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# The Wegener-Bergeron-Findeisen process – Its discovery and vital importance for weather and climate

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### Abstract

The Wegener-Bergeron-Findeisen process refers to the rapid growth of ice crystals at the expense of surrounding cloud droplets, which frequently occurs in atmospheric mixed-phase clouds. The process is a result of the difference in saturation vapor pressures with respect to liquid and ice, and may in some circumstances lead to abrupt and complete cloud glaciation at temperatures between -40 °C and 0 °C in the Earth's atmosphere. The process is named after three eminent scientists who were active in the first half of the 20th century, among them being German meteorologist WALTER FINDEISEN (1909–1945). In his classical paper published in 1938, FINDEISEN described the contemporary understanding of the Wegener-Bergeron-Findeisen process and other key cloud microphysical processes. Here, we compare the understanding of aforementioned processes at the time with that of the present, and find that they are remarkably similar. We also discuss how the Wegener-Bergeron-Findeisen process is implemented in state-of-the-art numerical models of the atmosphere, and highlight its importance for both weather and climate.

Keywords: Wegener-Bergeron-Findeisen process, mixed-phase clouds, weather and climate

#### Introduction 1

The importance of the Wegener-Bergeron-Findeisen (WBF) process, or simply the Bergeron-Findeisen pro-3 cess, is well known to meteorologists and climatologists 4 alike. By abruptly transforming non-precipitating liquid clouds to heavily precipitating ice clouds and dramatically changing cloud radiative properties, it can have a profound impact on both weather and climate. Its dis-8 covery, which dates back almost a century ago, should be equally accredited to three eminent scientists of the 10 time: ALFRED WEGENER, TOR BERGERON and WALTER 11 FINDEISEN. 12

The German scientist ALFRED WEGENER (1880-13 1930), well-known for his then-controversial theory on 14 continental drift, first laid the theoretical foundation for 15 the WBF process (WEGENER, 1911), by showing that 16 the co-existence of liquid and ice is a thermodynami-17 cally unstable state. This revelation allegedly came to 18 WEGENER while studying the formation of hoarfrost. A 19 decade later, in the winter of 1922, the Swede Tor BERG-20 ERON (1891–1977) found himself pondering the theory 21 put forth in WEGENER's book during a stay at a health 22 resort in Voksenkollen (430 m above sea level) outside 23 of Oslo in Norway. Observant as he was, BERGERON 24 had noticed that when the temperature was below freez-25 ing, nearby forest roads were clear of fog while trees 26 were covered in frost. Fog, however, would typically be 27 present and extend all the way to the ground when tem-28 peratures were above 0 °C. As an active member of the 29 prestigious Bergen School of Meteorology, BERGERON 30

became immersed in his duties in Bergen in the years following his discovery in Voksenkollen, so much to the extent that he did not further pursue his ideas on the matter until 1928, when the topic became one of the chapters in his PhD thesis (BERGERON, 1928).

It wasn't until 1938 that WALTER FINDEISEN entered 36 the scene, contributing to the previous work of WE-37 GENER and BERGERON by providing additional theoret-38 ical calculations, as well as cloud chamber experiments 39 to further develop their theories. FINDEISEN'S PhD the-40 sis (1931) focused on cloud droplet size distributions, 41 and included cloud chamber experiments, a novel ap-42 proach at the time. FINDEISEN's cloud chamber was ap-43 proximately 2 m<sup>3</sup> in volume, and was connected to a 44 vacuum pump, allowing the process of adiabatic expan-45 sion and atmospheric cloud formation to be mimicked 46 in the chamber. After World War II, FINDEISEN'S cloud 47 chamber was recovered from the ruins of Prague, where 48 FINDEISEN had his last appointment as director of the 49 Prague branch of the German Meteorological Office. 50 Fig. 1 shows the rebuilt cloud chamber, as it appeared 51 in Podzimek (1957). 52

FINDEISEN frequently cites the work of WEGENER 53 and BERGERON in his seminal paper from 1938 (FIND-54 EISEN, 1938, hereafter F38), whose work allowed him 55 to present a coherent and comprehensive overview of 56 the most recent understanding of atmospheric cloud and 57 precipitation formation at the time. As such, the paper 58 goes beyond the WBF process that FINDEISEN later be-59 came known for, and can in many ways be considered 60 the first complete description of cloud microphysics as 61 we understand it today. 62

