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Claudia Di Biagio, Yves Balkanski, Samuel Albani, O. Boucher, P. Formenti. Direct Radiative Effect by Mineral Dust Aerosols Constrained by New Microphysical and Spectral Optical Data. Geophysical Research Letters, 2020, 47 (2), 10.1029/2019GL086186. hal-02505450

HAL Id: hal-02505450 https://hal.science/hal-02505450

Submitted on 3 Apr 2020

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Direct radiative effect by mineral dust aerosols constrained by new microphysical and spectral optical data
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Key Points:
 New global dust simulations including particles >20 µm, refractive index representative of world sources, and longwave scattering correction The global dust longwave effect remains within published values while the shortwave one is reduced due to the inclusion of coarse particles Varying the longwave refractive index within its documented range of variability modifies the sign of the net global dust direct effect

21 Abstract

We revise the direct radiative effect (DRE) of mineral dust aerosols in the shortwave (SW) and 22 23 longwave (LW) based on global model simulations that include coarse dust particles (> 20 μ m) and a new LW complex refractive index (CRI) dataset representative of major global sources. 24 Simulations are constrained against observed dust size distributions and optical depth. Scattering 25 of LW radiation is accounted for in the analysis. The extension of the dust size beyond 20 µm 26 causes a reduction in the SW DRE compared to current model estimates, while the LW DRE 27 remains within published values due to compensating effects between changing size distribution, 28 CRI and accounting for dust scattering. The dust direct radiative effect efficiency from model 29 simulations reproduces well field observations close to sources and after transport. The global 30 mean net effect of dust is -0.03 Wm⁻² as a result of cooling over oceans and warming over land. 31

32 **1. Introduction**

Whether desert dust aerosols warm or cool the planet by their direct radiative effect is still a matter of debate (Boucher et al., 2013; Kok et al., 2017, hereafter Kok17). Dust particles of diameter (D) smaller than 2 µm mostly cool our planet because scattering of SW radiation dominates spectral absorption, while larger particles tend to cause warming by absorption of both SW and LW radiation (Liao and Seinfeld, 1998; Miller et al., 2004. Mahowald et al., 2014).

Currently, global and regional models suffer from important deficiencies that introduce biases in the estimated total dust DRE. These are:

 Dust size distribution is often limited to a maximum diameter of typically 10 or 20 μm in both regional and global models (Huneeus et al., 2011; Kok17), neglecting the coarsest particles which could contribute to positive DRE for both SW and LW radiation.
 Furthermore recent field observations suggest that particles larger than 20 μm are present in significant mass concentrations in the atmosphere (Ryder et al., 2013a, 2018, 2019; Weinzerl et al., 2017; van der Does et al., 2018).

- 46 2. Modelled dust mass concentrations are usually under-estimated in models for particles with 47 D>5 μ m and over-estimated for D<2 μ m compared to observations (Kok, 2011; Kok17; 48 Ryder et al., 2019). Kok17 uses constraints on the size-dependency of the dust emissions to 49 fit field observations, which results in an average contribution of 4.3% for diameters smaller 50 than 2 μ m, significantly lower than the 5–35% range in other models.
- 3. The variability in the dust complex refractive index at both SW and LW wavelengths, caused 51 by regional differences in the particle mineralogy (Sokolik and Toon, 1999), is not accounted 52 53 for in models. Global models commonly use the CRI of dust aerosols collected at Barbados after being transported from the Sahara by Volz (1973) (hereafter V73) at LW wavelengths, 54 whereas different CRI datasets (Patterson et al., 1977; Shettle and Fenn, 1979; d'Almeida et 55 al., 1991) are used in the SW. Recent laboratory measurements of dust samples collected 56 over many different deserts suggest that the imaginary part of the SW and LW CRI as 57 assumed in models are upper bound values that can lead to a strong overestimate of the dust 58

spectral absorption and biases in DRE (Di Biagio et al., 2017, hereafter DB17; Di Biagio et al., 2019).

- 4. Most global and regional models do not include LW scattering in their radiative scheme.
 However, the contribution of scattering is relevant as it could increase the LW DRE at the
 Top-of-the-Atmosphere (TOA) by 50% (Dufresne et al., 2002; Sicard et al., 2014; Osipov
 et al., 2015). Up to now only two studies (Miller et al., 2006; Kok17) try to account for
 missing LW scattering by artificially augmenting the retrieved TOA DRE by 23%.
 Nonetheless, this correction represents only about half of the value inferred by Dufresne et
 al. (2002), Sicard et al. (2014), and Osipov et al. (2015).
- 5. Dust particles are usually assumed as spherical in models. While this simplification may considerably impact the extinction efficiency (Q_{ext}) and AOD calculations (Dubovik et al., 2006; Kok17, Potenza et al., 2016), it was demonstrated to have only a limited influence on the TOA DRE (considering a more realistic phase function results in less than 5% and 10% difference compared to spherical dust in the SW and LW ranges, Bellouin et al., 2004; Colarco et al., 2014; however, a larger effect might be expected if a Bidirectional Reflectance Distribution Function, BRDF, surface albedo is assumed in models, Osipov et al., 2015).

