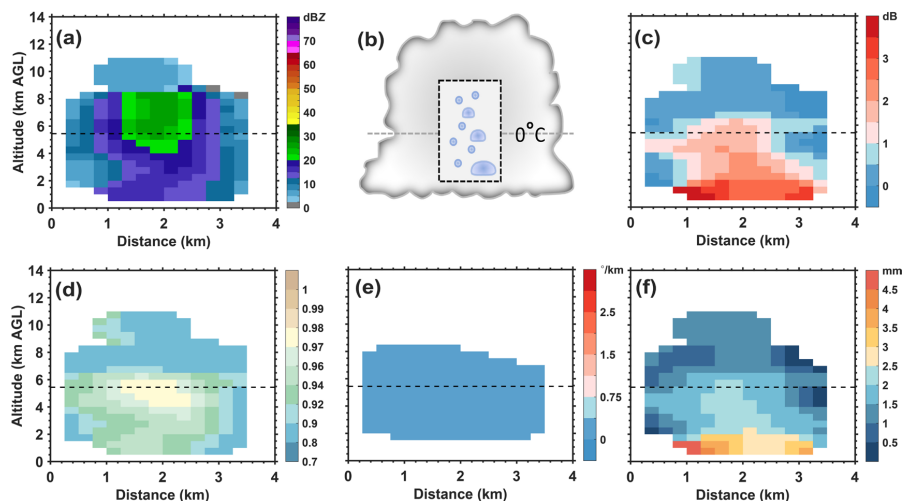
255 **2.4. Automatic 3D mapping of Z_{DR}/K_{DP} columns during the life cycle of an isolated cell storm**

256 Our objective in this study is to explore the performance of microphysics retrieved via radar
257 for forecasting lightning activity within isolated thunderstorm cells during the cloud life cycle. As
258 depicted in Figure 1, our radar observations indicate that before the initiation of lightning, the echo
259 intensity is weak during the early stage of a cloud. Moreover, we seek to determine whether Z_{DR}
260 columns form in the early stages of cloud formation. In addition, K_{DP} columns are representative of
261 small drops with high concentration shed from large ice particles (e.g., hailstones) growing in a wet
262 regime (Hubbert, et al., 1998; Loney, et al., 2002); thus, are K_{DP} columns absent in the initial stage
263 of convective cloud formation and even in early stages of lightning activity?

264 Figure 2 shows the first appearance of the Z_{DR} column at 17:24 (China Standard Time, CST),
265 which is ~36 minutes earlier than the first lightning occurrence and only lags behind the first radar
266 echo by 6 minutes. The high values of Z_{DR} extend to the mixed-phase region from the cloud bottom,
267 and the height of the Z_{DR} column is approximately 1 km (Figure 2c). The corresponding Z_H values
268 are smaller than 30 dBZ, but with the values of the co-polar correlation coefficient (CC) are
269 relatively high (Figure 2a, d). These characteristics indicate the presence of large raindrops with low
270 concentrations; the low K_{DP} values and large size of raindrops (exceeding 2 mm) support that
271 (Figure 2e, f), we illustrate the microphysical structure corresponding to high Z_{DR} values in Figure
272 2b. The threshold value for identifying the Z_{DR} column in this study is 1.5 dB, considering that the
273 size of raindrops should exceed 2 mm within the Z_{DR} column during the initial phase of a storm



274 (e.g., Kumjian, et al., 2014). In addition, the K_{DP} column is absent in the initial phase of this storm,
 275 not appearing until 18:30 CST.



276
 277 Figure 2. Cross section from the Cartesian grid of the studied isolated thunderstorm at 17:24 CST. (a) Z_H . (b)
 278 Conceptual model of the microphysical structure within high Z_{DR} values. (c) Z_{DR} , (d) CC, (e) K_{DP} . (f) Median
 279 volume diameter D_0 of raindrops. The black dashed line indicates the 0°C isotherm height.

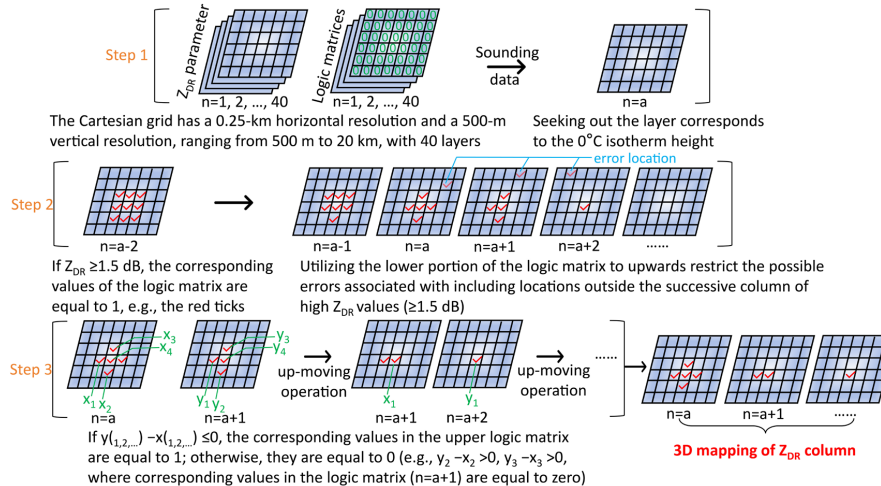
280 In this study, we establish a method that only depends on the Z_{DR} parameter for identifying and
 281 easily quantifying the Z_{DR} column (e.g., height and volume) during the whole life cycle of a storm,
 282 specifically, including the initial phase of a convective cloud; the morphology of the Z_{DR} column
 283 resulted by size sorting and the high Z_{DR} values (≥ 1.5 dB) in Cartesian grid data are combined as
 284 the basis of this method. A flow chart of this method is depicted in Figure 3.

285 First, we establish logic matrices with the same specifications as the Z_{DR} matrices and identify
 286 the layer that corresponds to the 0°C isotherm height (with sounding data used to determine the
 287 environmental temperature). Second, from the 1-km height below the freezing level to the mixed-
 288 phase region, if $Z_{DR} \geq 1.5$ dB, the corresponding logic values in the logic matrix are equal to 1.
 289 Notably, we utilize the lower portion of the logic matrix to upwards restrict the possible errors
 290 associated with including locations outside the successive column of high Z_{DR} values (≥ 1.5 dB).
 291 This restriction condition is based on the column morphology (columnar shape), which results from
 292 drop size sorting. Specifically, the region of the Z_{DR} column contracts upwards from the 0°C
 293 isotherm height below the mixed-phase region (e.g., as shown in Amiot et al. (2019), Hubbert et al.



294 (2018), Kumjian et al. (2014), Snyder et al. (2015) and Tuttle et al. (1989)). In the Cartesian grid
 295 data, this phenomenon is particularly obvious (Figure 2c).

296 Third, the size distribution of raindrops within the Z_{DR} column is determined by size sorting;
 297 thus, we utilize the negative vertical gradient of Z_{DR} on the basis of every grid between two adjacent
 298 layers from the 0°C isotherm height to the uppermost limit height to further ensure that the grids are
 299 associated with the Z_{DR} column. Finally, a 3D mapping of the Z_{DR} column is constructed. We can
 300 use the grid information to compute the height and volume of the Z_{DR} column. Although the
 301 formation mechanism of the K_{DP} column is different from that of the Z_{DR} column, the morphology
 302 of the K_{DP} column is highly consistent with that of the Z_{DR} column; thus, this method can be applied
 303 to map the K_{DP} column with a 3D grid based on the threshold value for identifying the K_{DP} column
 304 (e.g., $\geq 1^{\circ}/\text{km}$).



305

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Figure 3. Flow chart of 3D mapping of a Z_{DR} column.