Atmospheric scientists today are privileged to con-63 duct research in an age as data-rich as the present, with 64

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**Figure 1:** WALTER FINDEISEN'S cloud chamber, as it appeared in the publication that reported the first successful measurements with the chamber after it was recovered and rebuilt after World War II (PODZIMEK, 1957). Published with permission from ©Springer.

in situ measurements, remote sensing observations, lab-65 oratory work and numerical modeling all contributing to 66 this wealth of data. By contrast, the earliest works on 67 cloud microphysics by WEGENER, BERGERON and FIND-EISEN had very little *in situ* observations and of course 69 no satellite data available to them. It is a testimony to 70 their brilliance that they nevertheless came to many of 71 the same valid conclusions we find today. In fact, the 72 understanding of the microphysical processes involved 73 in liquid and ice cloud formation and subsequent cloud 74 evolution has changed relatively little relative to that pre-75 sented by F38. To give an example, in F38 FINDEISEN 76 claimed that every precipitation event of at least medium 77 intensity, and in particular every event with larger rain-78 drops, is caused by ice crystals. A more recent study 79 based on satellite data has confirmed the truth of this 80 statement, and found that the majority ( $\sim 70\%$ ) of trop-81 ical precipitation events indeed originate from the ice 82 phase (LAU and WU, 2003).

The remainder of this paper is dedicated to comparing the microphysical processes as they were described in F38 with our understanding of them today. Section 2 describes the theoretical foundation for the WBF process, Section 3 discusses the co-existence of supercooled liquid (i.e. liquid water existing at temperatures below 0 °C) and ice crystals required for the WBF process to occur, and Section 4 describes how the WBF process is implemented in state-of-the-art numerical models of weather and climate. Finally, Section 5 offers a brief conclusion.

## 2 The Wegener-Bergeron-Findeisen process

The WBF process refers to the rapid conversion of liq-97 uid to ice that may occur when supercooled droplets and ice crystals co-exist (PRUPPACHER and KLETT 2010). 99 The conversion occurs due to the difference in satu-100 ration vapor pressures over liquid and ice surfaces at 101 temperatures below 273 K ( $e_1$  and  $e_i$ , respectively, with 102  $e_1 > e_i$ ), which can be approximated from the *Clausius*-103 Clapeyron relation. In other words, an environment that 104 is saturated with respect to liquid water will be highly 105 supersaturated with respect to ice, and the relative dif-106 ference in supersaturation is exacerbated with decreas-107 ing temperature (Fig. 2). A common misconception is 108 that the WBF process is automatically activated when 109 liquid and ice co-exist, i.e. ice crystals are guaranteed 110 to grow at the expense of cloud droplets without excep-111 tion. However, as pointed out for example by KOROLEV 112 (2007) and KOROLEV and MAZIN (2003), the WBF pro-113 cess is only one of three possible cases that may occur 114 when a cloud consists of liquid and ice. The WBF pro-115 cess (i) will occur when the vapor pressure (e) lies be-116 tween  $e_i$  and  $e_l$ . The other two possible cases involve 117 either (ii) simultaneous growth of liquid droplets and 118 ice crystals ( $e > e_1 > e_i$ ) or (iii) simultaneous evapo-119 ration/sublimation of cloud droplets ( $e < e_i < e_l$ ). Cloud 120 dynamics in the form of small-scale updrafts and down-121 drafts exert an important control over which case plays 122 out for a given mixture of droplets and crystals. FIND-123 EISEN understood this, and described case (ii) in Sec-124 tion 4 of his 1938 paper: sufficient updrafts and hence 125 adiabatic cooling can result in the counter-intuitive pro-126 cess of droplet formation and growth in a glaciated 127 cloud. The reason why sufficiently high supersaturations 128 for droplet formation can occur in ice clouds was also 129 addressed in F38: the nuclei on which ice crystals form 130 in the atmosphere are very rare relative to the nuclei that 131 cloud droplets nucleate on. Hence, even though ice crys-132 tals are present in a cloud, they may not be present in 133 high enough number concentrations for their growth to 134 deplete supersaturation faster than the rate at which high 135 supersaturation is produced via adiabatic cooling. 136

