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Dust Induced Atmospheric Absorption Improves Tropical Precipitations In Climate Models

Yves Balkanski¹, Rémy Bonnet², Olivier Boucher², Ramiro Checa-Garcia¹ and Jérôme Servonnat¹

 ¹Laboratoire des Sciences du Climat et de l'Environnement, CEA-CNRS-UVSQ, IPSL, Gif-sur-Yvette, France
 ²Institut Pierre-Simon Laplace, Sorbonne Université-CNRS, Paris, France

Correspondance to: yves.balkanski@lsce.ipsl.fr

Abstract. The amount of shortwave radiation absorbed by dust has remained uncertain. We have developed a more accurate representation of dust absorption that is based on the observed dust mineralogical composition and accounts for very large particles. We analyze the results from two fully-coupled climate simulations of 100 years in terms of their simulated precipitation patterns against observations. A striking benefit of the new dust optical and physical properties is that tropical precipitations over Sahel, tropical North Atlantic and West Indian Ocean are significantly improved compared to observations, without degrading precipitations elsewhere. This

15 alleviates a persistent bias in earth system models that exhibit a summer African monsoon that does not reach far enough North. We show that the improvement results from a thermodynamical and dynamical response to dust absorption is unrelated to natural variability. Aerosol absorption induces more water vapor advection from the ocean to the Sahel, thereby providing an added supply of moisture available for precipitation. This work thus provides a path towards improving precipitation patterns in these regions by more realistically accounting for 20 both physical and optical properties of the aerosol.

1. Introduction

Mineral dust influences precipitation through direct radiative forcing (Miller et al., 2014), changing the vertical temperature profile, and is an efficient ice nucleus in the presence of feldspar mineral (Atkinson et al., 2013), therefore also producing an indirect, cloud-mediated radiative perturbation. It also influences the water cycle

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through microphysical interactions with clouds (Nenes et al., 2014). Near source regions, mineral dust absorption causes a change in atmospheric radiation of several tens of watts per square meter (W.m⁻²), an effect





stronger than the one exerted by aerosol-cloud interactions (Miller et al., 2014; Nenes et al., 2014). Sahel precipitation is influenced by aerosol absorption (Miller et al., 2004; Solmon et al., 2008; Yoshioka et al., 2007), and absorption depends on iron oxides (hematite and goethite) that are part of dust mineralogical composition

- 30 (Claquin et al., 1999; Sokolik and Toon, 1996). Over the last 15 years, simulating tropical precipitation has been notoriously difficult for climate models (Fiedler et al., 2020). Improving the representation of tropical monsoons is a prerequisite to predict future changes in tropical precipitations and attribute them to observed changes in greenhouse gases and to aerosol changes. We show here how a better representation of dust aerosols leads to an unequivocal improvement in the simulation of precipitation over key climatic tropical regions, namely Sahel,
- 35 tropical North Atlantic and West Indian Ocean without degrading precipitation elsewhere around the globe, and subsequently discuss the thermodynamically and dynamically-driven mechanisms at play that affect the water cycle.

Miller et al. (2014) showed that the increase in Sahel precipitation in response to high dust absorption is a fairly robust result across models. The link between this additional atmospheric absorption and dust physical

- 40 properties, however, remains poorly understood. Conversely, (Haywood et al., 2016) discuss how some tropical precipitation biases can be reduced by changing the model's energy balance between the Northern and the Southern Hemispheres, but they did so through ad hoc hemispheric albedo changes. Here we reunite these incomplete studies by describing an end-to-end physical mechanism that ties improvement in tropical precipitation to observational support for a higher level of dust absorption based on measurements of iron oxide
- 45 in dust particles, measurements of the full dust particle size distribution and detailed climate simulations with interactive dust.

The abundancy and variation in iron oxides, as well as the presence of large particles control absorption (Balkanski et al., 2007; Miller et al., 2004; Ryder et al., 2018; Yoshioka et al., 2007). Although iron oxides in dust are present in minute quantities from 1 to 5% by volume (Di Biagio et al., 2019; Journet et al., 2014;

