

MODEL INTER-COMPARISON AND EVALUATION OF DUST FORECASTS

SDS-WAS-2020-001

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Summary

This document describes the dust forecast inter-comparison and model evaluation available in the <u>Regional Center for Northern Africa, Middle East and Europe (hereafter RC NAMEE or RC)</u> of the World Meteorological Organization (WMO) Sand and Dust Storm Warning Advisory and Assessment System (SDS-WAS).

Please, be aware that the document is being revised regularly with the incorporation of the new models and observations. Last revision is done on 25th May 2022.



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1. Introduction

The Sand and Dust Storm Warning Advisory and Assessment System (SDS-WAS) is a project of the World Meteorological Organization (WMO) with the mission to enhance the ability of countries to deliver timely and quality sand and dust storm forecasts, observations, information and knowledge to end users. The Regional Center for Northern Africa, Middle East and Europe (hereafter RC NAMEE or RC), hosted by the Spanish State Meteorological Agency (AEMET) and the Barcelona Supercomputing Center (BSC), supports a network of research and operational partners implementing the objectives of the SDS-WAS program in the region.

The exchange of forecast model products is recognized as a core part of the WMO SDS- WAS activities, as a key contribution to the RC NAMEE and as a basis for the model intercomparison and evaluation. The SDS-WAS model inter-comparison and evaluation will make use of a wide range of available datasets describing different aspects of the atmospheric dust cycle. The results of this experiment are expected to **improve the dust parameterization in the individual models and ultimately improve dust forecasts**.

There was a preliminary list of modelling systems providing daily operational or preoperational dust forecast products. However, it was quite difficult to gather homogeneous products from the different partners and was decided (3rd. and 4th. SDS-WAS RC phone meetings) to start concentration of five models (BSC-DREAM8b, MACC, CHIMERE, LMDzT-INCA, and DREAM-NMME-MACC). Other models have been incorporated throughout the following years.



2. Forecast products

2.1. General features

The **geographical area of interest** is bounded by the following coordinates: latitude 25° W to 60° E and longitude 0° to 65° N (see Figure 1). It is called the **Reference Area (RA)** and is intended to cover the main source areas in Northern Africa and Middle East, as well as the main transport routes and deposition zones from the equator to the tip of the Scandinavian Peninsula.



Figure 1: The SDS-WAS Multi-model Median surface concentration dust forecast for 26th June 2019 at 6UTC. The domain shown is the Reference Area (RA) is the considered by the RC NAMEE.

The variables to be provided and their corresponding units are:

- Dust aerosol concentration at the surface (SCONC_DUST), instantaneous (kg·m-3)
- Dust optical depth at 550 nm (AOD550_DUST), instantaneous (adimensional)

The action will consider forecasts with lead times up to 72 h, based on 00 UTC or 12 UTC runs. The output frequency is of 3 hours. The products shall be daily available, ready for download by the RC team.



2.2. Forecasts models

In Table 1, there is listed the models have provided daily dust forecasts to the RC NAMEE.

Table 1. Overview of the models that have been contributed to the SDS-WAS multimodel intercomparison since the starting of the RC NAMEE. In red colour, those models that at present, are not providing dust forecasts to the RC NAMEE.

Model	Institution	Domain	PI or contact
BSC-DREAM8b	BSC	Regional	Sara Basart <sara.basart@bsc.es></sara.basart@bsc.es>
CHIMERE	LMD	Regional	Laurent Menut
LMDzT-INCA	LSCE	Global	Michael Schulz
CAMS-ECMWF	ECMWF	Global	Angela Benedetti <angela.benedetti@ecmwf.int></angela.benedetti@ecmwf.int>
DREAM-NMME-MACC	SEEVCCC	Regional	Goran Pejanovic <goran.pejanovic@hidmet.gov.rs></goran.pejanovic@hidmet.gov.rs>
NMMB-MONARCH	BSC	Regional	Sara Basart <sara.basart@bsc.es></sara.basart@bsc.es>
MetUM	MetOffice	Global	Melissa Brooks < <u>melissa.brooks@metoffice.gov.uk></u>
GEOS-5	NASA	Global	Arlindo da Silva <arlindo.dasilva@nasa.gov></arlindo.dasilva@nasa.gov>
NGAC	NCEP	Global	Jun Wang <jun.wang@noaa.gov></jun.wang@noaa.gov>
EMA REG CM4	EMA	Regional	Ashraf Zakey <ashraf.zakey@yahoo.com></ashraf.zakey@yahoo.com>
DREAMABOL	CNR-ISAC	Regional	Alberto Maurizi <a.maurizi@isac.cnr.it></a.maurizi@isac.cnr.it>
WRF-CHEM	NOA	Regional	Emmanouil Flaounas <flaounas@noa.gr></flaounas@noa.gr>
SILAM	FMI	Global	Mikhail Sofiev <mikhail.sofiev@fmi.fi></mikhail.sofiev@fmi.fi>
WRF-Chem	NOA	Regional	Vassiliki Kotroni < <u>kotroni@meteo.noa.gr</u> >
LOTOS-EUROS	TNO	Regional	Astrid Manders-Groot <astrid.manders@tno.nl></astrid.manders@tno.nl>
ICON-ART	DWD/KIT	Regional	Vanessa Bachmann <vanessa.bachmann@dwd.de></vanessa.bachmann@dwd.de>
DREAM8-NMME-MSG	IAASARS/NOA	Regional	Stavros Solomos <stavros@noa.gr></stavros@noa.gr>
ALADIN-Dust	MetOffice of ALGERIA	Regional	Abdenour AMBAR <ambar.abdenour@gmail.com></ambar.abdenour@gmail.com>
WRF-NEMO-CAMx	Aristotle University of Thessaloniki	Regional	Serafim Kontos <serkontos@gmail.com></serkontos@gmail.com>
ZAMG-WRF-CHEM	ZAMG	Regional	Barbara Scherllin-Pirscher \barbara.scherllin-



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MOCAGE	MétéoFrance	Global	Vincent Guidard <vincent.guidard@meteo.fr></vincent.guidard@meteo.fr>

Each modelling group has provided a short report on the main features of its model. The model characteristics are summarized in Table 2 and described in more detail in **Appendix A**.



Table 2. Model description. This table include the main features of the model configuration used by each modelling group.

Model	BSC-DREAM8b	CHIMERE	LMDzT-INCA	CAMS
Institution	BSC	LMD	LSCE	ECMWF
Meteorological driver	Eta/NCEP	MM5	LMDzT	ECMWF
Regional or global coverage	Regional	Regional	Global	Global
Meteorological initial fields	NCEP/GFS	NCEP/GFS	ECMWF/IFS	ECMWF/IFS
Emission scheme	Uplifting (Shao et al., 1993; Janjic et al., 1994; Ginoux et al., 2001)	Saltation and sandblasting (Marticorena and Bergametti, 1995; Alfaro and Gomes, 2001; Menut et al., 2005)	Uplifting (Schulz et al., 1998; Schulz, 2007; Guelle et al., 2000)	Uplifting (Ginoux et al., 2001; Morcrette et al., 2008, 2009)
Horizontal resolution	1/3° x 1/3°	1° x 1°	3.75°x2.85°	8-10 km approx. (O1280)
Vertical resolution	24 Eta-layers	30 sygma-layers	19 sygma-hybrid- layers	137 sygma-layers
Height first layer	86 m (above sea level)	40 m (above the surface)	120 m (above surface)	10 m (above the surface)
Radiation interactions	Yes	No	No	No
Transport size bins	8 bins (0.1-10µm)	9 bins (0.039- 20µm)	1-log normal mode, mass and number (width 2, MMD varying 1.5- 2.5 μm)	3 bins (0.03-20µm)
Data assimilation	No	No	No	Yes AOD550/MODIS



