



Models evaluation



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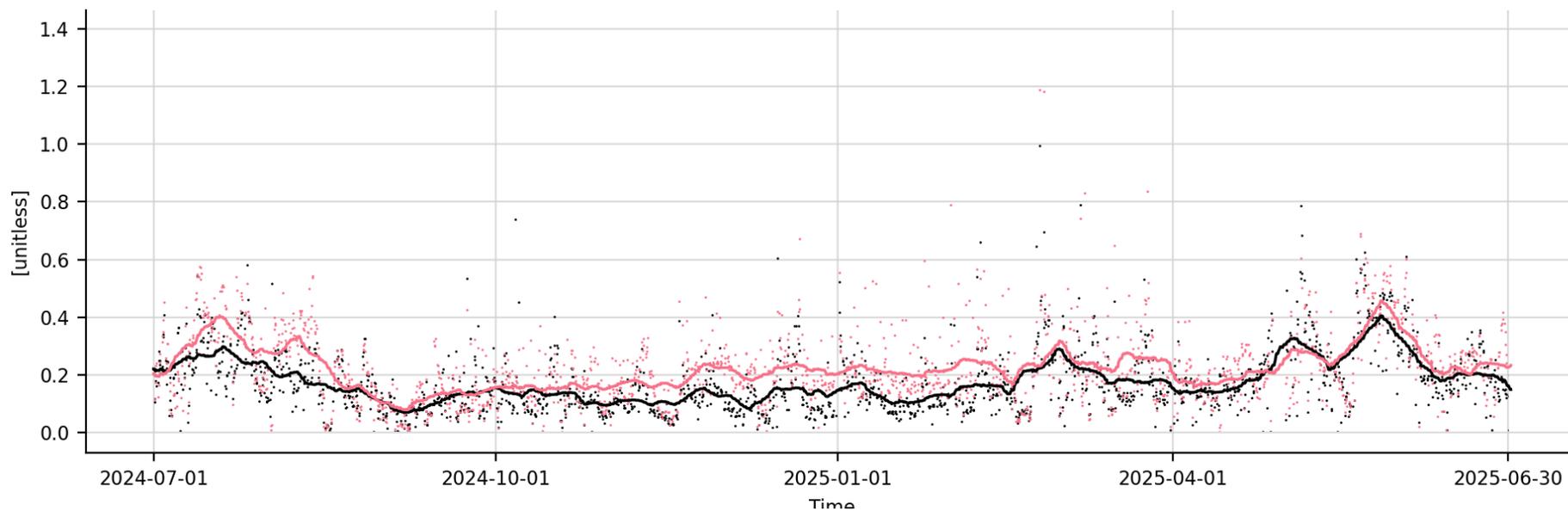
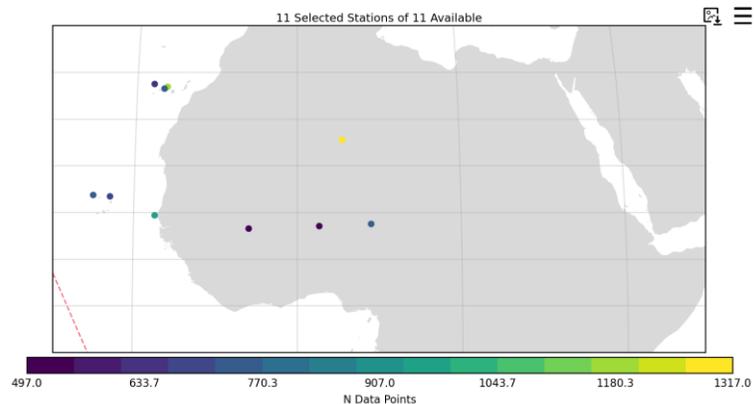
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- Routine evaluation of dust forecasts
- Non-routine evaluation
- Evaluation of dust reanalyses
- Final remarks



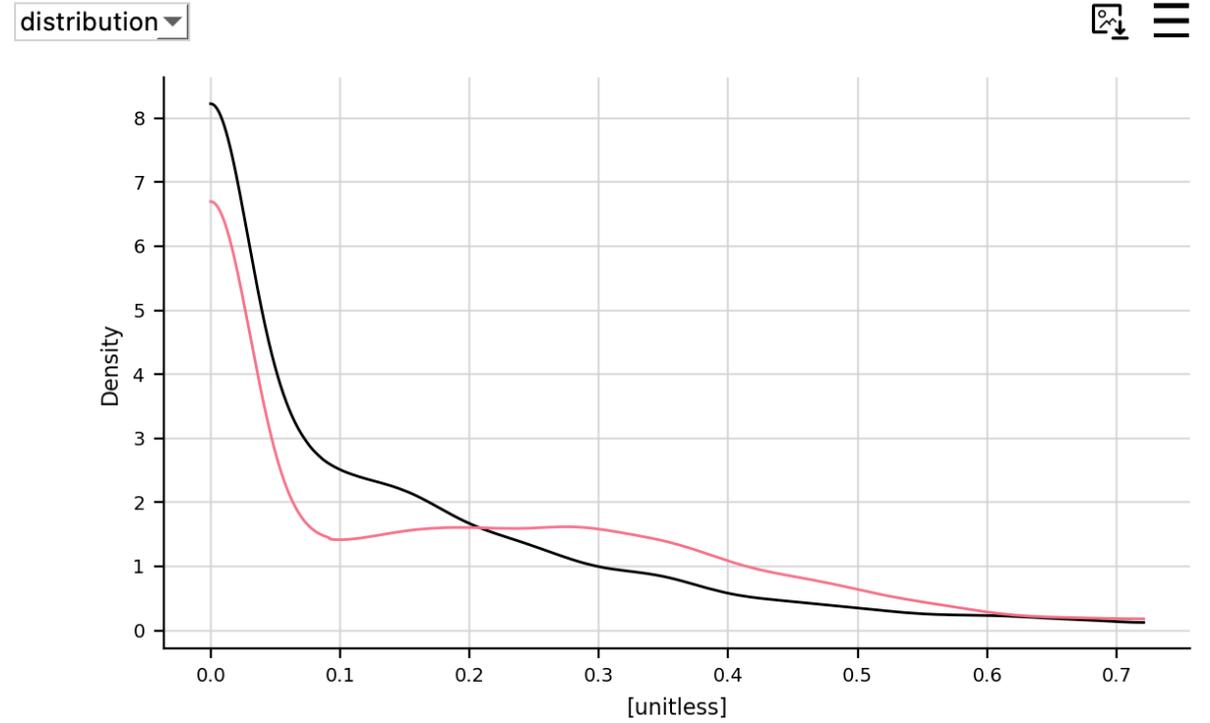
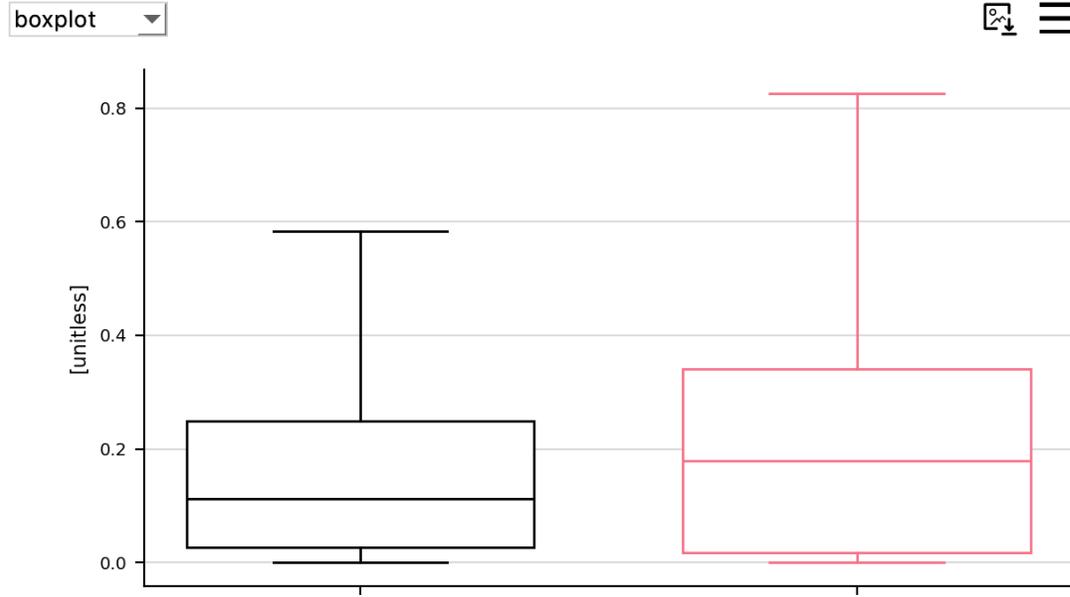
Evaluation statistics



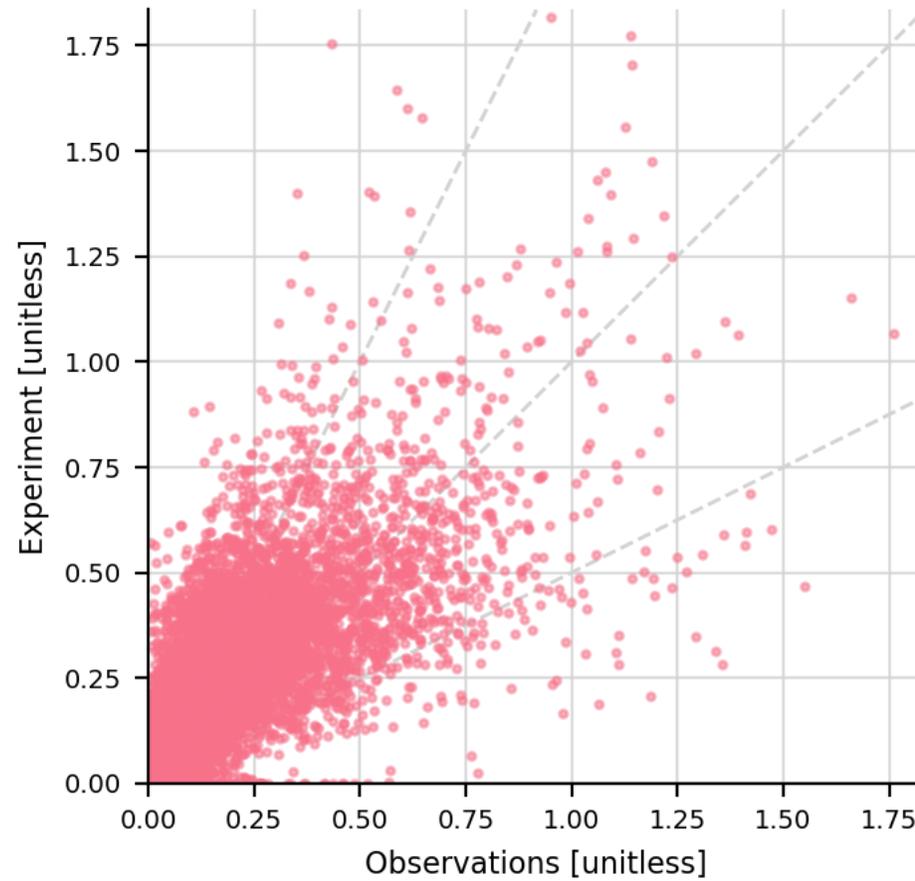
Eyeball verification



Statistical distribution



Scatter plots





Basic error statistics

Mean error - Mean Error = $\frac{1}{N} \sum_{i=1}^N (F_i - O_i)$

Answers the question: What is the average forecast error?

Range: $-\infty$ to ∞ . **Perfect score:** 0.

Correlation coefficient - $r = \frac{\sum (F - \bar{F})(O - \bar{O})}{\sqrt{\sum (F - \bar{F})^2} \sqrt{\sum (O - \bar{O})^2}}$

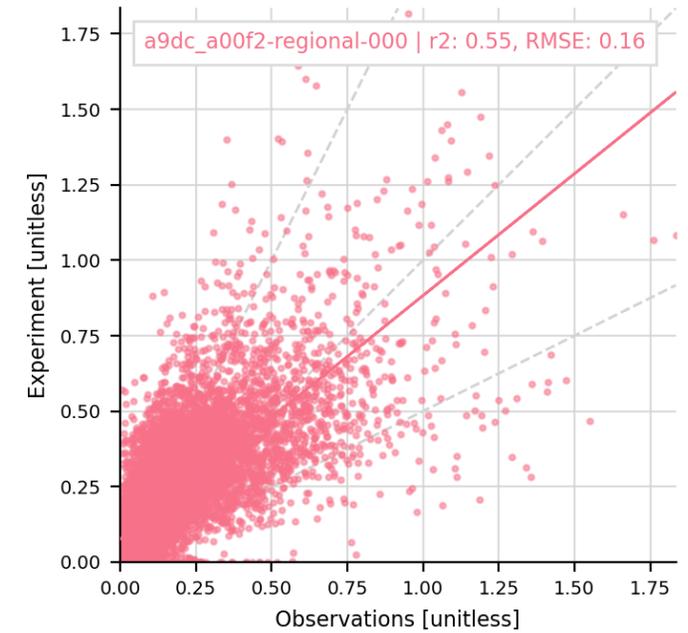
Addresses the question: How well did the forecast values correspond to the observed values?

Range: -1 to 1. **Perfect score:** 1.

Root mean square error - RMSE = $\sqrt{\frac{1}{N} \sum_{i=1}^N (F_i - O_i)^2}$

Answers the question: What is the average magnitude of the forecast errors?

Range: 0 to ∞ . **Perfect score:** 0.





Normalized error statistics

- **NMB (Normalized Mean Bias):** NMB captures the average deviations between two datasets. On this website it is reported in units of percent. Values near 0 are the best, negative values indicate underestimation and positive values indicate overestimation.

$$\text{NMB} = \frac{\sum_{i=1}^n (m_i - o_i)}{\sum_{i=1}^n o_i}$$

- **MNMB (Modified Normalized Mean Bias):** MNMB is a normalization based on the mean of the observed and forecast value. It ranges between -2 and 2 and when multiplied by 100 %, it can be interpreted as a percentage bias.

$$\text{MNMB} = \frac{2}{n} \sum_{i=1}^n \left(\frac{m_i - o_i}{m_i + o_i} \right)$$

Normalizing the RMSE facilitates the comparison between datasets or models with different scales.

