



Global impact of mineral dust on cloud droplet number concentration

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Abstract

15 The importance of wind-blown mineral dust for cloud droplet formation is studied
16 by considering *i*) the adsorption of water on the surface of insoluble particles, *ii*) the
17 particle coating by soluble material (due to atmospheric aging) which augments cloud
18 condensation nuclei (CCN) activity, and *iii*) the effect of dust on inorganic aerosol
19 concentrations through thermodynamic interactions with mineral cations. The
20 ECHAM5/MESSy Atmospheric Chemistry (EMAC) model is used to simulate the
21 composition of global atmospheric aerosol; the ISORROPIA-II thermodynamic
22 equilibrium model treats the interactions of K^+ - Ca^{2+} - Mg^{2+} - NH_4^+ - Na^+ - SO_4^{2-} - NO_3^- - Cl^- -
23 H_2O aerosol with gas-phase inorganic constituents. Dust is considered a mixture of
24 inert material with reactive minerals; emissions are calculated online by taking into
25 account the soil particle size distribution and chemical composition of different
26 deserts worldwide. The impact of dust on droplet formation is treated through the
27 “unified dust activation parameterization” that considers the inherent hydrophilicity
28 from adsorption and acquired hygroscopicity from soluble salts during aging. Our
29 simulations suggest that the presence of dust increases cloud droplet number
30 concentrations (CDNC) over major deserts (e.g., up to 20% over the Sahara and
31 Taklimakan Deserts) and decreases CDNC over polluted areas (e.g., up to 10% over
32 southern Europe and 20% over northeastern Asia). This leads to a global net decrease
33 of CDNC by 11%. The adsorption activation of insoluble aerosols and the mineral
34 dust chemistry are shown to be equally important for the cloud droplet formation over
35 the main deserts, e.g., by considering these effects CDNC increases by 20% over the
36 Sahara. Remote from deserts the application of adsorption theory is critically
37 important since the increased water uptake by the large aged dust particles (i.e., due to
38 the added hydrophilicity by the soluble coating) reduce the maximum supersaturation



39 and thus the cloud droplet formation from the smaller anthropogenic particles (e.g.,
40 CDNC decreases by 10% over southern Europe and 20% over northeastern Asia by
41 applying adsorption theory). The global average CDNC decreases by 10% by
42 considering adsorption activation, while changes are negligible when accounting for
43 the mineral dust chemistry. Sensitivity simulations indicate that CDNC is also
44 sensitive to the mineral dust mass and inherent hydrophilicity, and not to the chemical
45 composition of the emitted dust.

46

47 1. Introduction

48 Atmospheric aerosols from anthropogenic and natural sources adversely affect
49 human health and influence the Earth's climate, both directly and indirectly
50 (Haywood and Boucher, 2000; Lohmann and Feichter, 2005; Andreae and Rosenfeld,
51 2008; IPCC, 2013; Kushta et al., 2014; Lelieveld et al., 2015). The direct climate
52 effect refers to the influence of aerosols on the radiative budget of Earth's atmosphere
53 by scattering and absorbing solar radiation (Seinfeld and Pandis, 2006). The indirect
54 effects include the ability of aerosols to affect the cloud optical thickness and
55 scattering properties of clouds (Twomey, 1974) as well as the cloud lifetime and
56 precipitation (Albrecht, 1989). The scientific interest in aerosol-cloud-climate
57 interactions initially focused on anthropogenic pollutants (e.g., sulfate) and to a lesser
58 extent on naturally emitted aerosols (e.g., sea salt). However, among atmospheric
59 aerosols, mineral dust is of particular importance since it is globally dominant in
60 terms of mass concentration in the atmosphere (Grini et al., 2005; Zender and Kwon,
61 2005) and can influence cloud and precipitation formation (Levin et al., 2005; Yin
62 and Chen, 2007; Karydis et al., 2011; Rosenfeld et al., 2011; Kallos et al., 2014).
63 Additionally, dust alone is responsible for more than 400,000 premature deaths per
64 year (Giannadaki et al., 2014).

65 Freshly emitted dust is considered insoluble. Reports of hygroscopic growth
66 measurements of dust particles indicate solubility to be very low, which together with
67 the observed cloud condensation nuclei (CCN), has been attributed to soluble ions
68 present in the particles (Gustafsson et al., 2005; Herich et al., 2009; Koehler et al.,
69 2009; Garimella et al., 2014). Chemistry – climate models (CCMs) typically use
70 Köhler theory to describe droplet formation from dust, which assumes that the CCN
71 activity depends solely on their curvature effect and the fraction of soluble material on
72 the particle (Smoydzin et al., 2012). However, mineral dust can adsorb water which



73 results in a surface film of water with reduced activity (Sorjamaa and Laaksonen,
74 2007), and promote the formation of cloud droplets at cloud-relevant supersaturation,
75 even of freshly emitted and chemically unprocessed dust particles (Sorjamaa and
76 Laaksonen, 2007; Kumar et al., 2009a). Kumar et al. (2009a) emphasized the
77 importance of including water adsorption effects in describing the hygroscopic growth
78 of mineral aerosols, which was then included in a droplet formation parameterization
79 (Kumar et al. (2009b) for use in models. Evidence on the importance of adsorption
80 activation of dust particles is discussed in Kumar et al. (2011b; 2011a) for dry- and
81 wet-generated clays and mineral dusts representative of major regional dust sources
82 (North Africa, East Asia and North America). Adsorption activation was also found to
83 be important for volcanic ashes (Lathem et al., 2011). The observed hygroscopicity
84 could not be attributed to the soluble ions present, but rather to the strong water vapor
85 adsorption on the particle surface. Furthermore, the surface fractal dimension derived
86 from dust and ash critical supersaturation data agrees well with previous methods
87 based on measurements of nitrogen adsorption, which contribute strong evidence for
88 adsorption effects on water activity and droplet activation (Laaksonen et al., 2016),
89 despite concerns raised by Garimella et al. (2014) on multiple charging effects on the
90 work of Kumar et al. (2011b). Hatch et al. (2014) provided an alternative approach for
91 parameterizing CCN activation of fresh atmospheric mineral aerosol. This approach
92 was based on experimental water adsorption measurements on mineral clays
93 compared to CCN measurements used by Kumar et al. (2011b), which require
94 corrections for multiply charged particles and non-sphericity. Despite differences in
95 the adsorption parameters reported from the above two studies, the adsorption derived
96 CCN activities were quite similar and in excellent agreement. Based on these
97 findings, Karydis et al. (2011) integrated the Kumar et al. (2009b) parameterization
98 into the Global Modeling Initiative (GMI) chemical transport model (Considine et al.,
99 2005) and found that insoluble mineral dust can contribute up to 24% of the cloud
100 droplet number downwind of arid areas. Subsequently, the Kumar et al. (2009b)
101 parameterization has been integrated in a number of global and regional models and
102 applied to investigate the impact of mineral dust on warm cloud formation (Bangert et
103 al., 2012; Karydis et al., 2012; Gant et al., 2014; Zhang et al., 2015).

104 Soluble inorganic ions like Ca^{+2} , Mg^{+2} , Na^+ , and K^+ that exist on the surface of
105 mineral dust particles can participate in heterogeneous chemical reactions with acids
106 such as HNO_3 and HCl . Furthermore, dust particles can provide reaction sites for the



107 SO_2 oxidation into H_2SO_4 . These processes result in the coating of dust particles by
108 soluble material, which augments the hygroscopicity of dust and therefore its ability
109 to act as CCN (Kelly et al., 2007). On the other hand, highly oxidized, soluble organic
110 species, particularly including carboxylic acid groups (e.g., oxalic acid), can interact
111 with particles dominated by di-valent salts (e.g., CaCl_2) and strongly decrease their
112 hygroscopicity (Drozd et al., 2014). Due to their relatively large size, chemically aged
113 dust particles can act as giant CCN, enhancing precipitation as they efficiently collect
114 moisture and grow at the expense of smaller droplets (Feingold et al., 1999; Levin et
115 al., 2005). In addition, giant CCN compete with the submicron particles for water
116 vapor, potentially reducing supersaturation and cloud droplet formation (Barahona et
117 al., 2010; Betancourt and Nenes, 2014b; Betancourt and Nenes, 2014a). Soluble
118 coatings on dust are mostly evident in the atmosphere after long-range transport of
119 dust plumes. Anthropogenic NO_3^- and SO_4^{2-} mainly contribute to the chemical aging
120 of dust over continents while sea salt derived Cl^- is more important over oceans
121 (Sullivan et al., 2007; Fountoukis et al., 2009; Dall'Osto et al., 2010; Toto et al.,
122 2010; Bougiatioti et al., 2016b; Weber et al., 2016). Apart from the gas phase
123 composition, the chemical processing of dust also depends on its chemical
124 composition and thus on the source region (Sullivan et al., 2009; Karydis et al., 2016).
125 Several studies have revealed that Saharan dust can be efficiently transported over the
126 Mediterranean basin where it can acquire significant soluble coatings (mostly sea salt
127 and sulfate) resulting in the enhancement of its hygroscopicity and CCN activity
128 (Wurzler et al., 2000; Falkovich et al., 2001; Smoydzin et al., 2012; Abdelkader et al.,
129 2015). Twohy et al. (2009) have shown that Saharan dust often acts as CCN over the
130 eastern North Atlantic and significantly contributes to cloud formation west of Africa.
131 Begue et al. (2015) analyzed a case of possible mixing of European pollution aerosols
132 with Saharan dust transported over northern Europe, and found that aged Saharan dust
133 was sufficiently soluble to impact the hygroscopic growth and cloud droplet
134 activation over the Netherlands. Asian dust has also been reported to have a
135 considerable impact on cloud formation after being transported over long distances
136 and mixed with soluble materials (Perry et al., 2004; Roberts et al., 2006; Sullivan et
137 al., 2007; Ma et al., 2010; Stone et al., 2011; Yamashita et al., 2011).

138 Despite the importance of mineral dust aerosol chemistry for accurately predicting
139 the aerosol hygroscopicity changes that accompany these reactions, most
140 thermodynamic models used in global studies lack a realistic treatment of crustal



141 species, e.g., assuming that mineral dust is chemically inert (Liao et al., 2003; Martin
142 et al., 2003; Koch et al., 2011; Leibensperger et al., 2011). Only few global studies
143 have accounted for the thermodynamic interactions of crustal elements with inorganic
144 aerosol components (Feng and Penner, 2007; Fairlie et al., 2010; Xu and Penner,
145 2012; Hauglustaine et al., 2014; Karydis et al., 2016). Most of these models either
146 neglect the impact of dust on cloud droplet formation or apply simplified assumptions
147 about the CCN activity of dust, e.g., they convert “hydrophobic” dust to “hydrophilic”
148 dust by applying a constant κ -hygroscopicity (e.g., 0.1) and use Köhler theory to
149 describe cloud droplet activation. However, accounting for both the inherent
150 hydrophilicity of dust and the acquired hygroscopicity from soluble salts could
151 improve the predictive capability of CCMs. For this purpose, Kumar et al. (2011a)
152 presented a “unified dust activation framework” (UAF) to treat the activation of dust
153 with substantial amounts of soluble material by considering the effects of adsorption
154 (due to the hydrophilicity of the insoluble core) and absorption (due to the
155 hygroscopicity of the soluble coating) on CCN activity. Karydis et al. (2011) provided
156 a first estimate of aged dust contribution to global CCN and cloud droplet number
157 concentration (CDNC) by using the UAF. They found that coating of dust by
158 hygroscopic salts can cause a twofold enhancement of its contribution to CCN. On the
159 other hand, aged dust can be substantially depleted due to in-cloud supersaturation
160 and eventually reduce the CDNC. Bangert et al (2012) investigated the impact of
161 Saharan dust on cloud droplet formation over western Europe and found only a slight
162 increase in calculated CDNC. However, these studies did not include thermodynamic
163 interactions of mineral dust with sea salt and anthropogenic pollutants. Instead, a
164 prescribed fraction of mineral dust that is coated with ammonium sulfate was used to
165 represent the aged dust.