- 50 Kandler et al., 2007; Liu et al., 2018; Nickovic et al., 2012; Perlwitz et al., 2015; Reid, 2003), this relatively small volume largely controls mineral dust absorption (Balkanski et al., 2007; Di Biagio et al., 2019; Ryder et al., 2018). Large dust particles have been shown through recent measurements to absorb strongly (Ryder et al., 2018). Since large particles are particularly abundant over source regions, they change their atmospheric energy balance. Furthermore Sahel is one of the world regions with the highest iron oxide content in soils (Journet et al., 2018).
- 55 al., 2014; Nickovic et al., 2012). In this study, we analyse the strong relationship between high iron oxide content and increased Sahel precipitation. Specifically we determine the optical properties of airborne dust coming from African deserts based on its mineralogy and show the IPSL-CM6 precipitation fields in several key



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tropical areas are improved compared to observations when the effect of dust absorption is introduced in this model. We finally dissect the mechanisms that explain an increase in Sahel precipitation with dust absorption and answer the question of whether these mechanisms are thermodynamical, dynamical or occur in response to an improved phasing of the Atlantic Multidecadal Variability.

2. Results

We present in this study results from a fully-coupled climate simulation of 100 years (from which we analyse the last 30) and compare simulated precipitations with observations. Iron oxide content is based on the observations
of dust mineralogical composition over the Sahel region (Di Biagio et al., 2019; Lafon et al., 2006) and displayed for soils in Fig. 1. We infer the refractive index of the mineral dust using an optical model. Figure 2 illustrates the influence of the iron oxide content and the size of a particle on its radiative absorption. In this Figure, the aerosol absorption increases with the aerosol co-single-scattering-albedo (coSSA) along the x-axis. The coSSA is defined as:

$70 \quad coSSA = 1.-SSA$

(1)

the solid blue line illustrates the absorption calculated when only particles of dust of less than 10 μ m are considered. Furthermore, the shift from the solid blue to the solid orange line indicates dust absorption increase when particles larger than 10 μ m are taken into account. Hence, looking at the graph, particles of diameter less than 10 μ m with an iron oxide content of 5.0% absorb the same amount of radiation than particles with 3.0% iron oxide for which we consider also the diameters greater than 10 μ m. With these mineralogical compositions we obtain a coSSA of 0.09. Considering dust particles with iron oxide volume content of 1.5%, thought to be the global median value as discussed in Balkanski et al. (2007), the coSSA is 0.032 and it almost doubles to 0.058

when large particles are also considered. Hence, large particles, which are particularly abundant over the Sahel region, increase substantially the aerosol absorption. This has yet to be taken into account in many models since
80 they do not generally include particles sizes above 10 µm.

We now discuss the changes in aerosol direct radiative effect for dust containing 3.0% iron oxide which corresponds to the amount of iron oxides measured over Sahel (Fig. 1). Figure 3 illustrates the June, July, August and September (JJAS) mean radiative perturbation due to the presence of dust. Over the bright surfaces of the Sahel region, the top-of-atmosphere shortwave radiative perturbation is positive, i.e., an atmosphere with

85 dust is less reflective than an atmosphere without dust. At the surface, the radiative effect from dust is strongly negative (-18 W.m⁻² over the Sahel) as the dominant term is the reduction of shortwave radiation due to either



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back-scatter or absorption of radiation by dust. The difference between TOA and surface determines the dust JJAS mean atmospheric absorption due to dust (+26 W m⁻² over the Sahel). Since dust is highly variable in time, particularly strong dust episodes are characterized by atmospheric absorption that reaches several hundred watts per square meter (Pérez et al., 2006). Note that, in comparison, greenhouse gases contribute to a globally-