Model	DREAM8-NMME- CAMS	NMMB-MONARCH	MetUM	GEOS-5
Institution	SEEVCCC	BSC	Met office	NASA
Meteorological driver	NMME	NMMB/NCEP	MetUM	GEOS-5
Regional or global coverage	Regional	Regional	Global	Global
Meteorological initial fields	ECMWF/IFS	NCEP/GFS	MetUM	GEOS-5 Analysis
Emission scheme	Uplifting (Shao et al., 1993; Janjic et al., 1994)	Saltation and sandblasting (Janjic qt al., 1994; Marticorena and Bergametti, 1995)	Woodford (2001, 2011)	Based on Ginoux (2001)
Horizontal resolution	1/3° x 1/3°	1/3º x 1/3º	0.3516° x 0.2344°	0.25° x 0.3125°
Vertical resolution	24 Eta- layers	24 sygma-hybrid- layers	70 levels. Charney- Phillips grid	72 layers. Top: 0.01 hPa
Height first layer	96 m (above sea level)	108 m (above 20 m surface)		
Radiation interactions	No	Yes	Yes	Direct effects fully included
Transport size bins	8 bins (0.1- 10µm)	8 bins (0.1- 10µm)	2 (0.1-10 μm)	5 bins centered at (0.73μm,1.4 μm,2.4μm,4.5 μm,8.0 μm)
Data assimilation	Yes (ECMWF dust-analysis)	No	Yes (MODIS/Aqua)	Yes (MODIS)



Model	NGAC	EMA RegCM4	DREAMABOL	WRF-CHEM
Institution	titution NCEP EMA		CNR-ISAC	NOA
Meteorological driver	NEMS GFS	RegCM4	BOLAM	WRF
Regional or global coverage	Global	Regional	Regional	Regional
Meteorological initial fields	NCEP/GDAS	NCEP/GFS	NCEP/GFS	NCEP/GFS
Emission scheme	Emission scheme Dust uplifting followin g Ginoux (2001) Saltation and sandblasting (A.S. Zakey, 2006; Marticorena and Bergametti, 1995; Alfaro and Gomes, 2001)		Uplifting (Tegen et al., 1994)	Gocart scheme by Ginoux et al. (2001)
Horizontal resolution	T126 (~ 1°)	45 km x 45 km	0.4° x 0.4°	0.19° x 0.22°
Vertical resolution	64 sigma- pressure hybrid layers, Top at 0.2 hPa	18 sygma-layers	50 sigma-hybrid levels	30 sigma levels
Height first layer	20 m	50 m 27 m above surface level		
Radiation interactions	Yes (not activated)	Yes (both short and long waves)	Not active	No
Transport size bins	5 bins centered at (0.73,1.4, 2.4, 4.5, 8.0 μm)	4 bins(0.01:1,- 1:2.5 - 2.5:5 - 5:20)	8 bins (0.1- 10µm)	5 bins (0.5, 1.4, 2.4, 4.5, 8μm)
Data assimilation	No	No	No	No



Model	SILAM LOTOS-EUROS		ICON-ART	DREAM8-NMME- MSG
Institution	FMI	TNO	DWD + KIT	IAASARS/NOA
Meteorological driver	ECMWF	ECMWF	DWD	NCEP/NMME
Regional or global coverage	Global	Regional	Regional	Regional
Meteorological initial fields	ECMWF	ECMWF	ICON-ART Global with nested domain over NAMEE	NCEP/GFS
Emission scheme	Sandblasting following Marticorena & Bergametti, 1995, updated with Zender, 2003, Weinzierl, 2007, Prigent et al., 2007	Marticorena& Bergametti 1995. Dust uplifting following Shao et al. (2001).	Saltation and threshold friction velocity for dust emission flux (Rieger et al., 2017; Vogel et al., 2006; White, 1979; Shao and Lu, 2000; Alfaro and Gomes, 2001).	Dust uplifting following Shao et al. (1993) I ncluding the viscous sublayer approach (Janjic, 1994)
Horizontal resolution	0.5° x 0.5°	1/2° x 1/4°	40 km global + 20 km two-way nest	1/5°×1/5°
Vertical resolution	28 hybrid sigma- pressure levels	4 dynamical layers + surface layer	90 (global) and 60 (nest) Smooth Level Vertical SLEVE coordinate (Leuenberger 2010)	28 hybrid layers
Height first layer	~50m above surface level	25 m above surface level	10 m above the surface	50 m above sea level (approx.)
Radiation interactions	No	No	Yes	No
Transport size bins	5 bins (0.1-1, 1- 2.5, 2.5-10, 10- 30 µm)	5 bins (0.1-10µm)	3-log normal modes for mass and number concentration	8 bins (0.1- 10µm)
Data assimilation	No	No	No	Yes (MSG-SEVIRI over land)



Model	ALADIN-Dust	WRF-NEMO-CAMx	ZAMG-WRF-CHEM	MOCAGE
Institution	ONM-Algeria	Aristotle University of Thessaloniki	ZAMG	METEO FRANCE
Meteorological driver	ALADIN	WRF	WRF	ARPEGE
Regional or global coverage	Regional	Regional	Regional	Global
Meteorological initial fields	ARPEGE	NCEP/GFS	IFS forecasts	ARPEGE
Emission scheme	Dust Entrainment And Deposition (DEAD) model (Zender et al., 2003	Horizontal mass flux of Owen (1964), threshold friction velocity from Marticorena and Bergametti (1995), drag partition of Raupach et al. (1993) as in Darmenova et al. (2009) and sandblasting efficiency of Alfaro and Gomes (2001).	AFWA dust emission scheme for the GOCART aerosol model (LeGrand et al. 2019), tuning factors for friction velocity, soil moisture, preferential dust source term, and bulk vertical dust emission flux activated	Marticorena and Bergametti (1995)
Horizontal resolution	25km x 25km	18km x 18km	0.2°x 0.2°	1° x 1°
Vertical resolution	70 σ-layers	18 layers up to 100hPa	47 vertical eta levels, model top at 50 hPa	47 levels (global)
Height first layer	65m above the surface (approx.)	30 m above the surface (approx.)	~25 m above the surface	~20 m (above the surface)
Radiation interactions	Yes	No	Not activated	No
Transport size bins	3 bins (0.078- 5µm)	2 bins (0.036-2.5 μm and 2.5-10 μm in diameter)	5 dust bins, log- normal size distribution; effective radii of 0.73 μm, 1.4 μm, 2.4 μm, 4.5 μm, and 8 μm	6 bins (2.0E-3, 0.01, 0.1, 1, 2.5, 10, 50 microns)
Data assimilation	No	No	No	Yes, MODIS and VIIRS

2.2.1. Numerical data format

The format for data exchange is <u>NetCDF</u>, with one file per model run. The format has been



developed and mantained at <u>Unidata</u>, which is part of the <u>U. S. University Corporation for</u> <u>Atmospheric Research (UCAR)</u>. It allows data compression while preserving characteristics of numerical fields that have a very large dynamical range.

The exchanged files meet the following standards:

- One netcdf file with the daily run (at 00 or 12 UTC). The filename is YYYYMMDDHH_3H_MODELNAME.nc where YYYYMMDDHH is date and time of the model run and MODELNAME is a name selected by the modeler
- Any regular lat-lon domain
- Two variables: dust surface concentration (SCONC_DUST) and dust optical depth at 550 nm (OD550_DUST)
- Forecast time from 0 to 72 hours every 3 hours

The numerical dust forecast outputs are accessible through the <u>SDS-WAS RC website</u>.



3. SDS-WAS Multi-model products

The SDS-WAS Multi-model products are generated from the different prediction models. Two products describing centrality (median and mean) and two products describing spread (standard deviation and range of variation) of the multi-model ensemble are daily computed (Figure 2). In order to generate them, the model outputs are bi-linearly interpolated to a common grid mesh of $0.5^{\circ} \times 0.5^{\circ}$. Median values ranging from the initial day at 15:00 UTC to the following day at 12:00 UTC are also included in the model intercomparison and the model evaluation.



Figure 2: The SDS-WAS ensemble dust optical depth (DOD) forecast for 30th December 2020 at 12UTC.



4. Forecast visualisation

The values of dust surface concentration and dust optical depth provided by each model are daily plotted side-by-side for the RA using a common color palette (see Table 3 and Figure 3). The palette has been built by combining brownish and greenish colours. The brownish tones highlight the areas with the highest contents of mineral dust whereas the greenish tones allow emphasizing the thresholds set by European Union directives on air quality. An extra color (gray) has been defined for missing data (eventually non-available products or areas outside the integration bounds of limited-area models).

DOD	0 to 0.1	0.1 to 0.2	0.2 to 0.4	0.4 to 0.8	0.8 to 1.2	1.2 to 1.6	1.6 to 3.2	3.2 to 6.4	> 6.4
Conc, (ug/m3)	0 to 5	5 to 20	20 to 50	50 to 200	200 to 500	500 to 2000	2000 to 5000	5000 to 20000	> 20000
Colour									
RGB	255,255,255	161,237,227	92,227,186	252,215,117	218,114,48	158,98,38	113,73,33	57,37,17	29,19,9

 Table 3: SDS-WAS colour palette to display dust forecasts.