307

3.Results

308

3.1. Assessment of Z_{DR}/K_{DP} columns identified via the “3D mapping columns” method

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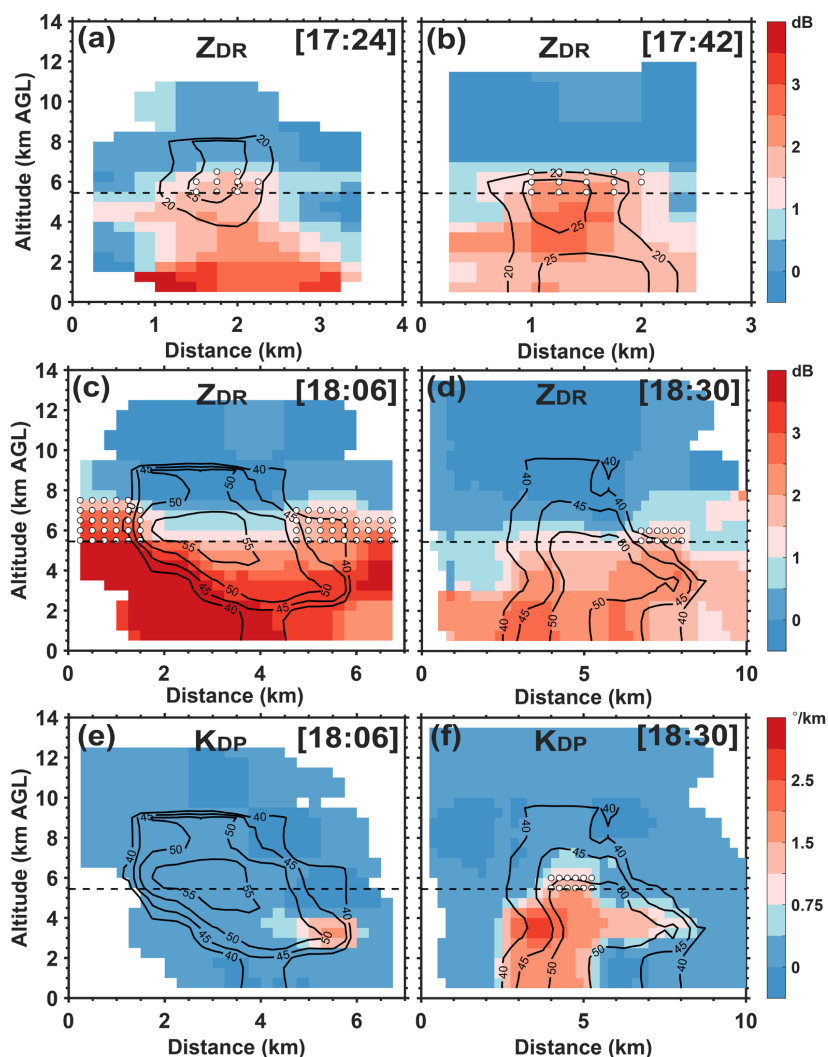
Snapshots of the identified Z_{DR} columns via the “3D mapping columns” method at four
 310 moments (the K_{DP} column only existed at one moment during the life cycle of this thunderstorm)
 311 are shown in Figure 4. The identified regions of the Z_{DR}/K_{DP} columns are represented by white dots.

312

We verify that the “3D mapping columns” method performs well in identifying the Z_{DR}/K_{DP} columns

313

via manual inspection.



314

315 Figure 4. Cross sections from the Cartesian grid of the studied isolated thunderstorm at (a) 17:24 CST, Z_{DR}; (b)

316 17:42 CST, Z_{DR}; (c) 18:06 CST, Z_{DR}; (d) 18:30 CST, Z_{DR}; (e) 18:06 CST, K_{DP}; and (f) 18:30 CST, K_{DP}. The black

317 dashed line indicates the 0°C isotherm height. The white dots indicate the areas of the identified Z_{DR}/K_{DP} columns.

318 The black contours with values indicate the reflectivity structure.

319 The first Z_{DR} column in this isolated thunderstorm occurred at 17:24 CST (Figure 4a). The

320 second Z_{DR} column subsequently occurred at 17:42 CST after 18 minutes (Figure 4b). At 18:06 CST,

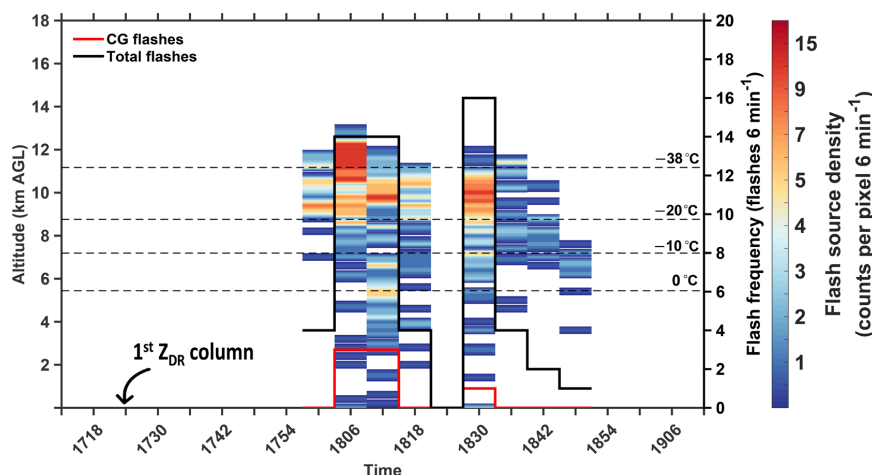
321 the lightning activity reached the first peak (Figure 5; to compare the radar and lightning data, the

322 lightning flash frequency was counted every 6 minutes), and the Z_{DR} column was the highest and



323 largest (in volume) at this time. However, the overlap region between the Z_{DR} column and
 324 reflectivity core at 17:24 and 17:42 CST disappeared at 18:06 CST (Figure 4c); i.e., the Z_{DR} column
 325 within the reflectivity core began to collapse because of the falling of large-sized (represented by
 326 Z_H values exceeding 40 dBZ) ice particles.

327 Although large ice particles form and fall, the K_{DP} column is absent. However, a K_{DP} core with
 328 high values ($\geq 1^\circ/\text{km}$) occurs near the location where large ice particles (approximately 50 dBZ)
 329 melt, and a shedding process occurs, resulting in a K_{DP} core. At 18:30 CST, the lightning activity
 330 reaches the second peak (Figure 5), but the Z_{DR} column almost disappears; interestingly, the K_{DP}
 331 column forms, with high values expanding downwards to the bottom of the cloud (Figure 4d, f).
 332 Thus, we suspect that K_{DP} column in this study may have formed on the basis of the raindrops (1–2
 333 mm) shed from hailstones melting in the warm-phase region, which recirculated into the updrafts
 334 and were lifted to the mixed-phase region.



335
 336 Figure 5. Time–height variation in flash source density (count per pixel, 6 min^{-1}). The black (red) stepped line
 337 indicates the total flashes (CG flashes) from the LFEDA. The dashed lines indicate the isotherm heights from 0 to
 338 -38°C .