- averaged radiative forcing of only 3 W m⁻² (Myhre et al., 2013) relatively constant on short timescales . To evaluate the impact of this change of radiative forcing on precipitation, we calculate the difference in 30-year (1985-2014) precipitation averaged over June, July, August and September (JJAS) between the simulation with dust and the one with no dust (Figs 4 & 5). These figures show an increase in precipitation between 6 and 20°N
- 95 latitude over Africa. A general feature of most ESMs is to have a summer African monsoon that does not reach far enough North compared to observations such as Tropical Rainfall Measuring Mission (Roehrig et al., 2013) (TRMM). Figure 5 shows that precipitation averaged from 10°W to 10°E increases from 0.5 to 1.5 mm day⁻¹ over the summer months (JJAS). Accounting for dust absorption hence shifts northward the extent of the African summer monsoon.
- 100 We now examine whether precipitations are better represented when the effect absorbing dust on atmospheric heating is accounted for. The accuracy with which the model captures the African monsoon was analyzed by comparing the incursion of the precipitations into the African continent with the TRMM observations for the same period of 15-years (2000-2014) over the summer months (JJAS). Figure 6 introduces the change in water budget due to the effect of absorbing dust over an airshed of the size of the Sahel (10°N-20°N; 15°W- 35°E). We
- 105 derive the amount of water advected into this region with the same units than precipitation or evaporation (mm day⁻¹, see Methods). The effect of dust on precipitation is to increase the advection of moisture entering Sahel from the southern edge at 10°N. Figure S1 shows that aerosol absorption induces more water vapor advection from the ocean to the Sahel, thereby providing an added supply of moisture that is available for precipitation. When sufficient water vapor is advected towards the African continent, aerosol absorption changes the regional
- energy balance and enhances vertical exchanges through the air column (Miller et al., 2014; Solmon et al., 2008). The largest change in water flux into the Sahel airshed is through the southern border of the region at 10°N with a flux reduction of 89% due to dust absorption, from -0.41 mm day⁻¹ (i.e. exiting the Sahel box) to only -0.05 mm day⁻¹. The change in flux on the western side of the airshed is significantly smaller and amounts to 0.1 mm day⁻¹. By comparison, the increases in precipitation and evaporation over the Sahel region are 0.40 and 0.09 mm day⁻¹, respectively, for the months JJAS averaged over the 30-year period (1985-2014).
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3. Discussion

We now compare the distribution of the surface precipitation between the two model simulations with and without dust with observations from the Global Precipitation Climatology Project (GPCP) for the months when African monsoon sets in from June to September. The precipitation statistics based upon the model/measurements comparison show significant improvements over Sahel, North Africa and the North Atlantic. We quantify these improvements in Table 1 through a comparison of the bias, the root mean square error (RMSE) and the spatial correlation between precipitation fields. The largest changes occur over the Sahel where precipitation increases by 21% over the period and the negative bias and of the RMSE are reduced by 34 and 29%, respectively. The spatial correlation of the precipitation is also improved from 0.951 to 0.965. Other

125 regions where all of the mentioned statistics are improved are the North Atlantic and the West Indian Ocean. Over Northern Africa, the strong dust absorption causes an excess precipitation but there are improvements in the RMSE and the spatial correlation.

The Sahel region is prone to substantial atmospheric dust absorption as it is an important mineral dust source region. Being an active source region, the lower troposphere above Sahel experiences high dust loads and a large

- 130 mass fraction comprises large-size particles of diameters above 10 μm (larger particles being more absorbing than smaller ones). Compounding these effects, soils from Sahel have a higher iron oxide content than other soils from North Africa (Di Biagio et al., 2019; Formenti et al., 2014; Kandler et al., 2007; Liu et al., 2018). The high atmospheric absorption that exists over the Sahel and illustrated by Fig. 3, induces water moisture advection from the North Atlantic in regions off the West Coast of Africa during the period of the African summer
- 135 monsoon (Fig. S1). We present below the terms of the energy budget that play a role over the Sahel have been discussed by Miller et al. (2014). We also explain the main elements that lead to upward movement of the moist air above the Sahel region that then generates precipitation. The action of mineral dust aerosol on precipitation is felt through the modifications of the diabatic heating and how the aerosol affects evaporation.

The terms in the energy balance that influence evaporation are the dimming caused by the aerosol layer of -18
W.m⁻² over the Sahel (see Fig. 3) which needs to be compensated by the decrease of net latent heat flux that leaves the surface. Following Miller et al.(2014), this surface flux reduction can be expressed as:

$$F_{surf} = \partial R_{surf}^{LW} + \partial LE + \partial S_E \tag{2}$$

where ∂R_{surf}^{LW} represents the change upward LW radiation flux, and the two other terms, ∂LE and ∂S_E are the changes in turbulent fluxes of latent and sensible heat due to the presence of dust. Over the oceans, the change in