166 The present work aims at advancing previous studies on dust influences of cloud
167 droplet formation by comprehensively considering *i*) the adsorption of water on the
168 surface of insoluble dust particles, *ii*) the coating of soluble material on the surface of
169 mineral particles which augments their CCN activity, and, *iii*) the effects of dust on
170 the inorganic soluble fraction of dust through thermodynamic interactions of semi-
171 volatile inorganic species and sulfate with mineral cations. The ECHAM5/MESSy
172 Atmospheric Chemistry (EMAC) model (Jöckel et al., 2006) is used to simulate
173 aerosol processes, while the “unified dust activation framework” (Karydis et al., 2011;
174 Kumar et al., 2011a) is applied to calculate the CCN spectra and droplet number



175 concentration, by explicitly accounting for the inherent hydrophilicity from adsorption
176 and acquired hygroscopicity from soluble salts by dust particles from atmospheric
177 aging. Mineral dust chemistry has been taken into account by using the
178 thermodynamic equilibrium model ISORROPIA II (Fountoukis and Nenes, 2007).
179 Dust emissions are calculated online by an advanced dust emission scheme which
180 accounts for the soil particle size distribution (Astitha et al., 2012) and chemical
181 composition (Karydis et al., 2016) of different deserts worldwide. The sensitivity of
182 the simulations to the emitted dust aerosol load, the mineral dust chemical
183 composition and the inherent hydrophilicity of mineral dust is also considered.

184
185 **2. Model Description**

186
187 **2.1 EMAC Model**

188 We used the ECHAM5/MESSy Atmospheric Chemistry (EMAC) model (Jöckel et
189 al., 2006) which uses the Modular Earth Submodel System (MESSy2) (Jöckel et al.,
190 2010) to connect submodels that describe the lower and middle atmosphere processes
191 with the 5th generation European Centre - Hamburg (ECHAM5) general circulation
192 model (GCM) as a dynamical core (Röckner et al., 2006). EMAC has been
193 extensively described and evaluated against in-situ observations and satellite
194 retrievals (de Meij et al., 2012; Pozzer et al., 2012; Tsimpidi et al., 2014; Karydis et
195 al., 2016). The spectral resolution of the EMAC model used in this study is T63L31,
196 corresponding to a horizontal grid resolution of approximately $1.9^\circ \times 1.9^\circ$ and 31
197 vertical layers between the surface and 10 hPa (i.e. 25 km altitude). EMAC is applied
198 for 2 years covering the period 2004-2005 and the first year is used as spin-up.

199 EMAC simulates the gas phase species through the MECCA submodel (Sander et
200 al., 2011). Aerosol microphysics are calculated by the GMXe module (Pringle et al.,
201 2010). The organic aerosol formation and chemical aging is calculated by the
202 ORACLE submodel (Tsimpidi et al., 2014). The CLOUD submodel (Röckner et al.,
203 2006) calculates the cloud cover as well as cloud micro-physics and precipitation of
204 large scale clouds (i.e., excluding convective clouds). The wet and dry deposition are
205 calculated by the SCAV (Tost et al., 2006) and the DRYDEP (Kerkweg et al., 2006)
206 sub-models.

207 The inorganic aerosol composition is computed with the ISORROPIA-II
208 (<http://isorropia.eas.gatech.edu>) thermodynamic equilibrium model (Fountoukis and



209 Nenes, 2007) with updates as discussed in Capps et al. (2012). ISORROPIA-II
210 calculates the gas-liquid-solid equilibrium partitioning of the K^+ - Ca^{2+} - Mg^{2+} - NH_4^+ -
211 Na^+ - SO_4^{2-} - NO_3^- - Cl^- - H_2O aerosol system. Potassium, calcium, magnesium, and
212 sodium are assumed to exist in the form of $\text{Ca}(\text{NO}_3)_2$, CaCl_2 , CaSO_4 , KHSO_4 , K_2SO_4 ,
213 KNO_3 , KCl , MgSO_4 , $\text{Mg}(\text{NO}_3)_2$, MgCl_2 , NaHSO_4 , Na_2SO_4 , NaNO_3 , NaCl in the solid
214 phase and Ca^{2+} , K^+ , Mg^{2+} , Na^+ in the aqueous phase. More details about the EMAC
215 model set up used in this study can be found in Karydis et al. (2016).

216

217 **2.2 CCN Activity and Cloud Droplet Formation Parameterization**

218 The equilibrium supersaturation, s , over the surface of a water droplet containing a
219 solute particle (i.e., without any insoluble material present) is calculated using the
220 hygroscopicity parameter, κ , based on κ -Köhler theory (Petters and Kreidenweis,
221 2007):

$$222 \quad s = \frac{4\sigma M_w}{RT \rho_w D_p} - \frac{D_{dry}^3 \kappa}{D_p^3} \quad (1)$$

223 where D_{dry} is the dry CCN diameter, D_p is the droplet diameter, σ is the CCN surface
224 tension at the point of activation, ρ_w is the water density, M_w is the molar mass of
225 water, R is the universal gas constant, and T is the average column temperature.

226 For insoluble particles (e.g., pristine mineral dust), the multilayer Frenkel-Halsey-
227 Hill (FHH) adsorption isotherm model (Sorjamaa and Laaksonen, 2007) is used,
228 which contains two adjustable parameters (A_{FHH} and B_{FHH}) that describe the
229 contribution of water vapor adsorption on CCN activity. In this case, the equation
230 describing the equilibrium supersaturation over the surface of a water droplet is given
231 by (Kumar et al., 2009b):

$$232 \quad s = \frac{4\sigma M_w}{RT \rho_w D_p} - A_{FHH} \left(\frac{D_p - D_{dry}}{2D_w} \right)^{-B_{FHH}} \quad (2)$$

233 where D_w is the diameter of a water molecule. The adsorption parameter A_{FHH}
234 represents the interactions between the first water monolayer and the dust surface.
235 B_{FHH} expresses the long range interactions of additional adsorbed water layers with
236 the dust surface. Kumar et al. (2011b) tested a wide range of fresh unprocessed
237 regional dust samples and minerals and found that one set of the FHH parameters



238 ($A_{FHH} = 2.25 \pm 0.75$, $B_{FHH} = 1.20 \pm 0.10$) adequately reproduces the measured CCN
239 activity for all dust types considered.

240 To account for the coating of soluble material on the surface of mineral dust, the
241 “unified activation framework” (Karydis et al., 2011; Kumar et al., 2011a) is used,
242 which describes the water vapor supersaturation over an aerosol particle consisting of
243 insoluble core with a soluble coating:

$$244 s = \frac{4\sigma M_w}{RT \rho_w D_p} - \frac{\varepsilon_s D_{dry}^3 \kappa}{(D_p^3 - \varepsilon_i D_{dry}^3)} - A_{FHH} \left(\frac{D_p - \varepsilon_i^{1/3} D_{dry}}{2D_w} \right)^{-B_{FHH}} \quad (3)$$

245 where ε_i is the insoluble volume fraction and ε_s is the soluble volume fraction. Eq. 3
246 takes into account both the inherent hydrophilicity from adsorption expressed in the
247 third term of the equation and the acquired hygroscopicity from soluble salts by dust
248 particles expressed in the second term of the equation. The first term accounts for the
249 Kelvin effect. Noting that for a complete insoluble dust particle, i.e., as $\varepsilon_s \rightarrow 0$ and
250 $\varepsilon_i \rightarrow 1$, the UAF approaches FHH theory (Eq. 2).

251 Calculation of CDNC is carried out in two conceptual steps, one involving the
252 determination of the “CCN spectrum” (i.e., the number of CCN that can activate to
253 form droplets at a certain level of supersaturation), and another one determining the
254 maximum supersaturation, s_{max} , that develops in the ascending cloudy air parcels used
255 to represent droplet formation in EMAC. The CDNC is then the value of the CCN
256 spectrum at s_{max} .

257 The “CCN spectrum”, $F^s(s)$, is computed following Kumar et al. (2009b) and
258 assumes that particles can be described either by KT or FHH theory. $F^s(s)$ for an
259 external mixture of lognormal particle size distributions is given by:

$$260 F^s(s) = \int_0^s n^s(s) ds = \sum_{i=1}^{n_m} \frac{N_i}{2} erfc \left[-\frac{\ln \left(\frac{s_{g,i}}{s} \right)}{x \sqrt{2} \ln(\sigma_i)} \right] \quad (4)$$

261 where s is the level of water vapor supersaturation, $n^s(s)$ is the critical
262 supersaturation distribution, $s_{g,i}$ is the critical supersaturation of the particle with a
263 diameter equal to the geometric mean diameter of the mode i , σ_i is the geometric



264 standard deviation for the mode i , and x is an exponent that depends on the
265 activation theory used. For modes following Köhler theory, $x = -\frac{3}{2}$ (Fountoukis and
266 Nenes, 2005), while for insoluble particles following FHH theory, x depends on
267 A_{FHH} and B_{FHH} (Kumar et al., 2009b). In the case of UAF x lies between the KT
268 and FHH-AT limits, and is determined from Eq. (3) by performing a power law fit
269 between s_g and D_{dry} as described in Kumar et al. (2011a). The calculation of s_g
270 involves determining the maximum of the relevant equilibrium curve in equilibrium
271 with the surrounding water vapor ($\frac{ds}{dD_p} \Big|_{D_p=D_g} = 0$ in Eqs. 1-3). Once D_g is determined,
272 it can be substituted in Eqs. 1-3 to obtain s_g .