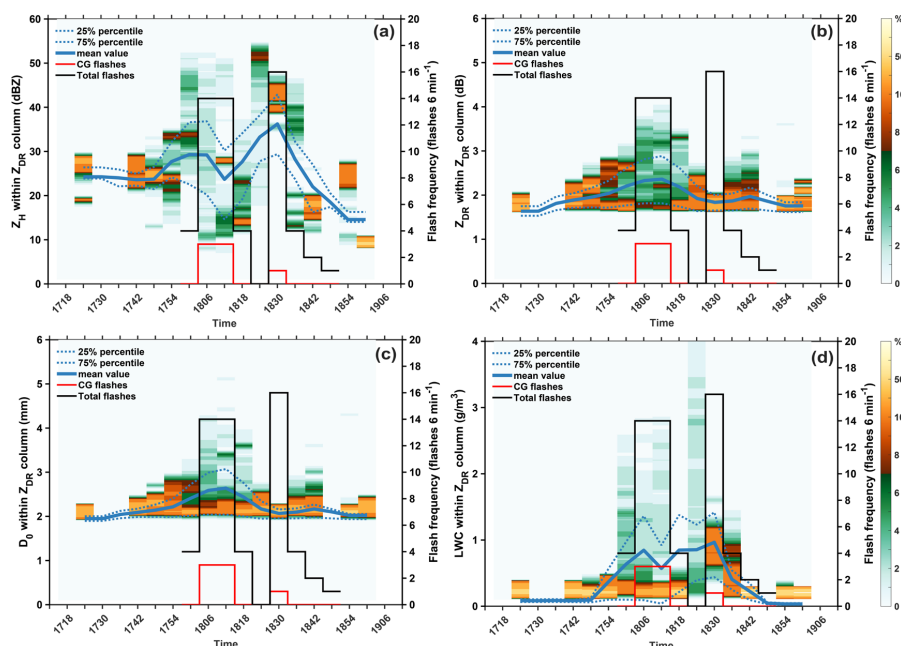
339 3.2. The polarimetric and microphysical characteristics within the Z_{DR} columns

340 Figure 6 shows the normalized distributions of the polarimetric and microphysical
 341 characteristics within the series of Z_{DR} columns during the life cycle of the studied thunderstorm.
 342 The Z_H values within the Z_{DR} columns range from approximately 10 to 55 dBZ; specifically, weak
 343 reflectivity is present in the initial phase of the thundercloud (Figure 6a). This suggests the use of



344 the Z_H threshold value (e.g., 25, 40, or 35–50 dBZ) to help select Z_{DR} columns results in the loss of
 345 information, especially for the initial phase of clouds. The increase in reflectivity intensity within
 346 the Z_{DR} columns can be used to predict lightning activity, and the peaks in both reflectivity intensity
 347 and lightning activity are consistent. A strong reflectivity intensity peak is associated with a high
 348 number of lightning flashes (Figure 6a).

349 The Z_{DR} values within the Z_{DR} columns range from approximately 1.5 to 4 dB, and the
 350 increasing trend of the Z_{DR} values is consistent with the first peak of lightning activity but has a low
 351 correlation with the second peak of lightning activity (Figure 6b). The pattern of D_0 within the Z_{DR}
 352 columns is similar to that of the Z_{DR} values, depending on the strong linear relationship between D_0
 353 and Z_{DR} (Figure 6c). The liquid water content within the Z_{DR} columns ranges from approximately
 354 0.1 to 4 gm^{-3} , and the peaks correspond to the two peaks of lightning activity (Figure 6d). However,
 355 the relationship between the liquid water content within the Z_{DR} columns and the lightning flash
 356 frequency is not as strong as that between the Z_H values within the Z_{DR} columns and the lightning
 357 flash frequency.

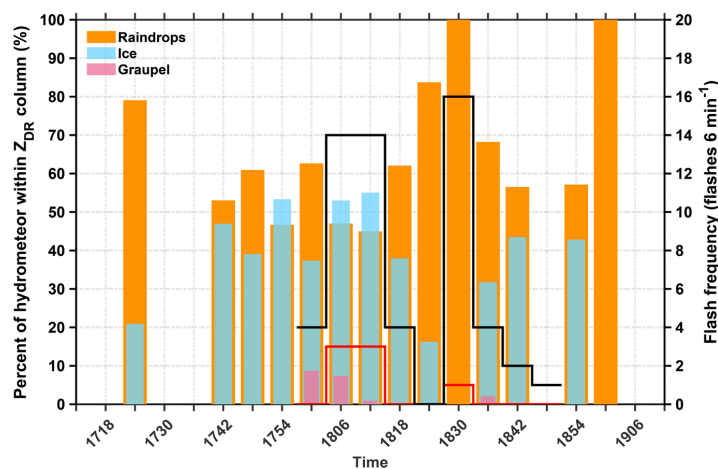


358
 359 Figure 6. The normalized distributions of the polarimetric and microphysical characteristics within the series of
 360 Z_{DR} columns. (a) Z_H . (b) Z_{DR} . (c) Liquid water content (LWC). (d) Median volume diameter (D_0) of raindrops. The



361 blue solid line indicates the mean value. The blue dashed lines indicate the 25% and 75% percentiles. The black
 362 (red) stepped line indicates the total flashes (CG flashes) from LFEDA, and the lightning flash frequency is
 363 counted every 6 minutes.

364 In addition, the percentage of hydrometeors within the Z_{DR} columns is investigated on the basis
 365 of the retrieved contents of ice (including graupel) or raindrops, as described in Section 2b. The
 366 obvious phenomenon is that the percentage of graupel within the Z_{DR} columns suddenly peaks
 367 before the first peak of lightning activity, but the second peak of lightning activity is not related to
 368 the presence of graupel within the Z_{DR} columns; the hydrometeor type within the Z_{DR} column at
 369 18:30 CST is raindrops (Figure 7). This indicate the collapse of the Z_{DR} column within the
 370 reflectivity core at 18:30 CST, which is consistent with the results shown in Figure 4d. On the other
 371 hand, the sudden increase in graupel within the Z_{DR} column at 18:00 CST may support the presence
 372 of a coalescence–freezing mechanism that led to graupel formation in the warm-based clouds. The
 373 hypothesis about coalescence–freezing mechanism was proposed in previous studies (e.g., Braham,
 374 1986; Bringi, et al., 1997; Carey and Rutledge, 2000; Herzegh and Jameson, 1992).



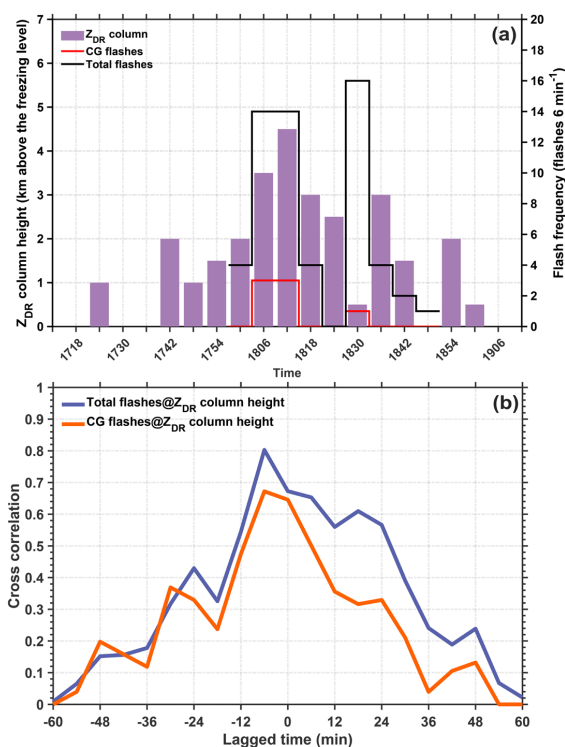
375
 376 Figure 7. The percentages of hydrometeors within the series of Z_{DR} columns. The orange bars indicate the
 377 percentage of raindrops. The blue bars indicate the percentage of ice particles (including graupel). The pink bars
 378 indicate the percentage of graupel. The black (red) stepped line indicates the total flashes (CG flashes) from
 379 LFEDA, and the lightning flash frequency is counted every 6 minutes.

380 3.3. Relationship between lightning activity and quantified Z_{DR} columns



381 To determine the relationship between lightning activity and the quantified Z_{DR} columns, the
 382 height and volume of the Z_{DR} column are calculated via the “3D mapping column” method; the
 383 volume is based on the accumulation of all grids within the Z_{DR} column, and the volume of a single
 384 grid is 0.03125 km^3 , with 0.25-km horizontal and 500-m vertical resolutions. The height of the Z_{DR}
 385 column is determined by counting the grid number (n) from the freezing level to the highest grid
 386 within the Z_{DR} column; if n is determined, the Z_{DR} column height is $n \times 0.5 \text{ km}$.