- 145 latent heat flux dominates and the evaporation is reduced hence diminishing precipitation over these regions (see last column of Table 1). Figure S2 indicates the vertical amount of transported Moist Static Energy (MSE). Two regions can be distinguished, one over the Sahel where the transport is upward as a result of the absorbed energy by dust, and the surrounding regions with a downward motion. These are the main perturbations that accompany the precipitation anomaly caused by the presence of dust. Other variables that increase are: evaporation, low-
- 150 level cloud cover, liquid water path. As noticed by Miller et al. (2004), and reinforced by the results presented here, evaporation over Sahel increases with dust absorption (see Fig. S3), while precipitation increases over the same region. Part of the evaporation is supplied by the moisture brought through precipitation over the same region. One mechanism for supplying the moisture is the advection that is evidenced in Fig. S1 and in the water budget presented on Fig. 6.
- 155 To complete the analysis of the possible mechanisms that explain this improvement in Sahel precipitation, we examined whether a different phasing of the Atlantic Multidecadal Variability (Enfield et al., 2001) (AMV), a basin-wide low-frequency variations of the sea surface temperature over the North Atlantic, could be responsible for better reproducing observed precipitation fields. Figure S4 compares the observed and simulated AMV Index (Enfield et al., 2001; Trenberth and Shea, 2006). The AMV index is more in phase in the simulation without dust
- 160 than in the simulation with dust. We conclude from this analysis that the precipitation improvements brought about by dust absorption, which are also evident for earlier portions of the 100-years long simulations, are not due to a better phasing of natural variability in the dust simulation. Instead they correspond to dynamical effects that respond to a thermodynamically driven forcing.

4. Conclusion

- 165 This study was designed to realistically represent dust absorption over the Sahel region and describe the mechanisms by which dust stimulates summer precipitation (JJAS) over the region. Our modelling includes two aspects not accounted for prior to it, first accounting for the high iron oxide content of the region in the optical properties, and secondly taking into consideration the extra-absorption from very large particles, with diameters greater than 10 µm, generally not represented in climate models. The striking benefit to estimate more precisely
- 170 dust absorption and take into account very large particles is that, at least in the IPSL-CM6 model¹ considered here, tropical precipitations are significantly improved compared to observations. This important result came

¹ IPSL-CM6 is the Earth System Model developed at the Institut Pierre- Simon Laplace and described in Boucher et al.(Boucher et al., 2020)





almost serendipitously, as we set to check if the comparison between simulated and observed precipitation over 30 years showed improvement. In key regions of tropical precipitations, namely: Sahel, tropical North Atlantic and West Indian Ocean the precipitation in the IPSL-CM6 climate model are significantly improved without degrading precipitations elsewhere. We believe that this is not restricted to this climate model as other models

- participating in the CMIP exercises have the same bias over Sahel, which is to have to little advection of water vapor northward into the region during the Northern Hemisphere summer months. We thus provide a path towards improving precipitation patterns in these regions by more realistically accounting for both physical (size-based) and optical (absorption) properties of the aerosol. Our results also offer a strong physical basis for a
- 180 stabilizing feedback loop involving dust emission, atmospheric absorption, Sahel precipitation, and vegetation, as hypothesized by Carslaw et al. (2013), which could create multiannual or multidecadal oscillations at these latitudes that could also interact with natural models of variability in the Atlantic region. Future studies should therefore account for the role of water recycling from semi-arid vegetation (Yu et al., 2017) which plays a potentially important role in this loop.

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5. Appendix

5.1 IPSL-CM6 description

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The climate model used here is the low resolution model from the Institut Pierre-Simon Laplace Climate Modelling Centre described by Boucher et al. (2020). The horizontal resolution is 2.5° in longitude and 1.28° in latitude with a discretization of the vertical into 79 layers that extends to about 80 km. For the ocean model, NEMO, that includes sea-ice and biogeochemistry, the horizontal resolution is 1° and the model is discretized using 75 vertical levels. The aerosols are run interactively in the simulations presented here.

5.2 Dust modeling

- Dust emission fluxes are calculated in two steps: in a first step, we derive the horizontal flux of dust that is mobilized based upon three criteria: a threshold velocity that depends on the nature of the upper soil, the wind speed at 10-meters and an erodibility factor that takes into account the effect of soil moisture. These erodibility factors were tuned following the procedure described in Balkanski et al. (2004). Total emissions and loads compare well with the constraints given by Ridley et al. (2016) and by Kok et al. (2017). The dust particle size distribution are emitted with a constant shape following the Brittle theory described by Kok (2011). The size
- 200 distribution is represented by one or several modes represented by a log-normal distributions with a mass median diameter which varies in response to the sink processes of the dust cycle. Simulations are done either with one mode centered at 2.5 µm with a width of 2.0 that represents the accumulation and coarse mode (Denjean et al., 2016; Schulz et al., 1998). Accounting for large particles of more than 10.0 µm follows a treatment of the size distribution with four modes (Di Biagio et al., 2020). The four-mode distribution has mass median diameters of
- 205 1.0, 2.5, 7.0 and 22.0 μm, respectively. The mineral composition which is described below is chosen to have the same dust absorption on all simulations.

