



# Supplement of

# Relative importance of high-latitude local and long-range-transported dust for Arctic ice-nucleating particles and impacts on Arctic mixed-phase clouds

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#### 7 Text S1: K14 dust emission parameterization

Kok et al. (2014a, b) (K14) is a physically based dust emission scheme that removes the need
to use an empirical dust soil erodibility map in other parameterizations (e.g., Zender et al., 2003).
The vertical dust emission flux, F<sub>d</sub> (kg m<sup>-2</sup> s<sup>-1</sup>), is given by

11 
$$F_d = C_d f_{bare} f_{clay} \frac{\rho_a(u_*^2 - u_{*t}^2)}{u_{*st}} (\frac{u_*}{u_*})^{C_a \frac{u_{*st} - u_{*st0}}{u_{*st0}}}, (u_* > u_{*t}),$$
(S1)

12 where  $C_d$  is the dimensionless dust emission coefficient,  $f_{bare}$  is the fraction of the surface 13 consisting of bare soil,  $f_{clay}$  is the soil clay fraction,  $\rho_a$  (kg m<sup>-3</sup>) is the air density,  $u_*$  (m s<sup>-1</sup>) is the 14 soil friction velocity,  $u_{*t}$  (m s<sup>-1</sup>) is the threshold of soil friction velocity above which saltation 15 occurs,  $u_{*st}$  (m s<sup>-1</sup>) is the soil threshold friction velocity standardized to standard atmospheric 16 density,  $u_{*st0}$  (m s<sup>-1</sup>) is the standardized threshold friction velocity of an optimally erodible soil, 17 and  $C_{\alpha}$  is the dimensionless constant scaling the fragmentation exponent ( $\alpha$ ).

# 18 Text S2: Ice nucleation parameterizations

In this section, we introduced five ice nucleation parameterizations used in this study. They can be classified into two types: the stochastic approach, which treats ice nucleation as a timedependent process, and the deterministic approach, which assumes that ice nucleation is timeinvariant and only depends on temperature and aerosol properties. In this study, the CNT parameterization follows the stochastic approach, while the other four parameterizations follow the deterministic approach.

# 25 S2.1 CNT parameterization

The classical nucleation theory (CNT) scheme is used for heterogeneous ice nucleation in mixed-phase clouds in EAMv1 simulations. This parameterization was first implemented in a global climate model by Hoose et al. (2010), and further improved by Wang et al. (2014) by introducing a probability density function of contact angles ( $\alpha$ -PDF) for immersion freezing of natural dust. In CNT, immersion/condensation, contact, and deposition nucleation on dust and BC are treated. The rate of heterogeneous nucleation per aerosol particle and time,  $J_{het}$ , is expressed by

33 
$$J_{het} = \frac{A' r_N^2}{\sqrt{f}} \exp\left(\frac{-\Delta g^{\#} - f \Delta g_g^0}{kT}\right),$$
 (S2)

where A' is a prefactor,  $r_N$  is the aerosol particle radius, f is a form factor describing the aerosol's ice nucleating ability,  $\Delta g^{\#}$  is the activation energy,  $\Delta g_g^o$  is the homogeneous energy of germ formation, k is the Boltzmann constant, and T is the temperature in K. The factor, f, is a function of contact angle,  $\alpha$ , in the form,

38 
$$f = \frac{1}{4}(2+m)(1-m)^2,$$
 (S3)

39 where  $m \equiv cos\alpha$ . The contact angle is assumed to follow a log-normal distribution in the form,

40 
$$p(\alpha) = \frac{1}{\alpha \sigma \sqrt{2\pi}} \exp\left(-\frac{\left(\ln(\alpha) - \ln(\mu)\right)^2}{2\sigma^2}\right),$$
 (S4)

41 where  $\mu$  is the mean contact angle and  $\sigma$  is the standard deviation.

We do not consider the differences in the mineralogical composition in different dust sources. Thus, dust particles originated from different sources are treated the same in the CNT (i.e., same contact angle distribution). The parameterization considers the immersion freezing point depression by coating of sulfate aerosols (Hoose et al., 2010). However, this effect has no differences for HLD and LLD, because aerosol species (e.g, dust, sulfate) are assumed to be internally mixed within an aerosol mode in the MAM4 aerosol module (Liu et al., 2016).