273 The maximum supersaturation, s_{max} , in the ascending parcel is calculated from an
274 equation that expresses the supersaturation tendency in cloudy air parcels, which at
275 the point of maximum supersaturation becomes (Nenes and Seinfeld, 2003; Barahona
276 and Nenes, 2007)

$$277 \frac{2aV}{\pi\gamma\rho_w} - Gs_{max}I(0, s_{max}) = 0 \quad (5)$$

278 where V is the updraft velocity (i.e., not including convection) calculated online by
279 assuming that the sub-grid vertical velocity variability is dominated by the turbulent
280 transports and by choosing the root-mean-square value of the GCM model-generated
281 turbulent kinetic energy (TKE) as a measure. Based on this assumption, the in-cloud
282 updraft velocity can be expressed as $V = \bar{V} + 0.7 \sqrt{TKE}$, where \bar{V} is the GCM-
283 resolved large scale updraft velocity (Lohmann et al., 1999a; Lohmann et al., 1999b).
284 Following Morales and Nenes (2010), V can be considered as a “characteristic updraft
285 velocity” which yields CDNC value representative of integration over a probability
286 density function (PDF) of updraft velocity. Morales and Nenes (2010) have shown
287 that this assumption applies well to large scale clouds (i.e., stratocumulus), which are
288 the type of clouds described by the CLOUD sub-model in EMAC. a, γ, G in Eq. (5)
289 are parameters defined in Nenes and Seinfeld (2003). $I(0, s_{max})$ is the “condensation
290 integral” which expresses the condensational depletion of supersaturation upon the
291 growing droplets at the point of s_{max} in the cloud updraft. It is expressed as the sum of
292 two terms:



293

294 $I(0, s_{\max}) = I_K(0, s_{\max}) + I_{FHH}(0, s_{\max}) \quad (6)$

295

296 The first term on the right hand side of Eq. (6), $I_K(0, s_{\max})$, describes the contribution
297 from particles that follow the Köhler theory and is calculated using the revisited
298 population splitting approach of Betancourt and Nenes (2014a). The second term,
299 $I_{FHH}(0, s_{\max})$, represents the contribution of freshly emitted or aged dust particles to
300 the condensation integral and is represented in Kumar et al. (2009b) and Karydis et al.
301 (2011). Once s_{\max} is determined by numerically solving Eq. (5), the number of cloud
302 droplets that form in the parcel, N_d , is obtained from the “CCN spectrum” (Eq. (4))
303 computed for s_{\max} , i.e., $N_d = F(s_{\max})$.

304

305 **2.3 Aerosol Precursor Emissions**

306 Dust emission fluxes are calculated online by an advanced dust flux scheme
307 developed by Astitha et al. (2012). This scheme uses an explicit geographical
308 representation of the airborne soil particle size distribution based on soil
309 characteristics in every grid cell. Emissions of crustal species (Ca^{2+} , Mg^{2+} , K^+ , Na^+)
310 are estimated as a fraction of mineral dust emissions based on the chemical
311 composition of the emitted soil particles in every grid cell (Karydis et al., 2016).
312 Emissions of sea spray aerosols are based on the offline monthly emission data set of
313 AEROCOM (Dentener et al., 2006) assuming a composition of 55% Cl^- , 30.6% Na^+ ,
314 7.7% SO_4^{2-} , 3.7% Mg^{2+} , 1.2% Ca^{2+} , 1.1% K^+ (Seinfeld and Pandis, 2006). The
315 CMIP5 RCP4.5 emission inventory (Clarke et al., 2007) is used for the anthropogenic
316 primary organic aerosol emissions from fossil fuel and biofuel combustion sources.
317 The open biomass burning emissions from savanna and forest fires are based on the
318 GFED v3.1 database (van der Werf et al., 2010). More details about the aerosol phase
319 emissions used by EMAC can be found in Karydis et al. (2016) and Tsimpidi et al.
320 (2016).

321 Related anthropogenic emissions of NO_x , NH_3 , and SO_2 , which represent the
322 gaseous precursors of the major inorganic components, are based on the monthly
323 emission inventory of EDGAR-CIRCE (Doering, 2009) distributed vertically as
324 presented in Pozzer et al. (2009). The natural emissions of NH_3 are based on the



325 GEIA database (Bouwman et al., 1997). NO_x produced by lightning is calculated
326 online and distributed vertically based on the parameterization of Grewe et al. (2001).
327 The emissions of NO from soils are calculated online based on the algorithm of
328 Yienger and Levy (1995) as described in Ganzeveld et al. (2002). Eruptive and non-
329 eruptive volcanic degassing emissions of SO₂ are based on the AEROCOM data set
330 (Dentener et al., 2006). The oceanic DMS emissions are calculated online by the
331 AIRSEA submodel (Pozzer et al., 2006). More details about the gas phase emissions
332 used by EMAC can be found in Pozzer et al. (2012) and Karydis et al. (2016).

333

334 **3. Model Results and Evaluation**

335 **3.1 Model Predictions**

336 The annual and seasonal (during DJF and JJA) mean CDNC calculated by EMAC
337 with UAF implementation for the lowest model level at which clouds are formed
338 (centered at 940 mb) are shown in Figure 1. The calculated CDNC is mostly sensitive
339 to the cloud updraft velocity and the total aerosol number concentration (Karydis et
340 al., 2012), which are the main drivers of the s_{\max} calculations. The annual mean
341 aerosol number concentration, updraft velocity, and s_{\max} calculated by EMAC at 940
342 mb are shown in Figure 2. The calculated global annual mean CDNC at 940 mb is
343 231 cm⁻³.

344 Over the continents, the predicted annual mean CDNC is 546 cm⁻³ and exceeds
345 1000 cm⁻³ over the industrialized areas of Europe, central and eastern Asia, and North
346 America. In these areas, the aerosol number concentration is high (exceeding 10,000
347 cm⁻³; Figure 2a), while the calculated updraft velocities (0.5-1 m s⁻¹; Figure 2b) allow
348 the development of sufficiently high s_{\max} (0.1-0.3%; Figure 2c) for the activation of
349 5% (over eastern China) to 15% (over central Europe) of the pollution aerosols into
350 cloud droplets. The simulated s_{\max} is close to the estimated s_{\max} (0.2%-0.5%) for
351 stratocumulus clouds based on data from continental air masses (Twomey and
352 Wojciechowski, 1968; Martin et al., 1993) indicating that the combination of aerosol
353 number concentration and updraft velocity in the model is realistic. While the aerosol
354 number concentration over the industrialized areas remains fairly constant throughout
355 the year, the updraft velocity is higher during the boreal winter (i.e., DJF) resulting in
356 a seasonal peak of CDNC during DJF (exceeding 2,000 cm⁻³) over North America,



357 Europe and eastern Asia (Figure 1b). The highest annual mean CDNC is calculated
358 over northern India ($\sim 2,000 \text{ cm}^{-3}$) where the model simulates highest aerosol
359 concentrations ($\sim 30,000 \text{ cm}^{-3}$). Over Southeast Asia and India, CDNC peaks during
360 JJA (exceeding $2,000 \text{ cm}^{-3}$; Figure 1c), affected by the East Asian Monsoon and the
361 high updraft velocities developed during the wet season. Relatively high CDNC
362 (annual mean of $300\text{-}700 \text{ cm}^{-3}$) are also calculated over the tropical regions of the
363 Southern Hemisphere which are influenced by biomass burning. Relatively low
364 values are calculated over the Congo Basin where the mean updraft velocity is
365 typically low (below 0.2 m s^{-1}) leading to low s_{\max} (below 0.05%) and cloud droplet
366 activation ($\sim 300 \text{ cm}^{-3}$). Downwind of deserts, the calculated CDNC varies between
367 100 cm^{-3} (e.g., Patagonia, and Australian deserts) to $1,000 \text{ cm}^{-3}$ (e.g., Sahara, Arabian,
368 Taklimakan, Gobi and Atacama). In the vicinity of the Sahara and Arabian deserts,
369 the mean updraft velocity is $\sim 0.5 \text{ m s}^{-1}$. However, downwind of the western part of the
370 Sahara the aerosol number concentration is relatively low ($\sim 1,000 \text{ cm}^{-3}$) leading to
371 higher s_{\max} ($\sim 0.2\%$) but low CDNC ($\sim 200 \text{ cm}^{-3}$). On the other hand, downwind of the
372 eastern Sahara and Arabian deserts the aerosol concentration is higher (2,000-3,000
373 cm^{-3}). Over these areas the presence of a high number of coarse dust particles
374 significantly reduces s_{\max} ($\sim 0.05\%$), but at the same time they efficiently activate into
375 cloud droplets (CDNC varies from 500 to $1,000 \text{ cm}^{-3}$). Close to Patagonia and
376 Australia, despite the high updraft velocities ($\sim 1 \text{ m s}^{-1}$), the aerosol concentration is
377 low (below 500 cm^{-3}) and also CDNC is relatively low ($\sim 100 \text{ cm}^{-3}$). The highest
378 updraft velocities are calculated around the Atacama and Gobi deserts (over 1 m s^{-1})
379 leading to both high s_{\max} (over 0.3%) and CDNC ($\sim 1,000 \text{ cm}^{-3}$). However, the central
380 Asian deserts (e.g., Gobi) are under the influence of the Siberian anticyclone during
381 winter (i.e., DJF) which causes katabatic winds (that inhibit the formation of positive
382 updraft velocities) and very low temperatures that prevent the formation of liquid
383 clouds.

384 Over the oceans, the predicted annual mean CDNC is 113 cm^{-3} and exceeds 500
385 cm^{-3} along the coasts of Mediterranean countries, China, India, SE Asia, California,
386 the northeastern USA and western Africa (Fig. 1). Over many coastal regions aerosol
387 concentrations are relatively high ($5,000\text{-}10,000 \text{ cm}^{-3}$), however, the low updraft
388 velocities ($\sim 0.2 \text{ m s}^{-1}$) result in lower CDNCs than over land (Figure 1). The
389 Mediterranean and Yellow Seas are somewhat exceptional since the annual mean



updraft velocities are higher ($\sim 0.3 \text{ m s}^{-1}$), resulting in higher s_{\max} ($\sim 0.1\%$ and $\sim 0.3\%$, respectively) and therefore high CDNC ($\sim 800 \text{ cm}^{-3}$ and $\sim 1200 \text{ cm}^{-3}$, respectively). The simulated s_{\max} is in close agreement with estimates ($\sim 0.1\%$) based on observational data over the eastern Mediterranean (Bougiatioti et al., 2016a; Kalkavouras et al., 2016). CDNC over these seas is subject to high seasonal variation ranging from $\sim 400 \text{ cm}^{-3}$ ($\sim 800 \text{ cm}^{-3}$) over the Mediterranean (Yellow) Sea during JJA, to over $1,000 \text{ cm}^{-3}$ ($2,000 \text{ cm}^{-3}$) during DJF due to the higher updraft velocities during boreal winter (exceeding 1 m s^{-1}) compared to summer (below 0.2 m s^{-1}). Over the northern coasts, the annual mean CDNC is significantly enhanced compared to the oceans of the Southern Hemisphere due to the transport of pollutants from industrialized areas in the Northern Hemisphere. Despite the high updraft velocities calculated over the southern oceans throughout the year (up to 1 m s^{-1}), the lack of aerosol (typically below 100 cm^{-3}) results in CDNC below 50 cm^{-3} . Finally, the calculated CDNC decreases with altitude due to the decrease in aerosol concentration by dilution and atmospheric removal (Figure 3). The global mean CDNC is predicted to be 231 cm^{-3} , 171 cm^{-3} , 120 cm^{-3} , 87 cm^{-3} , and 60 cm^{-3} at 940 mb, 900 mb, 860 mb, 820 mb, and 770 mb, respectively.