The plots are routinely generated and made available at the end of each day using the results of the simulations starting the same day either at 00 or at 12 UTC. In this manner, forecasts released by the models are available for a common period of up to 48 hours, thus making the product a powerful tool to issue short-term predictions and early warning notices. The latest forecasts, as well as historical plots, are available at: http://sds-was.aemet.es/forecasts products/compared-dust-forecasts





Figure 3: SDS-WAS Multi-model comparison of surface concentration dust forecasts for 30th December 2020 at 12UTC.



5. Model evaluation

5.1. Observations

The first problem for the evaluation of dust models is the scarcity of routine observations intended for dust monitoring. By the moment, aerosol optical depth (AOD) from sunphotometric measurements and satellite aerosol products are used in the present exercise.

Direct-sun photometric measurements provide retrieval of column-integrated aerosol properties. The <u>Aerosol Robotic Network (AERONET)</u> is a set of stations that provides aerosol retrievals in near-real-time (Holben et al., 1998; Dubovik and King, 2000). A major shortcoming of these measurements is their unavailability under cloudy skies and during nighttime. However, they are by far the most commonly used in dust model evaluation.

Satellite products have the advantage of a large spatial coverage and that measurements are regular and rapidly available. However, they are highly integrated over the column and over all aerosol components. Therefore, applications involving a particular aerosol type (like dust) are usually limited to seasons and regions, when or where that type dominates the aerosol composition (Basart et al, 2012). For the SDS-WAS model evaluation, it is considered the aerosol products from <u>NASA/MODIS</u>. There are different algorithms to retrieve aerosol optical depth (AOD) from the MODIS spectrometer travelling on board the Terra and Aqua satellites.

The U. S. Naval Research Laboratory (NRL) and the University of North Dakota (UND) developed a value-added NRT AOD product specifically designed for quantitative applications including data assimilation and model validation. It is generated every six hours, and time-stamped 00:00, 06:00, 12:00, and 18:00 UTC, including MODIS observations from +/-3 hours from the timestamp and near-real-time available through the NASA's EOSDIS system. It gives values of the total AOD without any information for partitioning between dust and other aerosol species.

Because of the difficulty in separating the signals of aerosols from those of highly reflective surfaces, aerosol retrievals over bright surfaces, such as deserts, have been limited. The MODIS Deep Blue aerosol retrieval algorithm uses the blue channels; where the surface contribution is relatively low, to retrieve aerosol properties over such regions (Hsu et al., 2004; 2006). The mean value of the MODIS Deep Blue aerosol optical depth retrieval is used for the evaluation whereas the mean value of the Angstrom exponent 0.412-0.47 μ m is used to identify those areas where mineral dust is the dominant source of atmospheric aerosol. The Deep Blue retrievals are included in the NASA's Level-3 MODIS Atmosphere Daily Global Product. All statistics are sorted into 1° × 1° cells on an equal-angle global grid.

Since November 2017, the NASA's MODIS aerosol products considered correspond to Collection 6.1.



5.2. Evaluation metrics

The common metrics that are used to quantify the mean departure between modelled (c_i) and observed (o_i) quantities are the mean bias error (BE), the root mean square error (RMSE), the correlation coefficient (r) and the fractional gross error (FGE). They are presented in Table 4, where *n* denotes the number of data.

Table 4. Summary of the statistical metrics that will be used in the model evaluation.

Statistic Parameter	Formula	Range	Perfect score	Description
Mean Bias Error (BE)	$BE = \frac{1}{n} \sum_{i=1}^{n} \left(c_i - o_i \right)$	∞ to +∞	0	It captures the average deviations between two datasets. It has the units of the variable. Values near 0 are the best, negative values indicate underestimation and positive values indicate overestimation.
Root Mean Square Error (RMSE)	$RMSE = \sqrt{\frac{1}{n} \sum_{i=1}^{n} (c_i - o_i)^2}$	0 to +∞	0	It combines the spread of individual errors. It is strongly dominated by the largest values, due to the squaring operation. Especially in cases where prominent outliers occur, the usefulness of RMSE is questionable and the interpretation becomes more difficult.
Correlation coefficient (r)	$r = \frac{\sum_{i=1}^{n} (c_i - \overline{c}) \cdot (o_i - \overline{o})}{\sqrt{\sum_{i=1}^{n} (c_i - \overline{c})^2} \cdot \sqrt{\sum_{i=1}^{N} (o_i - \overline{o})^2}}$	-1 to 1	1	It indicates the extent to which patterns in the model match those in the observations.
Fractional Gross Error (FGE)	$FGE = \frac{2}{n} \sum_{i=1}^{n} \left \frac{c_i - o_i}{c_i + o_i} \right $	0 to 2	0	It is a measure of model error, ranging between 0 and 2 and behaves symmetrically with respect to under- and overestimation, without over emphasizing outliers.



5.3. Evaluation methods

5.3.1. Comparison with AERONET

The dust optical depth (DOD) forecast are compared with the total aerosol optical depth (AOD) provided by the AERONET network for a selection of dust-prone stations located in Northern Africa, Middle East and Southern Europe that are listed in **Appendix B**. Since January 2017, **Version 3 Level 1.5 of AERONET products** are used for the near- real-time (NRT) evaluation. AERONET Level 1.5 data are automatically cloud screened but may not have final calibration applied. Before that date, Version 2 products had been used. In <u>Basart et al.</u> (2017) show the comparison between AERONET Version 2 and 3.

Since AERONET sun photometers do not yield AOD at 550 nm (AOD550), this variable is calculated from AOD at 440, 675 and 870 nm (AOD440, AOD675, AOD870) and the Ångström exponent 440-870 (AE440_870) using the Ångström law:

$$AOD\,550 = \frac{1}{3} \left(AOD\,440 \frac{440}{550}^{AE\,440_{870}} + AOD\,675 \frac{675}{550}^{AE\,440_{870}} + AOD\,870 \frac{870}{550}^{AE\,440_{870}} \right)$$

To minimize the sources of error, it is intended to restrict the comparison to situations in which mineral dust is the dominant aerosol type. Threshold discrimination is made by discarding observations with an Ångström exponent 440-870 higher than 0.6 (Pérez et al., 2006b).





Figure 4: SDS-WAS Multi-model comparison of dust optical depth forecasts for July 2018.

Since January 2017, coinciding with introduction of Version 3 products, AERONET observations are interpolated within 3-hour windows centered at multiple-of-3 hours. Before that date, the closest-in-time retrieval was considered. This resulting dataset is used for the <u>NRT</u> <u>evaluation</u> (see Figure 4) in which all the dust forecast are compare in the selected AERONET sites and for the calculation of <u>quantitative scores</u>.

To get the performance of the different models participating in this SDS-WAS Multi-model intercomparison, a system to evaluate the performance of the different models has been set. The system yields, on a monthly, seasonal and annual basis, evaluation scores computed from the comparison of the simulated dust optical depth (DOD) and the dust-filtered direct-sun AOD observations from AERONET.

The evaluation system is applied to instantaneous forecast values of DOD ranging from the initial day (D) at 15:00 UTC to the following day (D+1) at 12:00 UTC. It means that the lead times of forecasts to be evaluated range from 15 to 36 hours for model runs starting at 00 UTC, but from 3 to 24 hours for model runs starting at 12 UTC.

The scores of each model and median multi-model are computed for each AERONET site, for the 3 sub-regions (Sahel/Sahara, Middle East and Mediterranean; see **Appendix B**) as well as globally considering all sites. It should be noted that scores for individual sites can be little significant for being calculated from a small number of data.

Although observations with an Ångström exponent 440-870 higher than 0.6 are discarded in order to restrict the evaluation to situations in which mineral dust is the dominant aerosol type, other particles are always present (anthropogenic aerosol, products from biomass burning, etc.). Therefore, negative bias can be expected.



5.3.2. Comparison with MODIS

The model <u>evaluation of Saharan dust transport onto the Atlantic</u> uses the MODIS value-added NRT AOD product described in Section 5.1. Since this aerosol product does not provide any information for partitioning between dust and other aerosol species, the evaluation is restricted to an oceanic area, where it is known that mineral dust is by far the main source of atmospheric aerosol. The area, extending between 15° and 30° N and between 18° and 25° W, is the way of Saharan dust out to the Atlantic. As it was the case in the evaluation with AERONET data, although mineral dust is the dominant aerosol in the region, other particles are likely present and, therefore, a negative bias is expected.