# 3 Liquid in the supercooled state and the scarcity of ice nuclei

The distinction between the two classes of nuclei, cloud condensation nuclei (CCN) and ice nuclei (IN), was offered by F38 as an explanation for the frequent observations of supercooled liquid water in the atmosphere that had been reported at the time. While the reported



**Figure 2:** Left: Saturation vapor pressure over bulk liquid ( $e_1$ ) and over bulk ice ( $e_i$ ) as a function of temperature, calculated using the *Magnus formula* (MAGNUS, 1844). Right: Absolute (red line) and relative difference (black line) between  $e_1$  and  $e_i$ , the latter given as  $(e_1/e_i - 1) \cdot 100 \%$ , all as functions of temperature. The black line corresponds to the supersaturation that would be experienced by an ice crystal forming in a supercooled liquid cloud under the assumption that the water phase is in equilibrium with the liquid phase at the time of crystal formation.



**Figure 3:** Supercooled cloud fraction (SCF, %) based on CALIOP retrievals; global mean (green), the dust belt (blue, average over the region  $0-120 \degree$  W and  $30-50 \degree$  N) and the Southern Ocean (red, average over the region  $0-360 \degree$  W and  $60-70 \degree$  S). For further details on how SCFs were calculated based on the CALIOP retrievals, and associated uncertainties, see TAN et al. (2014a).

observations were naturally sporadic and few, they sup-144 ported the existence of liquid at temperatures even be-145 low -20 °C. Now, several decades into the satellite 146 era, we are able to take advantage of global datasets 147 that provide information on cloud thermodynamic phase 148 with relatively high temporal coverage. An example is 149 shown in Fig. 3, displaying the observed supercooled 150 cloud fraction (SCF, in %) as a function of tempera-151 ture, as retrieved by the Cloud and Aerosol Lidar with 152

Orthogonal Polarization (CALIOP) instrument onboard 153 NASA's Cloud-Aerosol Lidar and Infrared Pathfinder 154 Satellite Observations (CALIPSO) satellite (Hu et al. 155 2009, TAN, STORELVMO and CHOI 2014b, WINKER et al. 156 2009). These CALIOP retrievals are representative of 157 cloud tops only, and the SCF was calculated by taking 158 the ratio of liquid cloud top pixels to total cloud top pix-159 els within  $2.0^{\circ}$  longitude by  $2.5^{\circ}$  latitude grid boxes. 160 The cloud top temperatures were determined using the 161

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NCEP-DOE Reanalysis 2 dataset (KANAMITSU et al., 162 2002). The satellite observations support a global aver-163 age liquid cloud fraction of ~ 30% at -20 °C, in agree-164 ment with the findings from a century ago. Furthermore, 165 a comparison of the SCF in the Southern Ocean region 166  $(0-360 \circ W, 60-70 \circ S)$  with those found in the so-called 167 Dust belt  $(0-120 \circ W, 30-50 \circ N)$ , suggests that SCF is 168 spatially heterogeneous and that although certainly im-169 portant, temperature is not the sole factor influencing 170 cloud phase. 171

Substantial amounts of liquid exist over the Southern 172 Ocean, even at temperatures as low as  $\sim -30$  °C, pre-173 sumably owing to the scarcity of IN that are required 174 to initiate freezing at temperatures above approximately 175 -40 °C in the atmosphere. FINDEISEN was aware of this 176 and had documented it in Section 1 of F38. He estimated 177 that the ratio of CCN to IN number concentrations was 178 on the order of  $10^4$ , a number that matches current obser-179 vations using so-called CCN and IN-counters (HUDSON 180 and Squires, 1974; ROBERTS and NENES, 2005; ROGERS 181 1988; STETZER et al., 2008), instrumentation that was 182 not available during FINDEISEN's time. However, FIND-183 EISEN did state that it would be possible to design such instruments and remarked that they had the potential to 185 "clarify the controversial questions" presented in his pa-186 per. 187