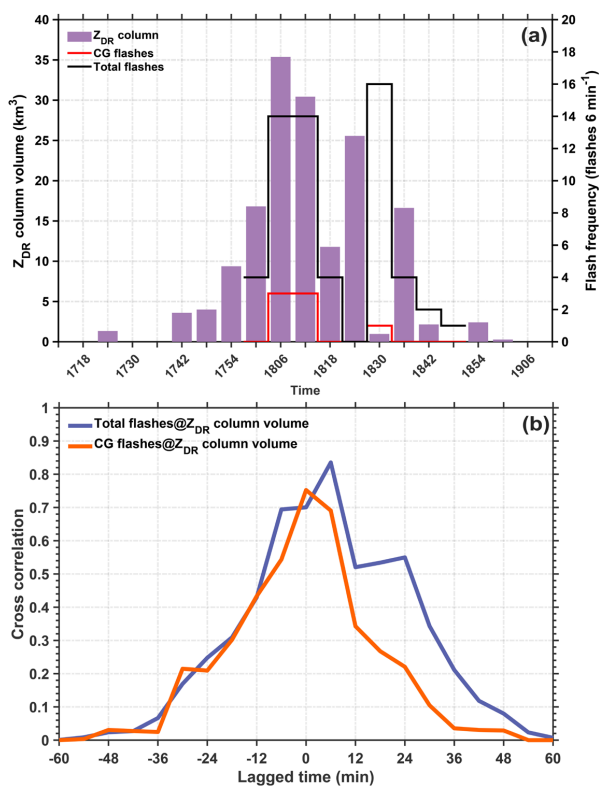
387 Figure 8a displays the variations in the lightning flash frequency and Z_{DR} column height. The
 388 variation trend of the lightning activity before the second peak is highly consistent with the trend of
 389 the Z_{DR} column height. However, these trends seem to be in sync, which is not beneficial for
 390 forecasting lightning activity. The cross-correlation approach can be used to examine the correlation
 391 considering the time lag, which is important for verifying whether a parameter is appropriate for
 392 forecasting another parameter. Figure 8b shows the cross-correlation between lightning activity and
 393 the Z_{DR} column height. The highest correlation coefficient (~ 0.8) between lightning activity and
 394 the Z_{DR} column height is observed at a lag time of -6 minutes; thus, the variation in lightning activity
 395 occurs before that in the Z_{DR} column height (Figure 8b).





397 Figure 8. (a) The variation in the Z_{DR} column height with time. The purple bars indicate the heights of the Z_{DR}
 398 columns. The black (red) stepped line indicates the total flashes (CG flashes) from LFEDA, and the lightning flash
 399 frequency is counted every 6 minutes. (b) Cross-correlation between flash frequency and Z_{DR} column height; the
 400 blue and orange lines indicate the total flashes and CG flashes, respectively.

401 Figure 9 shows the relationship between lightning activity and the Z_{DR} column volume, and
 402 the variation trend in the second peak of lightning activity is indistinguishable via the variation trend
 403 in the Z_{DR} column volume (Figure 9a); this finding is similar to that shown in Figure 8a. The highest
 404 correlation coefficient between the lightning activity and Z_{DR} column volume is improved (~ 0.84
 405 for the total flashes and 0.75 for CG flashes); specifically, the variation trend of the Z_{DR} column
 406 height can be used to predict the lightning activity (total flashes) after 6 minutes (Figure 9b).



407

408

Figure 9. The same as in Figure 8 but for the Z_{DR} column volume.

409

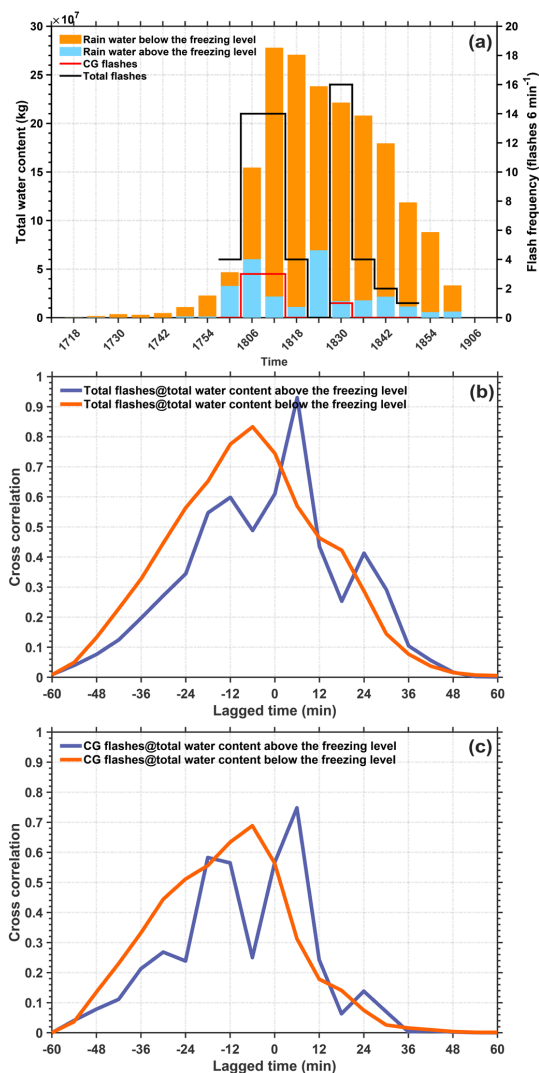
3.4. Relationship between lightning activity and ice (liquid) microphysics



410 The microphysical characteristics of ice or liquid should exhibit a strong relationship with
411 lightning activity on the basis of a noninductive charging mechanism. As expected, Figure 10
412 indicates that the variation in the rain-water content above the freezing level within the cloud can
413 be better used to forecast lightning activity (total flashes) than can the variation in the Z_{DR} column
414 volume. The highest correlation coefficient between the lightning activity (total flashes) and
415 supercooled liquid water reaches approximately 0.93, and the lightning activity lag time is 6 minutes.

416 Figure 11 shows that the variation in the ice or graupel content above the freezing level within
417 the cloud can indicate the lightning activity (total flashes) in real time, and the highest correlation
418 coefficient between the lightning activity (total flashes) and the ice content is 0.84–0.89. However,
419 the graupel content above the freezing level within the cloud is the best indicator for forecasting
420 lightning activity (CG flashes); the highest correlation coefficient between lightning activity (CG
421 flashes) and the graupel content is approximately 0.86, and the trend of CG flashes lags behind the
422 variation in graupel content above the freezing level within the cloud, with a lag time of 6 minutes.

423 Therefore, the content of supercooled liquid water within the cloud is the best proxy for
424 forecasting lightning activity (total flashes) after 6 minutes; the graupel content above the freezing
425 level within the cloud is the best proxy for forecasting the lightning activity (CG flashes) after 6
426 minutes.



427

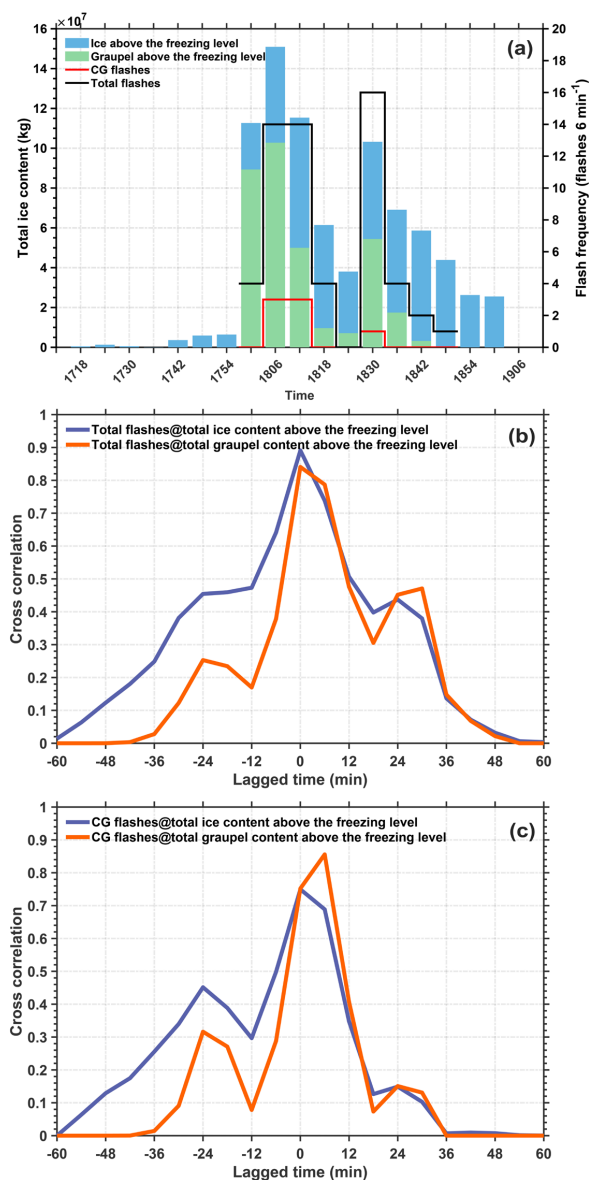
428 Figure 10. (a) The variation in total water content over time. The orange bars indicate rainwater below the freezing

429 level. The blue bars indicate rainwater above the freezing level. (b) Cross-correlation between flash frequency and

430 liquid microphysical characteristics; the blue and orange lines indicate the total flashes and CG flashes,

431

respectively.