- The forecasts of DOD at 12:00 and 18:00 of D+1 are compared with the corresponding MODIS-derived values of AOD. The granules of 00:00 and 06:00 are not used, because neither Terra nor Aqua fly over the area of interest at that times. Model forecasts are bi-linearly interpolated to a 0.5° x 0.5° mesh grid in order to match the spatial resolution of the MODIS retrievals.
- The scores of each model are computed on a monthly, seasonal and annual basis. In the monthly evaluations, model runs between the first and the last day of the month are compared with MODIS retrievals between the second day of the month and the first day of the following month. Only those models that do not use MODIS-derived data in the data assimilation process are considered.

The model <u>evaluation with MODIS Deep Blue retrievals</u> is based on the Aqua/MODIS Deep Blue products.

- The Aqua satellite turns in a sun-synchronous orbit. Its overpass time is around 12:00 local time in its ascending (daytime) mode. The forecasts of dust optical depth (DOD) at 12:00 of D+1 are compared with the corresponding MODIS-derived values of AOD. The maximum lag between observation and prediction is of 3-4 hours.
- It is intended to restrict the comparison to situations in which mineral dust is the dominant aerosol type. Threshold discrimination is made by discarding observations with a MODIS-retrieved Ångström exponent 412-490nm higher than 1.0. However, besides dust, there might be other aerosol types (anthropogenic source, biomass fire, etc.) and, therefore, a negative bias can be expected in the scores.
- Model forecasts are bi-linearly interpolated to a 1° x 1° mesh grid in order to match the spatial resolution of the MODIS deep blue retrievals. Only those models that are not using MODIS-derived AOD in the data assimilation process are considered in this model evaluation.
- The scores of each model are computed on a monthly, seasonal and annual basis. In the monthly evaluations, model runs between the first and the last day of the



month are compared with MODIS retrievals between the second day of the month and the first day of the following month.



6. References

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7. Appendices

7.1. Appendix A: Models description



7.1.1.BSC-DREAM8b

Model	BSC-DREAM8b v2.0
Institution	BSC
Meteorological driver	Eta/NCEP
Domain of simulation	0-65°N and 26°W-60°E
Meteorological initial fields	NCEP (GFS)
Emission scheme	Dust uplifting following Shao et al. (1993) using the USGS global 1-km land cover data is used to specify dust productive model points. Include the <i>viscous sublayer</i> approach between the surface and the lowest model layer (Janjic, 1994). This updated version (v2.0) includes a preferential source mask based on Ginoux et al. (2001) in its emission scheme.
Time step	120 s
Horizontal resolution	1/3° x 1/3°
Vertical resolution	24 Eta-layers
Height first layer	86 m (above sea level)
Radiation interactions	Radiation feedbacks described in Pérez et al. (2006a)
Transport size bins	8 bins (0.1-10µm)
Data assimilation	No
Model original coordinates	Eta rotated grid.
Dust outputs parameters	
LOAD_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs.
SCONC_DUST	Total dust concentration present in the first model layer above the topography. Directly from the model outputs.
AOD550_DUST	Dust AOD is related to column mass loading by:
	$AOD(\lambda) = \sum_{1}^{8} AOD_{k}(\lambda) = \sum_{1}^{8} \frac{3}{4\rho_{k}r_{k}} M_{k}Q_{ext}(\lambda)_{k}$
	where for each size bin k : \Box_k is the particle mass density, r_k is the effective radius, M_k is the column mass loading and $Q_{ext}(\lambda)_k$ is the extinction efficiency factor which was calculated using Mie scattering theory and we have considered the dust refraction indices from OPAC database. The Mie code used has been described in Mischenko et al. (2002).
Model output	File format: NetCDF
	Grid: Regular Lat-Lon. Linear interpolation. Longitude: 256 grid points (0-65°N vector in inc = $1/3°$)
	Latitude: 196 grid points ($26^{\circ}W-60^{\circ}E$ vector in inc = $1/3^{\circ}$)
	Time: 3-hourly vector starting at 12UTC (with 72h dust forecast)
	Variables: LOAD_DUST, SCONC_DUST, OD550_DUST, EMI_DUST
References	Nickovic et al. (2001), Pérez et al. (2006a,b), Haustein et al. (2009)



7.1.2. CHIMERE

Model	CHIMERE
Institution	LMD
Meteorological driver	WRF
Domain of simulation	North-Atlantic (including Europe and Africa): 100°W -80°E
	and 5°S -65°N
Meteorological initial fields	NCEP (GFS)
Emission scheme	Marticorena and Bergametti (1995) for saltation.
	Alfaro and Gomez (2011) (with update of Menut et al., 2005) for sandblasting.
Time step	5mn
Horizontal resolution	1° x 1°
Vertical resolution	30 levels from surface to 200hPa
Height first layer	$\sim\!\!40m$ (above the surface, but coordinates in sigma/pressure, depends on the location and meteorology)
Radiation interactions	No.
Transport size bins	9 bins (mean median diameter from 0.039 to 20µm).
Data assimilation	No.
Model original coordinates	Regular lat/lon.
Dust outputs paramete	ers
LOAD_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs.
SCONC_DUST	Total dust concentration present in the first model layer.
AOD550_DUST	Mass column loading used with a Mie code to compute.
EMI_DUST	Emissions fluxes in g/cm ² /day
Model output	File format: NetCDF Grid:
	Regular Lat-Lon.
	Longitude: 181 grid points (100°W-80°E) Latitude: 71 grid
	Time: Hourly outputs with 72h dust forecast starting at 00 of [D-1]
	Variables: LOAD DUST. SCONC DUST. OD550 DUST. EMI DUST
	·
References	Forêt et al. (2006), Menut (2008), Menut et al. (2005, 2007, 2008, 2009a,b), Vuolo et al. (2009)



7.1.3. LMDzT-INCA

Model	LMDzT-INCA
Institution	LSCE
Meteorological driver	LMDzT
Domain of simulation	Global
Meteorological initial fields	ECMWF-IFS
Emission scheme	Dust uplifting following Schulz et al. (1998), Guelle et al., (2000), Schulz (2007) using soil texture, soil humidity, maps of potential source strength and threshhold velocity derived from FAO soil maps.
Time step	30 minutes
Horizontal resolution	3.75° × 2.85°
Vertical resolution	19 sygma-hybrid-layers
Height first layer	120 m (above surface)
Radiation interactions	No in forecast mode (potentially yes)
Transport size bins	1- log normal mode, mass and number (width 2, MMD 1.5-2.5 $\mu m)$
Data assimilation	No
Model original coordinates	regular Lat-Lon
Dust outputs parameters	
LOAD_DUST	Directly from model output
SCONC_DUST	Directly from model output
AOD550_DUST	Dust AOD is function of local MMD, refractive index and aerosol mass.
Model output	File format: NetCDF Grid: Regular Lat-Lon Longitude: as documented in netCDF file Latitude: as documented in netCDF file, 1/2 degree at poles Time: 3-hourly for 72 hours into future starting at 00UTC. Variables: LOAD_DUST, SCONC_DUST, OD550_DUST, EMI_DUST
References	Balkanski et al. (2006), Huneeus et al. (2011), Guelle et al. (2000), Schulz (2007) , Schulz et al. (1998, 2009)



7.1.4. CAMS

Model	CAMS
Institution	ECMWF
Meteorological driver	ECMWF
Domain of simulation	Global
Meteorological initial fields	ECMWF/IFS
Emission scheme	Dust uplifting following Ginoux et al. (2001) and Morcrette et al. (2008, 2009).
Time step	1800s
Horizontal resolution	8-10 km approx. (01280)
Vertical resolution	137 ¤-layers
Height first layer	10 m (above the surface)
Radiation interactions	No.
Transport size bins	3 bins (0.03 - 0.55 - 0.9 - 20¤m)
Data assimilation	Yes. (Benedetti et al., 2009)
Model original coordinates	IFS reduced-Gaussian grid (Hortal and Simmons, 1991)
Dust outputs parameters	
LOAD_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs.
SCONC_DUST	Total dust concentration present in the first model layer above the topography. Directly from the model outputs.
AOD550_DUST	Dust AOD is related to column mass loading and the dust refraction indices from Kinne. The Mie code used has been described in Toon and Ackerman (1981).
Model output	File format: NetCDF
	Grid: Regular Lat-Lon. Linear interpolation to 1° x 1°
	Longitude: 360 grid points
	Latitude: 180 grid points
	I Ime: 3-nourly vector starting at 0001C
References	Benedetti et al. (2008), Hortal et al. (2009), Morcrette et al. (2008, 2009)