407

408 3.2 Model Evaluation

409 The predicted CDNC are compared to observational data from continental,
410 polluted marine and clean marine regions around the world (Karydis et al., 2011). The
411 locations of observations (i.e., longitude, latitude, and altitude) and time of year have
412 been taken into account in sampling the model results. Given that the observations
413 span a decade, in contrast to the simulation which represents one year, the month of
414 each campaign has been used to account for the seasonal variability of the CDNC.
415 Thus, the implicit assumption is that inter-annual variability can be neglected. It
416 should also be mentioned that the observations typically do not represent monthly
417 means over 1.9° grid squares, as sampled from the model results, so that the
418 comparison is more qualitative than quantitative. A summary of the comparison
419 results is presented in Table 1 and Figure 4. The mean bias (MB), mean absolute
420 gross error (MAGE), normalized mean bias (NMB), normalized mean error (NME),
421 and the root mean square error (RMSE) are used to assess the model performance
422 (Table 2).



423 The model captures the low values (below 100 cm⁻³) observed over the remote
424 Pacific, Atlantic and Indian Oceans and at the same time is capable of simulating the
425 higher concentrations (>100 cm⁻³) observed over the eastern Pacific Ocean (Table 1).
426 On the other hand, it falls short in reproducing the relatively high CDNC (>100 cm⁻³)
427 observed during summer over the western Arctic Ocean and over the remote area west
428 of Australia. Overall, the model tends to underestimate the CDNC over remote oceans
429 with a MB = -33 cm⁻³ and NMB = -39% (Table 2).

430 Both the observed and simulated CDNC show significant increases over polluted
431 marine regions close to the coasts (Table 1; Figure 4a). Compared to satellite
432 retrievals (Bennartz, 2007; Rausch et al., 2010), the model reproduces the CDNC over
433 the American and African coasts well, but it significantly overestimates CDNC along
434 the Asian coasts (Table 1). Compared to in situ observations, the model reproduces
435 the high CDNC along coastal areas in the Northern Hemisphere (e.g., the Yellow Sea,
436 Oregon, Florida, Canary Islands), but systematically overestimates CDNC over the
437 British coasts. Further, the model does not reproduce some of the high CDNC
438 observations over more remote areas (i.e., over the Azores and eastern Atlantic
439 Ocean). Overall, the model tends to overestimate the CDNC over polluted marine
440 areas with a MB = 127 cm⁻³ and NMB = 75% (Table 2).

441 The observed CDNC over continental regions is subject to high variability, with
442 reported values ranging from <100 cm⁻³ over Alaska (Dong and Mace, 2003) to
443 >1,000 cm⁻³ over China (Zhao et al., 2006), England (Bower et al., 1999), and the
444 continental USA (Fountoukis et al., 2007). The model captures the observed
445 variability with low values over remote areas (e.g., over Alaska) and high values over
446 the industrialized parts of the Northern Hemisphere (i.e., East Asia, Europe, and
447 China). Overall, the model overestimates CDNC over most regions (MB= 269 cm⁻³
448 and NMB=58%; Table 2). Over China, the simulated CDNC is within the observed
449 range with the exception of Hebei Province where it significantly overestimates
450 measured CDNC (Table 1). In Europe, the model reproduces the high CDNC
451 observed over Central Europe and England but it clearly overestimates the low CDNC
452 values observed over Finland. Over North America, the model captures the variability
453 of the observed CDNC, predicting lower values over remote areas (e.g., Alaska) and
454 higher values over the industrialized areas of USA (e.g., Ohio and Michigan). It tends
455 to overestimate the CDNC over the continental USA and underestimate the observed
456 values over Alaska.



457 Over all examined regions (clean marine, polluted marine, continental), the
458 calculated NMB is 56% and the NME is 82%, indicating that some of the discrepancy
459 between the modelled and the observed CDNC is explained by uncertainties in the
460 observations and the numerical simulations. Around 60% of the simulated CDNC are
461 within a factor of 2 compared to the measurements (Figure 4a) and 40% of the
462 simulated CDNC differ less than 30% from the measurements. Based on the typical
463 properties of marine stratus clouds, a uniform increase in global CDNC by 30% (or
464 50%) can result in a perturbation of -1.1 W m^{-2} (or -1.7 W m^{-2}) in the global mean
465 cloud radiative forcing (Schwartz, 1996). However, the simulated CDNC presented
466 here refers to the number concentration of droplets nucleated in clouds and represents
467 an upper limit with respect to the comparison with observations, since collision and
468 coalescence processes, which are not taken into account here, can reduce the CDNC.
469

470 4. Mineral Dust Effect on CDNC

471

472 4.1 Total Impact of Mineral Dust on CDNC

473 To estimate the overall effect of mineral dust on CDNC a sensitivity run was
474 conducted switching off the mineral dust emissions. Figure 5 depicts the difference in
475 CDNC between the base case simulation and the sensitivity test. A positive change
476 corresponds to an increase of the CDNC due to the presence of dust. The predicted
477 CDNC is typically increased by the presence of dust aerosols over the main deserts
478 (Figure 5). Over the Sahara, CDNC increases less than 50 cm^{-3} (up to 20%). The
479 largest change is calculated downwind of the Patagonian ($\sim 150 \text{ cm}^{-3}$ or 70%) and
480 Atacama ($\sim 350 \text{ cm}^{-3}$ or 40%) deserts. Over these deserts dust emissions increase the
481 aerosol concentration by more than $5,000 \text{ cm}^{-3}$. The effect of mineral dust on CDNC
482 close to Sahara varies significantly throughout the year due to the seasonality of the
483 mineral dust emissions. Over the sub-Saharan region, CDNC increases by up to 150
484 cm^{-3} during DJF, owing to the northeasterly trade winds (i.e., Harmattan winds) which
485 blow from the Sahara Desert over the West Africa during winter. Over the eastern
486 Sahara and the Arabian deserts CDNC increase up to 150 cm^{-3} during spring (i.e.,
487 MAM) and autumn (i.e., SON) when the Sirocco winds are most common. In contrast
488 to regions close to deserts, CDNC decreases over the polluted regions of the Northern
489 Hemisphere and especially over southern Europe (~ 100 or less than 10%) and
490 northeastern Asia (up to 400 cm^{-3} or 20%). In these areas, dust particles transported



491 from the Sahara over Europe and from the Gobi and Taklimakan deserts over Asia,
492 are mixed with anthropogenic particles affecting the aerosol-water vapor interactions.

493 As the insoluble fraction of aerosols increases, the exponent x in Eq. 4 changes,
494 resulting in a decrease of the number of activated droplets. Furthermore, the relatively
495 large, aged dust particles over these areas activate early on in the cloud formation
496 process, taking up much water per particle and thus reducing s_{\max} (~15%), and
497 consequently cloud droplet formation on the smaller anthropogenic particles (e.g., the
498 activated fraction of the particles in the accumulation mode reduces by 20%). Beside
499 microphysical effects, the presence of mineral dust can also affect cloud formation by
500 altering the energy balance of the atmosphere, and thus turbulent motions and the
501 updraft velocity. Nevertheless, the calculated updraft velocity does not change
502 significantly between the two simulations (less than 5%) since the meteorology is
503 dynamically nudged to analysis data (Jeuken et al., 1996). CDNC also decreases over
504 the oceans downwind of deserts in the Northern Hemisphere, and even over the
505 rainforests in the Southern Hemisphere (~150 or 30%). Overall, despite that CDNC
506 increases over the deserts due to the presence of dust particles, the decrease of CDNC
507 over the industrialized and forested continental areas dominates the calculated global
508 average change, i.e., the calculated global average CDNC decreases by 11% (or 26
509 cm^{-3}).

510

511 **4.2 Impact of Mineral Dust Chemistry on CDNC**

512 To estimate the effects of thermodynamic mineral dust interactions with inorganic
513 anions on the predicted CDNC, a sensitivity run was conducted by switching off the
514 dust-aerosol chemistry. Karydis et al. (2016) have shown that dust can significantly
515 affect the partitioning of inorganic aerosol components and especially nitrate.
516 Analogous to (Karydis et al. (2016)), accounting for thermodynamic interactions of
517 mineral dust in our simulations results in an increase of the tropospheric burden of
518 nitrate, chloride, and sulfate aerosols by 44%, 9%, and 7%, respectively. On the other
519 hand, ammonium decreases by 41%. The dust presence itself also decreases by 14%
520 since it becomes significantly more soluble, mostly due to the condensation of nitric
521 acid on its surface, and is removed more efficiently through wet and dry deposition,
522 the latter due to the increased sedimentation by dust particles that have a larger water
523 content. Therefore, the calculated change of CDNC (Figures 6a and 6b) is the net



524 result of counterbalancing effects. Due to the increase of the soluble fraction by
525 considering mineral dust chemistry, the CDNC activated from dust particles increases
526 (Figure 6c), while the total number of dust particles and the CDNC from insoluble
527 particles decreases (Figure 6d). Taking as an example a grid cell over the Sahara
528 desert, the model simulations indicate that by switching on the mineral dust
529 chemistry, the soluble fraction of the dust containing particles increases by 0.07,
530 resulting in an increase of CDNC activated from soluble aerosol modes by 150 cm^{-3}
531 (Figure 6c). On the other hand, the aerosol number concentration decreases by 90 cm^{-3}
532 due to the more efficient atmospheric removal of the aged dust particles, resulting in
533 a decrease of the CDNC activated from the insoluble modes by 50 cm^{-3} (Figure 6d).
534 The net effect is that the total CDNC increases by 100 cm^{-3} (Figure 6a).

535 Overall, the presence of reactive dust components results in an increase of CDNC
536 over the deserts that are close to anthropogenic sources, e.g., up to 100 cm^{-3} (or 20%)
537 over the Sahara and up to 200 cm^{-3} (or 30%) over the Arabian Peninsula. In these
538 areas, the CCN activity of mineral dust (initially hydrophilic) is enhanced by the
539 acquired hygroscopicity from the anthropogenic (including biomass burning) aerosol
540 compounds (mainly nitrate) during their thermodynamic interaction. Even though the
541 chemically aged dust particles activate into droplets more efficiently than insoluble
542 ones, their reduced number concentration dominates the calculated effect on CDNC
543 over the relatively pristine remote desert regions, e.g., CDNC decreases up to 200 cm^{-3}
544 (or 20%) downwind of the Taklimakan, 250 cm^{-3} (or 30%) around the Atacama, and
545 up to 100 cm^{-3} (or 40%) over the Patagonian deserts. Even over the rainforests, HNO_3
546 from biomass burning NO_x thermodynamically interacts with the coarse soil particles
547 from the upwind deserts, resulting in an increase of CDNC by around 50 cm^{-3} . CDNC
548 is also slightly increased over Europe and eastern Asia (up to 150 cm^{-3} or about 10%)
549 where HNO_3 from anthropogenic NO_x sources interacts with mineral dust from the
550 surrounding deserts. While the global average CDNC does not change much by taking
551 into account thermodynamic and chemical interactions of mineral dust with inorganic
552 air pollutants, CDNC spatial distributions change substantially.