432

433

Figure 11. The same as in Figure 10 but for the total ice content.

434 **4. Conclusion and discussion**

435 The relationship between the polarimetric structure and lightning activity is investigated within
 436 an isolated thunderstorm cell during the cloud life cycle in this study. We focus on the proxies of
 437 cloud updrafts and supercooled liquid raindrops (Z_{DR} or K_{DP} columns) and the content of ice or
 438 rainwater, which have been demonstrated to be related to the variations in the number of lightning



439 flashes in previous studies (e.g., Carey and Rutledge, 2000; Hayashi et al., 2021; Sharma et al., 2024;
440 Sharma, et al., 2021; van Lier-Walqui, et al., 2016). Therefore, the objective of this study is to clarify
441 the sequence and interactions of these parameters for predicting lightning activity during the cloud
442 life cycle and understanding the corresponding cloud microphysics.

443 To precisely identify and quantify the Z_{DR} or K_{DP} columns within an isolated thunderstorm
444 during the whole cloud life cycle, the “3D mapping columns” method is established; it based on the
445 morphology and high values of the Z_{DR} or K_{DP} columns in Cartesian grid data. The “3D mapping
446 columns” method has advantages in identifying Z_{DR} columns in the initiation phase of convective
447 clouds, avoiding the inappropriate threshold value of Z_H . The moment of occurrence of the first Z_{DR}
448 column can be determined at least 36 minutes prior to the first lightning flash (Figure 5), which is a
449 substantial lead time for forecasting the first lightning flash; notably, the numerical value was
450 usually 4~6 minutes in previous studies (e.g., Gremillion and Orville, 1999; Vincent et al., 2003;
451 Mosier, et al., 2011).

452 The volume and height of Z_{DR} columns are quantified via the “3D mapping columns” method,
453 and the correlation coefficient indicates that the volume of the Z_{DR} column is better for forecasting
454 lightning activity than is the column height. In addition, both the volume and height of a Z_{DR} column
455 have some limitations in forecasting lightning activity, except during the early phase. This
456 phenomenon is similar to the results of Sharma et al. (2024). In their study, the correlation coefficient
457 between the Z_{DR} column volume and total flash rate generally monotonically decreased after initial
458 lightning jump, and the volume of the K_{DP} columns exhibited relatively high co-variability with the
459 total flash rate, except in the early phase. The time lag between reported between the formation of
460 the Z_{DR} column and that of the K_{DP} column was consistent with the results of this study, indicating
461 the different formation mechanisms of the Z_{DR} and K_{DP} columns described in Section 1.

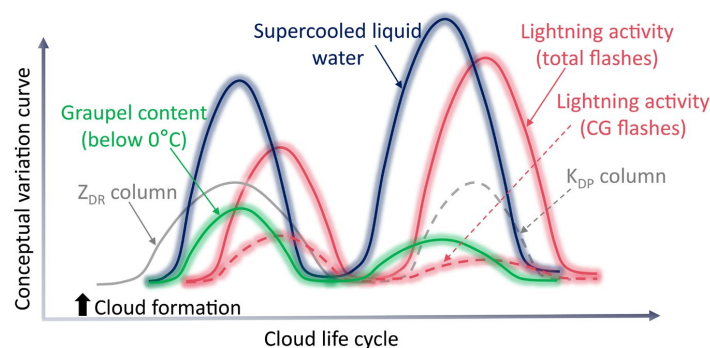
462 As shown in Figure 4 and discussed in Section 3.1, we hypothesize that the K_{DP} column may
463 form on the basis of the raindrops (1–2 mm) that shed from hailstones melting in the warm-phase
464 region of clouds, which then recirculate into the updrafts and are lifted to the mixed-phase region.
465 This is different from the hypothesis proposed in previous studies (e.g., (Bringi, et al., 1996, Hubbert,
466 et al., 1998, Loney, et al., 2002)). Thus, the presence of many or large hailstones in supercells may



467 result in robust K_{DP} columns (e.g., (Sharma, et al., 2024)); in contrast, short lifetimes and weak
 468 dynamics within isolated thunderstorm cells in this study result in single-moment K_{DP} column.

469 Notably, our results indicate that the content of supercooled liquid water is the best variable
 470 for forecasting lightning activity (total flashes); the correlation coefficient is approximately 0.94,
 471 and the lead time is 6 minutes. For CG flash forecasting, the content of graupel displays the highest
 472 correlation coefficient (~ 0.86) with lightning activity, and the lead time is also 6 minutes. Similar
 473 results were reported by Carey and Rutledge (2000), suggesting that graupel particles are likely
 474 related to CG flash occurrence.

475 In our opinion, the prediction of lightning activity should involve the content of supercooled
 476 liquid water and graupel. Specifically, the first occurrence of the Z_{DR} column can be used to forecast
 477 lightning initiation as early as possible. Owing to the time lag between the formation of the Z_{DR} and
 478 K_{DP} columns, the signatures of the Z_{DR} and K_{DP} columns should be coupled to retrieve dynamic
 479 information instead of lightning activity; specifically, the Z_{DR} column is only suitable for the early
 480 phase of cloud development. We bridged the polarimetric structure (four important parameters
 481 provided in previous studies) and lightning activity on the basis of observations of a
 482 thermodynamically dominated isolated thunderstorm cell (the variation curve is conceptualized in
 483 Figure 12).



484

485

Figure 12. A conceptual model bridging the polarimetric structure and lightning activity.

486

487

488

489

Notably, the variation in the Z_H intensity and liquid water content within the Z_{DR} columns can
 be used to predict lightning activity during the cloud life cycle, and the former is a better predictor.
 However, this result is novel and has not been reported previously; therefore, substantial
 investigations should be performed to verify this finding in the future. Although this study is based



490 on the results of previous studies (e.g., Carey and Rutledge, 2000; Krause and Klaus, 2024; Sharma
491 et al., 2024; Sharma, et al., 2021; Snyder, et al., 2015; van Lier-Walqui, et al., 2016; Woodard et al.,
492 2012), more types of thunderstorms and more samples should be analysed to reduce the probability
493 of uncertainty in our study.

494

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506

507 **Author contributions:**

508 Conceptualization: CZ and YZ. Data curation: CZ, YZ, DZ, SD, and WY. Formal analysis: CZ, YZ,
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510 YZ, HZ, ZL, and DZ. Project administration: YZ. Resources: CZ and YZ. Software: CZ, HZ, and
511 ZL. Supervision: YZ. Validation: CZ and YZ. Visualization: CZ and YZ. Writing (original draft):
512 CZ, YZ, and XP.

513 **Competing interests:**

514 The contact author has declared that none of the authors has any competing interests.

515

516 **Data and materials availability:** All data in this study can be obtained from an open repository
517 Figshare (Zhao, 2024).