In this study we present a novel evaluation of the global DRE by mineral dust aerosols and 75 its SW and LW components based on new global model simulations. We constrain the size 76 distribution of dust in the source regions and its AOD at 550 nm (AOD₅₅₀) in our simulations based 77 78 on field observations, incorporating dust sizes beyond 20 µm diameter. We correct the dust DRE for accounting the LW scattering effect following Dufresne et al. (2002). For the first time in global 79 simulations we take into account regional variations of the LW CRI, as documented in DB17, to 80 estimate the dust spectral optical properties. In the present study we assume that dust particles are 81 82 spherical.

We compare simulated dust SW and LW direct radiative effect efficiency (DREE) with available observations (including space–borne sensors) over Northern Africa, Asia, the Atlantic Ocean, and the Mediterranean basin.

86 **2. Method**

Global aerosol simulations are performed with the LMDZOR–INCA model (Schulz, 2007; Balkanski et al., 2010) which couples interactively the LMDZ (Laboratoire de Météorologie Dynamique) atmospheric General Circulation Model, the ORCHIDEE land surface model and the INCA (INteraction with Chemistry and Aerosols) aerosol module. The radiative transfer module includes a six–band ($0.185-4.0 \mu m$) version of the Fouquart and Bonnel (1980) scheme in the SW and the RRTMG (Rapid Radiative Transfer Model for Global Circulation Models) radiative scheme in sixteen bands between 3.33 and 1000 μm .

94 **2.1** Constraining the size distribution of dust aerosols

A superposition of lognormal modes is used to represent the aerosol size distribution in LMDZOR–INCA (Schulz, 2007). Each mode is described by two variables: a Mass Median

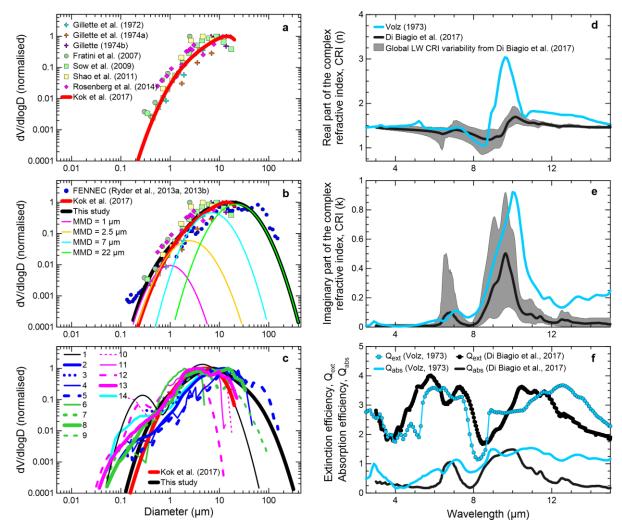
Diameter (MMD) and a geometric standard deviation (σ). The MMD in each mode varies during 97 the simulation in order to account for all processes that increase or deplete the aerosol atmospheric 98 concentration. In contrast, the width of the size distribution (measured by σ) is kept constant. The 99 shape of the dust size distribution at emission is constrained by fitting the dataset recently used by 100 101 Kok17 (Fig. 1a), but augmented to include missing particles larger than 20 um with airborne measurements taken during the FENNEC campaign in Western Sahara for airborne dust less than 102 12 hours after emission (Ryder et al., 2013a, 2013b) (Fig. 1b). FENNEC is the only campaign that 103 measured the dust size distribution up to 150 µm in diameter very close to source areas. We fit the 104 extended size distribution with four lognormal modes with respective MMD equal to 1 μ m (σ =1.8), 105 2.5 μ m (σ =2), 7 μ m (σ =1.9), and 22 μ m (σ =2). The relative mass contribution (m_i) by each mode 106 to the total emitted size, retrieved by fitting the ensemble of the observational dataset, is 0.6% 107 $(\pm 0.1\%)$, 4.3% $(\pm 0.4\%)$, 31.5% $(\pm 1.8\%)$ and 63.6% $(\pm 2.2\%)$ for modes at 1, 2.5, 7, and 22 µm 108 MMD, respectively (Fig. 1b). The ratio of the PM₂ ($D \le 2 \mu m$) to PM₂₀ ($D \le 20 \mu m$) emitted mass 109 110 is 4.7%, within the 3.5–5.7% range indicated by Kok17.