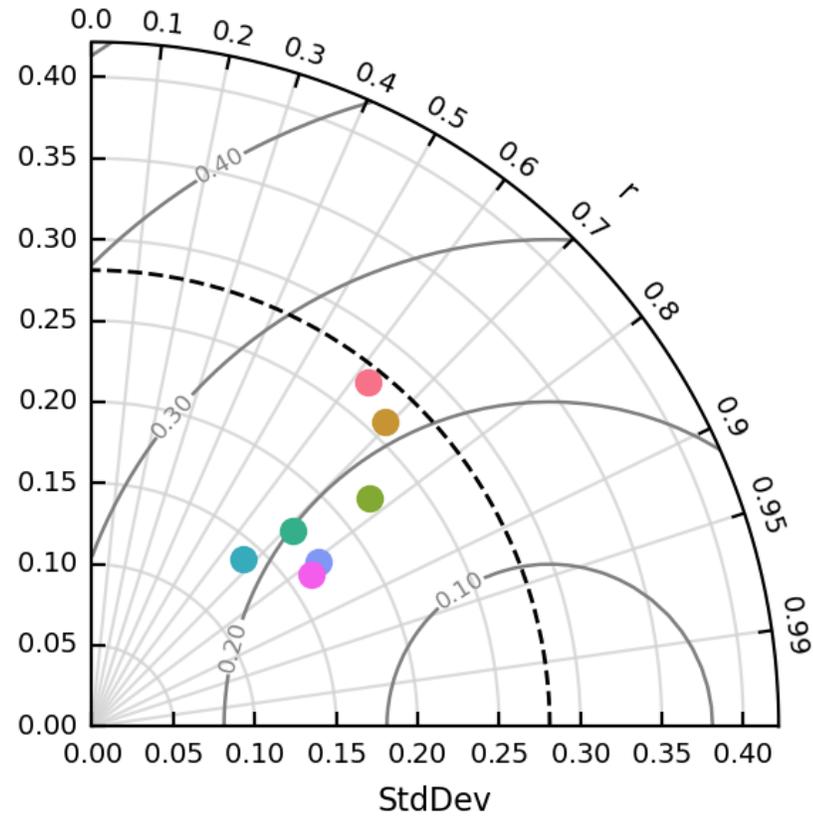
$$\text{NRMSE} = \frac{\sqrt{\frac{1}{n} \sum_{i=1}^n (o_i - m_i)^2}}{\bar{o}}$$

- **FGE (Fractional Gross Error):** FGE is a measure of model error, ranging between 0 and 2 and behaves symmetrically with respect to under- and overestimation, without over emphasizing outliers.

$$\text{FGE} = \frac{2}{n} \sum_{i=1}^n \left| \frac{m_i - o_i}{m_i + o_i} \right|$$

	RMSE	r	NRMSE	MFB	MFE	SLOPE	MB	NMB
a9dc_a00f2-regional-000	0.16	0.74	88.98	-4.95	84.14	0.81	0.04	24.00

Taylor diagrams

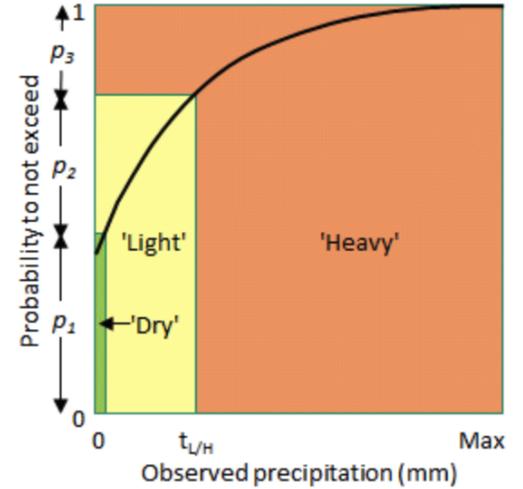


Stable equitable error in probability space (SEEPS) - $SEEPS = \frac{1}{N} \sum_{i=1}^3 \sum_{j=1}^3 n(F_i, O_j) s_{ij}$

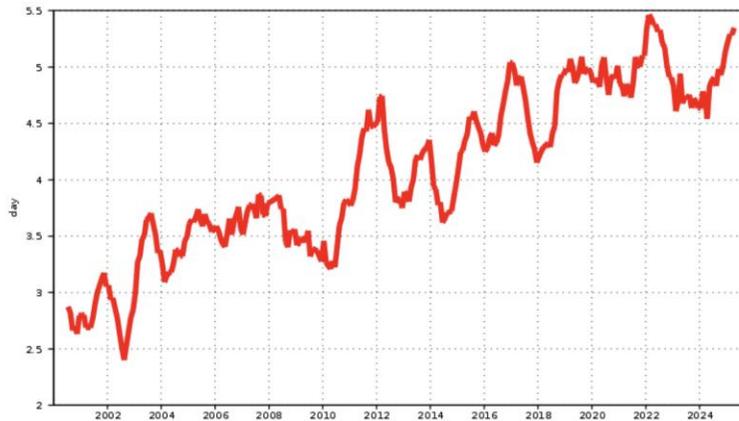
where $n(F_i, O_j)$ is the joint occurrence of forecast category i and observed category j in the 3x3 contingency table, and the scoring matrix is given by

$$s = \begin{bmatrix} 1 & 1 - \frac{1}{2(p_2 + p_3)} & 1 - \frac{1}{2p_3} - \frac{1}{2(p_2 + p_3)} \\ 1 - \frac{1}{2p_1} & 1 & 1 - \frac{1}{2p_3} \\ 1 - \frac{1}{2p_1} - \frac{1}{2(p_1 + p_2)} & 1 - \frac{1}{2(p_1 + p_2)} & 1 \end{bmatrix}$$

Like LEPS, SEEPS measures the error in probability space as opposed to measurement space. It was developed to assess rainfall forecasts, where $(1-p_1)$ is the climatological probability of rain (i.e., accumulation exceeding 0.2 mm, following WMO guidelines), and $p_2=2p_3$ divides the climatological cumulative rainfall distribution into "light" (lower 2/3 of rain rates ≥ 0.2 mm) and "heavy" (upper 1/3 of rain rates ≥ 0.2 mm). Refer to diagram at right, where $t_{L/H}$ is the threshold delineating "light" and "heavy" rain.



Stable Equitable Error in Probability Space | total precipitation Europe
score 12m MA reaches 0.450



Categorical verification

YES/NO forecasts (dichotomous)

Contingency Table

	Observed		Total
	yes	no	
Forecast yes	hits	false alarms	forecast yes
Forecast no	misses	correct negatives	forecast no
Total	observed yes	observed no	total

hit - event forecast to occur, and did occur

miss - event forecast not to occur, but did occur

false alarm - event forecast to occur, but did not occur

correct negative - event forecast not to occur, and did not occur



Categorical verification

Accuracy (fraction correct) - $Accuracy = \frac{hits + correct\ negatives}{total}$

Answers the question: Overall, what fraction of the forecasts were correct?

Range: 0 to 1. **Perfect score:** 1.

Bias score (frequency bias) - $BIAS = \frac{hits + false\ alarms}{hits + misses}$

Answers the question: How did the forecast frequency of "yes" events compare to the observed frequency of "yes" events?

Range: 0 to ∞ . **Perfect score:** 1.

Probability of detection (hit rate) - $POD = \frac{hits}{hits + misses}$ (also denoted H)

Answers the question: What fraction of the observed "yes" events were correctly forecast?

Range: 0 to 1. **Perfect score:** 1.

False alarm ratio - $FAR = \frac{false\ alarms}{hits + false\ alarms}$

Answers the question: What fraction of the predicted "yes" events actually did not occur (i.e., were false alarms)?

Range: 0 to 1. **Perfect score:** 0.

Probability of false detection (false alarm rate) -

$POFD = \frac{false\ alarms}{correct\ negatives + false\ alarms}$ (also denoted F)

Answers the question: What fraction of the observed "no" events were incorrectly forecast as "yes"?

Range: 0 to 1. **Perfect score:** 0.



GERRITY score

Gerrity score -
$$GS = \frac{1}{N} \sum_{i=1}^K \sum_{j=1}^K n(F_i, O_j) s_{ij}$$

where s_{ij} are elements of a scoring matrix given by

$$s_{ii} = \frac{1}{K-1} \left(\sum_{r=1}^{i-1} a_r^{-1} + \sum_{r=i}^{K-1} a_r \right) \quad (i = j, \text{ diagonal}), \quad s_{ij} = s_{ji} = \frac{1}{K-1} \left(\sum_{r=1}^{i-1} a_r^{-1} - (j-i) + \sum_{r=i}^{K-1} a_r \right) \quad (i \neq j, \text{ off-diagonal}), \quad \text{and} \quad a_i = \left(1 - \sum_{r=1}^i p_r \right) / \sum_{r=1}^i p_r$$

with the sample probabilities (observed frequencies) given by $p_i = N(O_i) / N$.

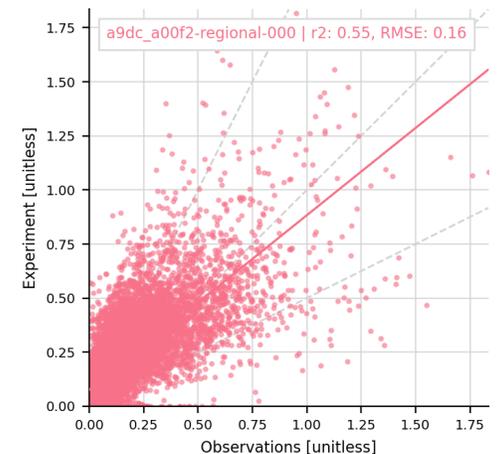
Answers the question: What was the accuracy of the forecast in predicting the correct category, relative to that of random chance?

Range: -1 to 1, 0 indicates no skill. **Perfect score:** 1

Categories:

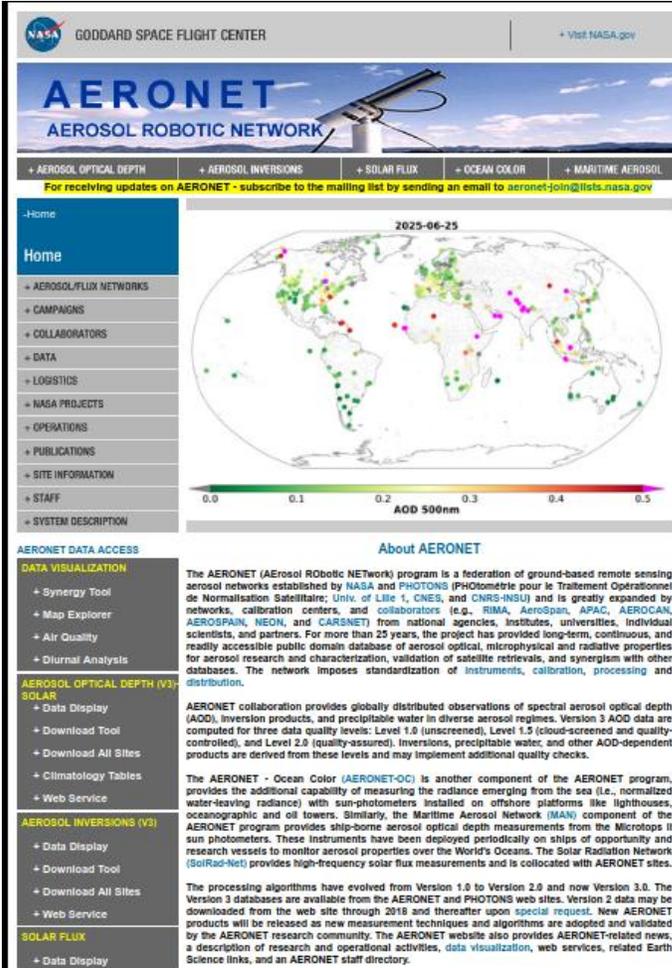
[0, 0.1, 0.4, 0.8]

$$GS = \begin{bmatrix} 0.42, & -0.28, & -0.66, & -1.00 \\ -0.28, & 0.34, & -0.03, & -0.37 \\ -0.66, & -0.03, & 2.86, & 2.52 \\ -1.00, & -0.37, & 2.52, & 23.3 \end{bmatrix} \bullet \begin{bmatrix} 3272, & 1067, & 61, & 0 \\ 282, & 2753, & 814, & 34 \\ 11, & 331, & 519, & 69 \\ 0, & 18, & 82, & 50 \end{bmatrix} = 0.52$$



Routine dust forecasts evaluation





The screenshot shows the NASA Goddard Space Flight Center AERONET website. The main navigation bar includes links for Aerosol Optical Depth, Aerosol Inversions, Solar Flux, Ocean Color, and Maritime Aerosol. A central map displays global AOD 500nm data for June 25, 2025, with a color scale from 0.0 to 0.5. The left sidebar provides navigation for home, networks, campaigns, collaborators, data, logistics, NASA projects, operations, publications, site information, staff, and system description. The main content area features an 'About AERONET' section with detailed text on the program's history and goals, and a 'Data Visualization' section with links to various data products like Synergy Tool, Map Explorer, Air Quality, and Diurnal Analysis.

- Direct Sun :
 - AOD
 - Angstrom Exponent
 - SDA: coarse and fine

- Inversions:
 - SSA
 - Complex refractive index (real and imaginary)
 - Absorption AOD
 - Asymmetry parameter
 - Phase function
 - Size distribution

AEROSOL OPTICAL DEPTH (V3)- SOLAR

- + Data Display
- + Download Tool
- + Download All Sites
- + Climatology Tables
- + Web Service

AEROSOL INVERSIONS (V3)

- + Data Display
- + Download Tool
- + Download All Sites
- + Web Service

Colocation/representativity errors

temporal

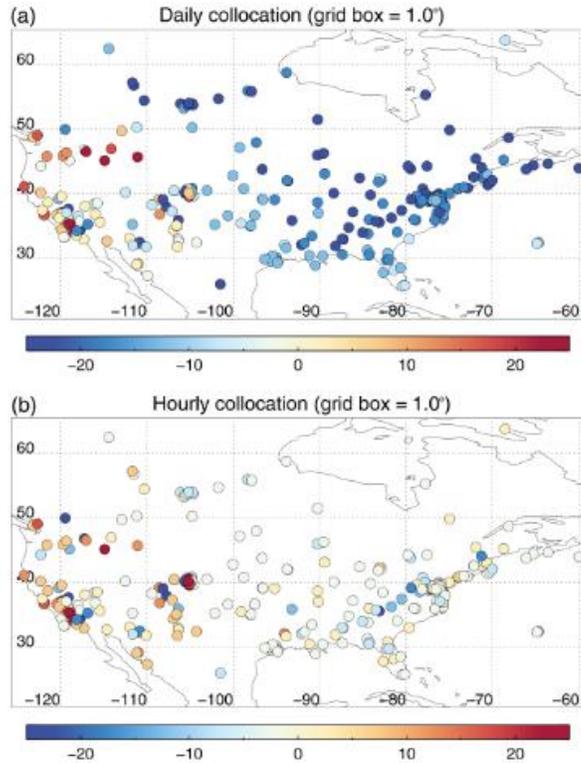


Figure 5. Yearly representation errors (%) for AOT from AERONET direct sun L2.0 in North America, for two different collocation protocols (a daily; b hourly) and a model grid-box size of 1°.

spatial err.