553

554 **4.3 Impact of Water Adsorption by Mineral Dust on CDNC**

555 To estimate the effects of water adsorption onto the surface of insoluble dust
556 particles on CDNC, a sensitivity run was conducted by switching off the FHH
557 adsorption calculations. In this sensitivity simulation, the soluble modes follow the κ -



558 Köhler theory while insoluble modes do not participate in cloud droplet formation
559 calculations. Figure 7 depicts the difference in CDNC between the base case
560 simulation and this sensitivity test. A positive change corresponds to an increase of
561 the CDNC from water adsorption on mineral dust. The calculations show that CDNC
562 is increased by applying FHH theory over several arid areas where the insoluble dust
563 concentration is high (Figure 7), since κ -Köhler theory does not take into account the
564 contribution of insoluble particles to cloud droplet formation. CDNC is increased in
565 the vicinity of the Sahara, Arabian and Thar deserts ($\sim 100 \text{ cm}^{-3}$ or about 20%) where
566 the insoluble fraction of mineral dust is larger due to the small anthropogenic
567 emission influence that makes the particles hygroscopic. On the other hand, CDNC
568 decreases over the polluted regions of the Northern Hemisphere and especially over
569 Europe ($\sim 100 \text{ cm}^{-3}$ or about 10%) and Asia (up to 400 cm^{-3} or $\sim 20\%$). Over these
570 areas, the added hydrophilicity by the soluble coatings on the surface of the aged dust
571 particles increases their water uptake during activation. Therefore, the aged dust
572 particles relatively strongly compete for water vapor, reducing the s_{\max} ($\sim 15\%$) and
573 thus cloud droplet formation from the smaller anthropogenic particles. Over the
574 tropical rainforests CDNC decreases by approximately 150 cm^{-3} (or $\sim 30\%$). Overall,
575 the use of the UAF results in a decrease of the global average CDNC by $\sim 10\%$ (or
576 about 23 cm^{-3}).

577

578 **5 Additional Sensitivity Tests**

579 Three additional sensitivity simulations were conducted to investigate the CDNC
580 dependency on i) the chemical composition of the emitted dust aerosols, ii) the
581 hydrophilicity of mineral dust, and iii) the strength of the dust aerosol emissions.
582 Figure 8 depicts the absolute annual mean changes in CDNC compared to the
583 reference simulation for each of the sensitivity tests. A positive change corresponds to
584 an increase of the CDNC relative to the reference.

585

586 **5.1 Sensitivity to the emitted dust aerosol composition**

587 The first sensitivity test assumes a globally uniform chemical composition of
588 mineral dust (Sposito, 1989), in contrast to the reference simulation where the mineral
589 dust composition depends on the soil characteristics of each desert (Karydis et al.,
590 2016). While the emitted mineral dust load remains the same in the sensitivity



591 simulation, the different mineral dust composition results in significant changes in the
592 calculated tropospheric burdens of dust components (Karydis et al., 2016). In
593 particular, the fraction of the mineral components relative to the total dust in the
594 sensitivity simulation is lower over most of the deserts compared to the reference.
595 This reduction of the chemically reactive mineral components in the sensitivity
596 simulation results in a slowdown of the mineral dust aging and hence in an increase of
597 its concentration due to the reduced atmospheric removal. Conversely, the CCN
598 activity of dust particles is higher in the reference simulation since the chemical aging
599 is stronger compared to the sensitivity simulation. These counterbalancing effects
600 result in negligible changes of CDNC worldwide (less than 10%).

601

602

603

604 **5.2 Sensitivity to the hydrophilicity of dust**

605 The second sensitivity test assumes increased hydrophilicity of mineral dust
606 aerosols by using a 10% lower B_{FHH} parameter ($B_{FHH}=1.1$). The higher hydrophilicity
607 of mineral dust in the sensitivity simulation results in increased CDNC over over
608 areas close to deserts by up to 30% (e.g., 100 cm^{-3} over Sahara and 200 cm^{-3} over
609 Gobi and Taklimakan). A notable increase is also calculated over eastern China and
610 northern India (up to 150 cm^{-3} or 10%) where mineral dust is mixed with
611 anthropogenic compounds. Remote from the main deserts (e.g., over central Europe),
612 the change in CDNC is negligible since the contribution of mineral dust particles on
613 cloud droplet formation is low. Overall, the calculated global average CDNC
614 increases in the sensitivity simulation by 5% (or 12 cm^{-3}).

615

616 **5.3 Sensitivity to the emitted dust aerosol load**

617 The final sensitivity test assumes 50% lower emissions of mineral dust compared
618 to the reference simulation. The lower tropospheric dust aerosol load in the sensitivity
619 simulation (49%) results in a 10-30% (up to 150 cm^{-3}) decrease of CDNC over the
620 main deserts. On the other hand, CDNC increases over the anthropogenic (e.g., East
621 Asia) and biomass burning (e.g., central Africa) regions by 5-10% (up to 150 cm^{-3}).
622 The opposing responses of CDNC to mineral dust emissions result from the fact that
623 the tropospheric load of the other aerosol species does not change significantly
624 between the two simulations since the chemical and thermodynamic interactions of



625 mineral cations with air pollution are still important even after the 50% emission
626 reduction of dust. Therefore, the presence of inorganic anions (e.g., NO_3^-) in the
627 aerosol phase remains almost unchanged between the two simulations which results in
628 a decrease of the insoluble fraction of the aerosol, given that mineral dust
629 concentrations are significantly lower in the reference simulation, leading to higher
630 CCN activity. Over the Taklimakan desert the insoluble fraction of the aerosol
631 changes by less than 10%, and therefore, the change in aerosol number concentration
632 (~40%) due to the mineral dust emission change dominates the effect on CDNC,
633 which is calculated to be about 100 cm^{-3} (or ~20%) lower in the sensitivity
634 simulation. On the other hand, over Southeast Asia, the aerosol number concentration
635 changes less than 10% while the insoluble fraction of the aerosols decreases by 40%.
636 The significant decrease of ε_i in Eq. (3) affects the calculated critical supersaturation
637 of the particle as well as the exponent x in Eq. (4) resulting in an increase of CDNC
638 by about 150 cm^{-3} (or ~10%). Overall, the impact of halving mineral dust emissions
639 on the calculated global average CDNC is remarkably small (~3% or 6 cm^{-3}).

640
641

642 **6 Summary and Conclusions**

643 This study assesses the impact of mineral dust on global cloud droplet number
644 concentrations by using an interactive aerosol-chemistry-cloud-climate model
645 (EMAC). The “unified dust activation framework” (UAF) has been implemented into
646 the EMAC model to account for the effects of dust particles through both the
647 hydrophilicity from adsorption and the acquired hygroscopicity from pollution solutes
648 (chemical aging) on CCN activity calculations. The calculation of cloud droplet
649 formation from soluble particles is carried out by using the κ -Köhler theory, while
650 that of insoluble particles is based on the FHH multilayer adsorption isotherm
651 approach. For atmospheric particles that contain a substantial fraction of both soluble
652 (e.g., nitrate) and insoluble material (e.g., mineral dust), cloud formation is calculated
653 using the UAF, which determines the maximum equilibrium water vapor
654 supersaturation over an aerosol consisting of an insoluble core with a soluble coating.
655 Furthermore, the model setup includes thermodynamic interactions between mineral
656 dust anions (i.e., Na^+ , Ca^{2+} , K^+ , Mg^{2+}) and inorganic cations (i.e., NO_3^- , Cl^- , SO_4^{2-}).

657 The simulated CDNC at 940 mb, i.e., at cloud base, is relatively high over the
658 industrialized areas of Europe, Asia and North America (exceeding $1,000 \text{ cm}^{-3}$) and



659 over the biomass burning regions in the tropics ($300\text{-}700\text{ cm}^{-3}$). Relatively high
660 CDNC is also calculated over the main deserts ($100\text{-}1,000\text{ cm}^{-3}$) where the CCN
661 activity of pristine mineral dust is enhanced by chemical and thermodynamic
662 interactions with soluble compounds from anthropogenic (including biomass burning)
663 and natural sources. Low CDNC (around 50 cm^{-3}) is calculated over the remote
664 oceans while CDNC is much higher (up to $1,000\text{ cm}^{-3}$) over more polluted marine
665 regions near the coast. In view of CDNCs from in situ and satellite observations, we
666 conclude that the model tends to underestimate CDNC over clean marine areas and
667 overestimates CDNC over polluted regions.

668 To estimate the effects of mineral dust and its variable chemical composition on
669 CDNC, three main sensitivity simulations have been conducted. In the first, mineral
670 dust emissions were switched off. This reveals that despite the large tropospheric load
671 of mineral dust aerosols (35 Tg in the base case simulation) the dust presence
672 decreases the calculated global average CDNC by only 11%. This is the net result of
673 substantial positive and negative, partly compensating effects. Over polluted regions
674 (e.g., Europe), dust particles, mostly transported from the Sahara, are mixed with
675 pollution aerosols resulting in a significant reduction of the CCN activity of the
676 anthropogenic particles and hence cloud droplet formation. On the other hand, the
677 activation of freshly emitted dust particles through water adsorption results in an
678 increase of CDNC over the main deserts. However, on a global scale this does not
679 match the calculated decrease over the polluted regions. While such sensitivity tests
680 do not relate to real-world changes, they help understand the role of mineral dust in
681 the climate system, and especially the importance of including these processes into
682 climate models, being hitherto neglected.

683 A second simulation has been performed by switching off the mineral dust
684 chemistry to estimate the impact of interactions between inorganic and mineral
685 cations on the predicted CDNC. We find that the tropospheric burden of inorganic
686 anions (mainly nitrate) increases, resulting in a slight increase of CCN activity and
687 cloud droplet formation in areas that are influenced by biomass burning and industrial
688 emissions. Furthermore, including crustal cation chemistry and thermodynamics
689 significantly affects the aging of mineral dust and its solubility, especially due to the
690 uptake of nitric acid, so that dust is removed more efficiently through wet and dry
691 deposition. This results in a decrease of CDNC over the remote deserts (e.g.,



692 Taklimakan). On average, global CDNC does not change significantly by considering
693 mineral dust chemistry and thermodynamics.

694 In the third simulation the FHH calculations have been switched off to estimate the
695 effects of water adsorption onto the surface of insoluble dust particles on the predicted
696 CDNC. The CDNC in the reference simulation is found to be higher over arid areas
697 due to the adsorption activation of the freshly emitted insoluble dust particles. On the
698 other hand, CDNC is lower over polluted regions (e.g., over Europe) since the aged
699 dust particles experience significant water uptake during their activation reducing the
700 s_{\max} and the activation of the smaller anthropogenic particles. Overall, the use of the
701 UAF results in a decrease of the global average CDNC by ~10%. This result shows
702 that for the modeling of cloud droplet formation, adsorption activation of insoluble
703 aerosols is more important than mineral dust chemistry and thermodynamics.
704 However, taking into account the adsorption activation of insoluble aerosols without
705 mineral dust chemistry can result in a significant overestimation of CDNC, mainly
706 over the remote deserts. Conversely, considering mineral dust chemistry and
707 thermodynamics without UAF can result in significant overestimation of CDNC over
708 polluted areas.