518



519 **References**

- 520 Amiot, C. G., Carey, L. D., Roeder, W. P., McNamara, T. M. and Blakeslee, R. J.: C-band Dual-
521 Polarization Radar Signatures of Wet Downbursts around Cape Canaveral, Florida. *Weather*
522 and Forecasting, 34(1): 103-131, 10.1175/waf-d-18-0081.1, 2019.
- 523 Baker, M. B., Blyth, A. M., Christian, H. J., Latham, J., Miller, K. L. and Gadian, A. M.:
524 Relationships between lightning activity and various thundercloud parameters: satellite and
525 modelling studies. *Atmospheric Research*, 51: 221-236, 10.1016/S0169-8095(99)00009-5,
526 1999.
- 527 Baker, M. B., Christian, H. J. and Latham, J.: A computational study of the relationships linking
528 lightning frequency and other thundercloud parameters. *Quarterly Journal of the Royal*
529 *Meteorological Society*, 121(527): 1525-1548, 10.1002/qj.49712152703, 1995.
- 530 Braham, R. R. Jr.: The cloud physics of weather modification. Part 1: Scientific basis. *WMO*
531 *Bulletin*, 35, 215–221, 1986.
- 532 Bringi, V. N. and Chandrasekar, V.: *Polarimetric Doppler Weather Radar: Principles and*
533 *Applications*. Cambridge University Press, Cambridge. 2001.
- 534 Bringi, V. N., Knupp, K., Detwiler, A., Liu, L., Caylor, I. J. and Black, R. A.: Evolution of a Florida
535 Thunderstorm during the Convection and Precipitation/Electrification Experiment: The Case
536 of 9 August 1991. *Monthly Weather Review*, 125(9): 2131-2160, [https://doi.org/10.1175/1520-](https://doi.org/10.1175/1520-0493(1997)125<2131:EOAFTD>2.0.CO;2)
537 [0493\(1997\)125<2131:EOAFTD>2.0.CO;2](https://doi.org/10.1175/1520-0493(1997)125<2131:EOAFTD>2.0.CO;2), 1997.
- 538 Bringi, V. N., Liu, L., Kennedy, P. C., Chandrasekar, V. and Rutledge, S. A.: Dual Multiparameter
539 Radar Observations of Intense Convective Storms: The 24 June 1992 Case Study. *Meteorology*
540 and *Atmospheric Physics*, 59: 3-31, 10.1007/BF01031999, 1996.
- 541 Bruning, E. C. and MacGorman, D. R.: Theory and Observations of Controls on Lightning Flash
542 Size Spectra. *Journal of the Atmospheric Sciences*, 70(12): 4012-4029, 10.1175/jas-d-12-
543 0289.1, 2013.
- 544 Carey, L. D. and Rutledge, S. A.: A Multiparameter Radar Case Study of the Microphysical and
545 Kinematic Evolution of a Lightning Producing Storm. *Meteorology and Atmospheric Physics*,
546 59(1): 33-64, 10.1007/BF01032000, 1996.
- 547 Carey, L. D. and Rutledge, S. A.: The Relationship between Precipitation and Lightning in Tropical
548 Island Convection: A C-Band Polarimetric Radar Study. *Monthly Weather Review*, 128(8):
549 2687-2710, 10.1175/1520-0493(2000)128<2687:TRBPAL>2.0.CO;2, 2000.
- 550 Deierling, W. and Petersen, W. A.: Total lightning activity as an indicator of updraft characteristics.
551 *Journal of Geophysical Research: Atmospheres*, 113(D16), 10.1029/2007jd009598, 2008.
- 552 Deierling, W., Petersen, W. A., Latham, J., Ellis, S. and Christian, H. J.: The relationship between
553 lightning activity and ice fluxes in thunderstorms. *Journal of Geophysical Research:*
554 *Atmospheres*, 113(D15), 10.1029/2007jd009700, 2008.
- 555 Fan, X. P., Zhang, Y. J., Zheng, D., Zhang, Y., Lyu, W. T., Liu, H. Y. and Xu, L. T.: A New Method
556 of Three-Dimensional Location for Low-Frequency Electric Field Detection Array. *Journal of*
557 *Geophysical Research: Atmospheres*, 123(16): 8792-8812, 10.1029/2017jd028249, 2018.
- 558 Fridlind, A. M., van Lier-Walqui, M., Collis, S., Giangrande, S. E., Jackson, R. C., Li, X., Matsui,
559 T., Orville, R., Picel, M. H., Rosenfeld, D., Ryzhkov, A., Weitz, R. and Zhang, P.: Use of
560 polarimetric radar measurements to constrain simulated convective cell evolution: a pilot study
561 with Lagrangian tracking. *Atmospheric Measurement Techniques*, 12(6): 2979-3000,
562 10.5194/amt-12-2979-2019, 2019.



- 563 Gatlin, P. N. and Goodman, S. J.: A Total Lightning Trending Algorithm to Identify Severe
564 Thunderstorms. *Journal of Atmospheric and Oceanic Technology*, 27(1): 3-22,
565 10.1175/2009jtecha1286.1, 2010.
- 566 Gremillion, M. S., and Orville, R. E.: Thunderstorm Characteristics of Cloud-to-Ground Lightning
567 at the Kennedy Space Center, Florida: A Study of Lightning Initiation Signatures as Indicated
568 by the WSR-88D. *Weather and Forecasting*, 14: 640-649, 1999.
- 569 Goodman, S. J., Blakeslee, R., Christian, H., Koshak, W., Bailey, J., Hall, J., McCaul, E., Buechler,
570 D., Darden, C., Burks, J., Bradshaw, T. and Gatlin, P.: The North Alabama Lightning Mapping
571 Array: Recent severe storm observations and future prospects. *Atmospheric Research*, 76(1-4):
572 423-437, 10.1016/j.atmosres.2004.11.035, 2005.
- 573 Hayashi, S., Umehara, A., Nagumo, N. and Ushio, T.: The relationship between lightning flash rate
574 and ice-related volume derived from dual-polarization radar. *Atmospheric Research*, 248,
575 10.1016/j.atmosres.2020.105166, 2021.
- 576 Helmus, J. J. and Collis, S. M.: The Python ARM Radar Toolkit (Py-ART), a Library for Working
577 with Weather Radar Data in the Python Programming Language. *Journal of Open Research*
578 *Software*, 4(1), 10.5334/jors.119, 2016.
- 579 Herzegh, P. H. and Jameson, A. R.: Observing Precipitation through Dual-Polarization Radar
580 Measurements. *Bulletin American Meteorological Society*, 73(9): 1365-1376, 10.1175/1520-
581 0477(1992)073<1365:OPTDPR>2.0.CO;2, 1992.
- 582 Homeyer, C. R. and Kumjian, M. R.: Microphysical Characteristics of Overshooting Convection
583 from Polarimetric Radar Observations. *Journal of the Atmospheric Sciences*, 72(2): 870-891,
584 10.1175/jas-d-13-0388.1, 2015.
- 585 Hu, J. and Ryzhkov, A.: Climatology of the Vertical Profiles of Polarimetric Radar Variables and
586 Retrieved Microphysical Parameters in Continental/Tropical MCSs and Landfalling
587 Hurricanes. *Journal of Geophysical Research: Atmospheres*, 127(5), 10.1029/2021jd035498,
588 2022.
- 589 Hubbert, J., Bringi, V. N., Carey, L. D. and Bolen, S.: CSU-CHILL Polarimetric Radar
590 Measurements from a Severe Hail Storm in Eastern Colorado. *Journal of Applied Meteorology*
591 *and Climatology*, 37(8): 749-775, 10.1175/1520-0450(1998)037<0749:CCPRMF>2.0.CO;2,
592 1998.
- 593 Hubbert, J. C., Wilson, J. W., Weckwerth, T. M., Ellis, S. M., Dixon, M. and Loew, E.: S-Pol's
594 Polarimetric Data Reveal Detailed Storm Features (and Insect Behavior). *Bulletin of the*
595 *American Meteorological Society*, 99(10): 2045-2060, 10.1175/bams-d-17-0317.1, 2018.
- 596 Krause, J. and Klaus, V.: Identifying ZDR Columns in Radar Data with the Hotspot Technique.
597 *Weather and Forecasting*, 39(3): 581-595, 10.1175/waf-d-23-0146.1, 2024.
- 598 Kumjian, M.: Principles and applications of dual-polarization weather radar. Part I: Description of
599 the polarimetric radar variables. *Journal of Operational Meteorology*, 1(19): 226-242,
600 10.15191/nwajom.2013.0119, 2013a.
- 601 Kumjian, M.: Principles and applications of dual-polarization weather radar. Part II: Warm- and
602 cold-season applications. *Journal of Operational Meteorology*, 1(20): 243-264,
603 10.15191/nwajom.2013.0120, 2013b.
- 604 Kumjian, M.: Principles and applications of dual-polarization weather radar. Part III: Artifacts.
605 *Journal of Operational Meteorology*, 1(21): 265-274, 10.15191/nwajom.2013.0121, 2013c.
- 606 Kumjian, M. R., Khain, A. P., Benmoshe, N., Ilotoviz, E., Ryzhkov, A. V. and Phillips, V. T. J.: The