The average size distribution of atmospheric dust is in agreement with in situ and remote sensing field observations taken after few days of transport in Northern Africa, the Mediterranean, and across the Atlantic Ocean (Fig. **1c**). The model captures well the coarse component of the dust size as measured in the field but does not represent the peaks in volume distribution below about 0.5 μ m shown in field data, which are documented to consist of fine anthropogenic particles mixed in the dust plume (Chou et al., 2008; Kandler et al., 2011).

117 The size-resolved dust load in our model also agrees with new field observations indicating 118 that, after few days of transport at Cape Verde, dust particles larger than 5 um (20 μ m) account for 119 60% (0–12%) of the mass (Ryder et al., 2019). Our model data extracted over the same area and 120 time period show 63% and 11.5% of the mass for D > 5 μ m and D > 20 μ m, respectively.

121 **2.2 Constraining the spectral CRI of dust**

122 To further constrain simulations we use a novel observational dataset of regionally-averaged LW CRI published by DB17 for nineteen natural dust aerosol samples collected in arid and semi-123 arid regions of the world (Africa, Asia, America, Australia). These nineteen samples were selected 124 from a much larger assemblage to represent the global variability of the dust content of LW-active 125 minerals (clays, quartz, and calcite), and therefore of LW CRI. Published radiative closure studies 126 based on aircraft radiation data (Meloni et al., 2018; Granados-Muñoz et al., 2019) and satellite 127 radiance observations (Liuzzi et al., 2017; Banks et al., 2018; Song et al., 2018) confirm the 128 improved capability of the DB17 dataset to represent the regional variations in the dust LW DRE 129 compared to the V73 CRI. 130



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¹ Dubovik et al. (2002; ² Weinzierl et al. (2009); ³ Formenti et al. (2011); ⁴ Ryder et al. (2013b) – SAL (Saharan Air Layer); ⁵ Ryder et al. (2013b) – aged dust; ⁶ Chen et al. (2011); ⁷ Weinzierl et al. (2011); ⁸ Weinzierl et al. (2017) – Cape Verde; ⁹ Ryder et al. (2018); ¹⁰ Formenti et al. (2003); ¹¹ Maring et al. (2003); ¹² Denjean et al. (2016b); ¹³ Weinzierl et al. (2017) – Barbados. ¹⁴ Denjean et al. (2016a)

136 Figure 1. Volume size distributions dV/dlogD and longwave optical properties of the dust aerosols. a Size 137 distribution of the emitted dust reported by Kok17 (Kok et al., 2017) obtained by fitting the reported dataset 138 ensemble. **b** Size distribution of the emitted dust retrieved in this study. Similar to panel a, the distribution is obtained by fitting the Kok17 dataset ensemble but also includes the FENNEC dataset that represents fresh 139 140 dust (<12 h from emission). The contribution by the four different modes to our fitted size is shown. c. 141 Globally-averaged atmospheric dust size distribution obtained from model simulations in this study (weighted 142 by the global mass load of each mode) and in Kok17. Field data from campaigns in Northern Africa (blue lines), the Mediterranean (cyan lines), eastern Atlantic Ocean (green lines) and Western Atlantic Ocean (pink 143 144 lines) are shown for comparison. Retrieved dust size from AERONET is also reported. All size data in panels a-c, including the scattering data and the fitting lines from Kok17, are normalized to 1 at the maximum of the 145 volume distribution. d-e Longwave real and imaginary parts of the CRI from V73 (Volz, 1973) and DB17 (Di 146 147 Biagio et al., 2017). The black line represents the average spectral values from DB17, while the shaded grey 148 area envelopes the minimum and the maximum of the DB17 dataset representing the CRI regional variability. 149 f Spectral absorption (Q_{abs}) and extinction (Q_{ext}) efficiencies estimated from Mie calculations for a particle of $D = 10 \ \mu m$ and V73 and DB17 CRI. 150

In the present study, the base model simulations use the mean wavelength-dependent LW 151 CRI values by DB17. The minimum and maximum of the imaginary part from DB17 (and 152 associated real parts from Kramers-Kronig relationships) serve to represent the envelope of the 153 regional variations in CRI. Figure 1d-f illustrates the important finding that the imaginary parts 154 155 of the CRI from DB17 is lower than reported by V73, resulting in a lower absorption over most of the spectrum. Figure 1f also illustrates the relative importance of scattering versus absorption at 156 longwave wavelengths, i.e. Qabs is only a fraction of Qext,. 157

In the SW range we employ the spectral CRI from Balkanski et al. (2007) computed assuming 158 that dust contains an average 1.5% of hematite by volume. This assumption corresponds to 1.52-159 0.0017i at 550 nm and proved to produce good agreement of the simulated SW TOA DRE and 160 satellite observations (Balkanski et al., 2007). This SW CRI falls at the mean of the values recently 161 reported by Di Biagio et al. (2019) for dust from major global sources. 162

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2.3 Constraining the dust emission flux, atmospheric load and optical depth