Given the lack of instrumentation at the time, FIND-188 EISEN's description of the properties of CCN versus 189 those of IN is remarkably similar to that of any con-190 temporary paper on the subject. In a recent review of 191 atmospherically relevant IN, MURRAY et al. (2012) reaf-192 firmed FINDEISEN's description of IN (referred to as sub-193 limation nuclei by FINDEISEN) in F38 as insoluble particles of terrestrial origin, mainly in the form of min-195 eral dust (quartz, according to FINDEISEN). Beyond this, 196 FINDEISEN also stated that the chemical composition and 197 origin of IN are largely unknown, a statement that to some degree still holds today. Notwithstanding FIND-199 EISEN's pioneering discoveries, atmospheric ice nucle-200 ation is currently a very active field of research, and 201 our understanding of what particles are able to act as 202 IN under what conditions is rapidly evolving. We now 203 know that certain mineral dust types are better at nucle-204 ating ice than others, and that quartz is not a particularly 205 good IN (ATKINSON et al., 2013). We also know that bio-206 logical particles and potentially anthropogenic particles 207 such as soot, ash and metallic particles (Cziczo et al., 208 2009; HOOSE and MOHLER, 2012) may also be acting as 209 IN in the atmosphere. 210

In addition to his work on the WBF process, FIND-211 EISEN had also performed laboratory work on cloud 212 droplet formation (F38) at approximately the same time 213 that HILDING KÖHLER was developing the relatively 214 straightforward theory of cloud droplet formation by 215 the so-called process of "CCN activation" in 1936, now 216 sometimes referred to as Köhler Theory. FINDEISEN's 217 untimely death towards the end of World War II in 1945 218 at the tender age of 36 in Prague, meant that KÖHLER, 219 outliving him, was able to influence the field for decades 220

thereafter, perhaps resulting in the different legacies of 221 the two scientists. 222

### 4 **Representations of the WBF process** in numerical weather and climate models

Returning to the WBF process that brought FINDEISEN 226 fame, its importance for weather and climate has in-227 creasingly attracted attention in recent years. A real-228 istic representation of the WBF process in numerical 229 weather prediction (NWP) and global climate models 230 (GCMs) is critical for more accurate simulations of at-231 mospheric dynamical and radiative processes, and hence 232 the climate system as a whole. The typical horizon-233 tal resolution of such models is on the order of 10 to 234 100 km, while the WBF process occurs on scales orders 235 of magnitude smaller. Such unresolved processes pose a 236 challenge for numerical models of weather and climate. 237 The impact of these small-scale processes on resolved 238 large-scale processes can be accounted for by includ-239 ing *parameterizations* of the small-scale processes that 240 are otherwise unresolved. In recent years, new param-241 eterizations with various levels of sophistication have 242 been developed. The simplest parameterizations impose 243 a critical threshold of in-cloud ice mixing ratio, above 244 which the WBF process is assumed to become efficient 245 enough to deplete all remaining liquid in the model 246 grid box within a single model time step (typically 247 ~ 30 min) (Storelvmo, Kristjansson and Lohmann 248 2008a, LOHMANN and HOOSE 2009). However, more re-249 cent studies have attempted to treat the WBF process in a 250 more rigorous fashion. In a parameterization frequently 251 used in both GCMs and NWP models (MORRISON et al. 252 2005), the WBF process is diagnosed based on the rate 253 of depositional growth of ice crystals, A, and the rate of 254 condensation of liquid, Q. If A > Q the WBF process is 255 assumed to deplete liquid water within the model's time 256 step. While this approach is consistent with the under-257 standing of how the WBF process operates in the atmo-258 sphere, it is oversimplified in the sense that it assumes 259 that all cloud properties are uniform within the cloudy 260 portion of each model grid-box, which, in a GCM, typi-261 cally spans  $\sim 100$  km in both longitudinal and latitudinal 262 directions. 263

A few studies have sought remedy for the afore-264 mentioned oversimplified parameterizations of the WBF 265 process by introducing sub-gridscale variability in cloud 266 properties that are key to accurately representing the 267 WBF process (ROTSTAYN, RYAN and KATZFEY 2000, 268 STORELVMO et al. 2008b, STORELVMO et al. 2010, ROT-269 STAYN 1997). In attempt to account for this sub-gridscale 270 variability, ROTSTAYN (1997) introduced a triangular 271 probability density function (PDF) for the total-water 272 mixing ratio, q, within each model grid box, following 273 SMITH (1990). The PDF was centered at the grid box 274 mean total-water mixing ratio. Instead of considering 275 differences in vapor pressure, e, between the two phases 276