Dust absorption is influenced mainly by the iron oxide embedded in the dust aggregates (Di Biagio et al., 2019; Lafon et al., 2006; Ryder et al., 2018). Measurements of iron oxides on soils from around the world have been reported for two particle size class the clays with diameters of less than 2 microns and the silts with diameters

210 between 2 and 64 µm. The iron oxide varies drastically depending on the soil types and most measurements indicate a weight content of 1 to 7% equivalent to 0.5 to 3.5% (Di Biagio et al., 2019; Engelbrecht et al., 2016; Journet et al., 2014; Lafon et al., 2006; Moosmüller et al., 2012) by volume. To determine the amount of iron oxides over Sahel, we used the high-resolution database published by <u>Nickovic et al. (2012)</u> and determined the amount of hematite over the Sahel region (16°W-36°E; 10°N-20°N), see Fig. 1. With the 30 s grid high-





- 215 resolution of the database, the mineral content of hematite could be retrieved for 6,026,016 points. For the clay fraction (diameter $\leq 2 \mu m$), 50% of these points had and hematite content of more than 2% by weight (equivalent to 1% by volume since density of hematite is twice that of all other minerals except goethite); 30% (respectively 17%) of the points had an hematite content of more than 3% (resp. 4%) by weight. For the silt fraction (diameter > 2 µm), 49% of these points had and goethite content of more than 2% by weight (equivalent to 1% by volume
- since density of hematite is twice that of all other minerals except goethite); 30% (respectively 12%) of the points had an hematite content of more than 4% (resp. 5%) by weight. Assuming that hematite and goethite contents are the same for these soils and accounting for the density of hematite (5300 kg m⁻³) and goethite (3800 kg m⁻³), we estimate that iron-oxides (hematite+goethite) represent 5.3% by weight and 3.0% by volume of mineral dust that has a density of 2650 kg m⁻³. Hence, in the simulation, we took the optical properties of mineral dust with a volume of 3.0% made of iron oxides.
- The absorption of dust size distribution is determined as follows: we consider dust as the mixture of six minerals kaolinite (kaol), illite (lili), montmorillonite (montmo), quartz (qua), calcite (calci) and hematite (hema). The difference in optical properties between goethite and hematite are not considered in this paper as we focus on the mechanisms by which dust absorption causes an increase of precipitation over the Sahel and not into having a
- 230 very precise calculation of this absorption. We vary the VOLUME content of hematite with the following values: 0.9, 1.5, 2.7, 3.0, 4.0, 5.0 and 10%.

A description of the Maxwell-Bruggeman approximation used here to compute the refractive index of dust can be found in Balkanski et al. (2007). The first step of the computation is for each of these hematite content compute the refractive index of the mixtures: kaol-hema, illi-hema, montmo-illi, qua-hema and calci-hema (for

- example for 3% hematite, all mixtures are composed of 97-3%). The second step is to compute the refractive index for the two most abundant constituents of the mixture as clays associated with hematite that is illi-hema and kaol-hema. The third step takes the resulting mixture illi-kaol-hema and mixes it with the third most abundant mineral montmorillonite. The resulting mixture illi-kaol-montmo-hema is then mixed with the fourth most abundant mineral quartz. And finally the mixture illi-kaol-montmo-quartz is mixed with calcite, the least
- abundant of those minerals. We refer the reader to Table 1 that explains the abundancies of the different assemblages and minerals.

Figure 2 illustrates how co-albedo (1.-SSA), SSA (single scattering albedo) varies with increasing iron oxide content and the effect of considering large particles (diameter > 10 μ m). For a co-albedo of 0.09, we can see from these curves that the same absorption from the whole size distribution including large particles (orange

solid line) requires only 3.0% volume content of iron oxide whereas for particles of less than 10 µm in diameter





the have to include a volume of 5.0% of iron oxide. This is also observed in field measurements (see Fig. 8 from Ryder et al. (2013)).