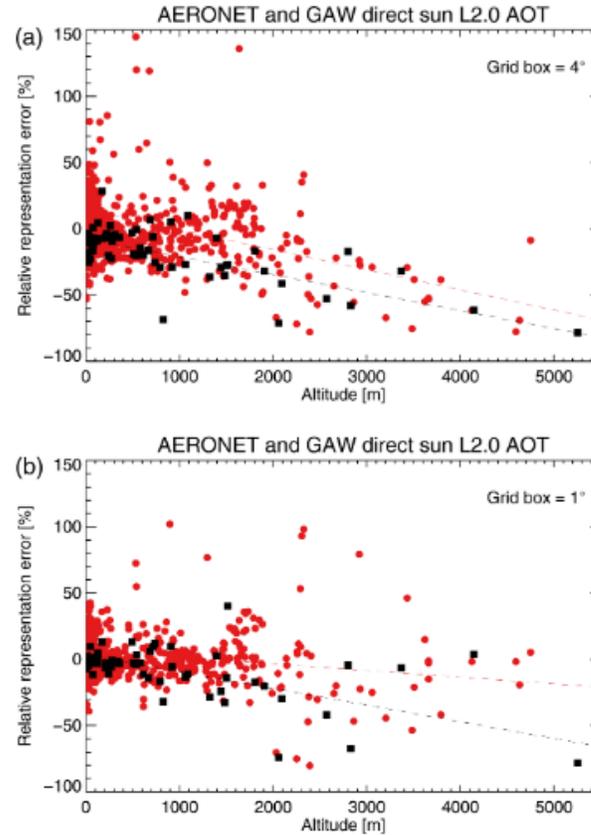


Figure 8. Yearly representation errors for AOT from AERONET direct sun L2.0 (red circles) and GAW (black squares) as a function of site altitude, for a model grid-box size of either 4° or 1°, using hourly collocation.

temporal + spatial

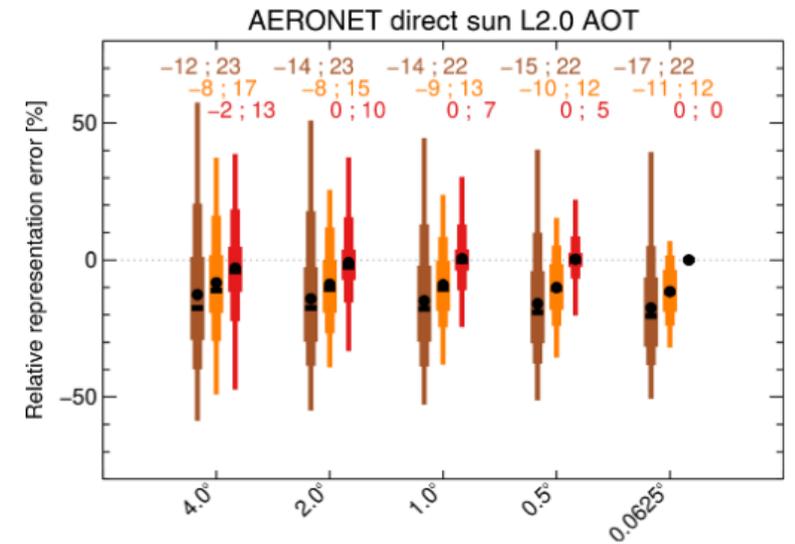
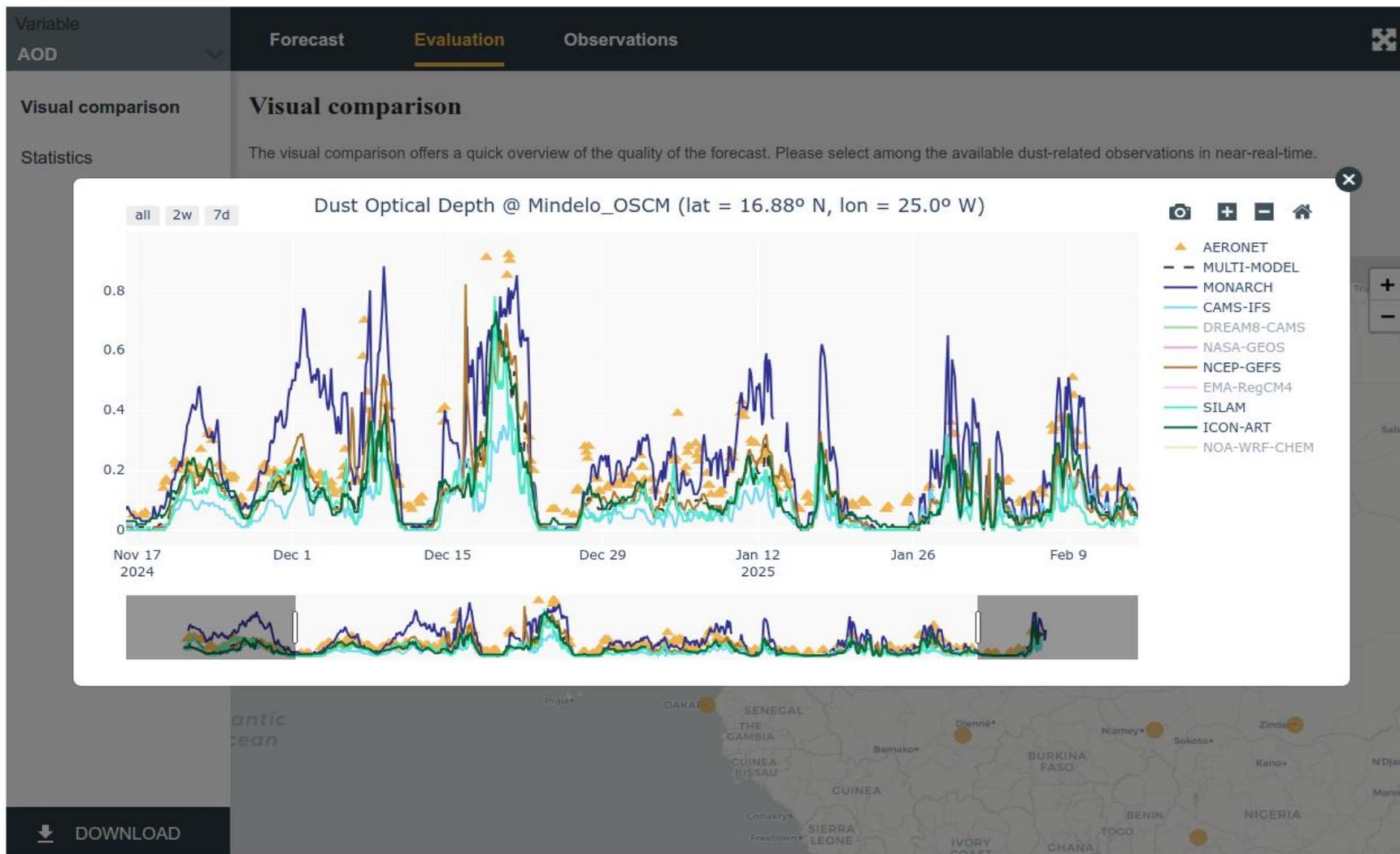


Figure 4. Yearly representation errors for AOT from AERONET direct sun L2.0 for different model grid-box sizes. The colours indicate different collocation protocols: yearly (brown), daily (orange) and hourly (red). Numbers on top are the means of the errors and means of the signless errors.

Schutgens (2020)





Dust identification

AERONET measures all-aerosol optical depth, but dust predominant scenes can be identified :

- 1- Selection of sites
- 2- Optically coarse: low Angstrom exponent
 - $AE < 0.6$: coarse particles
 - $AE < 0.3$: coarser particle (capturing dust events)
 - should be compared with AOD
- 3- Use the Spectral Deconvolution Algorithm (SDA) coarse AOD:
 - should be compared with coarse AOD
 - other coarse aerosols can be present (eg. sea salt)
- 4- Use almucantar inversions (Obiso et al 2024)
 - constraints on the spectral SSA, fine mode fraction, refractive index
 - few points-> climate Applications

Wavelengths:

Almucantar (standard) :
440, 675, 870, and 1020 nm

AOD at 550 can be interpolated using angstrom exponent

Others: 340, 380, 500, and 1640 nm,

Products (QA)

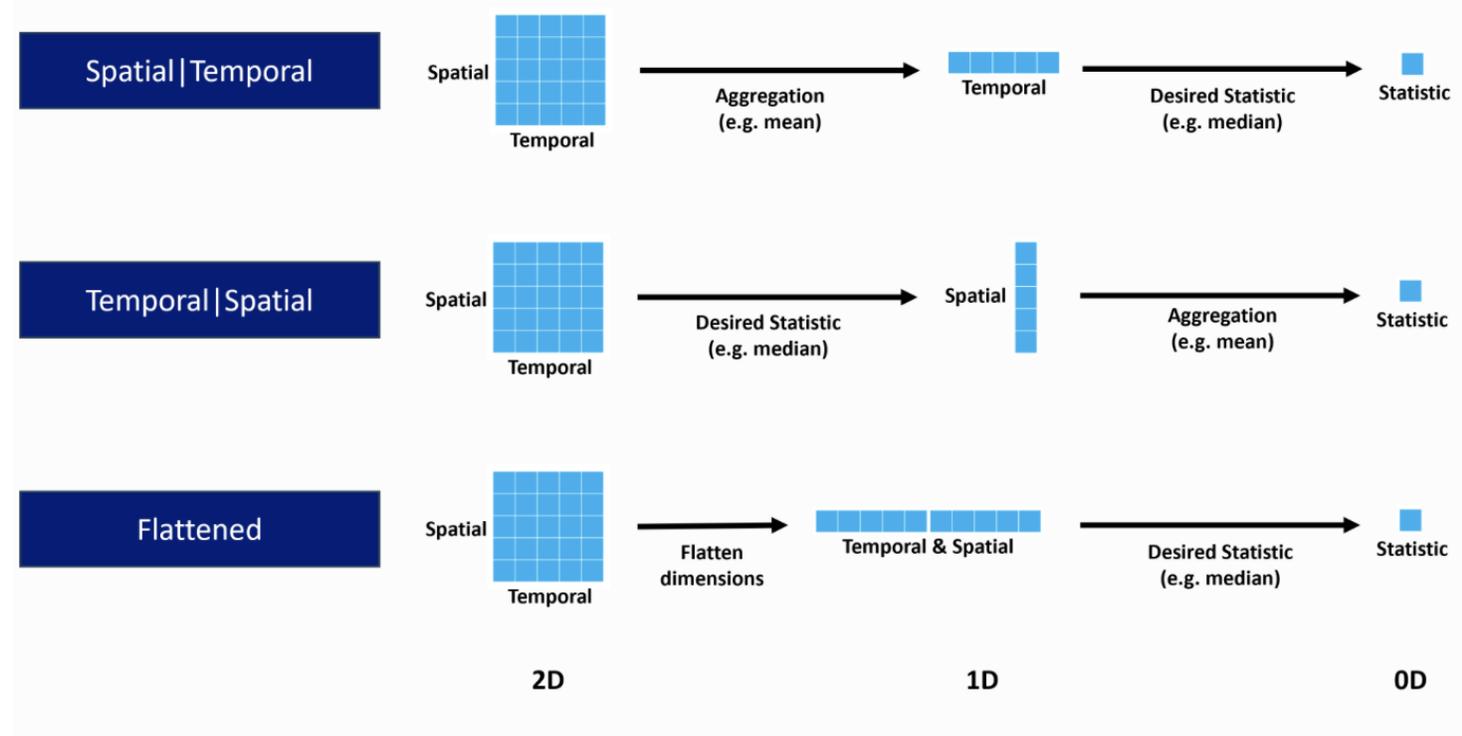
Level 1: Raw data

Level 1.5: cloud-screened

Level 2: calibrated (pre and post)

Preliminary steps

- Compute modeled optical depth $H(x) = \sum_i \sum_a \sum_d m_d^a(z_i) C_{ext}^{a,d}(\lambda)$
- Colocate in time (linear interpolation) and space (bilinear interpolation) with measurements
- (Aggregate data points over a region)
- Compute evaluation statistics
- Remember that we never observe only dust!





BDRC – Model comparison

Statistics ⓘ

Network: Aeronet v3 lev1.5 | Models: 6 models | Statistics: 4 statistics | Timescale: Annual | Selection: 2024 | [VIEW MAP](#)

MBE						
Station	MULTI-MODEL	Monarch	Cams	Nasa-Geos	Metoffice	Ncep-Gefs
Europe	-0.12	-0.12	-0.12	-0.10	-0.09	-0.12
Mediterranean	-0.10	-0.09	-0.10	-0.08	-0.04	-0.11
MiddleEast	-0.13	-0.12	-0.13	-0.12	0.03	-0.17
NAfrica	-0.12	-0.06	-0.15	-0.08	-0.04	-0.13
Total	-0.11	-0.10	-0.12	-0.09	-0.05	-0.12
r						
Station	MULTI-MODEL	Monarch	Cams	Nasa-Geos	Metoffice	Ncep-Gefs
Europe	0.47	0.43	0.47	0.49	0.55	0.40
Mediterranean	0.80	0.68	0.76	0.78	0.80	0.71
MiddleEast	0.73	0.59	0.62	0.71	0.66	0.61
NAfrica	0.77	0.61	0.71	0.78	0.76	0.73
Total	0.77	0.66	0.72	0.78	0.74	0.72
RMSE						
Station	MULTI-MODEL	Monarch	Cams	Nasa-Geos	Metoffice	Ncep-Gefs
Europe	0.15	0.15	0.15	0.13	0.12	0.15
Mediterranean	0.14	0.14	0.14	0.12	0.10	0.15
MiddleEast	0.17	0.18	0.19	0.17	0.15	0.22
NAfrica	0.26	0.27	0.28	0.22	0.22	0.26
Total	0.17	0.18	0.18	0.15	0.14	0.18
FGE						
Station	MULTI-MODEL	Monarch	Cams	Nasa-Geos	Metoffice	Ncep-Gefs
Europe	1.71	1.77	1.78	1.26	1.07	1.76
Mediterranean	1.40	1.46	1.50	1.01	0.64	1.54
MiddleEast	0.90	0.93	1.01	0.81	0.45	1.24
NAfrica	0.79	0.90	0.93	0.58	0.55	0.88
Total	1.35	1.41	1.44	1.00	0.74	1.47



BDRC – MONARCH forecasts upgrades

Resources

Filter by: PUBLICATIONS PAST EVENTS WEBINARS **TECHNICAL REPORTS** DISSEMINATION

Upgrading the MONARCH operational forecast (v2.7.2)

E. Karnezis et al., 2024

[PREVIEW](#)

[DOWNLOAD](#)

Upgrading the MONARCH operational forecast (v2.1.0)

E. Karnezis et al., 2023

[PREVIEW](#)

[DOWNLOAD](#)

Dust Regional Reanalysis Update: Extension To 2017

E. Karnezis et al., 2023

[PREVIEW](#)

[DOWNLOAD](#)

Barcelona Dust Forecast Center. Activity Report 2022

Werner et al., 2022

[PREVIEW](#)

[DOWNLOAD](#)