The total emission flux (E_{tot}) is 13689 Tg yr⁻¹ in our simulations, amounting to 5023 Tg yr⁻¹ 164 for D>20 μ m and 8666 Tg yr⁻¹ for D \leq 20 μ m, a value that is at the upper bound of the emission 165 flux range obtained by Escribano et al. (2017) through a source inversion approach. The Etot is 166 partitioned between the four modes following their mass percent contribution to the emitted size, 167 resulting in E₁=80, E_{2.5}=584, E₇=4308, and E₂₂=8717 Tg yr⁻¹, respectively. We set the E_{tot} value 168 in order to have a resulting global and annual mean dust AOD₅₅₀ within the range from recent 169 synthesis of observations (0.030 \pm 0.005) (Ridley et al., 2016) and at the same time both the PM₁₀ 170 $(D \le 10 \ \mu m)$ and PM₂₀ dust loads the closest as possible to the reported range by Kok17 (13–29) 171 Tg and 14–33 Tg, respectively). The dust AOD₅₅₀ in our simulations is 0.026 for a total load of 172 38.9 Tg, of which 26 Tg for PM_{10} and 34.1 Tg for PM_{20} . 173

2.4 Global simulations and DRE estimate 174

We run the model separately for each of the four size modes and for the multimodal size 175 distribution. Emission is set at E_1 , $E_{2.5}$, E_7 , and E_{22} for single-mode simulations and at E_{tot} for the 176 177 combined multimodal run. We repeat single-mode simulations by assuming different LW CRI datasets (mean, min, max from DB17 and V73). For the multimodal simulation we assume the 178 mean LW CRI from DB17 only. A reference simulation with no dust aerosols is performed. 179

The SW and LW DRE at the TOA and at the surface are calculated for clear- and all-sky 180 conditions as the difference in shortwave and longwave radiative fluxes with and without dust. 181 The dust feedbacks on climate are not activated in our simulations, i.e. dust is a passive tracer, and 182 the perturbation to radiative fluxes from dust is only diagnostic. 183

The dust AOD₅₅₀ and the DRE are averaged spatially (globally or over specific regions) and 184 temporally (annually or monthly/seasonally) for the evaluation of the global and annual averages 185 and for comparison with satellite and field observations. The SW and LW DREE is calculated as 186 the ratio of the DRE to AOD₅₅₀. 187

As longwave scattering by dust is not accounted for in the model radiative scheme, we correct the LW DRE assuming a multiplicative factor of 2.04 (± 0.18) (unitless) at TOA and 1.18 (± 0.01) at the surface based on Dufresne et al. (2002). This corresponds to 51% contribution of scattering to the LW DRE at TOA and 15% at the surface. Note that this correction, estimated for dust of D \leq 10 µm, might be a lower approximation of the LW scattering by coarse dust.

The uncertainty on the dust DRE and DREE arises from a combination of uncertainties in 193 194 the: (i) emissions, representation of the size distribution of dust and its spatio-temporal variability (i.e., transport and deposition processes in model), which can be expressed as a single uncertainty 195 of the model skill to simulate the dust AOD₅₅₀; (ii) dust vertical profile; (iii) refractive index 196 assumptions and its global variability; (iv) dust shape assumptions; (v) treatment of aerosol-197 radiation interactions; and (vi) host model uncertainties. The overall uncertainty on the dust DRE 198 is calculated by adding in quadrature all listed uncertainties in the assumption that error sources 199 are independent. The resulting relative uncertainty on the global annual mean TOA DRE (DREE) 200 is estimated to be 85% (88%) in the SW and 69% (72%) in the LW as 90% confidence intervals 201 202 (CI). More details are provided in the Supplementary Information.

3. Results

3.1 Model–observations comparison of the dust radiative effect efficiency

Table 1 shows the comparison of our model estimates of the clear–sky SW and LW DREE with those reported by field studies based on satellite and ground–based observations. Comparing the DREE allows eliminating differences due to the variable regional load, optically represented by the AOD₅₅₀. Observations correspond to monthly and seasonal averages in different regions close to African and Asian sources and along the transport pathway straddling along the Atlantic Ocean and the Mediterranean.

The DREE values from model simulations are in good agreement with observations in the LW. Using the CRI by DB17 allows reproducing observations within the uncertainty range, both close to the sources and remotely. Results for the V73 CRI are most of the time at the upper bound of field retrieved DREE intervals. Several field studies considered for comparison make use of a certain degree of modelling to derive the dust DREE. Our model results for DREE LW are in best agreement with those providing observational–only estimates.

The DREE comparison is generally worse in the SW, but a very good agreement is obtained over the Tropical Atlantic. Differences in the SW range may arise from the different spectral coverage between the observational products and the model, and also the different methods applied for DREE retrieval and averaging (see Supplementary Information).