We ran 100-year simulation of the fully-coupled IPSLCM6 model with all interactive components of the aerosol including dust for the 1915-2014 period, as well as another 100-year simulation without the dust. We analyzed the last 30 years of the coupled simulations (1985-2014) for the summer period that includes the month of June

250 the last 30 years of the coupled simulations (1985-2014) for the summer period that includes the month of June (June-July-August-September) referred to as JJAS in the rest of the text. We checked for all variables the consistency of the results compared to the previous 30-year period from 1955 to 1984.

5.3 Computation of the Direct Radiative Perturbation (DRP) from dust

- We compare the fluxes both at top-of-atmosphere and at the surface for the simulation with the dust aerosol and
 the case when dust aerosol concentrations are set to zero in the model. The refractive indices are described for
 the shortwave in the work from Di Biagio et al. (2019) and Balkanski et al. (2007) and for the longwave from Di
 Biagio et al. (2020). The solar radiation code in the LMDZ GCM consists of an improved version of the
 parameterizations of Fouquart and Bonnel (1980). The radiative transfer module includes a six-band (0.185–4.0
 µm) scheme in the SW and the Rapid Radiative Transfer Model for Global Circulation Models radiative scheme
- 260 in sixteen bands between 3.33 and 1,000 µm (Hogan and Bozzo, 2016). The model accounts for the diurnal cycle of solar radiation and allows fractional cloudiness to form in a grid box. The reflectivity and transmissivity of a layer are computed using the delta Eddington approximation(Joseph et al., 1976) in the case of a maximum random overlap(Morcrette and Fouquart, 1986) by averaging the clear and cloudy sky fluxes weighted linearly by their respective fractions in the layer. The radiative fluxes are computed every two hours, at the top-of-
- atmosphere and at the surface, with and without the presence of clouds, and with and without the presence of aerosols. The clear-sky and all-sky aerosol radiative forcings can then be estimated as the differences in radiative fluxes with and without aerosols.

Few models have published the radiative effect of dust over the Sahel, hence to compare this effect to other publications we present in Table S1 global results and discuss how the net atmospheric absorption compares in

- 270 each model. Most models published predict a net absorption of radiation by dust except for the result from Yoshioka et al. (Yoshioka et al., 2007) that we discuss below. If we take the three following studies Woodward (2001) and Miller et al. (2004, 2014) they have in common that the absorption in the shortwave dominates what is absorbed in the longwave. Compared to this study, where LW absorption represents -0.41 W.m⁻², the LW absorption of these 3 papers are within the range [-0.23 to -0.03 W.m⁻²], i.e., the net surface LW radiation term is
- greater than the one at top-of-atmosphere.





In the study of Yoshioka et al. (2007) the top-of-atmosphere LW radiation effect is within the other models but the surface LW effect amounts to $+1.13 \text{ W.m}^{-2}$, nearly twice the effect of this study. The consequence is that the atmospheric cooling caused by the LW effect (-0.81 W.m⁻²) more than compensates for the SW heating (+0.67 W.m⁻²) and results in a net cooling of the atmospheric column.

280 5.4 Deriving the Water Budget along the Sahel airshed (10°N-20°N; 15°W- 35°E)

Following Sheen et al. (Sheen et al., 2017), we seek to determine the total flux of moisture depth across each of the airshed boundaries. Hence we compute the integrated moisture flux through the following integral:

$$1./\rho_w g \int_0^{\rho_s} \langle qu \rangle dp \tag{1}$$

where $\langle qu \rangle$ represents the monthly mean of the qu product, g is the acceleration due to gravity, \Box_w is the density of water and p_s is the surface pressure. The units for the flux are kg.m⁻¹ s⁻¹. The integrated fluxes across each side of the airshed are first averaged and then scaled by the length along the flux trajectory(Trenberth, 1999), and then divided by the airshed area to obtain units of mm per day that can be compared to the precipitation and the evaporation fluxes over the airshed.

Deriving the vertical advection response of moist static energy over North Africa (Fig. S2)

Following the method of Hill et al. (Hill et al., 2017), the following term allows to estimate the vertical advection of Moist Static Energy (MSE):

$$\delta\left(\langle\omega\rangle\frac{\partial\langle MSE\rangle}{\delta n}\right) \tag{2}$$

Where MSE, the moist static energy is derived as:

	$MSE = c_p T + gz + L_V ovap$	(3)
295	c_p : is the heat capacity of dry air	
	T is the temperature	
	gz is the geopotential height	
	L _v is the latent heat of vaporization of water	
	ovap: specific humidity	



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Author contributions

Y.B. conceived and designed the project and led manuscript writing. Y.B. and O.B. analysed the data and interpreted results. R.C.-G processed the observational satellite dataset and compared with the model. Y.B. led manuscript writing and preparation. R.B., O.B., R.C.-G. and J.S. assisted in manuscript writing and preparation.