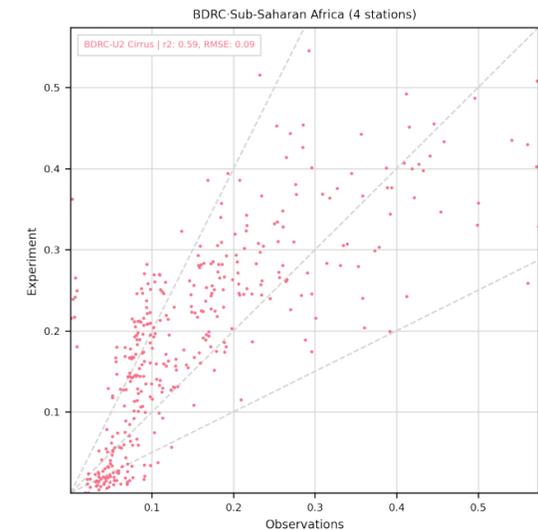
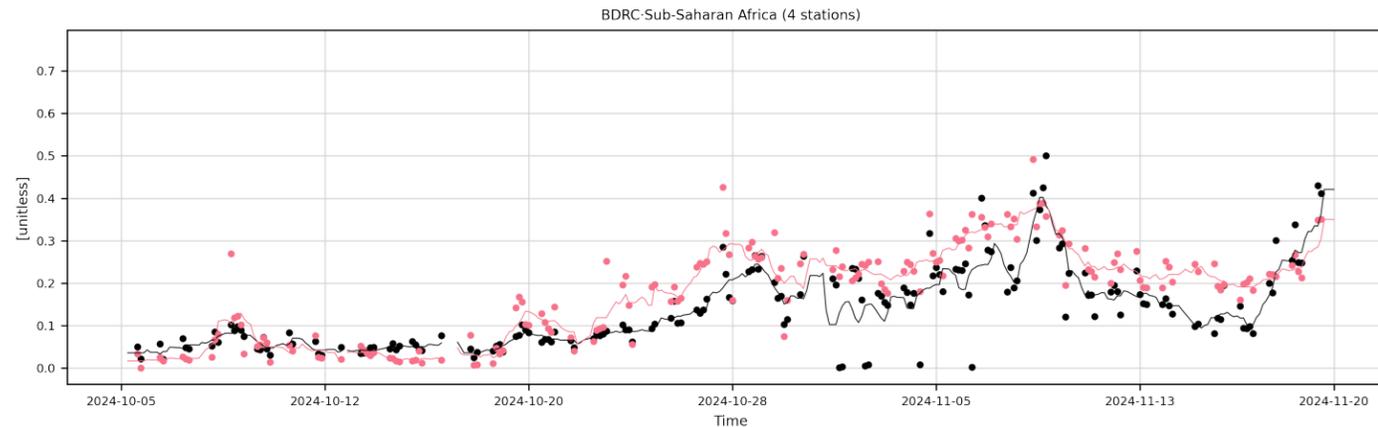
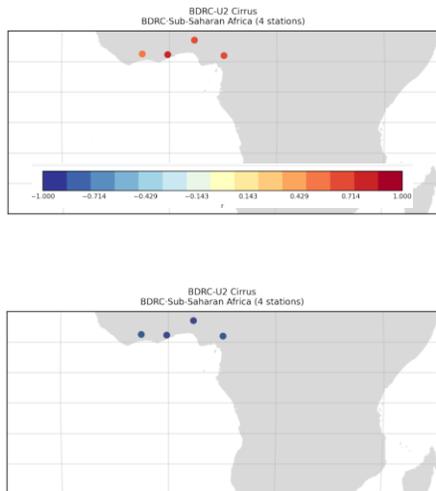


AERONET SDA coarse AOD at 500nm compared to modeled coarse Dust Optical Depth (DODcoarse) at 550nm

		Mean	RMSE	r	MFB	MFE
Selected_BDRC_2021	Operational	-0.02	0.11	0.74	-89.37	112.67
	Upgrade	0.01	0.13	0.74	-70.66	106.95
Mediterranean	Operational	-0.03	0.08	0.80	-110.14	122.28
	Upgrade	-0.01	0.09	0.81	-91.84	114.13
NorthAfrica	Operational	-0.00	0.20	0.61	-26.62	89.60
	Upgrade	0.05	0.22	0.63	-5.47	91.06
MiddleEast	Operational	-0.02	0.11	0.70	-36.67	62.79
	Upgrade	0.01	0.12	0.71	-13.29	58.66
SouthernEurope	Operational	-0.02	0.05	0.81	-142.71	149.53
	Upgrade	-0.02	0.06	0.82	-128.65	140.89

BDRC – MONARCH NRT evaluation

- The website evaluation tool provide either very granular and interactive evaluation or automatic but monthly-yearly statistics
- Established a new bi-weekly automatic reporting with Providentia to regularly monitor MONARCH dust forecasts (internal usage)



Experiments

IFS

IFS-EAC4

IFS-EGG4

IFS-ESUITE-Cy48R1

IFS: Evaluation of CAMS forecast models

Both OSUITE and CNTRL are evaluated against multiple observation records including AOD from AERONET and PM, O3 and NO2 measurements.

[+ Show More](#)

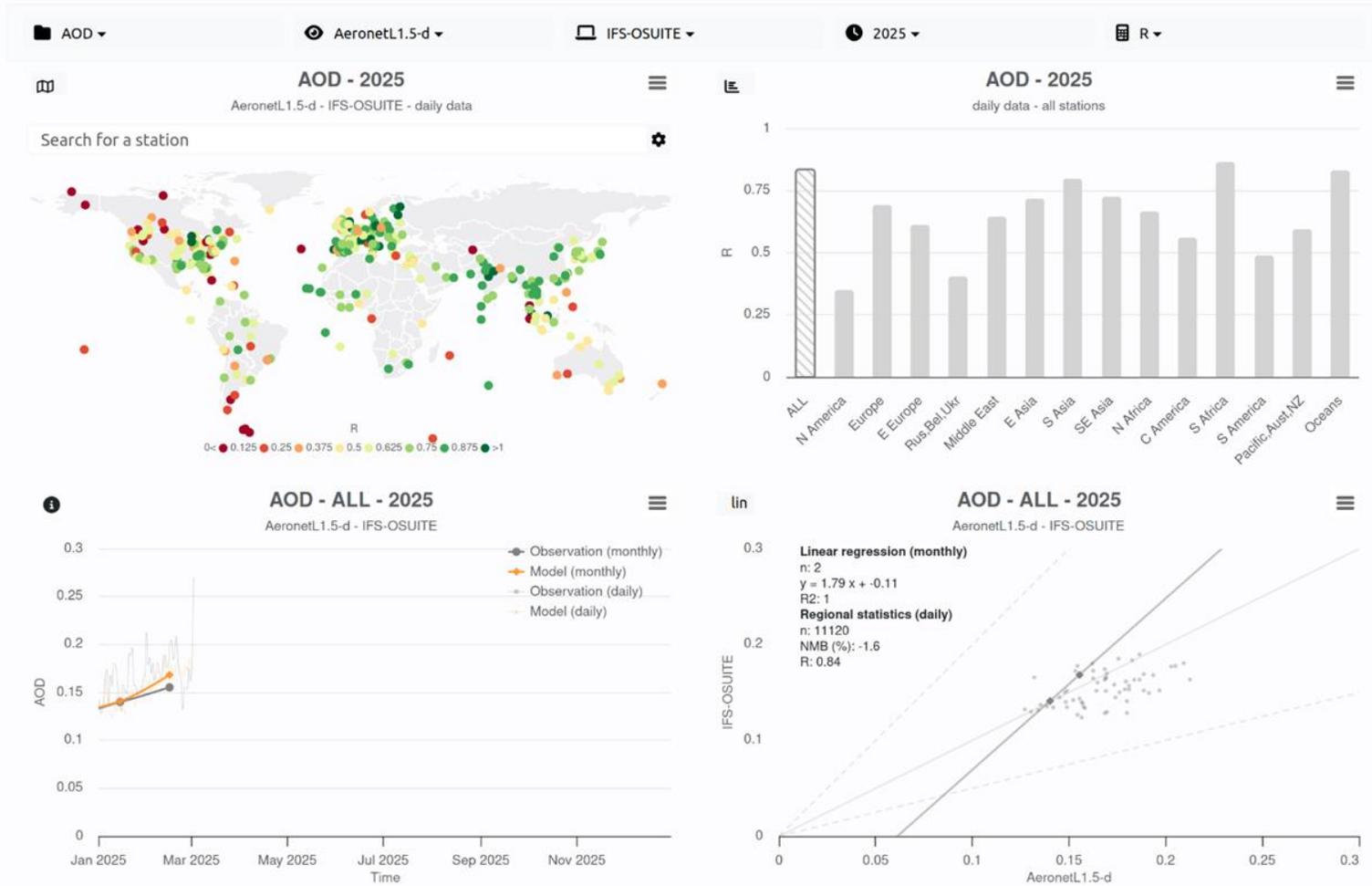
[CAMS user support](#)

2025-05-07

0.30.dev0

Data Policy

AeroVal makes use of several observation networks. Before using the data, please check the specific network data policies on the [Information](#) page.



<https://global-eqc-server.atmosphere.copernicus.eu>

Experiments

IFS

IFS-EAC4

IFS-EGG4

IFS-ESUITE-Cy48R1

IFS: Evaluation of CAMS forecast models

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[Show More](#)

[CAMS user support](#)

2025-05-07

0.30.dev0

AODc - Middle East

AeronetSDAV1.5-d



Data Policy

AeroVal makes use of several observation networks. Before using the data, please check the specific network data policies on the [Information](#) page.

Heatmap Time Series Taylor Diagram

AODc

AeronetSDAV1.5-d

Middle East

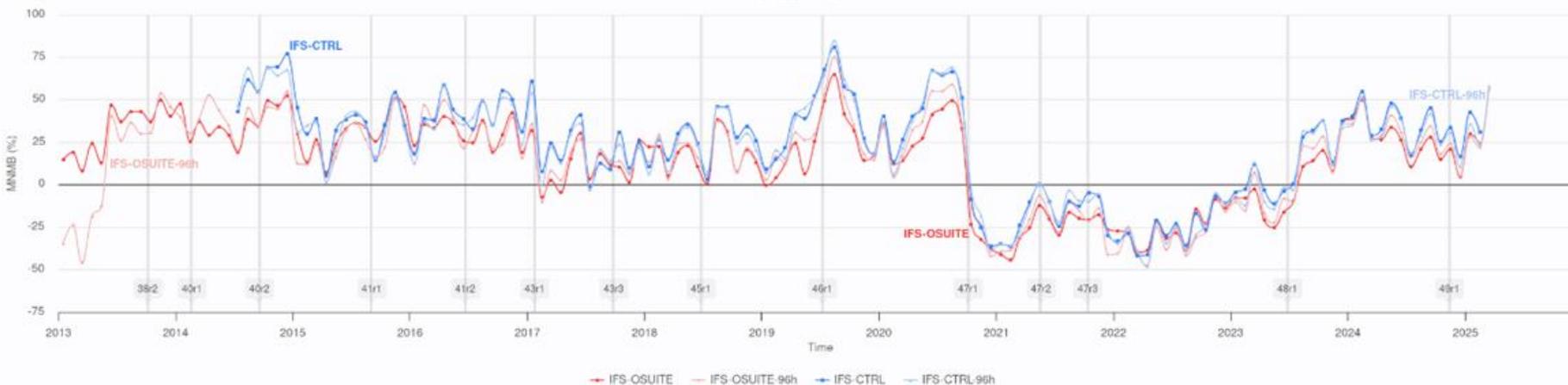
2013-2025

MNMB

Annotations

AODc - Middle East - 2013-2025

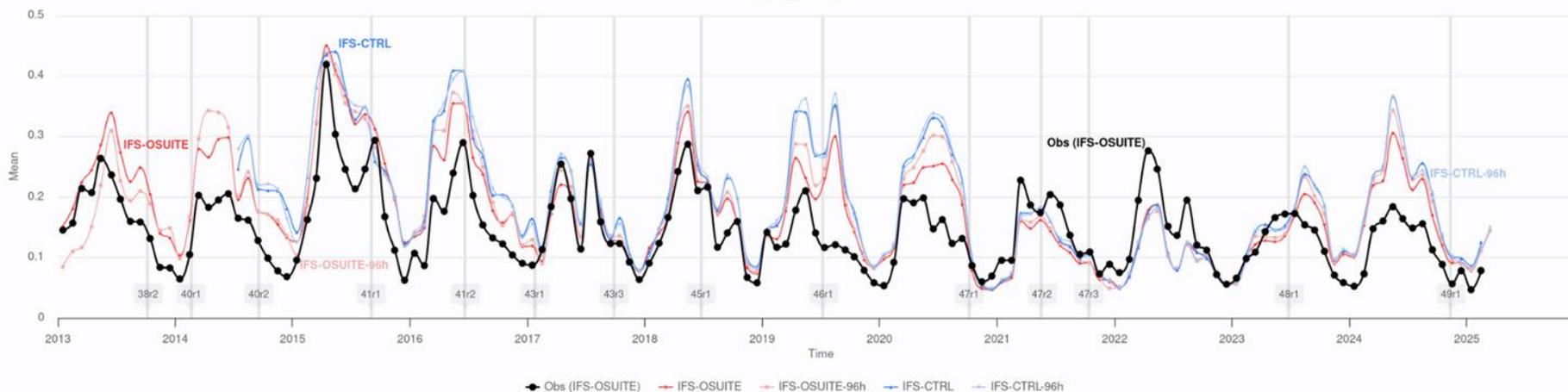
AeronetSDAV1.5-d



Annotations

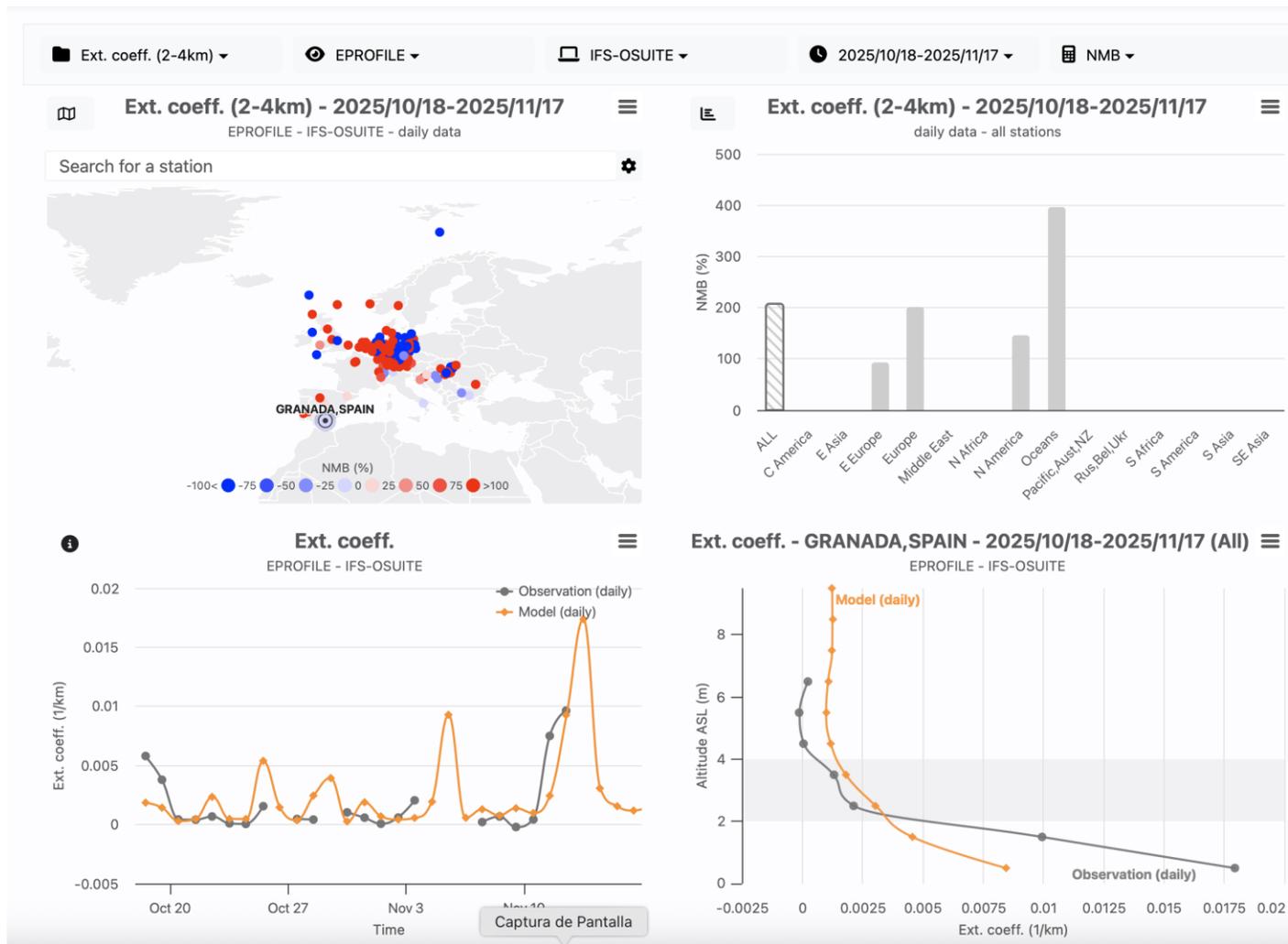
AODc - Middle East - 2013-2025

AeronetSDAV1.5-d





Aeroval: e-profiles





Validation report of the CAMS near-real-time global atmospheric composition service