Note that the total DREE computed by adding up the DRE from single mode simulations is up to 30% (SW) and 7% (LW) lower in absolute value than obtained from the multimodal run.

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		Short	wave spe	ctral range						
DREE model (Wm ⁻²)										
Geographical zone	Temporal interval	Platform	Level	DREE field (Wm ⁻²)	CRI= B07 SIZE= SM		C RI= B07 IZE= MM			
Sahara desert (15°–30°N, 10°W– 30°E)	JJA	Satellite and model ^a	ТОА	~0	11.6		10.5			
Tropical Atlantic	JJA	Satellite ^b	TOA	-35	-31.6		-28.0			
(15–25N, 15–45W)	JJA	Satemite	surface	-65	-62.6		-58.3			
Tropical Atlantic (10–30N, 20–45W)	JJA	Satellite ^c	TOA	-28	-35.9		-32.7			
Atlantic Ocean (0–30N, 10–60W)	JJA	Satellite ^d	TOA	-42 to 54	-23.7		-21.6			
Mediterranean basin	Sept	Ground-based ^{e-f}	surface	-68.8	-68.0		-65.8			
(35.5N, 12.6E)	Sept	Ground-based	TOA	-45.5	-35.5		-33.6			
China (39N, 101E)	AMJ	Ground-based ^g	surface	-60	-44.6		-34.3			
	-	Longy	vave spe	ctral range						
	Temporal interval	Platform		DREE field		EE model (Wm				
Geographical zone			Level	(Wm ⁻²)	CRI= DB17 SIZE= SM	CRI= DB17 SIZE= MM	CRI = V73 SIZE = SM			
North Africa (15–35N, 18W–40E)	JJA	Satellite ^{h-i}	ТОА	15–22	14.9	14.1	27.1			
West Africa (16–28N, 16–4W)	JJA	Satellite ^{h-i}	TOA	16–20	15.2	14.3	26.9			
Niger–Chad (15–20N, 15–22E)	JJA	Satellite ^{h-i}	TOA	16–21	16.5	15.9	30.0			
Sudan (15–22N, 22–36E)	JJA	Satellite ^{h-i}	ТОА	19–23	14.4	14.1	27.4			
Egypt–Israel (23–32N, 23–35E)	JJA	Satellite ^{h-i}	TOA	1–27	14.0	14.0	27.4			
North Libya (27–33N, 15–25E)	JJA	Satellite ^{h-i}	TOA	11–25	13.4	12.9	24.6			
South Libya (23–27N,15–25 E)	JJA	Satellite ^{h-i}	TOA	11–22	14.3	14.0	26.9			
Sahara desert (15–30N, 10W– 30E)	JJA	Satellite ^j	TOA	11–26	15.9	15.1	27.9			
Tropical Atlantic (10–30N, 20–45W)	JJA	Satellite ^c	TOA	8.5	8.8	8.7	16.8			
Atlantic Ocean (0–30N, 10–60W)	JJA	Satellite ^d	TOA	2.6–11.4	10.7	10.3	19.9			
Cape Verde	Sept	Ground–based and model ^k	TOA	13	9.3	8.9	17.2			
(16.7N, 22.9W)	Sept		surface	16	15.6	14.6	25.4			
China (39N, 101E)	AMJ	Ground–based ^g	TOA	17–21	9.3	7.7	16.1			
			surface	31–35	20.5	16.0	34.9			

225 226 ^a Patadia et al. (2009); ^b Li et al. (2004); ^c Song et al. (2018); ^d Christopher and Jones (2007); ^e di Sarra et al. (2008); ^f Di Biagio et al. (2010); ^g Hansell et al. (2012); ^h Zhang and Christopher (2003); ⁱ Brindley and Russel (2009); ^j Yang et al. (2009); ^k Hansell et al. (2010)

227 228 JJA = June–July–August, AMJ = April–Mai–June; SM = Single modes simulations (sum of single modes DRE); MM = Multimodal size distribution simulations; B07 = Balkanski et al. (2007); DB17 = Di Biagio et al. (2017); V73= Volz (1973)

229

230 Table 1. Model-observations comparison of the shortwave and longwave dust clear-sky direct radiative effect efficiency (DREE) at the surface and the Top-of-the-Atmosphere (TOA) for different size assumptions and 231

complex refractive index (CRI) data. We indicate in blue the studies that do not rely on modelling to derive the 232

3.2 Dust global DRE: role of coarse particles and sensitivity to the refractive index

Table 2 summarizes the contribution of dust particles of different sizes and CRI to the various processes and variables in our simulations. The global annual mean all–sky DRE of mineral dust at TOA is -0.25 W m^{-2} ($-0.04 \text{ to } -0.46 \text{ W m}^{-2}$, 90% CI) for the SW and $+0.22 \text{ W m}^{-2}$ (+0.07 to $+0.37 \text{ W m}^{-2}$, 90% CI) for the LW as obtained for the multimodal simulation. The net TOA DRE is -0.03 W m^{-2} , which corresponds to $-0.29 \text{ to } +0.23 \text{ Wm}^{-2}$ within 90% CI. The value of the net TOA DRE is given by the sum of a positive effect over land and a negative effect over oceans, particularly over the Northern Hemisphere where most of the dust is found.