709 Finally, three additional sensitivity simulations have been conducted to investigate
710 the sensitivity of the results to the physicochemical properties of the emitted mineral
711 dust (chemical composition, hydrophilicity and emission strength). This indicates that
712 the calculated CDNC is sensitive to the mineral dust hydrophilicity and emission load.
713 By assuming drastic differences in the dust source and the dust hydrophilicity, we find
714 only small (~5%) changes in the average CDNC. Further, the global average CDNC is
715 not sensitive to the chemical composition of mineral dust.

716 This study demonstrates that a comprehensive treatment of the CCN activity of
717 mineral dust aerosols and their chemical and thermodynamic interactions with
718 inorganic species by CCMs is important to realistically account for aerosol-chemistry-
719 cloud-climate interactions. Neglecting the adsorption activation of freshly emitted
720 dust can result in significant biases over areas close to deserts. In addition, neglecting
721 the mineral dust chemistry and thermodynamics results in an underestimation of the
722 coating of dust by hygroscopic salts during atmospheric aging. The realistic
723 representation of soluble coating on dust is crucial since it affects its efficiency to
724 grow by water uptake, which significantly influences the local supersaturation and



725 thus cloud droplet formation over anthropogenically polluted regions. In this first
726 study we apply the UAF diagnostically, while for future applications, e.g., to simulate
727 climate effects, we plan prognostic climate calculations where effects on precipitation
728 formation and dynamical responses will also be accounted for.

729

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Table 1. Comparison of simulated and observed (Karydis et. al, 2011 and the references therein) cloud droplet number concentrations

Location	Lat.	Long.	Alt.	Time	Observation	Simulation
S. Pacific Ocean			PBL	Annual	40	23
S. Pacific Ocean	20S-35S	135W-175W	PBL	Annual	82	26
Eastern Pacific Ocean	29N-32N	120W-123W	450-850m	July	49-279	133
N. Pacific Ocean	41N	131W	<1500m	April	21-74	51
N. Pacific Ocean			PBL	Annual	64	59
W. of Canary Islands	32N	25W	PBL	July	17	115
N. Atlantic Ocean			PBL	Annual	89	112
S. Atlantic Ocean			PBL	Annual	67	51
S. Indian Ocean			PBL	Annual	42	29
West Australia (remote)	30S-40S	88E-103E	PBL	Annual	107	22
Beaufort Sea (Western Arctic Ocean)	72N-78N	154W-159W	202-1017m	June	178-365	25
Beaufort Sea (Western Arctic Ocean)	70.5N-73N	145N-147N	300-3000m	June	20-225	28
Beaufort Sea (Western Arctic Ocean)	65N-75N	130W-170W	400-4600m	April	48-77	39
Northeast Alaska coast	69N-71N	150W-158W	400-4000m	October	10-30	23
Yellow Sea (Eastern coast of China)	28N-31N	127E-131E	PBL	Annual	30-1000	764
SE Asia coast	10N-40N	105E-150E	PBL	Annual	186 (100-250)	522
NE Asia coast			PBL	Annual	129	768
N. America coast (Pacific)			PBL	Annual	96	91
N. America coast (Pacific)	15N-35N	115W-140W	PBL	Annual	159 (150-300)	190
S. America coast (Pacific)			PBL	Annual	77	75
S. America coast (Pacific)	8S-28S	70W-90W	PBL	Annual	182 (100-300)	186
N. Africa coast (Atlantic)			PBL	Annual	95	123
S. Africa coast (Atlantic)			PBL	Annual	95	107
S. Africa coast (Atlantic)	5S-25S	10W-15E	PBL	Annual	153 (130-300)	189
Eastern N. Atlantic Ocean	50N-55N	25W-30W	800-2200m	April	65-300	39
NW coast of Santa Maria, Azores	37N	25W	550-1000m	June	150 (74-192)	83
Canary Islands Vicinity	28N	16.5W	PBL	June-July	51-256	174
Canary Islands Vicinity	28N	16.5W	PBL	June-July	90-300	174
Atlantic Ocean (W. of Morocco)	34N	11W	PBL	July	77	114
Coast of Oregon	45.5N	124.5W	PBL	August	25-210	124
Key West, FL	24.5N	82W	PBL	July	268-560	318
Bay of Fundy, Nova Scotia, Canada	44N	66W	20-290m	August	61 (59-97)	246
Cornwall Coast (SW UK)	50N	5.5W	450-800m	February	130	602
British Isles, UK	55N	2.5W	Surface	April	172	287
British Isles, UK	51N	6W	Surface	October	119	71
British Isles, UK	53N	9.5W	Surface	December	96	318
SE coast of England	51.5N-52N	1.5E-2.5E	380-750m	September	151-249	1019
Indian Ocean (SW of India)	10S-10N	65E-75E	50-550m	February-March	100-500	520

**Table 1.** Continued

Location	Lat.	Long.	Alt.	Time	Observation	Simulation
Qinghai Province (Western China)	34N-37N	98E-103E	PBL	Annual	30-700	585
Beijing, China	37N-41N	113E-120E	PBL	Annual	30-1100	1185
NE China (East of Beijing)	39N-40N	117.5E-118.5E	1719-1931m	April-May	200-800	813
Hebei Province (Central Eastern China)	35N-40N	112E-119E	PBL	Annual	30-400	1150
Cumbria, N. England	54.5N	2.5W	Surface	March-April	100-2000	743
Cumbria, N. England	54.5N	2.5W	Surface	May	482-549	840
Koblenz, Germany	50N	7.5E	901-914hPa	May	675-900	1258
Koblenz, Germany	50N	7.5E	945hPa	October	965	1039
Northern Finland	68N	24E	342-572m	Annual	154 (30-610)	332
Kuopio, Finland	62.5N	27.5E	306m	August-November	138	1142
Northern Finland	68N	24E	342-572m	October-November	55-470	336
Cabauw, Netherland	51N	4.5E	PBL	May	180-360	946
Jungfraujoch, Switzerland	46.5N	7.5E	Surface	July-August	112-416	176
Barrow, AK	71.5N	156.5W	389-830m	August	56	47
Barrow, AK	71.5N	156.5W	431-736m	May	222	26
Barrow, AK	71.5N	156.5W	297-591m	June	121	31
Barrow, AK	71.5N	156.5W	393-762m	July	54	29
Barrow, AK	71.5N	156.5W	1059-1608m	September	81	23
Southern Great Plains, OK	36.5N	97.5W	795-1450m	Winter	265-281	341
Southern Great Plains, OK	36.5N	97.5W	343-1241m	Winter	244	341
Southern Great Plains, OK	36.5N	97.5W	985-1885m	Spring	200-219	384
Southern Great Plains, OK	36.5N	97.5W	671-1475m	Spring	203	537
Southern Great Plains, OK	36.5N	97.5W	1280-2200m	Summer	128-159	393
Southern Great Plains, OK	36.5N	97.5W	756-1751m	Summer	131	603
Southern Great Plains, OK	36.5N	97.5W	1030-1770m	Autumn	217-249	505
Southern Great Plains, OK	36.5N	97.5W	404-1183m	Autumn	276	642
Southern Great Plains, OK	36.5N	97.5W	900-800hPa	March	200 (100-320)	563
Southern Great Plains, OK	36.5N	97.5W	300-600m	April	650	1159
Southern Great Plains, OK	36.5N	97.5W	700-1200m	September-October	457	740
Cleveland, OH; Detroit, MI	40N-42.5N	80.5W-85W	300-1000m	August	320-1300	817
Central Ontario, Canada	50N	85W	<2500m	October	147 (119-173)	201
Central Ontario	50N	85W	2000-2100m	Summer	350-360	143
Central Ontario	50N	85W	1300m	Winter	190	112
Upper NY State	44N	75W	1500m	Autumn	240	583
State College, Pennsylvania	41N	78W	1000-1600m	October	388	551
Mount Gibbes, NC	35.5N	82W	Surface	Annual	238-754	392
Cape Kennedy, FL	28.5N	80.5W	600-2800m	August	250-330	134



Table 2. Statistical evaluation of EMAC CDNC against 74 worldwide observational datasets derived from in situ measurements and satellite retrievals.

Site Type	Number of datasets	Mean Observed (cm ⁻³)	Mean Simulated (cm ⁻³)	MAGE (cm ⁻³)	MB (cm ⁻³)	NME (%)	NMB (%)	RMSE (cm ⁻³)
Clean marine	14	86	53	51	-33	60	-39	81
Polluted marine	24	169	296	159	127	94	75	263
Continental	37	339	536	269	198	80	58	358
Total	75	237	369	193	132	82	56	295

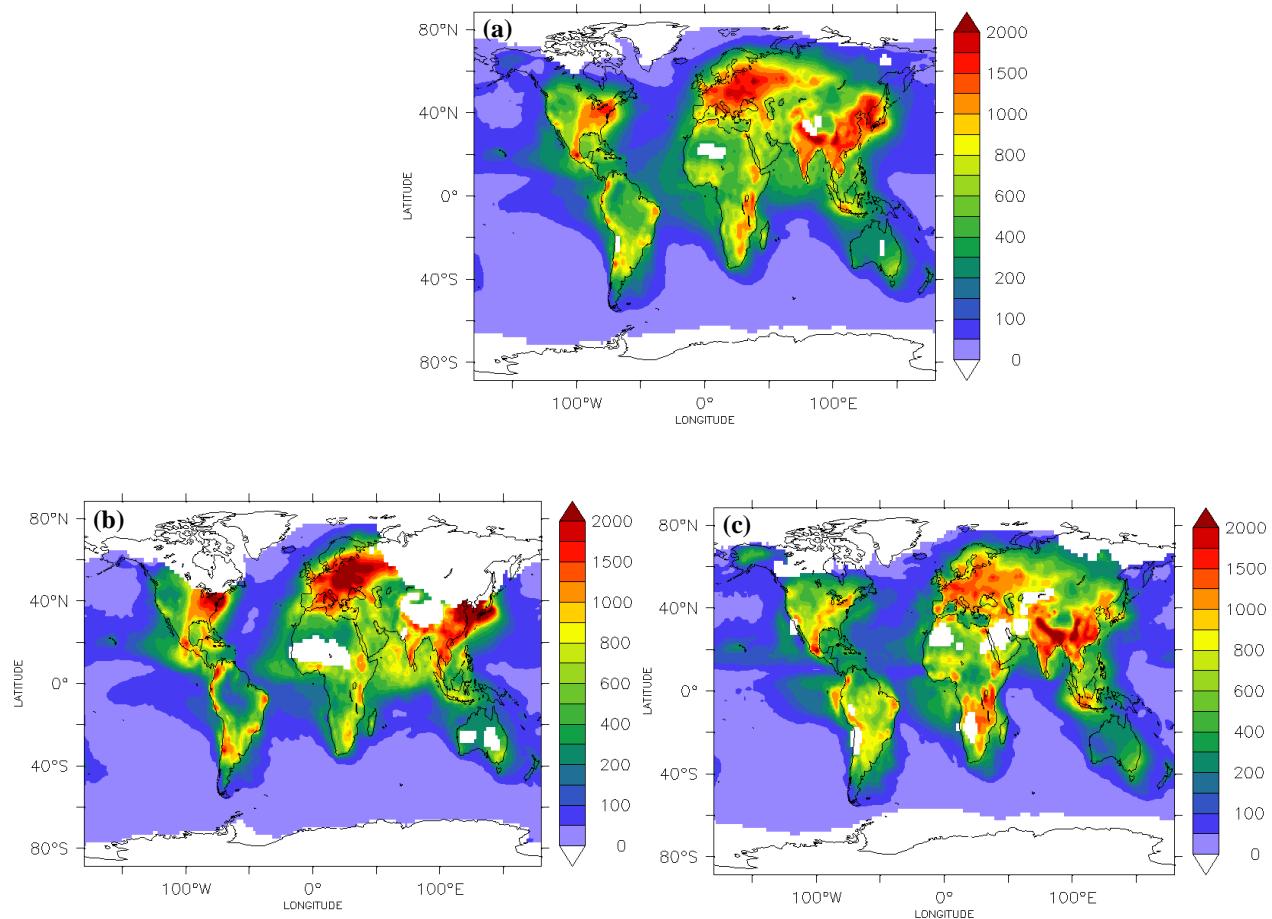


Figure 1: Predicted (a) annual, (b) DJF, and (c) JJA mean cloud droplet number concentrations (cm^{-3}) at the lowest cloud-forming level (940 mb). White color represents areas that are cloud-free or covered by ice clouds.