#### 48 S2.2 D15 parameterization

The DeMott et al. (2015; D15) parameterization is a dust immersion freezing ice nucleation
parameterization derived from a combination of laboratory and field data. The laboratory data are

from ice nucleation experiments on Saharan and Asian desert dust using the Aerosol Interaction and Dynamics in the Atmosphere chamber. The field data were collected over the Pacific Ocean basin and US Virgin Islands, which are dominated by Asian and Saharan desert dust, respectively. Thereby, D15 can be regarded as a LLD ice nucleation parameterization in our study, though it is also applied to HLD in Figure 8e for sensitivity studies. In D15, dust INP number concentration,  $n_{INP}$  (std L<sup>-1</sup>), is related to temperature,  $T_k$  (K), and the number concentration of dust particles larger than 0.5  $\mu m$ ,  $n_{a>0.5\mu m}$  (std cm<sup>-3</sup>), in the form,

58 
$$n_{INP}(T_k) = (cf)(n_{a>0.5\mu m})^{\alpha(273.16-T_k)+\beta} \exp{(\gamma(273.16-T_k)+\delta)},$$
 (S5)

59 where 
$$cf = 3$$
,  $\alpha = 0$ ,  $\beta = 1.25$ ,  $\gamma = 0.46$ , and  $\delta = -11.6$ .

# 60 S2.3 SM20 parameterization

The Sanchez-Marroquin et al. (2020; SM20) parameterization is based on aircraft-collected freshly emitted Icelandic dust samples and thus is treated as a parameterization for HLD in our study. It is an immersion freezing ice nucleation scheme formulated in terms of the ice-nucleating active surface site density (INAS). The total INP concentration,  $n_{INP}$  (L<sup>-1</sup>), is given by

65 
$$n_{INP} = n_{HLD} \{ 1 - \exp[-S_{ae} n_s] \},$$
 (S6)

66 where  $n_{HLD}$  (L<sup>-1</sup>) is the number concentration of HLD,  $S_{ae}$  (m<sup>2</sup>) is the surface area of a single HLD

67 particle, and  $n_s$  (m<sup>-2</sup>) is the density of active sites.  $n_s$  is in the form

$$68 n_s(T) = 10^{-0.0337 - 0.199T}, (S7)$$

69 where T is temperature in  $^{\circ}$ C.

### 70 S2.4 Sc20 parameterization

The Schill et al. (2020; Sc20) parameterization is an INAS-based immersion freezing ice
nucleation parameterization based on smoke from western US wildfires and grassland prescribed

burns. It is an ice nucleation parameterization for biomass burning black carbon (BC), but we apply it to BC from both biomass burning and fossil fuel combustion. The total INP concentration is given by the same equation as Eq.(S6), except  $n_{HLD}$  is replaced by  $n_{BC}$ , which is the number concentration of BC. The  $n_s$  fit for Sc20 is given by

77 
$$n_s(T) = \exp(1.844 - 0.684T - 0.00597T^2),$$
 (S8)

78 where T is temperature in  $^{\circ}$ C.

## 79 S2.5 M18 parameterization

The McCluskey et al. (2018; M18) parameterization is an INAS based immersion freezing ice nucleation parameterization for sea spray aerosols (SSAs; includes sea salt and marine organic aerosol) derived from pristine marine air mass measurements at the Mace Head Research Station. The total INP concentration is given by the same equation as Eq.(S6), except  $n_{HLD}$  is replaced by  $n_{SSA}$ , which is the number concentration of SSA. The  $n_s$  fit for M18 is given by

85 
$$n_s(T_k) = \exp(-0.545(T_k - 273.15) + 1.0125),$$
 (89)

86 where  $T_k$  is temperature in K.

#### 87 S2.6 Discussion regarding the choice of dust ice nucleation parameterizations

In this study, we use three dust ice nucleation parameterizations (i.e., CNT, D15, and SM20). CNT is chosen because it is the default ice nucleation scheme for EAMv1. We use D15 because it is found to produce the most reasonable INP concentrations in EAMv1 based on our earlier study (Shi and Liu, 2019). There are various other LLD INP parameterizations, many of which are INASbased (e.g., Niemand et al., 2012; Ullrich et al., 2017). The Niemand et al. (2012) parameterization was tested in Shi and Liu (2019) and was found to overestimate the Arctic INP concentrations with corrected dust concentrations in EAMv1. There are also INP parameterizations based on dust 95 minerology (e.g., Atkinson et al., 2013; Harrison et al., 2019), which are not used because we do 96 not represent dust speciation in the current model. There are not a lot of HLD INP 97 parameterizations (or even data) as compared to LLD INP schemes. To our knowledge, Paramonov 98 et al. (2018) analyze the ice nucleation ability of soil samples collected from Iceland and provide 99 an INAS-based fit. We use SM20 which was developed based on airborne samples rather than 100 Paramonov et al. (2018) in our study, due to the possible large differences between soil samples 101 and airborne dust samples.