Period December 2024 - February 2025

Issued by: KNMI
Date: 02 June 2025
Ref: CAMS2_82_2023SC2_D82.1.1.14-DJF2025

Table S.1: Performance of o-suite for a 0-24h and 72-96h as well as for GHG 25km and 9km experiments for the period DJF-2025. REF¹ Average statistics of AirNow, EEA and CNEMC REF² Average statistics of GAW, IASOA and ESRL. REF³ Average statistics of ACE-FTS, SAGE-III/ISS, OMPS-LP, Aura MLS and ozonesondes. REF⁴ From a network of stations that were collected from FMI. IAGOS Global statistics consider all airports but Frankfurt and Madrid. The color scale legend, units and type of statistics used in each case is provided below.

Species	Reference	Type	Region	tres	Bias		Error		R	
					00-24h	72-96h	0-24h	72-96h	0-24h	72-96h
<i>CAMS for Reactive Gases & Aerosol</i>										
AOD	AERONET	COL	Global	daily	13%	8%	39%	41%	0.83	0.78
	AERONET	COL	N. America	daily	27%	14%	45%	41%	0.37	0.33
	AERONET	COL	Europe	daily	3%	9%	36%	39%	0.70	0.60
	AERONET	COL	E. Asia	daily	13%	6%	39%	43%	0.70	0.62
	AERONET	COL	N. Africa	daily	-25%	-17%	50%	52%	0.59	0.43
	AERONET	COL	S. America	daily	27%	6%	47%	36%	0.51	0.55
	AERONET	COL	Oceans	daily	19%	17%	34%	37%	0.81	0.76
	AERONET SDA	COL	Europe	3h	-120%	-118%	140%	140%	0.17	0.17
AERONET SDA	COL	Middle East	3h	-26%	-25%	76%	78%	0.44	0.40	
AERONET SDA	COL	N. Africa	3h	-51%	-45%	84%	89%	0.70	0.67	
AE	AERONET	COL	Global	daily	0.09	0.09	0.09	0.09	0.56	0.55
	AERONET	COL	N. America	daily	0.13	0.14	0.13	0.14	0.36	0.33
	AERONET	COL	Europe	daily	-0.00	-0.00	0.00	0.00	0.64	0.61
	AERONET	COL	E. Asia	daily	0.04	0.05	0.04	0.05	0.24	0.19
	AERONET	COL	N. Africa	daily	-0.10	-0.09	0.10	0.09	0.76	0.73
	AERONET	COL	S. America	daily	0.28	0.28	0.28	0.28	0.20	0.19
AERONET	COL	Oceans	daily	0.10	0.10	0.10	0.10	0.59	0.58	



Validation report of the CAMS near-real-time global atmospheric composition service

Period December 2024 - February 2025

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Table S.5: Improvement or deterioration of o-suite 0-24h forecast due to Data Assimilation (DA) is calculated by the difference of performance statistics for o-suite and the control experiment. The improvement or deterioration of the Current Year Quarter (CYQ) compared to the Previous Year same Quarter (PYQ) is calculated by the difference of performance statistics for CYQ and the PYQ experiment. The color scale legend, units and type of statistics used in each case is provided below.

Species	Reference	Type	Region	tres	DA improvement?			CYQ to PYQ improvement?		
					Bias	Error	R	Bias	Error	R
<i>CAMS for Reactive Gases & Aerosol</i>										
AOD	AERONET	COL	Global	daily	-11%	-1%	0.04	-3%	4%	0.04
	AERONET	COL	N. America	daily	-22%	-10%	-0.01	-4%	4%	0.05
	AERONET	COL	Europe	daily	0%	1%	0.07	1%	6%	0.07
	AERONET	COL	E. Asia	daily	-13%	2%	0.06	-5%	5%	0.14
	AERONET	COL	N. Africa	daily	-3%	-1%	-0.02	-9%	5%	0.18
	AERONET	COL	S. America	daily	-15%	-7%	0.03	1%	-1%	-0.09
	AERONET	COL	Oceans	daily	-15%	-1%	0.04	-9%	5%	0.08
	AERONET SDA	COL	Europe	3h	-6%	-2%	-0.01	1%	7%	-0.10
AERONET SDA	COL	Middle East	3h	-10%	-2%	0.02	-3%	-3%	-0.22	
AERONET SDA	COL	N. Africa	3h	-10%	-3%	0.04	-45%	-2%	0.20	
AE	AERONET	COL	Global	daily	-0.02	-0.02	-0.02	0.11	0.11	0.01
	AERONET	COL	N. America	daily	0.00	0.00	-0.04	0.14	0.14	0.03
	AERONET	COL	Europe	daily	0.02	0.02	0.01	0.15	0.15	0.08
	AERONET	COL	E. Asia	daily	0.01	0.01	0.01	0.15	0.15	0.05
	AERONET	COL	N. Africa	daily	0.03	0.03	-0.02	0.04	0.04	0.04
	AERONET	COL	S. America	daily	0.01	0.01	-0.07	0.18	0.18	-0.18
AERONET	COL	Oceans	daily	-0.04	-0.04	-0.04	0.09	0.09	-0.02	



**Validation report of the CAMS
near-real-time global atmospheric
composition service**

Period December 2024 - February 2025

Issued by: KNMI

Date: 02 June 2025

Ref: CAMS2_82_2023SC2_D82.1.1.14-DJF2025

	o-suite	cntrl	SDS-WAS	ICAP
Forecasts 00-24 hours				
COR	0.67	0.65	0.80	0.84
MB	-0.03	-0.02	-0.01	-0.02
RMSE	0.10	0.10	0.08	0.07
MNMB	-87.21	-80.45	-65.36	-44.85
Forecasts 48-72 hours				
COR	0.66	0.66	0.77	0.78
MB	-0.03	-0.02	-0.01	-0.02
RMSE	0.10	0.10	0.08	0.08
MNMB	-85.56	-80.79	-60.88	-46.11
Forecasts 96-120 hours				
COR	0.65	0.65	NaN	0.74
MB	-0.03	-0.02	NaN	-0.02
RMSE	0.10	0.10	NaN	0.09
MNMB	-85.00	-81.15	NaN	-46.30

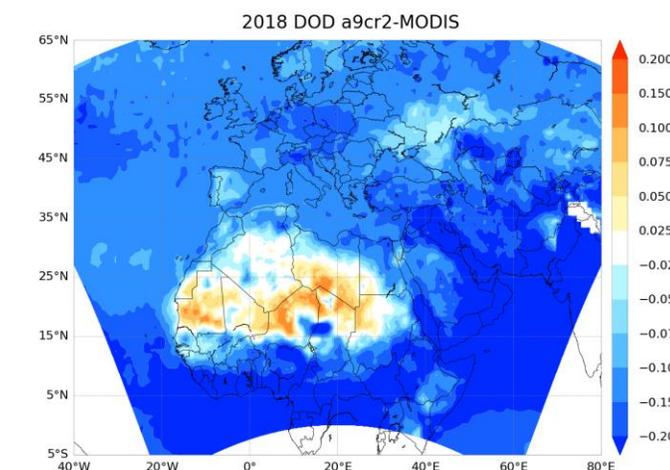
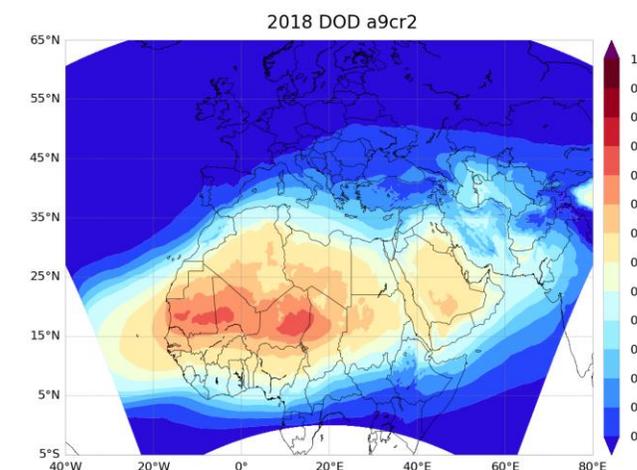
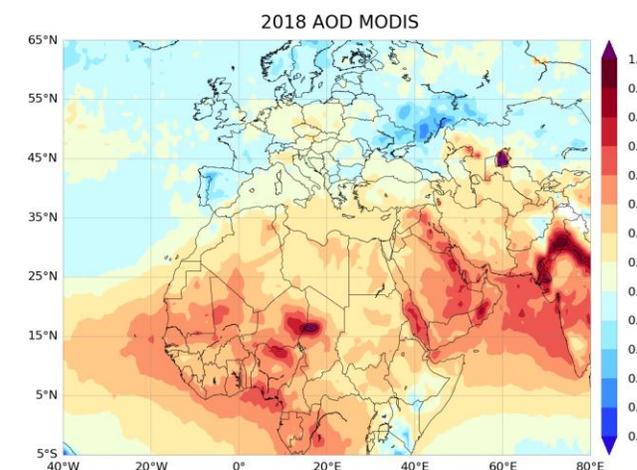
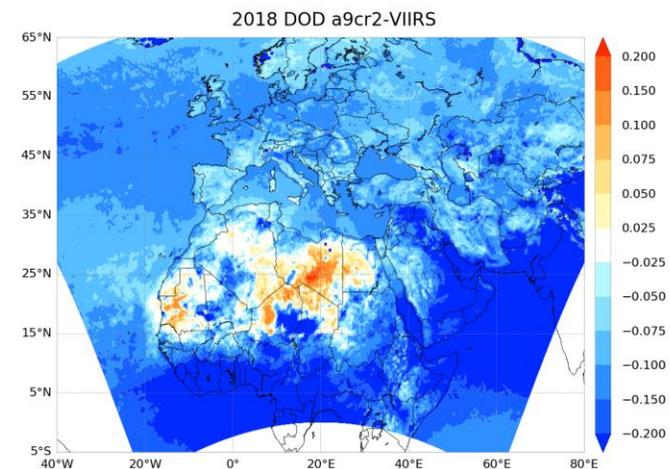
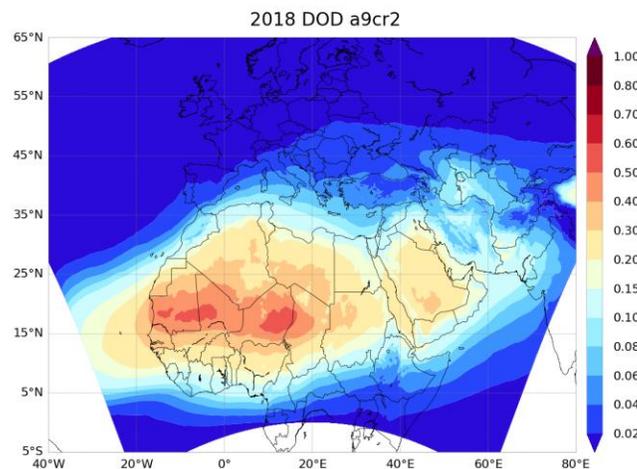
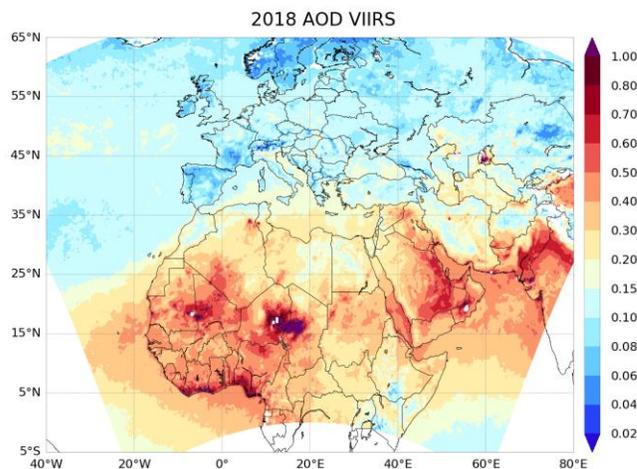
Table 9.1.1: Skill scores (MB, MNMB, RMSE, and r) of 0-24 hours, 48-72 hours and 96-120 hours forecasts (on a 3-hourly basis) for CAMS o-suite, CAMS control and SDS-WAS multi-model median, and ICAP multimodel mean for DJF-2025 NAMEE region. DOD (AODcoarse SDA product) from AERONET is the reference.