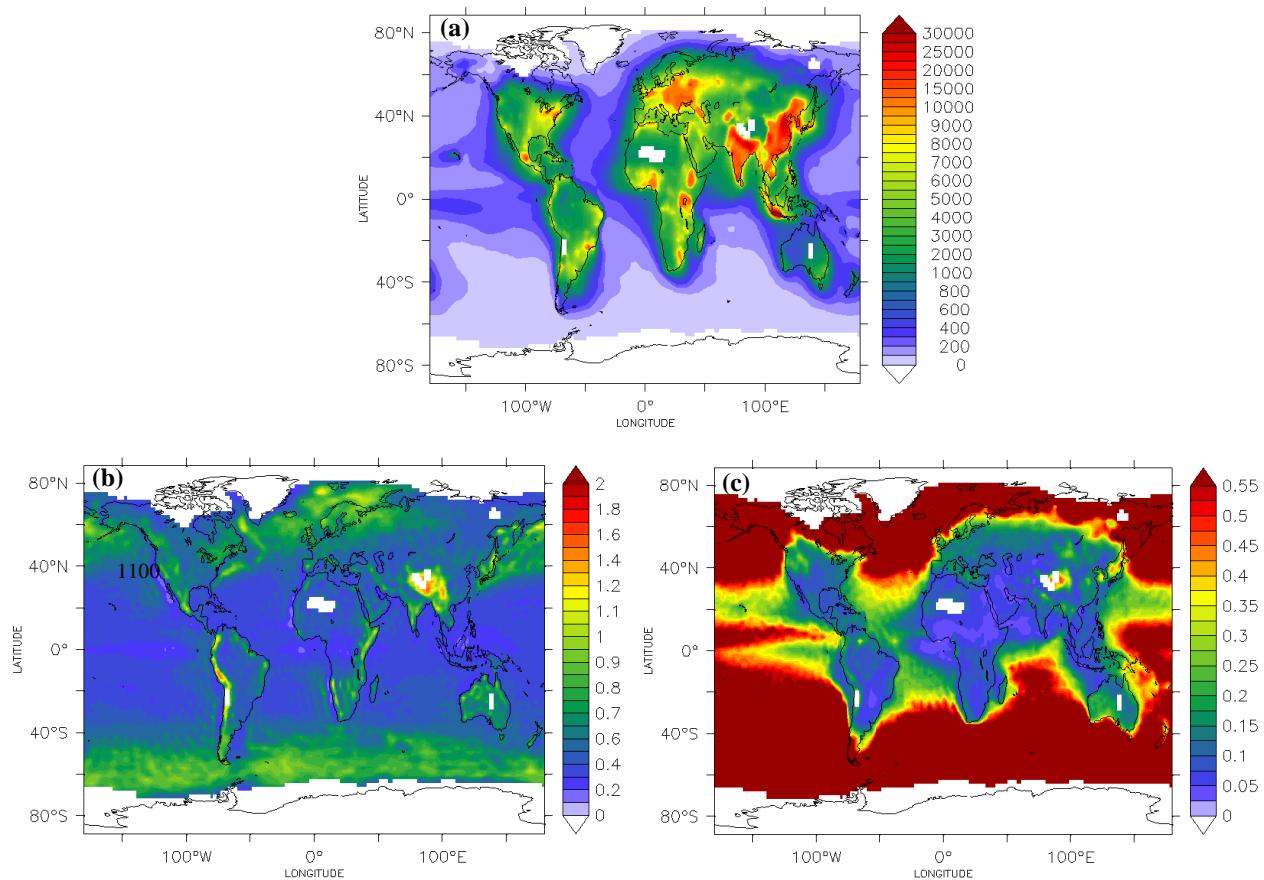


Figure 2: Predicted annual mean (a) aerosol number concentration (cm^{-3}), (b) large-scale cloud updraft velocity (m s^{-1}), and (c) maximum supersaturation (%) at the lowest cloud-forming level (940 mb). White areas correspond to regions where liquid cloud droplets do not form.

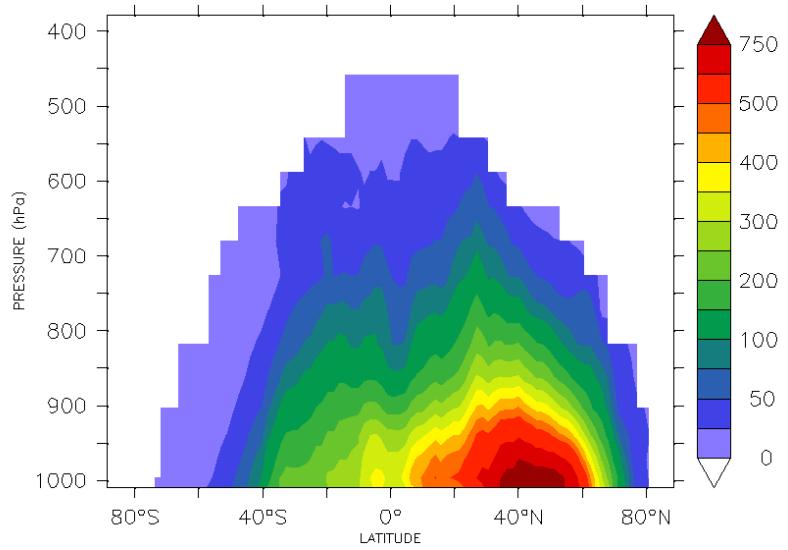


Figure 3: Predicted zonal annual mean cloud droplet number concentration (cm^{-3}).
White areas correspond to regions where liquid cloud droplets do not form.

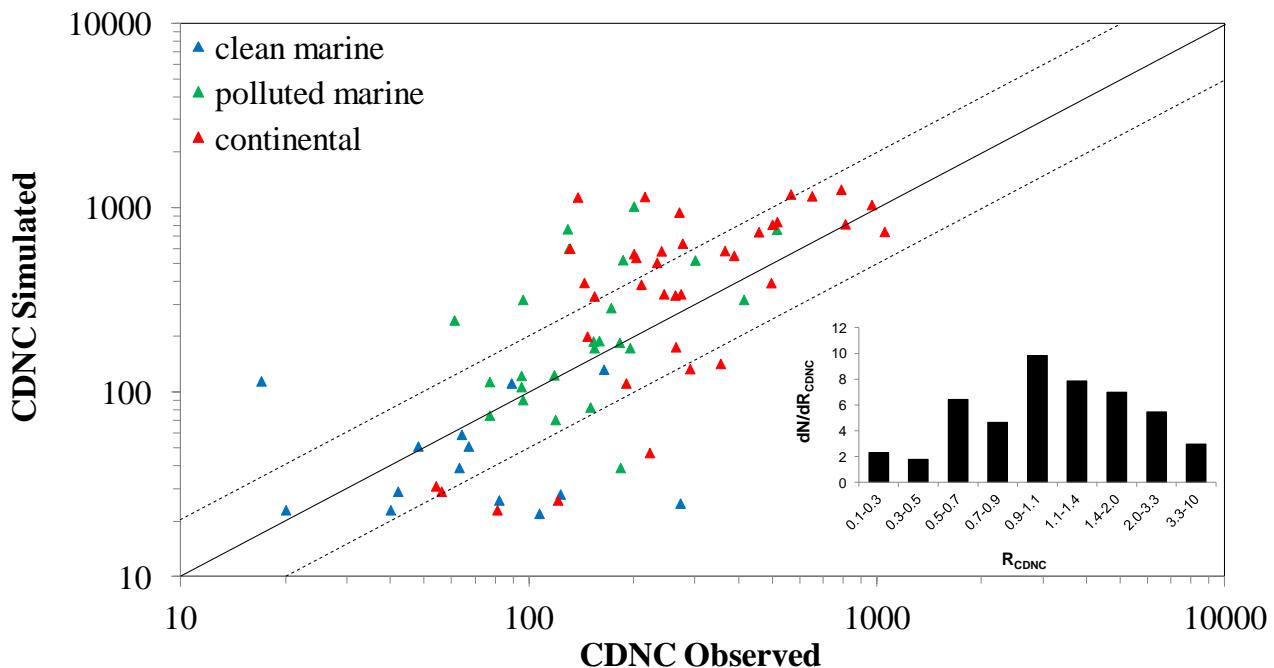


Figure 4: Scatterplot comparing model simulated cloud droplet number concentrations (cm^{-3}) against 74 worldwide observational datasets derived from in situ measurements and satellite retrievals. Also shown are the 1:1, 2:1, 1:2 lines, and the probability distribution of the ratio of the simulated CDNC to the observed CDNC (R_{CDNC}), where N is the number of occurrences in each R_{CDNC} (inset plot).