- 607 Anatomy and Physics of ZDR Columns: Investigating a Polarimetric Radar Signature with a
608 Spectral Bin Microphysical Model. *Journal of Applied Meteorology and Climatology*, 53(7):
609 1820-1843, 10.1175/jamc-d-13-0354.1, 2014.
- 610 Lang, T. J. and Rutledge, S. A.: A Framework for the Statistical Analysis of Large Radar and
611 Lightning Datasets: Results from STEPS 2000. *Monthly Weather Review*, 139(8): 2536-2551,
612 10.1175/mwr-d-10-05000.1, 2011.
- 613 Latham, J. and Dye, J. E.: Calculations on the electrical development of a small thunderstorm.
614 *Journal of Geophysical Research: Atmospheres*, 94(D11): 13141-13144,
615 <https://doi.org/10.1029/JD094iD11p13141>, 1989.
- 616 Li, H., Moisseev, D., Luo, Y., Liu, L., Ruan, Z., Cui, L. and Bao, X.: Assessing specific differential
617 phase (KDP)-based quantitative precipitation estimation for the record- breaking rainfall over
618 Zhengzhou city on 20 July 2021. *Hydrology and Earth System Sciences*, 27(5): 1033-1046,
619 10.5194/hess-27-1033-2023, 2023.
- 620 Li, H., Yin, J. and Kumjian, M.: Z Backwards Arc: Evidence of Multi-Directional Size Sorting in
621 the Storm Producing 201.9 mm Hourly Rainfall. *Geophysical Research Letters*, 51(10):
622 e2024GL109192, <https://doi.org/10.1029/2024GL109192>, 2024.
- 623 Liu, D., Li, F., Qie, X., Sun, Z., Wang, Y., Yuan, S., Sun, C., Zhu, K., Wei, L., Lyu, H. and Jiang, R.:
624 Charge Structure and Lightning Discharge in a Thunderstorm Over the Central Tibetan Plateau.
625 *Geophysical Research Letters*, 51(16): e2024GL109602,
626 <https://doi.org/10.1029/2024GL109602>, 2024.
- 627 Liu, Z., Zheng, D., Guo, F., Zhang, Y., Zhang, Y., Wu, C., Chen, H. and Han, S.: Lightning activity
628 and its associations with cloud structures in a rainstorm dominated by warm precipitation.
629 *Atmospheric Research*, 246, 10.1016/j.atmosres.2020.105120, 2020.
- 630 Loney, M. L., Zrnić, D. S., Straka, J. M. and Ryzhkov, A. V.: Enhanced Polarimetric Radar
631 Signatures above the Melting Level in a Supercell Storm. *Journal of Applied Meteorology*,
632 41(12): 1179-1194, [https://doi.org/10.1175/1520-0450\(2002\)041<1179:EPRSAT>2.0.CO;2](https://doi.org/10.1175/1520-0450(2002)041<1179:EPRSAT>2.0.CO;2),
633 2002.
- 634 López, R. E. and Aubagnac, J.-P.: The lightning activity of a hailstorm as a function of changes in
635 its microphysical characteristics inferred from polarimetric radar observations. *Journal of*
636 *Geophysical Research: Atmospheres*, 102(D14): 16799-16813,
637 <https://doi.org/10.1029/97JD00645>, 1997.
- 638 Marshall, T. C., Rust, W. D. and Stolzenburg, M.: Electrical structure and updraft speeds in
639 thunderstorms over the southern Great Plains. *Journal of Geophysical Research: Atmospheres*,
640 100(D1): 1001-1015, <https://doi.org/10.1029/94JD02607>, 1995.
- 641 Mitzeva, R. and Saunders, C. P. R.: Thunderstorm charging: calculations of the effect of ice crystal
642 size and graupel velocity. *Journal of Atmospheric and Terrestrial Physics*, 52(4): 241-245,
643 [https://doi.org/10.1016/0021-9169\(90\)90090-A](https://doi.org/10.1016/0021-9169(90)90090-A), 1990.
- 644 Mosier, R. M., Schumacher, C., Orville, R. E. and Carey, L. D.: Radar Nowcasting of Cloud-to-
645 Ground Lightning over Houston, Texas. *Weather and Forecasting*, 26(2): 199-212,
646 <https://doi.org/10.1175/2010WAF2222431.1>, 2011.
- 647 Pruppacher, H. R., and Klett, J. D.: *Microphysics of Clouds and Precipitation*. 2d ed. Kluwer
648 Academic, 954 pp., 1997.
- 649 Qie, X., Yu, Y., Liu, X., Guo, C., Wang, D., Watanabe, T. and Ushio, T.: Charge analysis on lightning
650 discharges to the ground in Chinese inland plateau (close to Tibet). *Ann. Geophys.*, 18(10):