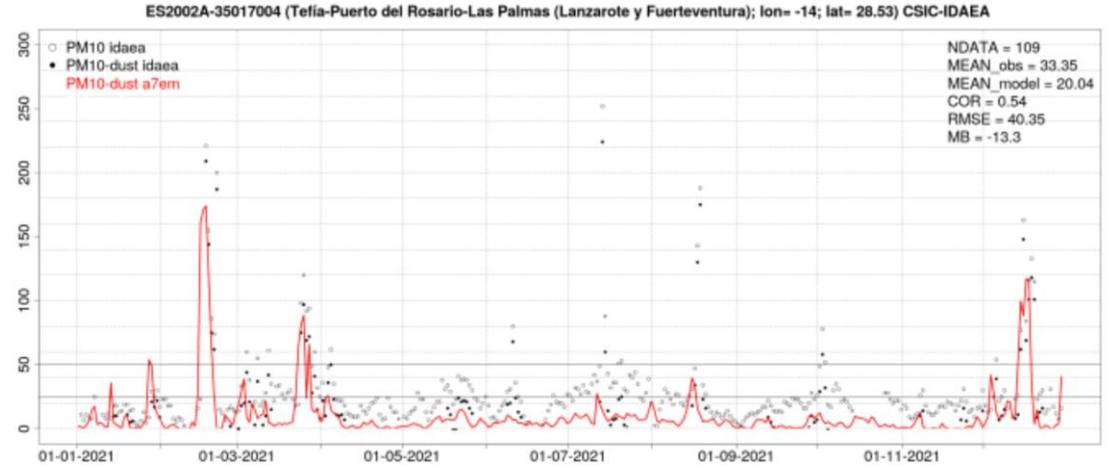
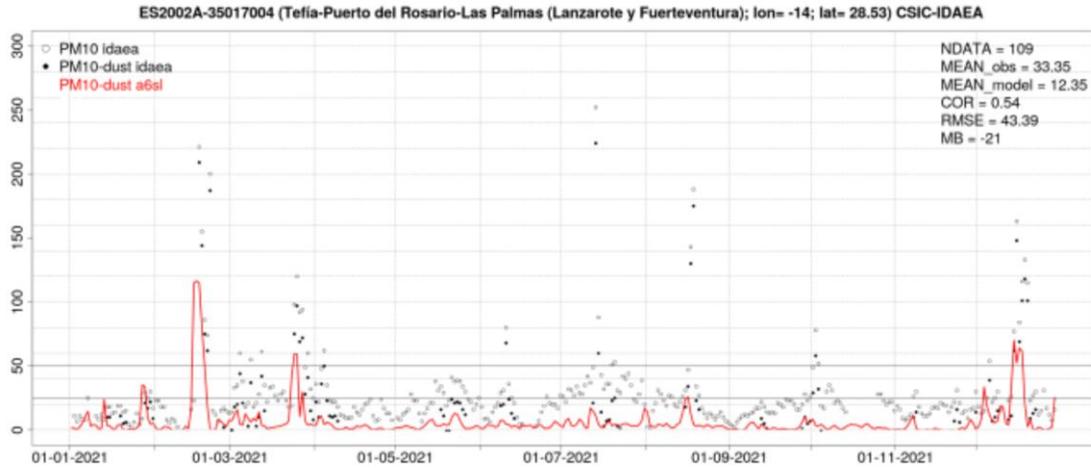


Non-routine dust evaluation

Satellites evaluation

Courtesy of E. Karnezi





PM10 dust contribution from Escudero et al. (2007)

	Hit rate	False alarm rate
MONARCH v2.1.0	13.4%	0.6%
MONARCH v2.7.2	19.6%	1.4%

Uses the linear depolarization ratio:

PLDR = 0 for spherical particles
 PLDR \gtrsim 30 for dust and computes dust and non-dust contributions

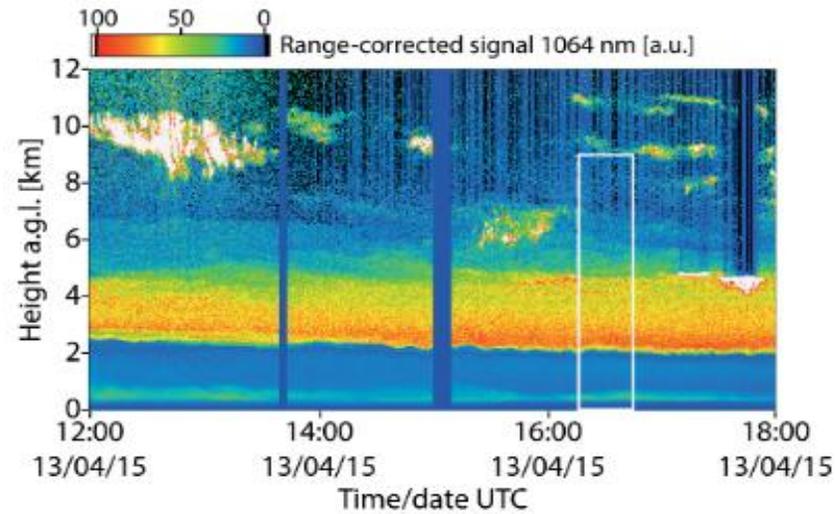


Figure 8. Dust layering over the central Asian AERONET site of Dushanbe, Tajikistan, on 13 April 2015 observed with Polly lidar at 1064 nm (range-corrected signal). The densest layer from 2 to 5 km height a.g.l. (above ground level) contained dust particles from Iran, Afghanistan, and Oman according to the backward trajectories in Fig. 9. With increasing height, dust was advected from the Arabian peninsula and the Sahara. The polluted boundary layer reached up to about 2 km height and contained traces of local dust and dust from Kazakhstan. Above 6.5 km height (and temperatures $< -20^\circ\text{C}$) ice clouds developed triggered by dust particles, which are favorable ice-nucleating particles. POLIPHON results in Figs. 10–12 are derived for the height–time range indicated by the white rectangle.

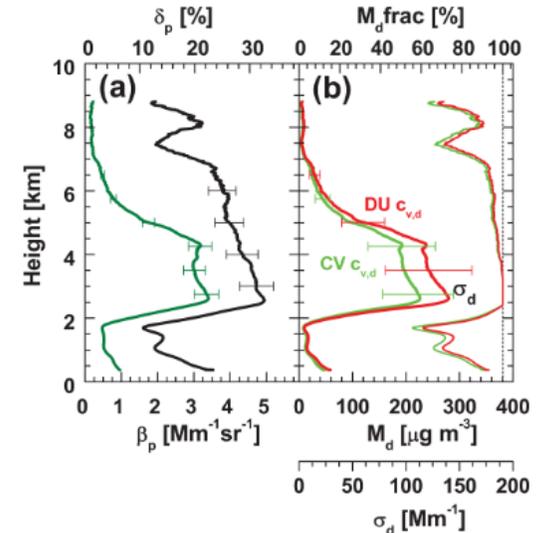
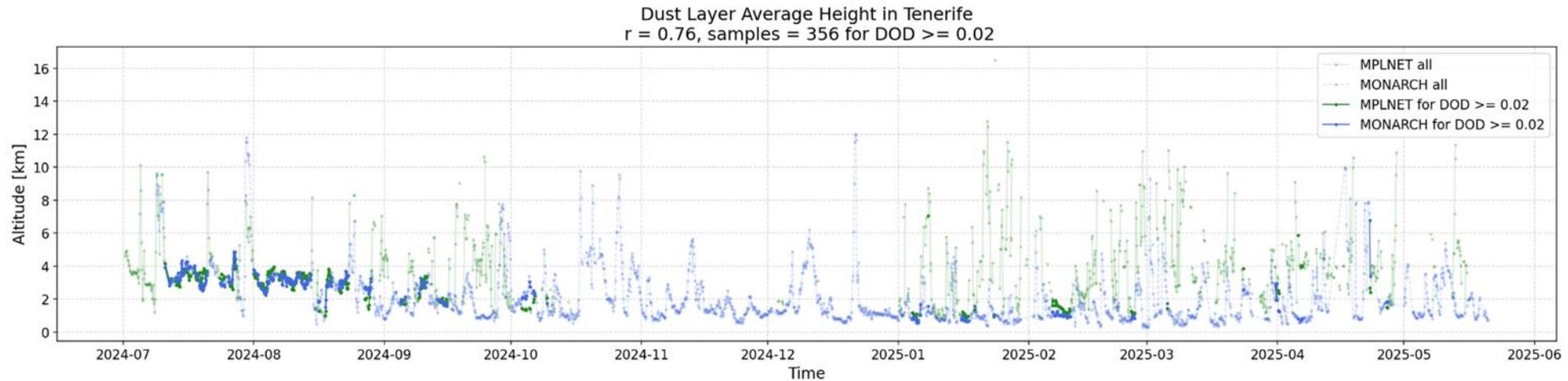
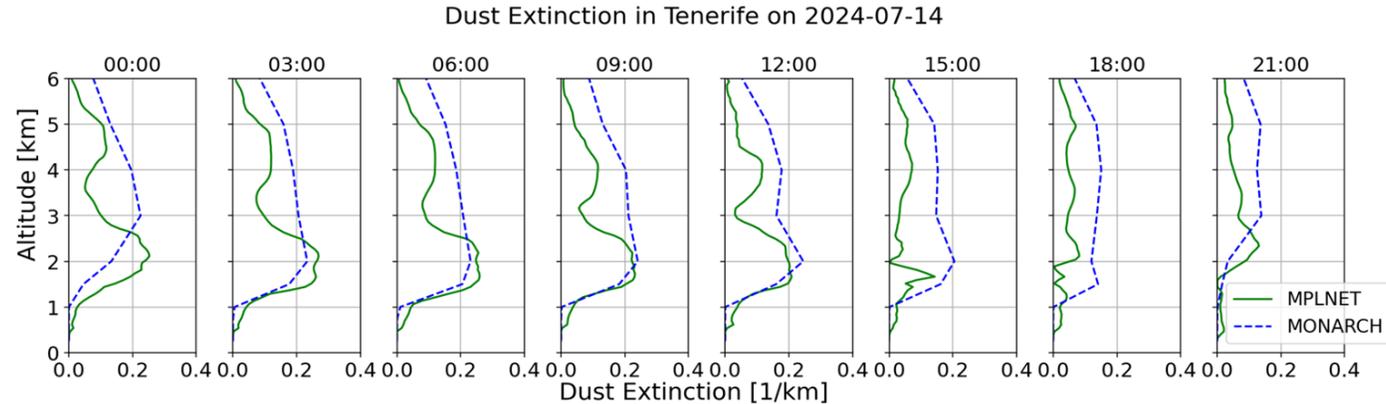


Figure 10. Retrieval of dust mass concentration. From profiles of the particle backscatter coefficient β_p (green curve in **a**, 532 nm) and particle linear depolarization ratio δ_p (black curve in **a**, 532 nm), the profile of the dust backscatter coefficient β_d is determined and then converted into the dust extinction coefficient σ_d (red curve in **b**) by means of a lidar ratio of 40 sr. The σ_d profile is then converted into mass concentration M_d (shown in **b** as thick lines) by means of volume conversion factors $c_{v,d}$ of 0.64×10^{-12} Mm for Sal, Cabo Verde (CV, green M_d profile; see Table. 4), and 0.79×10^{-12} Mm for Dushanbe (DU, red M_d profile) and dust particle density $\rho_d = 2.6 \text{ g cm}^{-3}$. Respective profiles of M_d fraction (thin red and green curves in **b**) are also shown. The Polly lidar observation was performed at Dushanbe on 13 April 2015, 16:15–16:44 UTC (white rectangle in Fig. 8). The temporally averaged lidar signal profiles were smoothed with 750 m before the computation of β_p and δ_p . Error bars indicate (a) 10% and (b) 30% uncertainty (typical uncertainty according to Table 1).

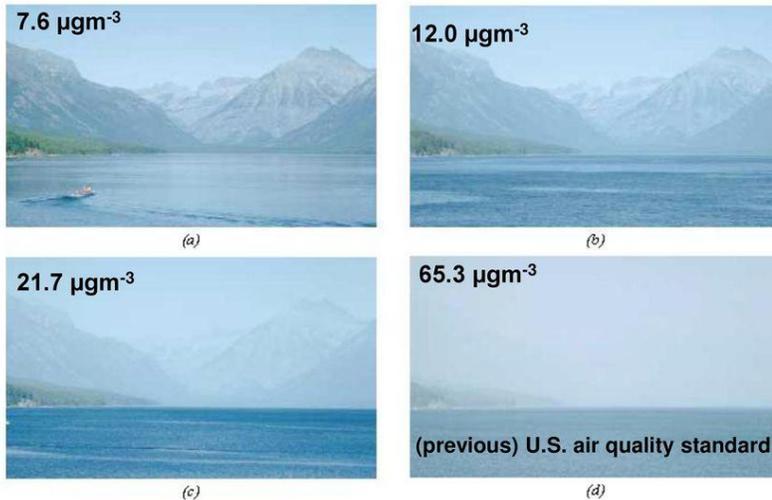
- Fair agreement of profile shapes (as seen by ρ)
- Overestimation of MONARCH DOD
- Fair agreement in the mean altitude of the dust mass for dust events



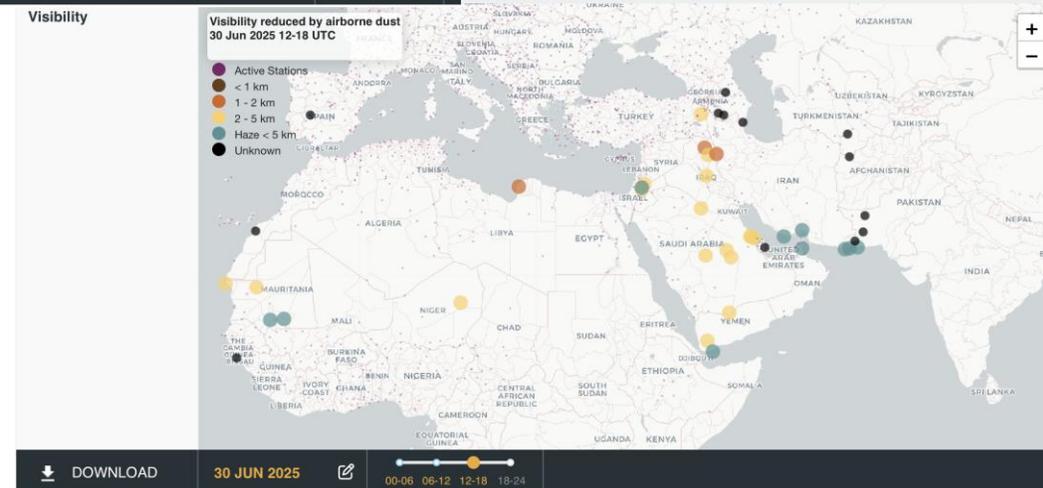
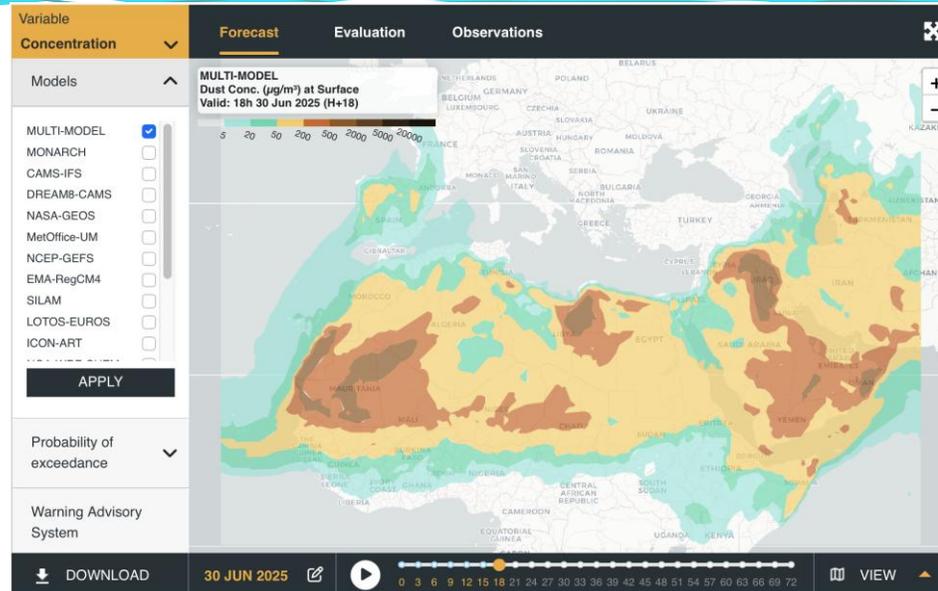
<https://dust.aemet.es/resources/evaluation-of-vertical-profiles-of-dust-concentrations>