The modes at 1 and 2.5 µm account for a tiny fraction of emission (less than 5%) but are 242 responsible for 21% of the dust load, 57% of AOD₅₅₀ and most of the SW cooling. The opposite 243 is true for the mode at 22 µm that represents 64% of emission but only 17% of load, 3% of AOD₅₅₀ 244 and has a lower but not negligible contribution to both SW and LW DRE. In contrast, the mode at 245 7 µm amounts to 32% of emission, 60% of load, 40% of AOD₅₅₀ and more than 60% of DRE LW. 246 The fraction of dust above 20 µm diameter is estimated from modes at 7 and 22 µm to contribute 247 to 37% of the total emission, 12% of the load, and 2% of the AOD₅₅₀, and to account for about 248 30% of the DRE of the mode at 22 µm. The key role of particles larger than 20 µm however does 249 250 not only rely on their direct contribution to the DRE, but mostly on the fact that their inclusion reduces the contribution by smaller (cooling) particles to the global dust cycle. 251

The SW DRE is negative (cooling) for the 1, 2.5, and 7 μ m modes and positive (warming) for the 22 μ m mode, while the total (SW+LW) effect is negative for the 1 and 2.5 μ m modes and positive for the 7 and 22 μ m modes. These global values mask the sharp contrast existing between the positive SW values in the vicinity of source regions and the negative values over oceanic areas, as can be seen in Table 2 comparing TOA DRE over the Sahara desert and the Tropical Atlantic.

Using the V73 CRI data results in a LW DRE of $+0.42 \text{ Wm}^{-2}$, with a net SW+LW positive effect of $+0.13 \text{ Wm}^{-2}$ (sum of single mode simulations). Using the mean CRI data from DB17 reduces the LW DRE by almost a factor two for each mode simulation compared to V73. Varying the LW CRI between the minimum and maximum of the values indicated by DB17 also changes the sign of the net DRE from -0.19 to $+0.08 \text{ Wm}^{-2}$ due to the variation of the DRE LW between $+0.09 \text{ Wm}^{-2}$ and $+0.36 \text{ Wm}^{-2}$, respectively. The CRI is therefore one of the largest source of uncertainty of the dust DRE.