Competing interests

The authors declare no competing interests.

Availability of materials and data

The datasets generated during and/or analysed during the current study are available from the corresponding

465 author on reasonable request.





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Figure 1. Iron oxide content (by mass) in the clay and silt fractions of soils over Africa from Nickovic et al. (2012).





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Figure 2. Relationship between the aerosol absorption, (co-single-scattering albedo) presented on the x-axis, and the percentage in volume of iron oxide present in dust. The solid blue line presents this relationship for dust particles with diameters of less than 10 μ m. The shift from the blue to the orange line shows the increase in dust absorption when the full dust size distribution observed in Ryder et al. (Ryder et al., 2018) is considered. The optical model used is described in the Methods. The ranges of absorptions measured during the AER-D campaign (Ryder et al., 2018) over Sahara and the near Atlantic are indicated by the blue shading (from 0.01 to 0.09 for the co-albedo), the range measured during the FENNEC campaign (Ryder et al., 2013) with the red shading (0.02 to 0.14 for the coSSA).







Figure 3. Top panel: Top-of-atmosphere Dust Direct Radiative Effect (in W m⁻²); Middle panel: Dust Atmospheric Absorption (W m⁻²) which is obtained as the difference between top-of-atmosphere and surface effects; Bottom Panel: Surface Dust Radiative effect (W m⁻²). The effects indicated to the left of the Figures are the sum of SW+LW, the SW and the LW for the period JJAS, respectively, Over the Sahel region (10°N to 20°N; 15°W to 35°E), at the top-of atmosphere this effect amounts to +8.1 W.m⁻² (SW=+4.4, LW=+3.7); the atmospheric absorption amounts to +25.8 W.m⁻² (SW=+36.0, LW=-10.2); at the surface, -17.7 W.m⁻² (SW=-31.6, LW=+13.9).







30 years (1985 to 2014) by substracting the precipitation fields of the experiment with dust and the experiments without dust in the IPSL-CM6 climate model where dust is run interactively. Figure 4. Mean Precipitation difference (mm d¹) due to the effect of absorbing dust obtained for the months JJAS for







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Figure 5. Hovmoller diagram showing the time and latitudinal variations of the zonally-averaged precipitation (mm day⁻¹) from 10°W to 10°E for *JJAS* from 2000 to 2014. TRMM indicates the observed precipitations from the NASA *Tropical Rainfall Measuring Mission*.







Figure 6. Water Budget Difference (mm day⁻¹) over Sahel 30-year mean (1985-2014) JJAS between with and without dust from the surface to 200 mb. The way this budget was established is explained in the Methods. The Sahel region is indicated on the Figure with a box. The difference has a positive (resp. negative) sign when water enters (resp. exits) the Sahel box.





Regions	No Dust vs. GPCP	GPCP		Dust vs. GPC	Dust vs. GPCP Precipitation		Change
						D	Due to Dust
	Bias	RMSE	Correlation	Bias	RMSE	Correlation	
Globe	0.277	1.61	0.821	0.276	1.62	0.819	-0.1%
N. Atlantic							
(50°W-20°W; 0-30°N)	0.625	1.43	0.952	0.499	1.25	0.956	-3.9%
N. Africa							
(18W-40E; 0-35N)	0.029	1.67	0.883	0.235	1.56	0.916	7.5%
Sahel							
(16W-36E; 10N-20N)	-1.18	1.51	0.951	-0.775	1.07	0.965	20.9%
West Indian Ocean							
(50E-70E; 10S-15N)	1.33	1.74	0.815	1.26	1.58	0.865	-2.1%
Equatorial Pacific							
(120E-90W; 10S-10N) 0.313	0.313	3.67	0.704	0.326	3.68	0.709	0.1%

for the months of June-July-August-September (JJAS). Both simulated and observed precipitation fields are compared for Table 1. Statistics of the simulated precipitation between without dust and with dust compared to the GPCP observations improvement/degradation from 5 to 15% (resp. > 15%) of the bias, RMSE, and correlation for the region indicated in the the same JJAS period from 1985 to 2014. The Table cells with statistics in italics (resp. in bold) indicate an first column.