AEROSOL IMPACTS ON VISIBILITY

Visibility degradation by aerosols at Glacier National Park, Montana



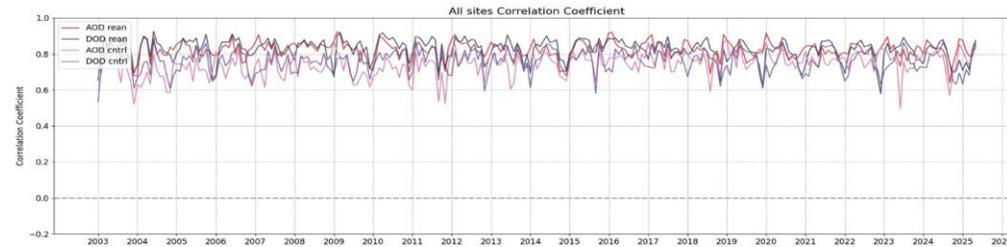
Natural aerosol concentrations are typically less than $2 \mu\text{g m}^{-3}$



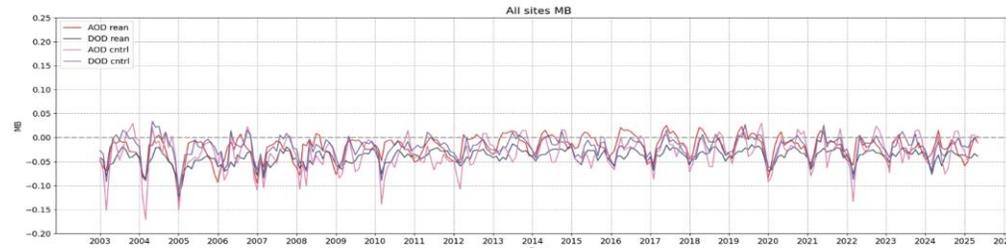


Reanalysis evaluation

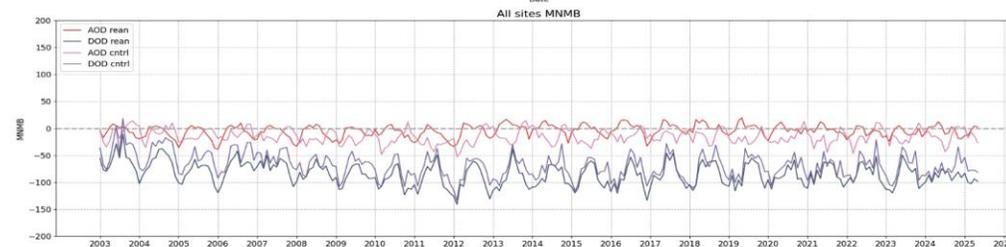
Correlation



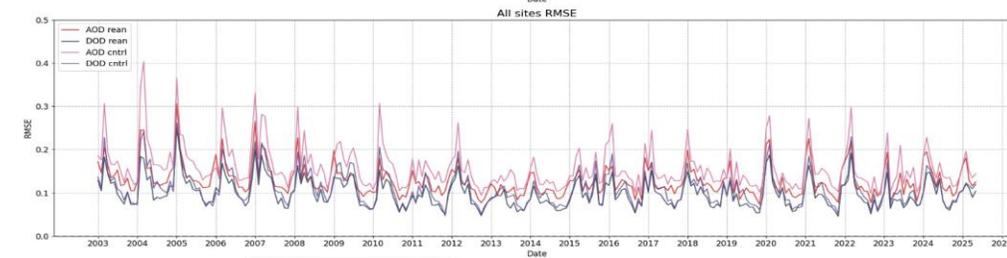
Mean bias



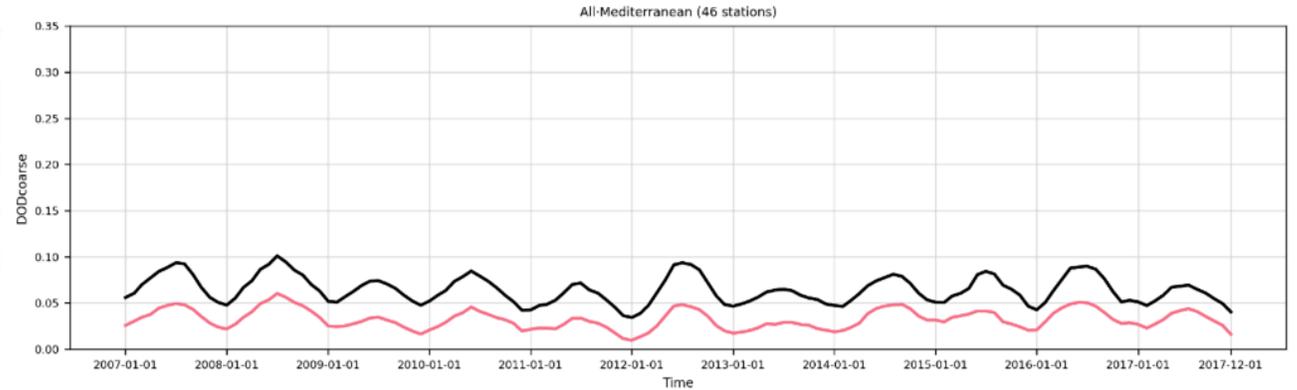
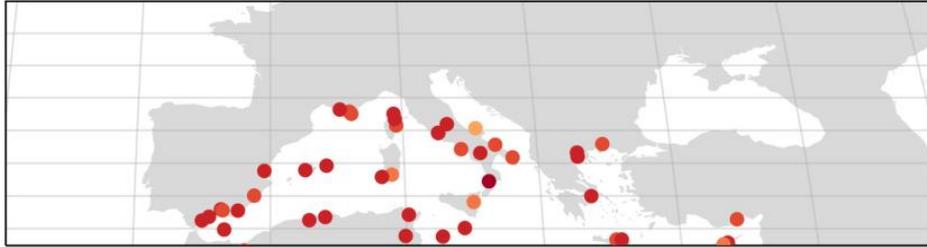
MNMB



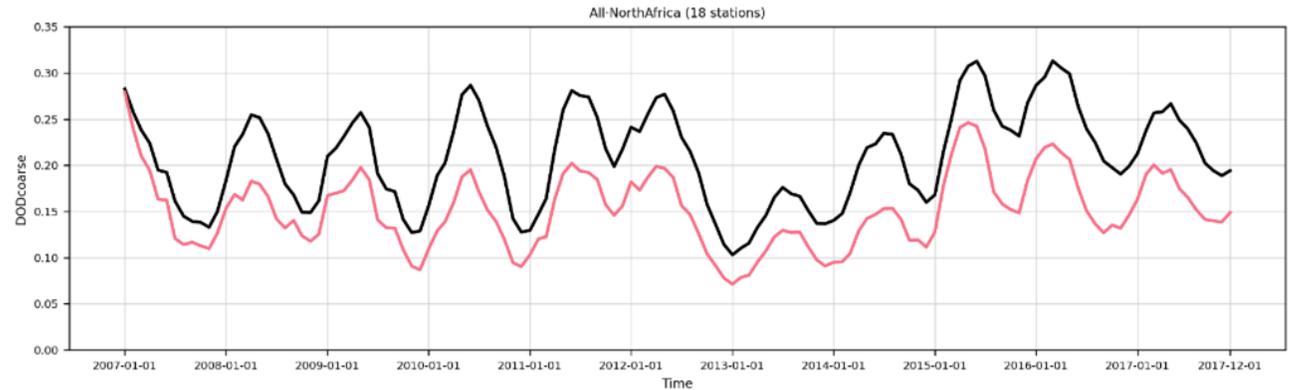
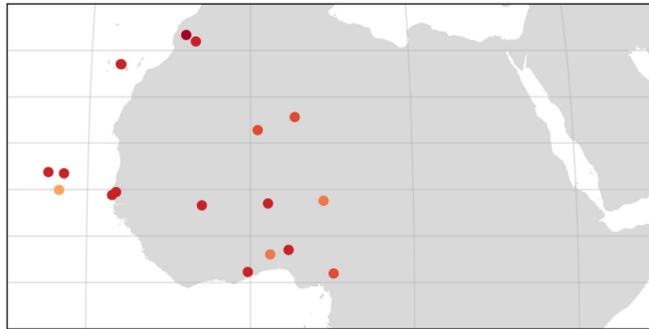
RMSE



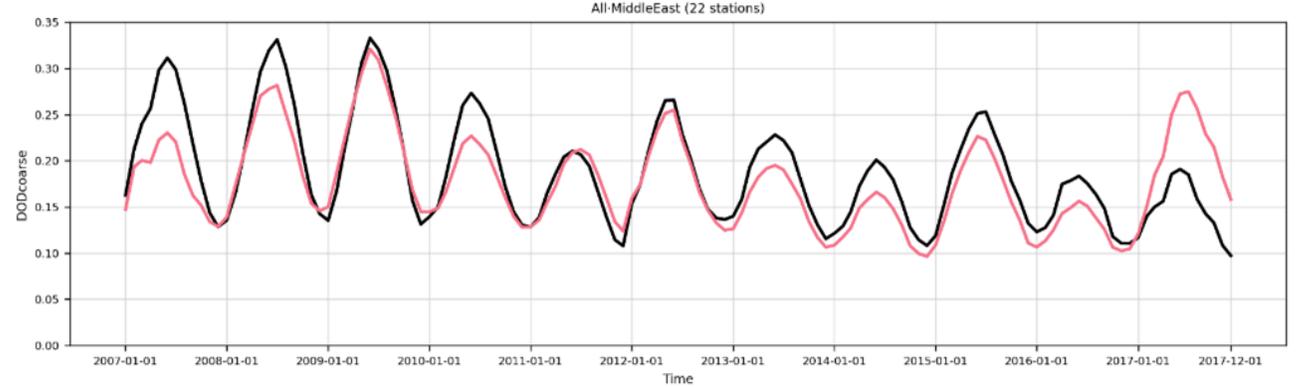
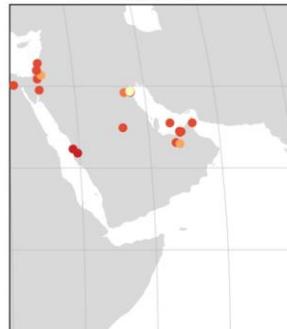
Reanalysis
All-Mediterranean (46 stations)



Reanalysis
All-NorthAfrica (18 stations)



Reanalysis
All-MiddleEast (22 stations)





Dustclim evaluation report

[DustClim: ERA4CS] DELIVERABLE D2.4



Report on reanalysis evaluation results and associated uncertainties

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Serena Trippetta (CNR-IMAA), Francesca Barnaba (CNR-
ISAC), Sara Basart (BSC), Enza Di Tomaso (BSC), Jeronimo
Escribano (BSC), Carlos Pérez García-Pando (BSC), Oriol
Jorba (BSC), Beatrice Marticorena (CNRS), Paola Formenti
(CNRS), Claudia Di Biagio (CNRS), Juan Cuesta (CNRS)**

Abstract

A decadal dust reanalysis for Northern Africa, Middle East and Europe has been produced in the framework of the DustClim project, using the mineral dust module of the MONARCH chemical weather system and by assimilating satellite observations of aerosol optical depth (AOD) with specific observational constraints for dust. As a second step, the evaluation of the MONARCH model reanalysis performance has been carried out using independent datasets grouping observations of variables that are included in the model outputs and are relevant for its scoring. This deliverable describes the approach used to evaluate the reanalysis products and provides a discussion of the first results obtained.

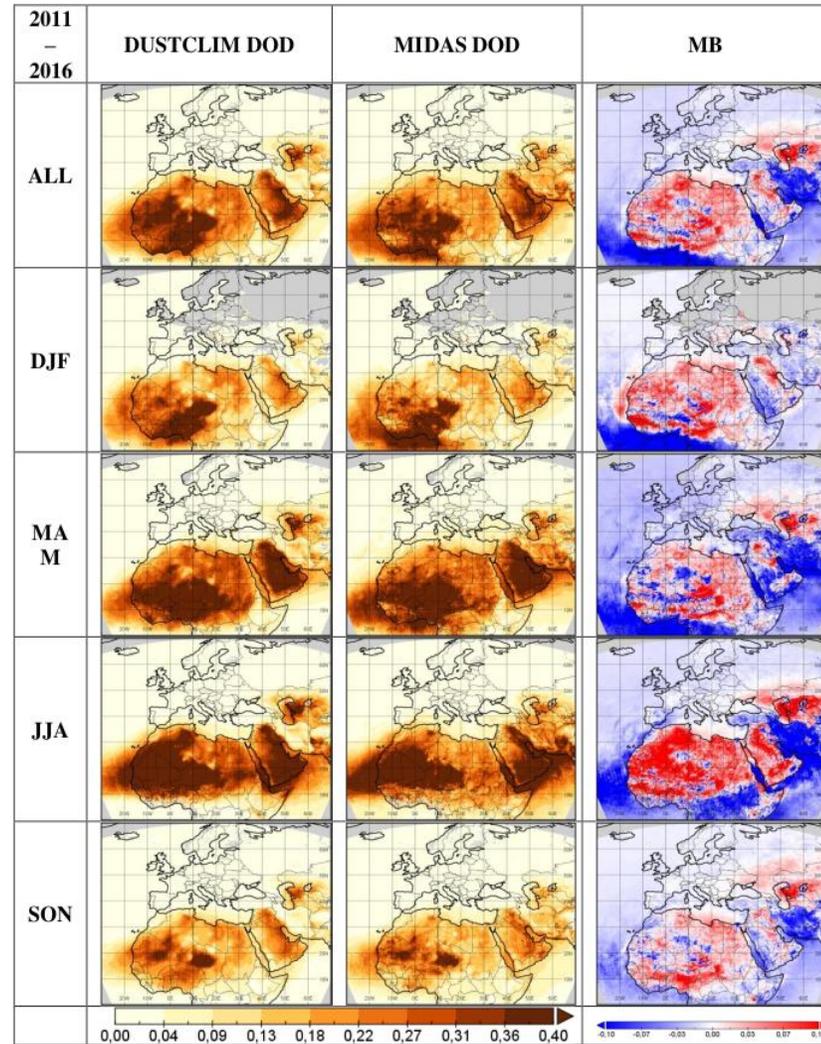
DustClim is supported by the European Commission under the ERA4CS action - Joint Call on Researching and Advancing Climate Services Development, Grant Agreement no. 690462 - ERA4CS - H2020-SC5-2014-2015/H2020-SC5-2015-one-stage



Dustclim evaluation: DOD

MIDAS dataset

Gkikas et al. (2021)