**Figure 4:** The fraction of cloud in which the WBF process is active, as a function of cloud droplet number concentration (CDNC,  $10^5 \text{ m}^3$ ) and ice crystal number concentration (ICNC,  $10^2 \text{m}^{-3}$ ), assuming a Gaussian PDF of *w* centered at 0.1 m/s with a standard deviation of 0.2 m/s. Ice crystal and cloud

(as in Section 1), the corresponding difference in satu-277 ration vapor mixing ratio ( $q_{s,1}$  and  $q_{s,i}$  for liquid and ice, 278 respectively) was used to determine the portion of the 279 cloud that consists of co-existing ice and liquid. In a grid 280 box containing both liquid and ice, coexistence would 281 be possible for the portion of the grid box with  $q > q_{s,1}$ , 282 while the portion with  $q_{s,i} < q < q_{s,l}$  would have ice 283 clouds only, and  $q < q_{s,i}$  would correspond to cloud-free 284 conditions. Note that this framework assumes that the 285 cloud droplet and ice crystal response to sub-saturation 286 is fast, and that complete evaporation occurs within one 287 model time step ( $\sim 30 \text{ min}$ ) Following up on the work of 288 ROTSTAYN (1997) and SMITH (1990), STORELVMO et al. 289 (2008b) implemented a normal distribution for the ver-290 tical velocity, w, in place of the triangular PDF for q 291 used in ROTSTAYN (1997). Previously, KOROLEV (2007), 292 KOROLEV and MAZIN (2003) had derived parameteriza-293 tions for the critical updraft above which liquid and ice 294 could co-exist  $(w_{c,u})$ , and the critical downdraft below 295 which both liquid and ice crystals are bound to evaporate 296  $(w_{c,d})$ . By combining this with the PDF of w, the evo-297 lution of the thermodynamic phase of clouds can be di-298 vided into three distinct regimes: i) simultaneous growth 299 of droplets and ice crystals, ii) growth of ice crystals 300 at the expense of cloud droplets (the WBF process), 301

and iii) simultaneous evaporation of droplets and ice 302 crystals.  $w_{c,u}$  (always positive) and  $w_{c,d}$  (always neg-303 ative) are functions of ice crystal number concentra-304 tion (ICNC) and cloud droplet number concentration 305 (CDNC), among other variables. Fig. 4 displays the frac-306 tion of a cloud that will be dominated by the WBF pro-307 cess (regime ii above) as a function of CDNC and ICNC, 308 calculated according to the formulae in KOROLEV (2007) 309 (for other assumptions made for the calculation, see the 310 caption of Fig. 4). At high CDNCs, saturation can still 311 be maintained in strong downdrafts by evaporating the 312 many cloud droplets present. The parameterization ac-313 counts for this by allowing  $w_{c,d}$  to become increasingly 314 negative, thereby causing the fraction of the cloud in 315 which ice crystals can grow at the expense of cloud 316 droplets to increase. At high ICNC, ice crystal growth 317 on the many ice crystals present rapidly depletes water 318 vapor and brings the vapor pressure below that of sat-319 uration with respect to liquid water. In this case, very 320 strong updrafts are required for simultaneous growth of 321 droplets and ice crystals (i.e.  $w_{c,u}$  is large). As a result, 322 the fraction of the cloud dominated by the WBF process 323 increases with increasing ICNCs. 324

Independently of how the WBF process is treated <sup>325</sup> in GCMs and/or NWP, the extent to which ice crystals <sup>326</sup> Table 1: Net Cloud Radiative Effect (CRE) evaluated at the top of the atmosphere, Total Water Path (TWP), total precipitation and the ratio of stratiform to convective precipitation for simulations in which i) cloud phase is prescribed according to temperature (i.e. no representation of the WBF process, NO\_WBF), ii) a crude critical ice mixing ratio threshold treatment (see above, SIMPLE\_WBF) is applied and iii) a WBF treatment which accounts for subgrid scale variability (see above, SUBGRID\_WBF) is implemented. Observations are from satellite retrievals (LOEB et al., 2009; KOMURCU et al. 2014).