7.1.5. DREAM8-NMMB-MACC

Model	DREAM8-NMME-MACC
Institution	SEEVCCC
Meteorological driver	NMME
Domain of simulation	0-60°N and 25°W-45°E
Meteorological initial fields	ECMWF
Emission scheme	Dust uplifting following Shao et al. (1993) using the USGS global 1-km land cover data is used to specify dust productive model points. Include the viscous sublayer approach between the surface and the lowest model layer (Janjic, 1994).
Time step	120 s
Horizontal resolution	1/3° x 1/3°
Vertical resolution	28 hybrid layers
Height first layer	48 m above sea level (approx.)
Radiation interactions	No at the moment
Transport size bins	8 bins (0.1-10μm)
Data assimilation	ECMWF-dust-analysis at 18:00 UTC is used as a target field to which 6-hour nudging is done with Newtonian relaxation assimilation.
Model original coordinates	Eta rotated grid.
Dust outputs parameters	
LOAD_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs.
SCONC_DUST	Total dust concentration present in the first model layer above the topography. Directly from the model outputs.
AOD550_DUST	Dust AOD is related to column mass loading by: $AOD(\lambda) = \sum_{1}^{8} AOD_{k}(\lambda) = \sum_{1}^{8} \frac{3}{4\rho_{k}r_{k}} M_{k}Q_{ext}(\lambda)_{k}$ where for each size bin k : \Box_{k} is the particle mass density, r_{k} is the effective radius, M_{k} is the column mass loading and $Qext(\lambda)_{k}$ is the extinction efficiency factor which was calculated using Mie scattering theory and we have considered the dust refraction indices from OPAC database. The Mie code used has been described in Mischenko et al. (2002).
Model output	File format: NetCDF, GRIB Grid: Regular Lat-Lon. Bi-linear interpolation. Longitude: 481 grid points (5-60°N vector in inc = 1/4°) Latitude: 251 grid points (50°W-70°E vector in inc = 1/4°) Time: 3-hourly vector starting at 12UTC (with 72h dust forecast) with one day delay, depends on ECMWF-dust-analysis availability Variables: LOAD_DUST, SCONC_DUST, AOD550_DUST, EMI_DUST
References	Nickovic et al. (2001), Nickovic (2004), Benedeti et al, (2008), Pejanovic et al (2010), Xie et al. (2008)



7.1.6. NMMB-MONARCH

Model	NMMB-MONARCH (the mineral dust module is also known as NMMB/BSC-Dust)
Institution	BSC
Meteorological driver	NMMB/NCEP
Domain of simulation	10°S-66°N and 33°W-68°E
Meteorological initial fields	NCEP (GFS)
Emission scheme	Dust uplifting following Marticorena and Bergametti (1995) using the USGS global 1-km land cover database, the high resolution NESDIS 5-years monthly climatology of vegetation fraction, and topographic preferential source mask of Ginoux to specify dust productive model points. Include the <i>viscous sublayer</i> approach between the surface and the lowest model layer (Janjic, 1994).
Time step	80 s
Horizontal resolution	1/3° x 1/3°
Vertical resolution	24 hybrid pressure-sygma layers
Height first layer	108 m (above sea level)
Radiation interactions	Radiation feedbacks described in Pérez et al. (2006a), not activated
Transport size bins	8 bins (0.1-10µm)
Data assimilation	No
Model original coordinates	NMMB rotated grid.
Dust outputs parameters	
LOAD_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs.
SCONC_DUST	Total dust concentration present in the first model layer above the topography. Directly from the model outputs.
AOD550_DUST	Dust AOD is related to column mass loading by: $AOD[\lambda] = \sum_{1}^{8} AOD_{k}[\lambda] = \sum_{1}^{8} \frac{3}{4\rho_{k}r_{k}} M_{k}Q_{ext}[\lambda]_{k}$ where for each size bin k : \square_{k} is the particle mass density, r_{k} is the effective radius, M_{k} is the column mass loading and $Q_{ext}(\lambda)_{k}$ is the extinction efficiency factor which was calculated using Mie scattering theory and we have considered the dust refraction indices from OPAC database. The Mie code used has been described in Mischenko et al. (2002).
Model output	File format: NetCDF Grid: Regular Lat-Lon. Linear interpolation. Longitude: 289 grid points (10°S-66°N vector in inc = 1/3°) Latitude: 211 grid points (33°W-68°E vector in inc = 1/3°) Time: 3-hourly vector starting at 12UTC (with 72h dust forecast) Variables: SCONC_DUST, OD550_DUST
Rejerences	$rerez et at. (2011), \Pi dustelli et at. (2011)$



7.1.7.MetUM

Model	MetUM TM (global NWP configuration of Met Office Unified Model)
Institution	UK Met Office
Meteorological driver	MetUM
Domain of simulation	Global (but data provided over sub-domain: 60W to 55E,0 to 70N)
Meteorological initial fields	MetUM
Emission scheme	Simplified 2-bin version of Woodward et al. (2001, 2011). Horizontal flux is calculated across 9 bins (0.03-1000 μ m) as in Woodward (2011) but vertical flux is emitted into 2 bins only using a prescribed size distribution (instead of the original 6 bins).
Time step	10 mins
Horizontal resolution	0.3516°x0.2344°
Vertical resolution	70 levels from surface to 80km (uses terrain-following staggered Charney- Phillips grid)
Height first layer	~ 20m (theta) and ~10 m (u,v,p,p) above surface
Radiation interactions	No (possible but not currently activated).
Transport size bins	2 bins (0.1-2µm, 2-10µm)
Data assimilation	MODIS/Aqua
Model original coordinates	Regular lat-lon
Dust outputs parameters	
SCONC_DUST	Total dust concentration present in the first model layer. Directly from the model outputs.
AOD550_DUST	Mass column loading used with a Mie code (offline) to compute dust extinction coefficients. Dust refractive indices are taken from Balkanski et al (2007).
Model output	File format: NetCDF Grid: Regular Lat-Lon. Longitude: 327 grid points Latitude: 299 grid points Time: 3-hourly vector starting at 00UTC Variables (currently providing): SCONC_DUST, OD550_DUST
References	Woodward, S (2011), Mineral dust in HadGEM2, Tech. Note 87, Hadley Cent., Met Office, Exeter, UK. Woodward, S. (2001), Modeling the atmospheric life cycle and radiative impact of mineral dust in the Hadley Centre climate model, <i>J. Geophys. Res.</i> , 106, D16, doi:10.1029/2000JD900795



7.1.8.GEOS-5

Model	GEOS-5 Earth System Model
Institution	NASA/Goddard Space Flight Center/Global Modeling and Assimilation
Meteorological driver	Aerosols are transported within the GEOS-5 global model
Domain of simulation	Global
Meteorological initial fields	GEOS-5 Atmospheric Data Assimilation System
Emission scheme	Based on Ginoux (2001)
Time step	Aerosol tendencies computed every 30 minutes
Horizontal resolution	0.25 degree longitude by 0.3125 degree latitude
Vertical resolution	72 vertical layers, model top at 0.01 hPa (-85 km)
Height first layer	
Radiation interactions	Aerosol direct effects on radiation fully included.
Transport size bins	5 bins centered at (0.73 μm , 1.4 μm , 2.4 μm , 4.5 μm , 8.0 μm)
Data assimilation	Data sources: MODIS Aqua/Terra reflectances, Neural Net AOD retrieval
	Analysis algorithm: 3-hourly analysis splitting consisting of a 2D AOD analysis and 3D increments based on local displacement ensembles.
Model original coordinates	Constant longitude/latitude grid; shortly switching to cubed-sphere
Dust outputs parameters	
DUSMASS	dust surface mass concentration. Dust concentration, summed over the 5 bins, for the first model layer above the surface
DUEXTTAU	dust extinction aot [550 nm]. Computed online based on mass extinction coefficients look up tables. Optical properties based on Colarco et. al. (2002), Kim et al. (2011) and Levoni et al. (1997). Spheroidal shape distribution after Dubovik et al. (2006), properties calculated after Meng et al. (2010).
Model output	File format: COARDS (CF 1.0) compliant NetCDF-4 files Grid:
	Regular Lat-Lon.
	Longitude: 1152 grid points (180W-1/9.68/5E, increment: 0.3125°)
	Time: hourly vector starting at OUTC (with 5 day dust forecast)
	Variables: SCONC_DUST, OD550_DUST
References	Colarco, P., A. da Silva, M. Chin and T. Diehl, 2009: Online simulations of global aerosol distributions in the NASA GEOS-4 model and comparisons to satellite and ground-based aerosol optical depth. J. Geophys. Res., 115, D14207, doi:10.1029/2009JD012820.
	Nowottnick, E., P. Colarco, A. da Silva, 2011: The Fate of Saharan Dust Across the Atlantic and Implications for a Central Americal Dust Barrier. <i>Atmos. Chem. Phys.</i> , 11, 8415-8431, doi:10.5194/acp-11-8415-2011.