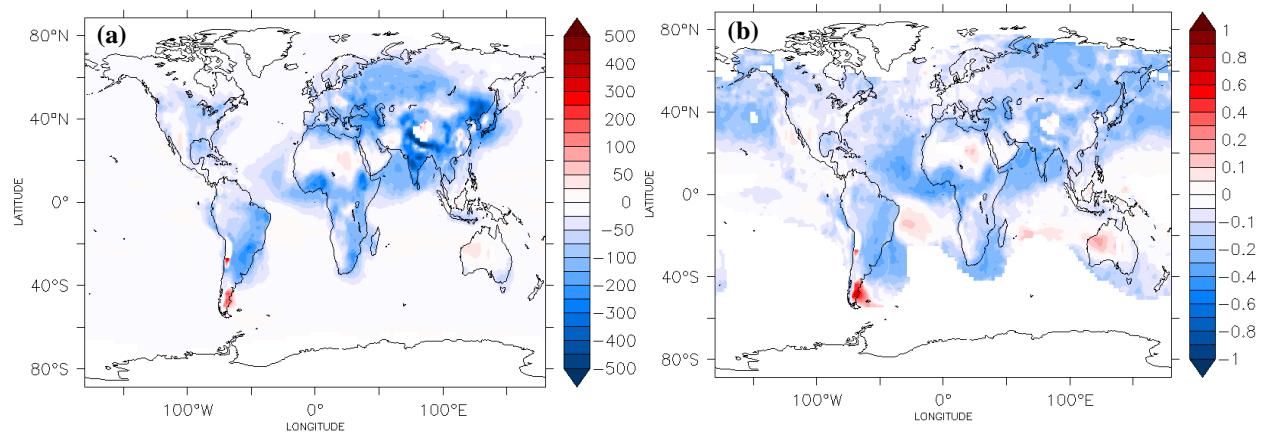


Figure 5: (a) Absolute (in cm^{-3}) and (b) fractional annual change of the predicted CDNC (at the lowest cloud-forming level, 940 mb) by switching on/off the mineral dust emissions. A positive change corresponds to an increase from the presence of dust.

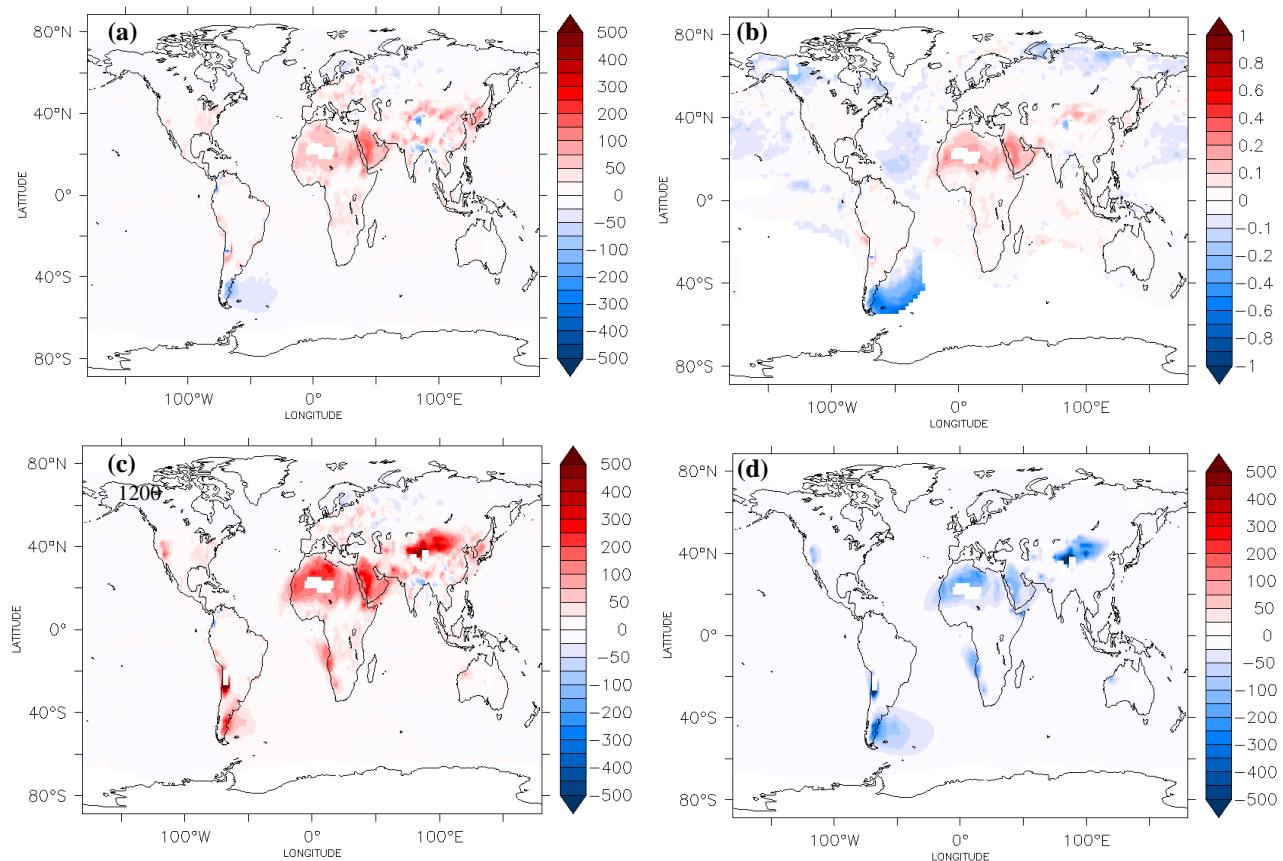


Figure 6: **(a)** Absolute (in cm^{-3}) and **(b)** fractional annual average change of the predicted total CDNC, and absolute (in cm^{-3}) annual average change of the CDNC from **(c)** soluble and **(d)** insoluble particle modes, by switching on/off the mineral dust chemistry. Concentrations reported at the lowest cloud-forming level (940 mb). A positive change corresponds to an increase from dust–chemistry interactions.

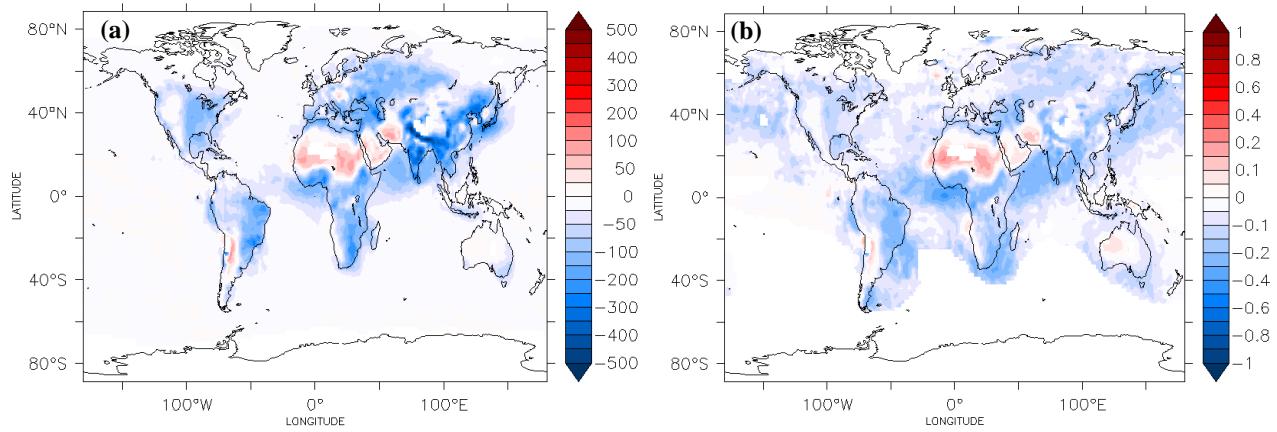


Figure 7: (a) Absolute (in cm^{-3}) and (b) fractional annual average change of the predicted CDNC (at the lowest cloud-forming level, 940 mb) by switching on/off the FHH adsorption activation physics. A positive change corresponds to an increase from water adsorption on mineral dust.

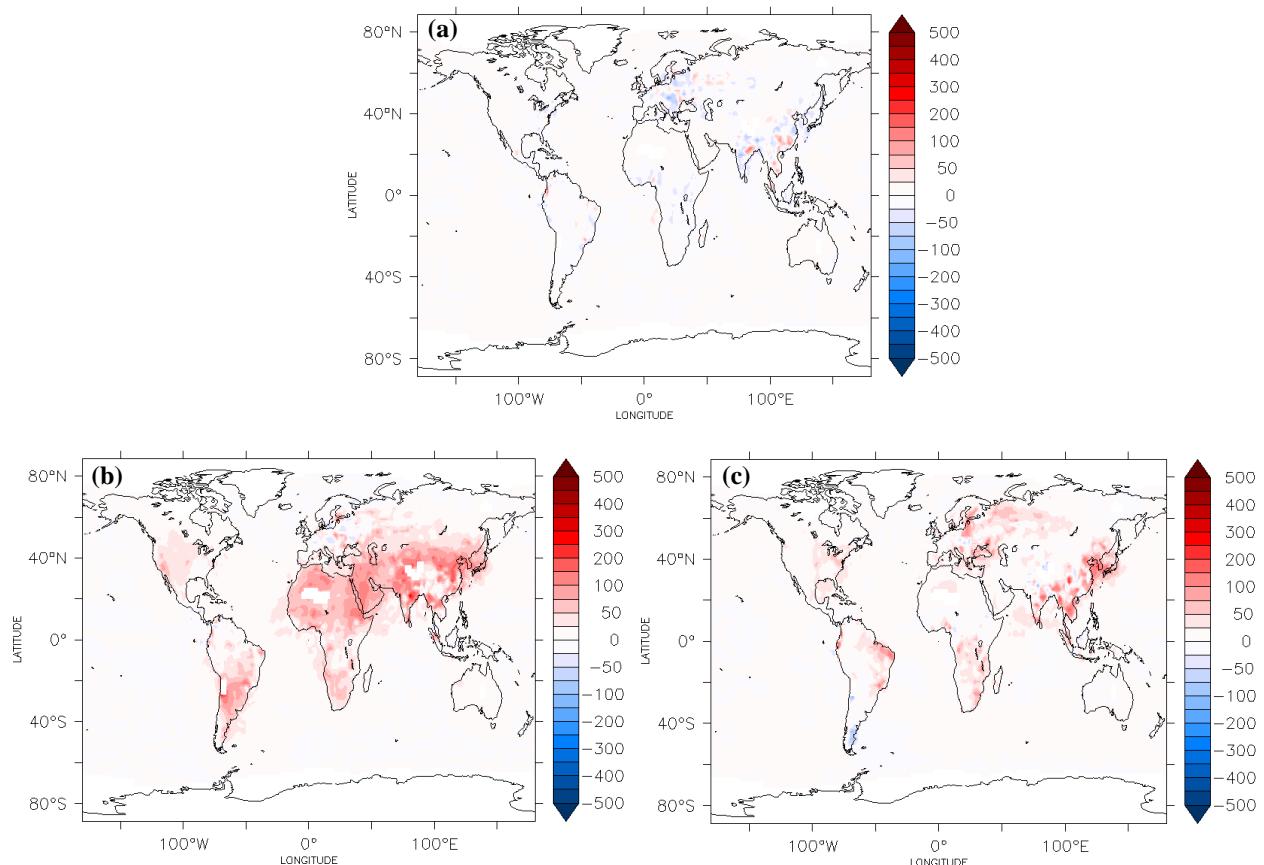


Figure 8: Absolute changes (in cm^{-3}) of the predicted annual average CDNC by (a) assuming a globally uniform chemical composition of mineral dust, (b) increasing the BF_{HH} hydrophilicity parameter of dust by 10%, and (c) reducing mineral dust emissions by 50%. A positive change corresponds to an increase relative to the reference simulation.