Simulations	NO_WBF	SIMPLE_WBF	SUBGRID_WBF	OBSERVATIONS
Net CRE (Wm <sup>-2</sup> )	-15.7	-24.9	-21.4	-24.5-17.9
<b>TWP</b> $(gm^{-2})$	148.3	112.2	132.1	47-109
Total precipitation (mm/day)	2.84	2.80	2.78	2.74
Stratiform/convective precipitation ratio	0.37	0.54	0.51	N/A

and cloud droplets are assumed to be well-mixed with 327 each other in the cloud volume, or whether they are as-328 sumed to exist in separate pockets of ice and liquid, is 329 of critical importance (KOROLEV and ISAAC, 2006). This 330 statement can be illustrated with two sensitivity simu-331 lations<sup>1</sup> using the CAM5 GCM (http://www.cesm.ucar. 332 edu/models/cesm1.2/cam/) that attempt to mimick pure 333 homogeneous (i.e. well-mixed) and pure heterogeneous 334 mixing between the two phases (simulations HOM and 335 HET, respectively). Between the two simulations, HOM 336 yielded three times the amount of vertically integrated 337 amount of ice in the atmosphere (Ice Water Path, IWP) 338 relative to HET. The contrast between homogeneous and 339 heterogeneous mixing was mimicked by reducing the ef-340 ficiency of the WBF process by a factor of  $10^{-6}$ , physi-341 cally corresponding to a situation in which there is only 342 contact between the pockets of liquid and ice in rela-343 tively narrow mixing zones. High-frequency in situ mea-344 surements of cloud phase may aid in developing pa-345 rameterizations that realistically represent the degree of 346 mixing that occurs within mixed-phase clouds, but such 347 measurements are presently scarce. 348

To illustrate how sensitive model-simulated cloud, 349 radiation and precipitation fields can be to the repre-350 sentation of the WBF process, Table 4 shows global 351 mean output from three 5-year simulations with the 352 same atmospheric GCM (STORELVMO et al., 2008b). The 353 simulations only differ in their treatment of the WBF 354 treatment. Drastic changes in the net radiative effect of 355 clouds, as well as in the column-integrated amount of 356 liquid and ice in the atmosphere, are evident. Since the 357 design of atmospheric GCM simulations is such that 358 surface evaporation remains relatively constant (because 359 of prescribed climatological sea surface temperatures), 360 total precipitation does not change much between the 361 simulations. However, the partitioning of the precipita-362 tion between the stratiform and convective type can, and 363 does, change drastically.

### Conclusion 5

The WBF process is an extremely powerful microphys-366 ical mechanism that can cause rapid transformation of 367

cloud macrophysical and radiative properties. It can play 368 a tremendously important role in both climate forc-369 ing and feedback mechanisms by amplifying the effect 370 that anthropogenic perturbations in IN have on climate. 371 It may also affect the cloud-climate feedback mecha-372 nism sometimes referred to as the cloud optical depth 373 feedback (ZELINKA, KLEIN and HARTMANN, 2012) by 374 amplifying the effect that warming temperatures has 375 on cloud phase (McCoy, HARTMANN and GROSVENOR, 376 2014). As such, the significance of the WBF process 377 is gaining attention, as it becomes increasingly clear 378 that realistic representations of aerosol-cloud interac-379 tions and cloud feedbacks in climate models rely on 380 the accuracy of the representation of the WBF process 381 in these models. In retrospect, FINDEISEN's paper from 382 1938 is thus more relevant now than ever before, but 383 ironically for reasons that FINDEISEN could not have pre-384 dicted when he wrote his seminal paper. Global warming 385 was not yet detectable at the time, and the early warnings 386 by ARRHENIUS (1896) had largely been forgotten. 387

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<sup>&</sup>lt;sup>1</sup>The simulations were run for one year after a three-month spin-up, at a relatively coarse horizontal resolution of 4 ° × 5 °.

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