7.1.9.NGAC

Model	NCEP NEMS GFS Aerosol Component (NGAC)
Institution	NOAA NCEP
Meteorological driver	NEMS GFS
Domain of simulation	Global
Meteorological initial fields	NCEP GDAS
Emission scheme	Dust uplifting following Ginoux (2001)
Time step	450 seconds
Horizontal resolution	T126 (~ 1 deg)
Vertical resolution	64 vertical sigma-pressure hybrid layers, model top at 0.2 hPa
Height first layer	~ 20 m
Radiation interactions	Aerosol direct effects on radiation not currently activated
Transport size bins	5 bins centered at (0.73 $\mu m,1.4~\mu m$, 2.4 $\mu m,4.5~\mu m,8.0~\mu m)$
Data assimilation	No
Model original coordinates	GFS reduced Gaussian grids
Dust outputs parameters	
DUSMASS	dusmass dust surface mass concentration. Dust concentration, summed over the 5 bins, for the first model layer above the surface
DUEXTTAU	dust extinction aod [550 nm]. Computed offline based on mass extinction coefficients look up tables.
Model output	File format: GRIB2
	Grid: Regular lat-lon. Linear interpolation to 1° x 1°
	Longitude: 360 grid points, Latitude: 180 grid points
	Time: 3-hourly vector starting at OUTC (with 5 day dust forecast).
Deferrer	Variables: SCONC_DUST, AOD550_DUST
References	Lu et al., 2010: Development of NCEP Global Aerosol Forecasting System: An overview and its application for improving weather and air quality forecasts, NATO Science for Peace and Security Series: Air Pollution Modeling and Its Application XX, 451-454, doi:10.1007/978-90-481-3812-8.
	Lu, CH., da Silva, A., Wang, J., Moorthi, S., Chin, M., Colarco, P., Tang, Y., Bhattacharjee, P. S., Chen, SP., Chuang, HY., Juang, HM. H., McQueen, J., and Iredell, M. (2016): The implementation of NEMS GFS Aerosol Component (NGAC) Version 1.0 for global dust forecasting at NOAA/NCEP, Geosci. Model Dev., 9, 1905-1919, doi:10.5194/gmd-9-1905-2016.



7.1.10. EMA RegCM4

Model	EMA-RegCM4
Institution	EMA
Meteorological driver	Online dust scheme with the Regional Climate Model version 4 (RegCM4)
Domain of simulation	Regional
Meteorological initial fields	NCEP/GFS
Emission scheme	Saltation and sandblasting process (A.S. Zakey 2006), the dust scheme depends on (Marticorena and Bergametti, 1995; Alfaro and Gomes, 2001)
Time step	150 s
Horizontal resolution	45 km x 45 km
Vertical resolution	18 sygma-layers
Height first layer	50 m
Radiation interactions	Yes (both with shortwave and long waves) (Direct effects)
Transport size bins	4 bins(0.01:1 - 1:2.5 - 2.5:5 - 5:20)
Data assimilation	No
Model original coordinates	Arakawa-Lamb B-staggering
Dust outputs parameters	
LOAD_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs.
SCONC_DUST	Total dust concentration present in the first model layer above the topography. Directly from the model outputs.
OD550_DUST	AOD is related to column mass loading and the considered dust refraction indices from Kinne. The Mie code used has been described in Toon and Ackerman (1981).
Model output	File format: NetCDF Grid: Lambart Conformal projection
	Longitude: 240 grid points Latitude:
	180 grid points
	Time: 3-hourly vector starting at 03UTC
References	A. S. Zakey, F. Solmon, and F. Giorgi, (2006) "Implementation and testing of a desert dust module in a regional climate model", Atmos. Chem. Phys., 6, 4687-4704.



7.1.11. DREAMBOL

Model	DREAMABOL v1.0
Institution	CNR-ISAC
Meteorological driver	BOLAM
Domain of simulation	0-65°N and 25°W-60°E
Meteorological initial fields	NCEP (GFS)
Emission scheme	Dust uplift following Tegen et al. (1994) using the USGS global 1-km land cover data to specify dust productive model points and FAO soil database for availability of uplifted species. Uses surface TKE based uplift velocity to account for strong convective conditions. Includes a preferential source mask based on Ginoux et al. (2001).
Time step	240 s
Horizontal resolution	0.4° x 0.4° in rotated pole lon-lat grid.
Vertical resolution	50 sygma-hybrid-levels, up to 0.01 hPa
Height first layer	27 m (above surface) at sea level.
Radiation interactions	Based on the substitution of climatological values with the actual model dust AOD in the radiation scheme by Morcrette (1991). Not yet active in operational mode.
Transport size bins	8 bins (0.1-10 μm)
Data assimilation	No
Model original coordinates	Rotated pole lon-lat grid: north_pole_longitude = -162.5, north_pole_latitude=57.5.
Dust outputs parameters	
LOAD_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model output.
SCONC_DUST	Total dust concentration present in the first model layer above the topography. Directly from the model output.
EMI_DUST	Emissions fluxes sampled at the output time step (not cumulated). Directly from the model output.
OD550_DUST	Computed run-time, level-by-level, using an approximation of Mie theory (Evans and Fournier, 1990) to compute the extinction coefficient and approximating of the actual particle distribution by a lognormal distribution with the same parameters.
Model output	File format: NetCDF. Grid: model output is interpolated onto the Model Ensemble grid: Longitude: 171 grid points (0-65°N vector in inc = 0.5°), Latitude: 131 grid points (25°W-60°E vector in inc = 0.5°). Time: 3-hourly steps starting at 00UTC (72h forecast) Variables: LOAD_DUST, SCONC_DUST, OD550_DUST, EMI_DUST



7.1.12. WRF-CHEM

Model	WRF-CHEM
Institution	NOA
Meteorological driver	WRF
Domain of simulation	2-70°N and 28°W-66°E
Meteorological initial fields	GFS
Emission scheme	Gocart scheme by Ginoux et al. (2001)
Time step	60 s
Horizontal resolution	0.19° x 0.22°
Vertical resolution	30 sigma levels
Height first layer	
Radiation interactions	No at the moment
Transport size bins	8 bins (0.15, 0.25, 0.45, 0.78, 1.3, 2.2, 3.8, 7.1µm)
Data assimilation	No
Model original coordinates	Lon-lat standard grid.
Dust outputs parameters	
LOAD_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs.
SCONC_DUST	Total dust concentration present in the first model layer above the topography. Directly from the model outputs.
OD550_DUST	Dust AOD is related to column mass loading and considered dust refraction indices.
Model output	File format: NetCDF Grid: Regular Lat-Lon. Longitude: 424 grid points Latitude: 348 grid points Time: 3-hourly vector starting at 12UTC (with 72h dust forecast) Variables: SCONC_DUST, OD550_DUST
References	In preparation



