

3D-EnVar Aerosol Assimilation System for Global Aerosol Forecasting and **Reanalysis** at NOAA/OAR

Mariusz Pagowski^{1,2}, Bo Huang^{1,2}, Shih-Wei Wei^{3,4}, Arlindo da Silva⁵, and Sarah Lu^{3,4}

Collaborators:

Cory R. Martin⁶, Andrew Tangborn^{6,7}, Daryl T. Kleist⁶,
Shobha Kondragunta⁸,

Maryam Abdi-Oskouei⁴, Jérôme Barré⁴, Cheng Dang⁴, Ben Johnson⁴, and the JEDI Team

¹CIRES, CU Boulder

²NOAA/OAR/GSL

³SUNYA,

⁴UCAR/Joint Center for Satellite Data Assimilation

⁵NASA/GMAO

⁶NOAA NWS NCEP EMC

⁷IMSG at NCEP EMC

⁸NOAA NESDIS STAR

Near-Real Time Aerosol Assimilation System

(since August 2021, <https://ruc.noaa.gov/projects/nrt/>)

MODEL: Global Ensemble Forecast System - Aerosols (GEFS-Aerosols):

- FV3 dynamical core (six tiles) and GFS physics;
- GOCART with 15 aerosol tracers;
- 64 levels at ~100km resolution.

Currently switching to a new NOAA model **UFS-Aerosols**

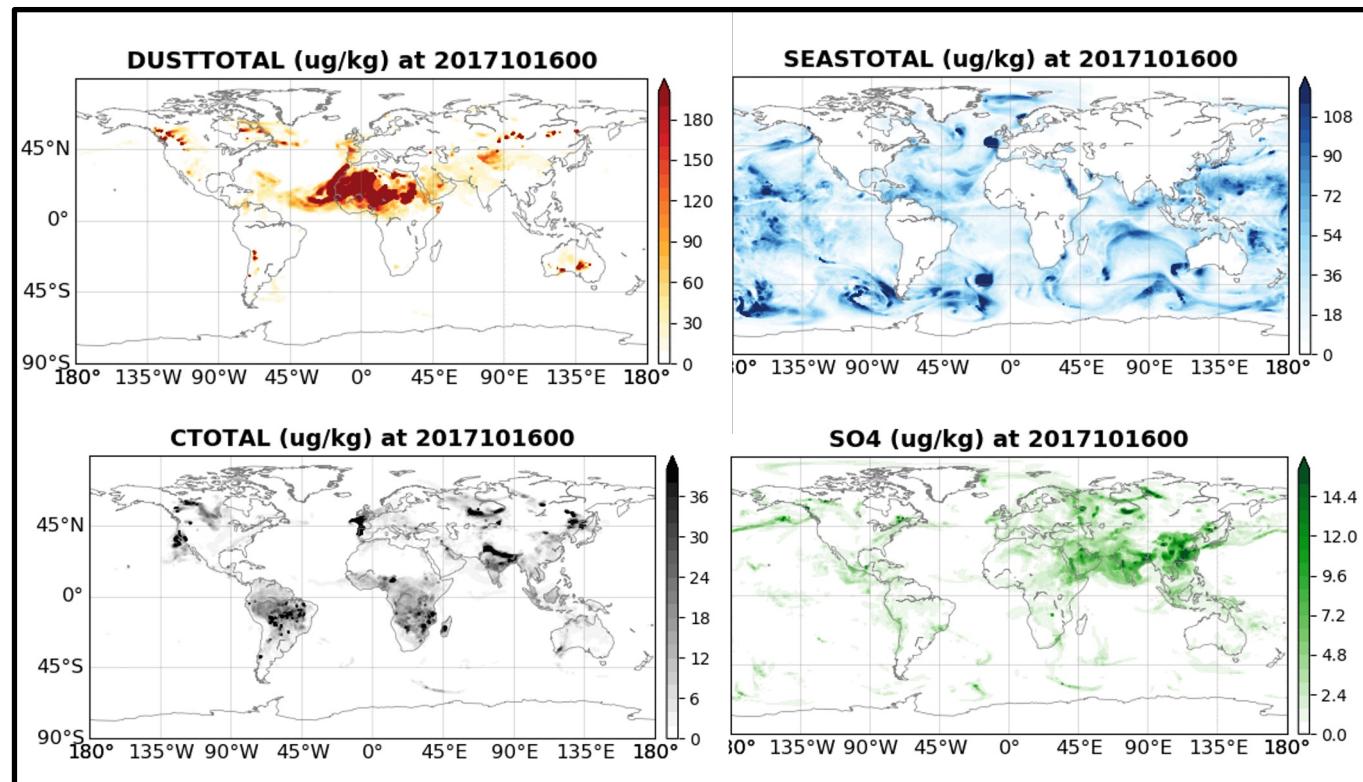
- GOCART2G: 15 GOCART tracers + 3 nitrate bins (from NASA);
- NOAA's Fengsha dust scheme;
- NOAA's GBBEPx wildfire emissions;
- 127 levels at ~50km resolution.