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	Mode 1	Mode 2	Mode 3	Mode 4						
	MMD=1µm	MMD=2.5µm	MMD=7µm	MMD=22µm	Total					
	NMD=0.35µm	NMD=0.59µm	NMD= $2.03\mu m$	NMD= $5.21 \mu m$						
	σ=1.8	σ=2	σ=1.9	σ=2.0						
% mass fraction (m _i) ($\pm 1\sigma$) for dust										
size at emission from fitting field	0.6 (±0.1)	4.3 (±0.4)	31.5 (±1.8)	63.6 (±2.2)						
observations										
Emission rate (Tg yr ⁻¹)	80	584	4308	8717	13689					
Emission PM ₂ (Tg yr ⁻¹)	70	220	112	2	405					
Emission PM ₂₀ (Tg yr ⁻¹)	80	584	4092	3910	8666					
Emission D>20 µm (Tg yr ⁻¹)	0	0	216	4807	5023					
Load (Tg)	1.2	7.0	24.2	6.5		38.9				
Load PM ₂ (Tg)	1.0	2.7	0.6	0		4.3				
Load PM ₂₀ (Tg)	1.2	7.0	23.0	2.9	34.1					
Load D>20 µm (Tg)	0	0	1.2	3.6	4.8					
Lifetime (days)	5.4	4.4	2.0	0.3		1.0				
AOD550	0.0045	0.0105	0.0106	0.0009		0.0265				
AOD ₅₅₀ PM ₂	0.0044	0.0073	0.0019	0		0.014				
AOD550 PM20	0.0045	0.0104	0.0105	0.0006	0.026					
AOD550 D>20 μm	0	0.0001	0.0001	0.0003		0.0005				
	Mode 1	Mode 2	Mode 3	Mode 4	Sum					
	MMD=1µm	MMD=2.5µm	MMD=7µm	MMD=22µm	single	Multimodal				
	NMD=0.35µm	NMD=0.59µm	NMD=2.03µm	NMD= $5.21 \mu m$	modes					
Direct Do dicti	$\sigma=1.8$	$\sigma=2$	σ=1.9 al mean all–sky, mea	$\sigma=2.0$	17					
SW	-0.09	-0.18	-0.03	+0.02	-0.29	-0.25				
LW	+0.01	-0.18 +0.06	+0.14	+0.02 +0.02	-0.29 +0.23	+0.22				
NET (SW+LW)	-0.08	-0.13	+0.14	+0.02	+0.23 -0.06	-0.03				
						-0.03				
Direct Radiat	ve Effect at TOA	(Wm ⁻²), global annu	al mean all–sky, min	LW CRI from DB1	7					
LW	+0.00	+0.02	+0.06	+0.01	+0.09	—				
NET (SW+LW)	-0.09	-0.16	+0.03	+0.03	-0.19	—				
Direct Radiati	ve Effect at TOA	(Wm ⁻²), global annu	al mean all–sky, max	LW CRI from DB1	7					
LW	+0.02	+0.11	+0.21	+0.02	+0.36	_				
NET (SW+LW)	-0.07	-0.07	+0.18	+0.04	+0.08	_				
Direct Radiative Effect at TOA (Wm ⁻²), global annual mean all–sky, CRI from V73										
LW	+0.02	+0.10	+0.27	+0.03	+0.42	_				
NET (SW+LW)	-0.08	-0.08	+0.24	+0.05	+0.13	_				
Net (SW+LW) Dire	ect Radiative Effect	ct at TOA (Wm ⁻²), a	nnual mean all–sky,	mean LW CRI from	DB17					
Northern hemisphere land	-0.23	-0.24	0.63	0.18	0.33	0.39				
Northern hemisphere ocean	-0.17	-0.23	-0.05	0.01	-0.44	-0.33				
Southern hemisphere land	-0.02	-0.03	0.00	0.01	-0.04	-0.04				
Southern hemisphere ocean	-0.01	-0.01	0.00	0.00	-0.02	-0.02				
Tropical Atlantic (15–25N,15–45W)	-1.05	-2.12	-0.37	0.14	-3.40	-2.78				
Sahara (18– 35N, 18 W–40 E)	-0.53	0.02	3.38	0.93	3.79	3.65				
Sahel (11–18N, 18 W – 22.5 E)	-1.26	-1.22	3.50	0.93	1.95	2.34				
Middle East (15–40N, 40–60 E)	-0.38	-0.53	0.68	0.17	-0.05	0.07				
Eastern Asia (30–50 N, 75–130 E)	-0.52	-0.90	0.32	0.23	-0.87	-0.44				
270	0.02	0.70	0.02	0.20	5.07					

270

271 Table 2. Summary of results of our global simulations. We report the contribution of dust particles of different

sizes and complex refractive index (CRI) to emissions, atmospheric load, lifetime, AOD₅₅₀, and the shortwave

273 (SW), longwave (LW), and net direct radiative effect (DRE).

4. Discussion: towards an observationally–constrained dust DRE

Figure 2 summarizes recent developments resulting from applying observational constraints to dust global models including size and optical properties. The inclusion of the coarse mode up to 20 μ m in Kok17 and its further extension in the present study leads to a progressive reduction of the SW cooling when compared to the AEROCOM (Aerosol Comparisons between Observations and Models, Huneeus et al., 2011) estimate for PM₁₀ dust (-0.65 Wm⁻² median value in AEROCOM models, -0.49 Wm⁻² in Kok17, -0.25 Wm⁻² in the present study).

We assume for the first time a LW CRI constrained by laboratory measurements, and we also account for the strong scattering effect of dust in the same spectral range. Our estimated dust LW DRE of +0.22 Wm⁻² is in between the AEROCOM median estimate of +0.15 Wm⁻² and the +0.29Wm⁻² published by Kok17. The LW DRE represents on average between 23 and 59% of the SW perturbation at TOA from past literature. Here, the LW contribution amounts to 88% of the SW term at TOA.

The reduction of SW cooling and the increase of the LW/SW ratio also result in a progressive reduction of the net DRE from the strong negative values of AEROCOM (-0.50 Wm^{-2}) to our estimate of -0.03 Wm^{-2} . However, we stress that because net TOA DRE is geographically varying and can have opposing sign, this can hide large impacts with potentially relevant implications for regional climate (Albani and Mahowald, 2019). In analogy with their study, we report an absolute value of net TOA DRE (global annual average) of 0.32 Wm^{-2} .