7.1.13. SILAM

1	SILAM
Institution	Finnish Meteorological Institute
Meteorological driver	ECMWF/IFS
Domain of simulation	Global -to- $\gamma\text{-mesoscale}$. Dust forecasts are provided from the global domain
Meteorological initial fields	ECMWF/IFS
Emission scheme	Saltation and sandblasting following Marticorena & Bergametti, (1995), Zender, (2003) with several updates. The sandblasting efficiency is refitted from original Gillette (1979) observations. Critical u* equation was reanalyzed, variables split and an approximate analytical solution found, Size spectrum is after Weinzierl (2007), roughness length is from wind scatterometer after Prigent et al., (2007)
Time step	1200s
Horizontal resolution	0.5° × 0.5°
Vertical resolution	29 hybrid ¤-pressure layers
Height first layer	~25 m (above the surface at the sea level)
Radiation interactions	No.
Transport size bins	5 bins (0.1-1, 1-2.5, 2.5-10, 10-30 μm)
Data assimilation	No
Model original coordinates	Regular lon-lat
Dust outputs parameters	
LOAD DUST	Total dust an extension for the active structure basis advance of the model. Diversity
	from the model outputs. Post-processing, available on request.
CONC_DUST	Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs. Post-processing, available on request. Total dust concentration in the first model layer. Available as a layer of a 3D field directly from the model outputs.
CONC_DUST OD550_DUST	 Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs. Post-processing, available on request. Total dust concentration in the first model layer. Available as a layer of a 3D field directly from the model outputs. AOD is related to column mass loading and the dust refraction indices from Kinne. The Mie code used has been described in Toon and Ackerman (1981). AOD of each mode available from model outputs. Total dust AOD is a result of post-processing.
CONC_DUST OD550_DUST EMI_DUST	 Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs. Post-processing, available on request. Total dust concentration in the first model layer. Available as a layer of a 3D field directly from the model outputs. AOD is related to column mass loading and the dust refraction indices from Kinne. The Mie code used has been described in Toon and Ackerman (1981). AOD of each mode available from model outputs. Total dust AOD is a result of post-processing. Dust emission in kg/cell. Can be enabled in the model outputs on request.
CONC_DUST OD550_DUST EMI_DUST Model output	 Total dust concentration for the entire atmospheric column of the model. Directly from the model outputs. Post-processing, available on request. Total dust concentration in the first model layer. Available as a layer of a 3D field directly from the model outputs. AOD is related to column mass loading and the dust refraction indices from Kinne. The Mie code used has been described in Toon and Ackerman (1981). AOD of each mode available from model outputs. Total dust AOD is a result of post-processing. Dust emission in kg/cell. Can be enabled in the model outputs on request. File format: NetCDF4 Grid: Regular Lat-Lon. 0.5° x 0.5° Longitude: 720 grid points Latitude: 359 grid points Time: hourly-averaged, starting at 00UTC up to +120 hours Variables: LOAD_DUST, CONC_DUST, OD550_DUST, EMI_DUST



7.1.14. LOTOS-EUROS

Model	LOTOS-EUROS	
Institution	TNO	
Meteorological driver	ECMWF	
Domain of simulation	0-65 °N and 25°W-65°E	
Meteorological initial fields	ECMWF	
Emission scheme	GLC land cover map, STATSGO soil texture map, potential sources approach by Ginoux et al (2001). Approach by Marticorena& Bergametti 1995, impact of clay fraction by Fécan et al (1999) with modification as in Mokthari et al (2012). Dust uplifting following Shao et al. (2001).	
Time step	Variable, depends on Courant conditions	
Horizontal resolution	1/2° x 1/4° (lon x lat)	
Vertical resolution	4 dynamical layers + surface layer	
Height first layer	25 m above terrain	
Radiation interactions	No	
Transport size bins	5 bins (0.1-10µm)	
Data assimilation	no	
Model original coordinates	Regular lon-lat	
Dust outputs parameters		
SCONC_DUST	Translation of dust in first model layer to observation height (2.5 m above terrain) using constant flux approach (direct model output)	
OD550_DUST	AOD is calculated per layer based on mass extinction coefficents for concentrations per size bin, then summed to obtain total column AOD	
Model output	File format: NetCDF Grid: Regular Lat-Lon. Time: 3-hourly vector starting at 00 UTC (with 72h dust forecast) with one day delay, depends on ECMWF-dust-analysis availability Variables: SCONC_DUST, OD550_DUST	
References	LOTOS-EUROS v2.0 reference guide, 2016 A.M.M. Manders and S. Janson, <i>Modelling of mineral dust in the Sahara region</i> , TNO report TNO2014 R11118, 2014 Both available at www.lotos-euros.nl	



7.1.15. ICON-ART

Model	ICON-ART				
Institution	DWD + KIT				
Meteorological driver	DWD				
Domain of simulation	Global with two-way nest (0 -82°N,68°W-68°E)				
Meteorological initial fields	From own data assimilation cycle				
Emission scheme	Saltation and threshold friction velocity for dust emission flux; HWSD for soil types (Rieger et al., 2017; Vogel et al., 2006; White, 1979; Shao and Lu, 2000; Alfaro and Gomes, 2001)				
Time step	Global: 6 minutes, nest: 3 minutes				
Horizontal resolution	40 km global + 20 km two-way nest over Europe, North Atlantic and North Africa. Triangular mesh based on an icosahedron.				
Vertical resolution	90 (global) and 60 (nest) Smooth Level Vertical SLEVE coordinate (Leuenberger 2010)				
Height first layer	10 m (above the surface) for global and nest				
Radiation interactions	Radiation feedback (direct and semi-direct effect) described in Rieger et al. (2017) and in Gasch et al. (2017)				
Transport size bins	3-log normal modes for mass and number concentration				
Data assimilation	Yes, same observations as in operational ICON at DWD. Prognostic dust is included in first guess of DA cycle, but so far no assimilation of dust observations is done.				
Model original coordinates	Triangular grid				
Dust outputs parameters					
SCONC_DUST	Total dust mass concentration present in the first model layer above the topography.				
OD550_DUST	AOD is calculated per layer based on mass extinction coefficients for mass concentrations per mode, then summed to obtain total column AOD.				
Model output	File format: NetCDF Grid: Regular Lat-Lon of nest region. Linear interpolation to 1/16° x 1/16° Longitude: 1041 grid points Latitude: 1361 grid points Time: 6-hourly vector starting at 00 UTC Variables: SCONC_DUST, OD550_DUST				
References	Rieger et al. (2017), Gasch et al. (2017), Rieger et al. (2015), Zängl et al. (2015), Vogel et al. (2006)				



7.1.16. DREAM8-NMME-MSG

Model	DREAM-NMME-MSG				
Institution	IAASARS/NOA				
Meteorological driver	NMME				
Domain of simulation	0°-55°N , 40°W -80°E				
Meteorological initial fields	NCEP/GFS				
Emission scheme	Dust uplifting following Shao et al. (1993) and Nickovic et al., 2001. Includes the viscous sublayer approach between the surface and the lowest model layer (Janjic, 1994).				
Time step	72 s				
Horizontal resolution	1/5° x 1/5°				
Vertical resolution	28 hybrid layers				
Height first layer	50 m above sea level (approx.)				
Radiation interactions	No				
Transport size bins	8 bins (0.1-10µm)				
Data assimilation	MSG-SEVIRI at 12:00 UTC is used as a target field to which 6-hour nudging is done with Newtonian relaxation assimilation (Pejanovic et al, 2010; Solomos et al., 2017)				
Model original coordinates	Eta rotated grid.				
Dust outputs parameters					
SCONC_DUST	Total dust concentration present in the first model layer above the topography. Directly from the model output.				
OD550_DUST	The dust optical depth is related to column mass loading by: $AOD(\lambda) = \sum_{1}^{8} AOD_{k}(\lambda) = \sum_{1}^{8} \frac{3}{4\rho_{k}r_{k}}M_{k}Q_{ext}(\lambda)_{k}$ where for each size bin k: ρ k is the particle mass density, rk is the effective radius, Mk is the column mass loading and $Qext(\lambda)$ k is the extinction efficiency factor which was calculated using Mie scattering theory and we have considered the dust refraction indices from OPAC database. The Mie code used has been described in Mischenko et al. (2002).				
Model output References	NetCDF Regular Lat-Lon. Bi-linear interpolation. Longitude: 701 grid points (5°S-70°N vector in inc = 1/5°) Latitude: 370 grid points (50°W-90°E vector in inc = 1/5°) 3-hourly vector starting at 06UTC (with 72h dust forecast) with one day delay, depends on MSG-SEVIRI dust optical depth availability Variables: <i>SCONC_DUST, OD550_DUST</i> Nickovic et al. (2001), Pejanovic et al (2010), Solomos et al. (2017)				



7.1.17. ALADIN-Dust

Model	ALADIN-Dust			
Institution	ONM-Algeria (ALADIN consortium)			
Meteorological driver	ALADIN			
Domain of simulation	Regional			
Meteorological initial fields	ARPEGE			
Emission scheme	 The dust fluxes are calculated using the Dust Entrainment And Deposition (DEAD) model (Zender et al., 2003). The physical parameterizations in the DEAD scheme are based on the Marticorena and Bergametti (1995) scheme, in which dust is calculated as a function of saltation and sandblasting. DEAD was implemented in the ISBA scheme embedded in SURFEX (Grini et al., 2006). Recently this emission parameterization has been improved by Mokhtari et al. (2012) in order to better account for the soil aggregate distribution. 			
Time step	420s			
Horizontal resolution	25km x 25km			
Vertical resolution	70 σ-layers			
Height first layer	65m (approx.)			
Radiation interactions	Yes, the Fouquart and Morcrette radiation scheme (FMR;. Morcrette, 1989).			
Transport size bins	Log-normal (mode, mass and number) with 3 bins (0.078-5µm)			
Data assimilation	Νο			
Model original coordinates	ALADIN rotated grid			
Dust outputs parameters				
SCONC_DUST	Total dust concentration present in the first model level, directly from the model outputs.			
OD550_DUST	Mass column loading used with a Mie code to compute.			
Model output	File format: FA (Form ARPEGE), converted to NetCDF to meet SDSWAS technical requirements. Grid: Regular Lat-Lon Longitude: 342 grid points Latitude: 262 grid points Time: 3-hourly vector starting at 00UTC (with 72h dust forecast)			
References	Zender et al. (2003), Grini et al. (2006), Mokhtari et al. (2012), Mokhtari et al.			