- 651 1340-1348, 10.1007/s00585-000-1340-z, 2000.
- 652 Reynolds, S. E., Brook, M. and Gourley, M. F.: THUNDERSTORM CHARGE SEPARATION.
653 Journal of Atmospheric Sciences, 14(5): 426-436, <https://doi.org/10.1175/1520->
654 0469(1957)014<0426:TCS>2.0.CO;2, 1957.
- 655 Rison, W., Thomas, R. J., Krehbiel, P. R., Hamlin, T. and Harlin, J.: A GPS-based three-dimensional
656 lightning mapping system: Initial observations in central New Mexico. Geophysical Research
657 Letters, 26(23): 3573-3576, <https://doi.org/10.1029/1999GL010856>, 1999.
- 658 Rosenfeld, D., Lohmann, U., Raga, G. B., O'Dowd, C. D., Kulmala, M., Fuzzi, S., Reissell, A. and
659 Andreae, M. O.: Flood or Drought: How Do Aerosols Affect Precipitation? Science, 321(5894):
660 1309-1313, doi:10.1126/science.1160606, 2008.
- 661 Saunders, C.: Charge Separation Mechanisms in Clouds. Space Science Reviews, 137(1): 335-353,
662 10.1007/s11214-008-9345-0, 2008.
- 663 Seliga, T. A. and Bringi, V. N.: Potential Use of Radar Differential Reflectivity Measurements at
664 Orthogonal Polarizations for Measuring Precipitation. Journal of Applied Meteorology and
665 Climatology, 15(1): 69-76, <https://doi.org/10.1175/1520->
666 0450(1976)015<0069:PUORDR>2.0.CO;2, 1976.
- 667 Sharma, M., Tanamachi, R. L. and Bruning, E. C.: Investigating Temporal Characteristics of
668 Polarimetric and Electrical Signatures in Three Severe Storms: Insights from the VORTEX-
669 Southeast Field Campaign. Monthly Weather Review, 152(7): 1511-1536,
670 <https://doi.org/10.1175/MWR-D-23-0144.1>, 2024.
- 671 Sharma, M., Tanamachi, R. L., Bruning, E. C. and Calhoun, K. M.: Polarimetric and Electrical
672 Structure of the 19 May 2013 Edmond–Carney, Oklahoma, Tornadoic Supercell. Monthly
673 Weather Review, 149(7): 2049-2078, <https://doi.org/10.1175/MWR-D-20-0280.1>, 2021.
- 674 Shi, D., Zheng, D., Zhang, Y., Zhang, Y., Huang, Z., Lu, W., Chen, S. and Yan, X.: Low-frequency
675 E-field Detection Array (LFEDA)—Construction and preliminary results. Science China Earth
676 Sciences, 60(10): 1896-1908, 10.1007/s11430-016-9093-9, 2017.
- 677 Snyder, J. C., Bluestein, H. B., Dawson II, D. T. and Jung, Y.: Simulations of Polarimetric, X-Band
678 Radar Signatures in Supercells. Part I: Description of Experiment and Simulated phv Rings.
679 Journal of Applied Meteorology and Climatology, 56(7): 1977-1999,
680 <https://doi.org/10.1175/JAMC-D-16-0138.1>, 2017.
- 681 Snyder, J. C., Ryzhkov, A. V., Kumjian, M. R., Khain, A. P. and Picca, J.: A ZDR Column Detection
682 Algorithm to Examine Convective Storm Updrafts. Weather and Forecasting, 30(6): 1819-1844,
683 <https://doi.org/10.1175/WAF-D-15-0068.1>, 2015.
- 684 Souza, J. C. S. and Bruning, E. C.: Assessment of Turbulence Intensity in Different Spots of
685 Lightning Flash Propagation. Geophysical Research Letters, 48(21): e2021GL095923,
686 <https://doi.org/10.1029/2021GL095923>, 2021.
- 687 Takahashi, T.: Riming Electrification as a Charge Generation Mechanism in Thunderstorms. Journal
688 of Atmospheric Sciences, 35(8): 1536-1548, <https://doi.org/10.1175/1520->
689 0469(1978)035<1536:REAACG>2.0.CO;2, 1978.
- 690 Tuttle, J. D., Bringi, V. N., Orville, H. D. and Kopp, F. J.: Multiparameter Radar Study of a
691 Microburst: Comparison with Model Results. Journal of Atmospheric Sciences, 46(5): 601-
692 620, [https://doi.org/10.1175/1520-0469\(1989\)046<0601:MRSOAM>2.0.CO;2](https://doi.org/10.1175/1520-0469(1989)046<0601:MRSOAM>2.0.CO;2), 1989.
- 693 van Lier-Walqui, M., Fridlind, A. M., Ackerman, A. S., Collis, S., Helmus, J., MacGorman, D. R.,
694 North, K., Kollias, P. and Posselt, D. J.: On Polarimetric Radar Signatures of Deep Convection



- 695 for Model Evaluation: Columns of Specific Differential Phase Observed during MC3E.
696 Monthly Weather Review, 144(2): 737-758, <https://doi.org/10.1175/MWR-D-15-0100.1>, 2016.
- 697 Vincent, B. R., Carey, L. D. Schneider, D., Keeter, K., and Gonski, R.: Using WSR-88D reflectivity
698 data for the prediction of cloud-to-ground lightning: A central North Carolina study. *Nat. Wea.*
699 *Dig.*, 27: 35-44, 2003.
- 700 Williams, E., Boldi, B., Matlin, A., Weber, M., Hodanish, S., Sharp, D., Goodman, S., Raghavan, R.
701 and Buechler, D.: The behavior of total lightning activity in severe Florida thunderstorms.
702 *Atmospheric Research*, 51(3): 245-265, [https://doi.org/10.1016/S0169-8095\(99\)00011-3](https://doi.org/10.1016/S0169-8095(99)00011-3),
703 1999.
- 704 Williams, E. R., Weber, M. E. and Orville, R. E.: The relationship between lightning type and
705 convective state of thunderclouds. *Journal of Geophysical Research: Atmospheres*, 94(D11):
706 13213-13220, <https://doi.org/10.1029/JD094iD11p13213>, 1989.
- 707 Woodard, C. J., Carey, L. D., Petersen, W. A., and Roeder, W. P.: Operational utility of dual-
708 polarization variables in lightning initiation forecasting, *Electronic J. Operational Meteor.*, 13,
709 79-102, 2012.
- 710 Yan, M., Guo, C., Ge, Z.: Numerical study of cloud dynamic-electrification in an axisymmetric,
711 time-dependent cloud model. I: Theory and model. *ACTA GEOPHYSICA SINICA*, 39: 52-64,
712 1996a.
- 713 Yan, M., Guo, C., Ge, Z.: Numerical study of cloud dynamic-electrification in an axisymmetric,
714 time-dependent cloud model. II: Calculation results. *ACTA GEOPHYSICA SINICA*, 39: 65-
715 77, 1996b.
- 716 Zhang, Y., Sun, A., Yan, M., Guo, F., Qie, X., Huang, M.: Numerical modeling for effects of electric
717 activity during thunderstorms upon the growth of hail particles. *Chinese Journal of Geophysics*,
718 47(1): 25-32, 2004a.
- 719 Zhang, Y., Dong, W., Zhao, Y., Zhang, G., Zhang, H., Chen, C. and Zhang, T.: Study of charge
720 structure and radiation characteristic of intracloud discharge in thunderstorms of Qinghai-Tibet
721 Plateau. *Science in China Series D: Earth Sciences*, 47(1): 108-114, 10.1007/BF02880986,
722 2004b.
- 723 Zhang, Y., Yan, M., Sun, A., Guo, F.: *Thunderstorm Electricity*, China Meteorology Press, Beijing,
724 384 pp., 2009.
- 725 Zhao, C.: Data for “Bridging the polarimetric structure and lightning activity of an isolated
726 thunderstorm during the cloud life cycle”. Figshare. [Dataset].
727 <https://doi.org/10.6084/m9.figshare.28070105.v1>, 2024.
- 728 Zhao, C., Zhang, Y., Zheng, D., Li, H., Du, S., Peng, X., Liu, X., Zhao, P., Zheng, J. and Shi, J.:
729 Technical note: On the ice microphysics of isolated thunderstorms and non-thunderstorms in
730 southern China – a radar polarimetric perspective. *Atmospheric Chemistry and Physics*, 24(20):
731 11637-11651, 10.5194/acp-24-11637-2024, 2024.
- 732 Zhao, C., Zhang, Y., Zheng, D., Liu, X., Zhang, Y., Fan, X., Yao, W. and Zhang, W.: Using
733 Polarimetric Radar Observations to Characterize First Echoes of Thunderstorms and
734 Nonthunderstorms: A Comparative Study. *Journal of Geophysical Research: Atmospheres*,
735 127(23): e2022JD036671, <https://doi.org/10.1029/2022JD036671>, 2022.
- 736 Zhao, C., Zhang, Y., Zheng, D., Zhou, Y., Xiao, H. and Zhang, X.: An improved hydrometeor
737 identification method for X-band dual-polarization radar and its application for one summer
738 Hailstorm over Northern China. *Atmospheric Research*, 245: 105075,



- 739 <https://doi.org/10.1016/j.atmosres.2020.105075>, 2020.
- 740 Zhao, C., Zheng, D., Zhang, Y., Liu, X., Zhang, Y., Yao, W. and Zhang, W.: Turbulence
741 Characteristics of Thunderstorms Before the First Flash in Comparison to Non-Thunderstorms.
742 Geophysical Research Letters, 48(18): e2021GL094821,
743 <https://doi.org/10.1029/2021GL094821>, 2021.
- 744 Zheng, D. and Zhang, Y.: New Insights Into the Correlation Between Lightning Flash Rate and Size
745 in Thunderstorms. Geophysical Research Letters, 48(24): e2021GL096085,
746 <https://doi.org/10.1029/2021GL096085>, 2021.
- 747 Znić, D. S.: Three-body scattering produces precipitation signature of special diagnostic value.
748 Radio Science, 22(1): 76-86, <https://doi.org/10.1029/RS022i001p00076>, 1987.
749