Dustclim evaluation: vertical

LIVAS dataset

Amiridis et al. (2015)

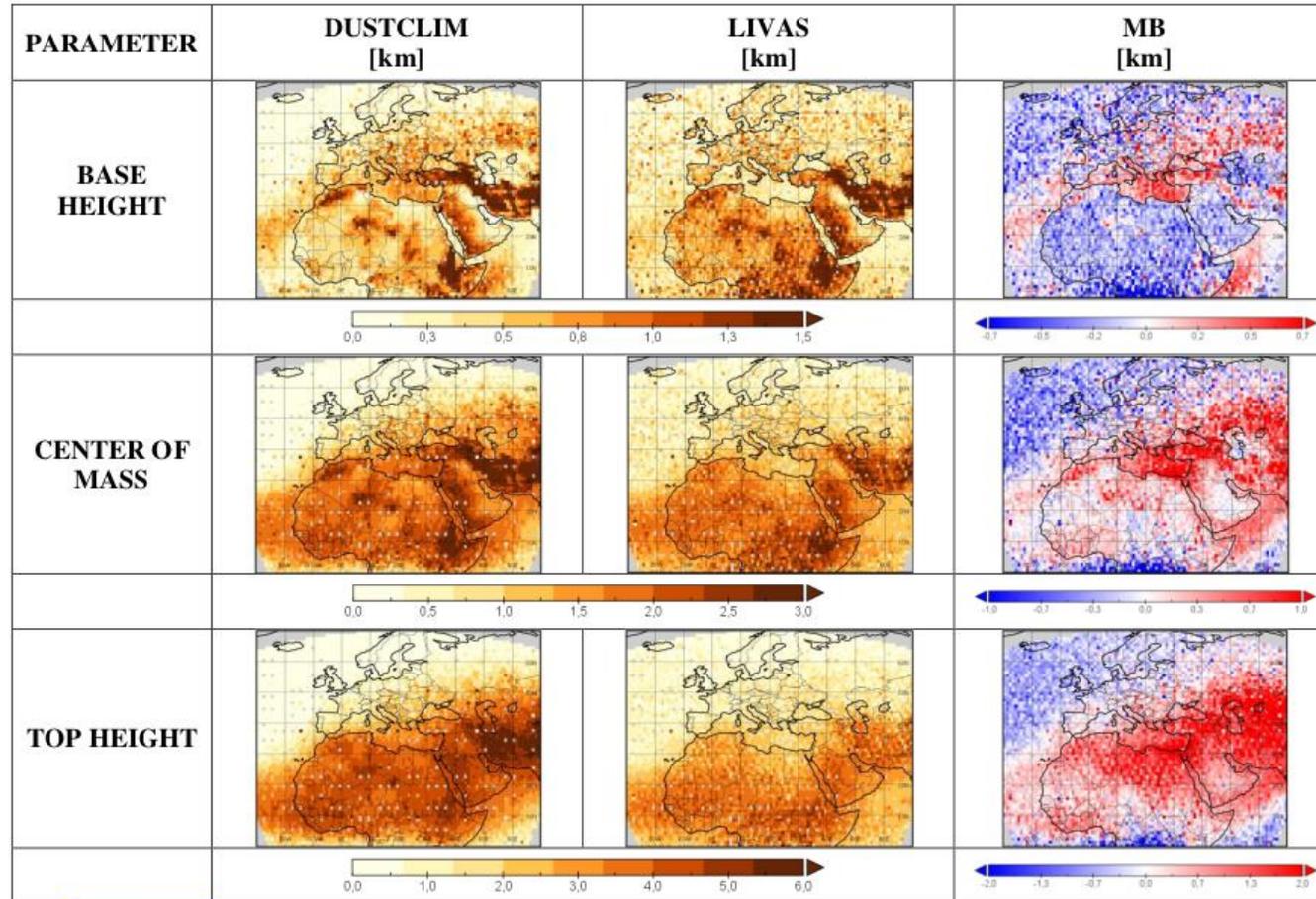
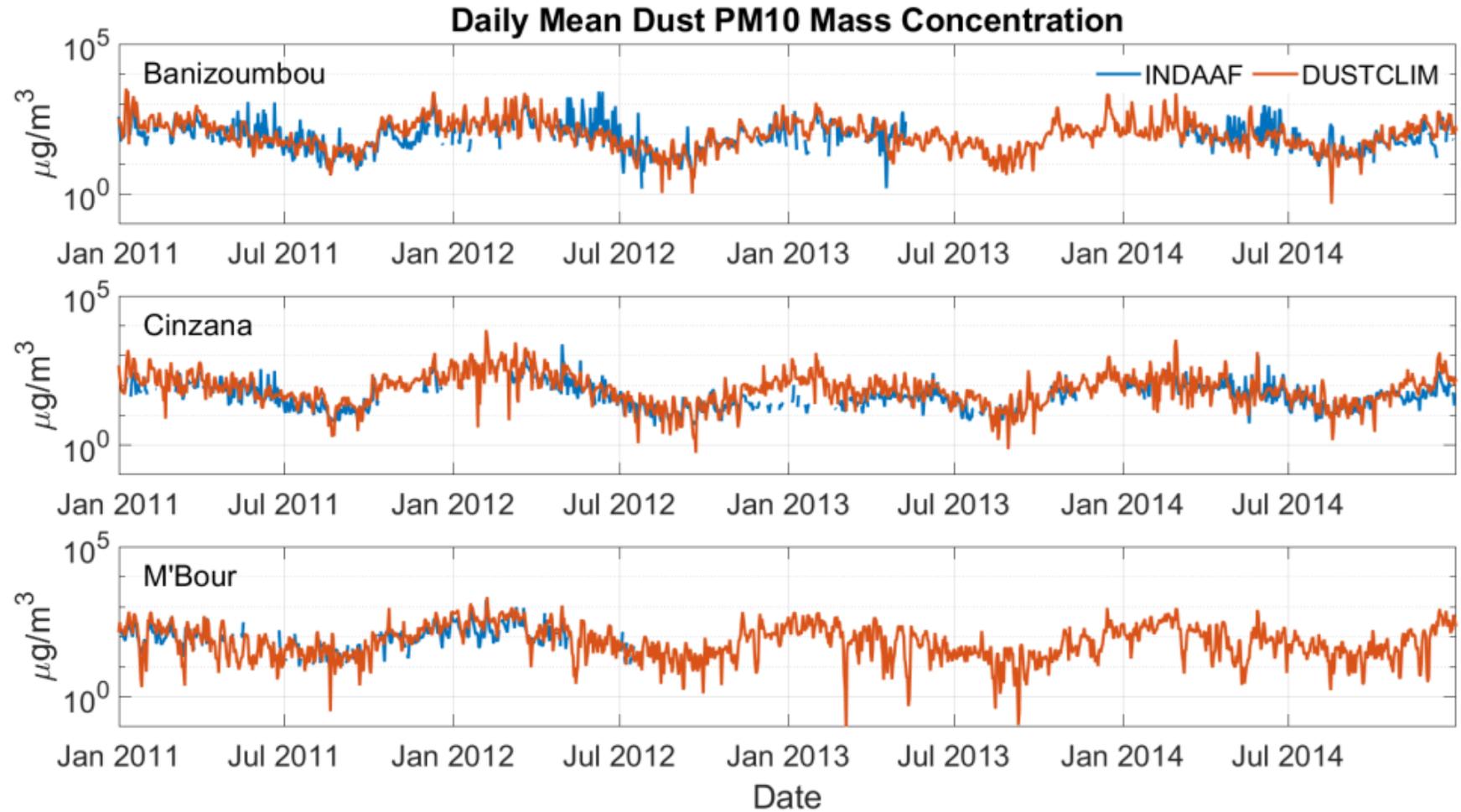


Figure 3.17 Base height (upper row), center of mass (middle row) and top height (lower row) of the dust layer, in km a.s.l., over the DustClim domain, for the period 2011–2016

Dustclim evaluation: surface



Figure 3.29 The 5 INDAAF/SDT monitoring stations (www.lisa.u-pec.fr/SDT/). The stations used for the DustClim reanalysis evaluation are marked with red dots



Dustclim evaluation: surface

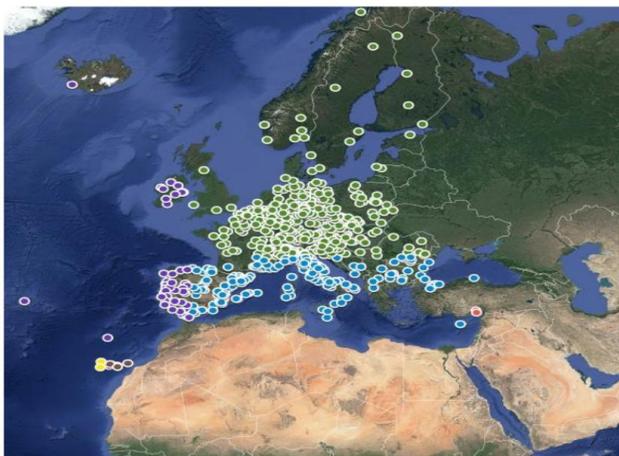
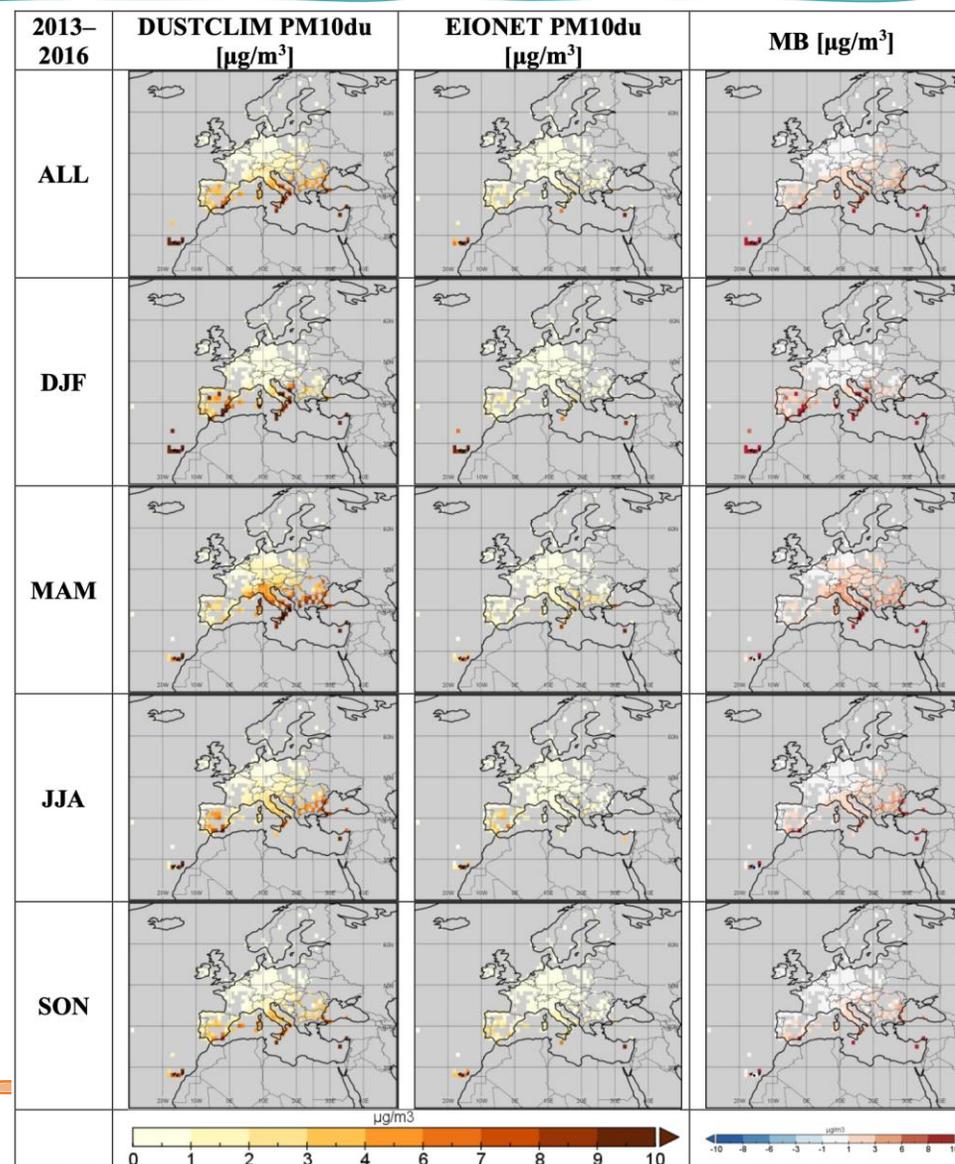


Figure 3.33 EIONET stations indicated with different colors according to the regional division of the DustClim domain (Figure 2.1): Blue for Mediterranean Sea, green for Northern Europe, purple for Subtropical Atlantic, yellow for Tropical Atlantic, brown for Western Africa and red for Western Asia stations.

PM10 dust contribution from Barnaba et al. (2017)



Dustclim evaluation: deposition



Figure 3.29 The 5 INDAAF/SDT monitoring stations (www.lisa.u-pec.fr/SDT/). The stations used for the DustClim reanalysis evaluation are marked with red dots



Figure 3.40 Location of the CARAGA samplers constituting the deposition network deployed in the western Mediterranean basin and southern of France

	Model				Measured 2012				Measured 2006-2012			
	Dry	Wet	Total	Wet/Tot	Dry only	Wet	Total	Wet/Tot	Dry only	Wet	Total	Wet/Tot
INDAAF												
Banizoumbou (Niger)	114	107	221	49%	39	97	183	53%	48	72	135	53%
Cinzana (Mali)	137	98	235	42%	39	97	130	75%	36	79	119	66%
M'Bour (Senegal)	108	70	179	39%					65	7	92	7%
CARAGA									Measured 2014			
Medenine (Tunisia)	108	153	261	59%							60	
					Measured 2012-2013							
Lampedusa (Italy)	17	102	119	86%			7					
Mallorca (Spain)	1	27	28	95%			6					
Ersa (Corsica)	1	17	18	95%			2					

Table 3.21 Deposition fluxes produced by the reanalysis with the same quantities recorded at INDAAF and CARAGA ground-based stations. The unit in the deposition files are kg m^{-3} . It was assumed that it corresponds to the loss by the surface level and that it corresponds to surface deposition in km m^{-2} .



Final remarks

- Quantitative evaluation of mineral dust models not straightforward because
 - we never measure only dust!
 - dust amounts vary strongly temporally and geographically
 - ground-truth observations are very sparse in main dust sources regions
- Wide consensus on DOD evaluation not yet there, in the meanwhile we prefer using AERONET coarse optical depth and compare it with coarse dust DOD (but with some care on which error statistics to look at)
- Near real time and extensive evaluation of forecasts and reanalyses of dust is common practice and publicly available
- Mineral dust forecasts generally provide skillful predictions up to 3 days in advance
- Hourly to interannual dust variability well reproduced by reanalyses
- Evaluation strategy should be adapted based on the objective (modeling improvements, air-quality forecasting, solar energy application etc.)



References

1. <https://www.cawcr.gov.au/projects/verification/>
2. To be updated ...



Funded by the
European Union

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