7.1.18. WRF-NEMO-CAMx

Model	WRF-N.E.MOCAMx			
Institution	Aristotle University of Thessaloniki			
Meteorological driver	WRF			
Domain of simulation	37.5°W-78°E and 12-60°N			
Meteorological initial fields	NCEP (GFS)			
Emission scheme	Horizontal mass flux of Owen (1964), threshold friction velocity from Marticorena and Bergametti (1995), drag partition of Raupach et al. (1993) as in Darmenova et al. (2009) and sandblasting efficiency of Alfaro and Gomes (2001).			
Time step	Variable, depending on CFL criterion			
Horizontal resolution	18km			
Vertical resolution	18 layers up to 100hPa			
Height first layer	30 m above ground level (approx.)			
Radiation interactions	No			
Transport size bins	2 bins (0.036-2.5 μm and 2.5-10 μm in diameter)			
Data assimilation	No			
Model original coordinates	Lambert Conformal Conic			
Dust outputs parameters				
SCONC_DUST	Total dust mass concentration present in the first model layer.			
OD550_DUST	Calculated (offline) from dust load, applying the mass extinction efficiencies from IMPROVE algorithm (Malm and Hand, 2007, Pitchford et al., 2007).			
Model output	NetCDF Regular Lat-Lon. Distance-weigthed interpolation. Longitude: 525 grid points (25°W-60°E vector in inc = 0.162°) Latitude: 297 grid points (16°N-60°N vector in inc = 0.162°) 1-hourly vector starting at 00UTC (with 72h dust forecast) Variables: SCONC_DUST, OD550_DUST, LOAD_DUST			
References	Liora et al. (2015), Kontos et al. (2018)			



7.1.19. ZAMG-WRF-CHEM

Model	WRF-Chem			
Institution	ZAMG			
Meteorological driver	WRF, online-coupled model with IFS forecasts used as initial and boundary conditions (3-hourly resolution)			
Domain of simulation	Regional domain (0-65°N, 25°W-65°E)			
Meteorological initial fields	IFS forecasts			
Emission scheme	AFWA dust emission scheme for the GOCART aerosol model (LeGrand et al. 2019), tuning factors for friction velocity, soil moisture, preferential dust source term, and bulk vertical dust emission flux activated			
Time step	90 seconds			
Horizontal resolution	0.2° latitude x 0.2° longitude			
Vertical resolution	47 vertical eta levels, model top at 50 hPa			
Height first layer	~25 m above the surface			
Radiation interactions	Not activated			
Transport size bins	5 dust bins, log-normal size distribution; effective radii of 0.73 μm, 1.4 μm, 2.4 μm, 4.5 μm, and 8 μm			
Data assimilation	Currently not activated (assimilation of MODIS AOD and ground-based PM2.5 measurements possible)			
Model original coordinates	Regular latitude-longitude grid			
Dust output parameters				
SCONC_DUST	Total dust mass concentration at the first model layer above the topography.			
AOD550_DUST	AOD is calculated per layer based on mass extinction coefficients for mass concentrations per mode, then summed to obtain total column AOD.			
Model output for WMO SDS-WAS	File format: netCDF			
	Grid: regular latitude-longitude			
	Longitude: 450 grid points			
	Latitude: 325 grid points			
	Time: 72 time steps, 3-hourly vector starting at 00 UTC			
	Variables: SCONC_DUST, OD550_DUST			
References	Grell et al. (2005); LeGrand et al. (2019)			



7.1.20. MOCAGE

Model	MOCAGE			
Institution	METEO FRANCE			
Meteorological driver	ARPEGE (METEO FRANCE NWP Model)			
Domain of simulation	Global			
Meteorological initial fields	ARPEGE			
Emission scheme	Marticorena and Bergametti (1995)			
Time step	Advection time step : 1h / Chemical time step : 15min			
Horizontal resolution	1°			
Vertical resolution	47 levels			
Height first layer	~20m			
Radiation interactions	N/A			
Transport size bins	6 bins (2.0E-3, 0.01, 0.1, 1, 2.5, 10, 50 microns)			
Data assimilation	Hourly 3D-VAR assimilating AOD 550nm from MODIS (on Terra/Aqua satellites) and VIIRS (on NPP and NOAA20 satellites) instruments			
Model original coordinates	1° x 1° regular grid			
Dust output parameters				
SCONC_DUST	Total dust mass concentration present in the first model layer			
AOD550_DUST	Dust AOD at 550nm			
Model output for WMO SDS-WAS	File format: NetCDF			
	Grid: Regular Lat-Lon Region : Lon : -25°E-65°E ; Lat : 0°N:65°NResolution 1°			
	Time: Instantaneous values every 3hours ; validity time up to +72h, one production per day : basetime D-day 00hutc			
	Variables: SCONC_DUST, OD550_DUST			
References	Martet et al (2009), Sic et al (2015), Guth et al (2016), Sic et al (2016), El Amraoui et al (2022)			



7.1.21. Appendix B: AERONET stations used in the evaluation

Site name	Longitude	Latitude	Country	Region
Avignon	4.88°E	43.93°N	France	Mediterranean
Banizoumbou	2.66°E	13.54°N	Niger	Sahel/Sahara
Barcelona	2.12°E	41.39°N	Spain	Mediterranean
Cabo_da_Roca	9.50°W	38.78°N	Portugal	Mediterranean
Caceres	6.34°W	39.48°N	Spain	Mediterranean
Cairo_EMA_2	31.29°E	30.08°N	Egypt	Mediterranean
Capo_Verde	22.93°W	16.73°N	Capo Verde	Sahel/Sahara
CUT-TEPAK	33.04°E	34.67°N	Cyprus	Mediterranean
Dakar	16.96°W	14.39°N	Sénégal	Sahel/Sahara
Eilat	34.92°E	29.50°N	Israel	Mediterranean
Ersa	9.36°E	43.00°N	France	Mediterranean
ETNA	15.02°E	37.61°N	Italy	Mediterranean
Evora	7.91°W	38.57°N	Portugal	Mediterranean
FORTH_CRETE	25.28°E	35.33°N	Greece	Mediterranean
Granada	3.60°W	37.16°N	Spain	Mediterranean
IASBS	48.51°E	36.70°N	Iran	Middle East
IER_Cinzana	5.93°W	13.28°N	Mali	Sahel/Sahara
llorin	4.34 °E	8.32°N	Nigeria	Sahel/Sahara
IMAA_Potenza	15.72°E	40.60°N	Italy	Mediterranean
IMS-METU-ERDEMLI	34.26°E	36.56°N	Turkey	Mediterranean
KAUST_Campus	39.10 °E	22.30 °N	Saudi Arabia	Middle East
Kuwait University	47.97 °E	29.33 °N	Kuwait	Middle East
Lampedusa	12.63°E	35.52°N	Italy	Mediterranean
Lecce_University	18.11°E	40.33°N	Italy	Mediterranean
Oujda	1.90°W	34.65°N	Morocco	Mediterranean
Ouarzazate	6.91°W	30.93°N	Morocco	Sahel/Sahara
Palma_de_Mallorca	2.62°E	39.55°N	Spain	Mediterranean
Porquerolles	6.16°E	43.00°N	France	Mediterranean
Rome_Tor_Vergata	12.65°E	41.84°N	Italy	Mediterranean
Saada	8.16°W	31.62°N	Morocco	Sahel/Sahara



Santa_Cruz_Tenerife16.25°W28.47°NSpainSahel/Sahara
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