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	Annual	MAM	JJA	SON	DJF
Arc	15.88	20.96	20.82	10.49	15.10
NAm	1.99	2.78	3.78	1.68	0.84
NAf	0.62	1.11	0.50	0.35	0.32
CAs	2.58	2.66	4.11	2.51	1.01
MSA	0.76	1.50	0.45	0.49	0.63
EAs	2.42	2.19	2.99	2.02	2.75
RoW	0.00	0.00	0.00	0.00	0.01

**Table S1.** Arctic burden efficiency  $(10^{-3} \text{ mg m}^{-2}) (\text{mg m}^{-2} \text{ s}^{-1})^{-1}$ .

	CTRL	HLD_half
2007	129.2	64.2
2008	213.8	103.4
2009	114.2	50.8
2010	127.1	53.2
2011	137.8	56.7

**Table S2.** Yearly (2007 to 2011) averaged HLD emission flux (Tg yr<sup>-1</sup>) in CTRL and HLD\_half.



Figure S1. Same as Figure 1a, but with four sub-sources tagged in the Arctic (Ala: Alaska, NCa:
North Canada; GrI: Greenland and Iceland; NEu: North Eurasia).



Figure S2. Global distribution of relative contributions (%) to the annual mean (2007 to 2011)
dust column burden from each tagged source region.



Figure S3. Annual mean (2007 to 2011) lower tropospheric stability (LTS) from MERRA2 172

reanalysis data and the CTRL simulation. LTS is defined as the potential temperature difference 173

between 700 and 1000 hPa. The LTS from the CTRL simulation agrees well with the MERRA2 174 data.

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- 176



Figure S4. Simulated INP concentrations as a function of temperature. The simulated INP 178 179 concentrations are derived from a) LLD using classical nucleation theory (CNT), b) LLD and HLD, both using CNT, c) LLD using CNT and HLD using Sanchez-Marroquin et al (2020; SM20), d) 180 LLD using DeMott et al. (2015; D15), e) LLD and HLD, both using D15, f) LLD using D15 and 181 182 HLD using SM20, g) BC using Schill et al. (2020; Sc20), and h) SSA using McCluskey et al. (2018; M18). The temperature of each data point is also shown by its color. Nine INP datasets are 183 classified by symbols A to I. This figure is based on the same simulated INP concentrations that 184 used from Figure 8. 185



Figure S5. Percentage difference of zonally averaged dust concentration between CTRL and
sensitivity experiments (i.e., noArc, noNAf, noEAs). Black contours are zonally averaged
temperatures in °C.



**Figure S6.** Process budget analysis associated with total ice water tendencies from cloud microphysical processes in the Arctic (unit:  $10^{-3} \ \mu g \ kg^{-1} \ s^{-1}$ ). Only the processes that have large changes are shown in this figure.



Figure S7. Seasonal changes in shortwave downwelling radiative flux at the surface (unit: W m<sup>-2</sup>)
caused by dust INPs from Arctic (top panel), North Africa (middle panel), and East Asia (bottom
panel). The numbers are averaged radiative flux differences in the Arctic.



Figure S8. Same as Figure S7, but for longwave downwelling radiative flux.



**Figure S9.** Same as S7, but for net downwelling radiative flux.





Figure S10. Yearly (2007 to 2011) comparisons of dust deposition fluxes in the Arctic (Greenland)
for CTRL and HLD\_half. The locations of the markers are shown by the red triangles on Figure
2d. Unit: g m<sup>-2</sup> yr<sup>-1</sup>.



Figure S11. Yearly (2007 to 2011) comparisons of surface dust concentrations at Alert station for
 CTRL and HLD\_half. Unit: μg m<sup>-3</sup>. The measurements are shown by black solid line, with gray
 shade representing standard deviation. The simulated total dust concentrations are shown by pink
 soild line, while contributions from seven tagged sources are shown by colored dashed lines.