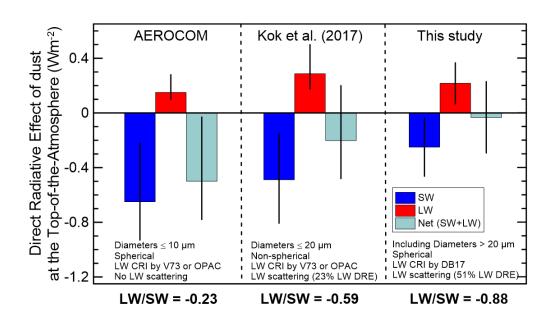


Figure 2. Top-of-the-atmosphere global annual mean all-sky shortwave (SW), longwave (LW), and net dust
 direct radiative effect as obtained in AEROCOM models, in Kok et al. (2017) and in this study. AEROCOM
 estimate is from Figure 4 in Kok et al. (2017). The inserts detail main assumptions including the used complex
 refractive index (CRI) data (OPAC is Optical properties of Aerosols and Clouds, Hess et al., 1998), if the LW
 scattering correction is applied and its percentage of the TOA LW DRE.

5. Conclusions

Our model simulations indicate that the global net DRE of dust is close to zero, due to almost opposing SW (cooling) and LW (warming) effects. This global value is also the result of the sum of a positive effect over land, in particular over the Sahara, and a negative effect over oceans.

We find that accounting for dust beyond 20 μ m diameter reduces the SW cooling compared to previous studies, while the LW DRE remains in the range of previous estimates due to the compensating effects of updating size, LW CRI and scattering. Based on our sensitivity calculations we stress the importance of including regional differences in the CRI and a more realistic representation of the dust size distribution and LW scattering both in global and regional models since they affect the magnitude and sign of the dust DRE. Also, we highlight the necessity for more field measurements to better constrain the emitted dust size distribution at D \geq 20 μ m.

Our results suggest that current climate models might significantly overestimate the dust global cooling effect, thus also biasing estimates of the total aerosol radiative perturbation. Although it remains an open question whether global dust loading will increase or decrease in the future, our study indicates that the spatial variability of dust net DRE could be more complex than previously thought in driving global feedbacks, with a potentially important role of dust DRE on regional climate.

320

321 Acknowledgements

The laboratory experiments to retrieve the dust refractive indices in Di Biagio et al. (2017) that 322 feed this work had received funding from the European Union's Horizon 2020 research and 323 innovation program through the EUROCHAMP-2020 Infrastructure Activity under grant 324 agreement no. 730997. They were supported by the French national programme LEFE/INSU (Les 325 Enveloppes Fluides et l'Environnement / Institut National des Sciences de l'Univers) and by the 326 OSU-EFLUVE (Observatoire des Sciences de l'Univers-Enveloppes Fluides de la Ville à 327 l'Exobiologie) through dedicated research funding to the RED-DUST project. The authors 328 329 acknowledge the CNRS-INSU for supporting the CESAM chamber as national facility and the AERIS datacenter (www.aeris-data.fr) for distributing and curing the data produced by the 330 CESAM chamber the hosting the datacenter through of **EUROCHAMP** 331 (https://data.eurochamp.org). The present project conducted at IPSL (Institut Pierre Simon 332 Laplace) used the HPC (High Performance Computing) resources of TGCC (Très Grand Centre 333 de calcul du CEA, Commissariat à l'énergie atomique et aux énergies alternatives) under the 334 allocations 2018–A0050102201, and 2019–A0050102201 (project gen2201) provided by GENCI 335 (Grand Équipement National de Calcul Intensif). Y. Balkanski and O. Boucher were partly 336 supported by the CRESCENDO project, funded by the European Union's Horizon 2020 337 338 programme, Grant Agreement no. 641816. C. Di Biagio was supported by the CNRS via the Labex L-IPSL, which is funded by the ANR (grant no. ANR-10-LABX-0018). S. Albani acknowledges 339

- 340 funding from the European Union's Horizon 2020 research and innovation programme under the
- Marie Skłodowska–Curie grant agreement No 708119, for the project "DUSt, Climate, and the
- Carbon Cycle" (DUSC3). The authors wish to acknowledge C. Denjean, C. L. Ryder, and J. Kok
- for providing the size distribution data shown in Fig. 1. C. Di Biagio also wishes to thank J. Kok
- and J.–L. Dufresne for useful discussions. The authors wish to thank the reviewers, Y. Huang and
- 345 S. Osipov, for their helpful comments that helped to improve the quality of the paper.
- 346

347 Data availability

- 348 The LMDZOR–INCA input data, run configuration and output diagnostic variables are publicly
- available at http://doi:10.5281/zenodo.3531929. Complex refractive indices from Di Biagio et al.
- (2017) used here are freely available within the Library of Advanced Data Products (LADP) of the
- 351 EUROCHAMP datacenter (https://data.eurochamp.org/data-access/optical-properties/). The
- 352 complex refractive index data from Volz (1973) are available at http://eodg.atm.ox.ac.uk/ARIA/.
- The size data used for comparison in Fig. 1c and the satellite data in Table 1 are described in the
- 354 Supplementary Information and accessible from the main publications. Data in Fig. 3 are available
- from Kok et al. (2017) and the present study.
- 356

357 **Conflicts of interest**

- The authors declare no conflicts of interests.
- 359

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