OBSERVATIONS: AOD 550nm:

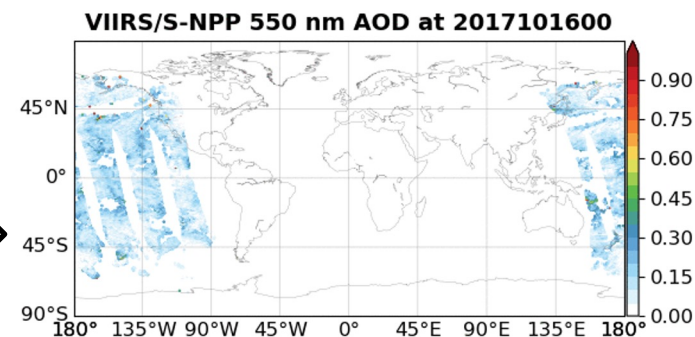
- NOAA-SNPP VIIRS retrievals produced by NOAA/NESDIS (combined DT&DB);
- 750 m pixels sampled at ~50km.

ASSIMILATION: JEDI-Based 3D-EnVar:

- Observation operator using GMAO's aerosol scattering look-up tables;
- Ensemble of 20 members with perturbed emissions plus Control using met analyses;
- EnVar and LETKF to obtain analyses.



Simulate



Correct

NOAA S-NPP
VIIRS 550 nm
AOD retrievals

Huang, B., M. Pagowski, S. Trahan, C. Martin, A. Tangborn, S. Kondragunta, and D. Kleist, 2023: JEDI-Based Three-Dimensional Ensemble-Variational Data Assimilation System for Global Aerosol Forecasting at NCEP, JAMES, <https://agupubs.onlinelibrary.wiley.com/doi/full/10.1029/2022MS003232>.

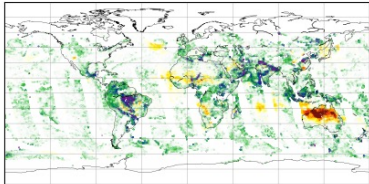
Near-Real Time Aerosol Assimilation System

(since August 2021, <https://ruc.noaa.gov/projects/nrt/>)

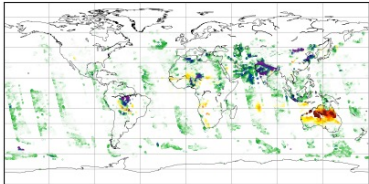
AOD 550nm VIIRS and MODIS

550 nm Aerosol Optical Depth (AOD) Bias wrt VIIRS/S-NPP (left) and MODIS/AQUA (or TERRA if AQUA unavailable, right) aggregated on 11/03/2023

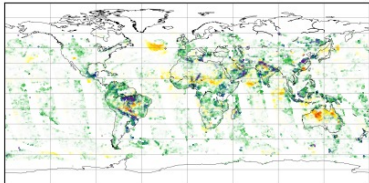
NODA 6hr fcst bias wrt VIIRS AOD



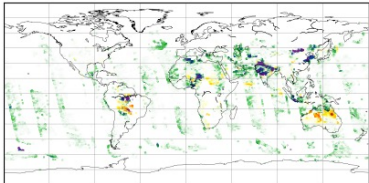
NODA 6hr fcst bias wrt MODIS AOD



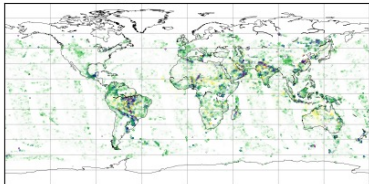
DA 6hr fcst bias wrt VIIRS AOD



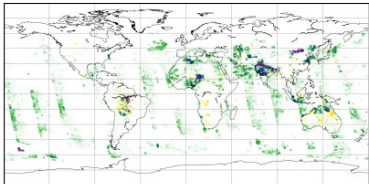
DA 6hr fcst bias wrt MODIS AOD



DA analysis bias wrt VIIRS AOD

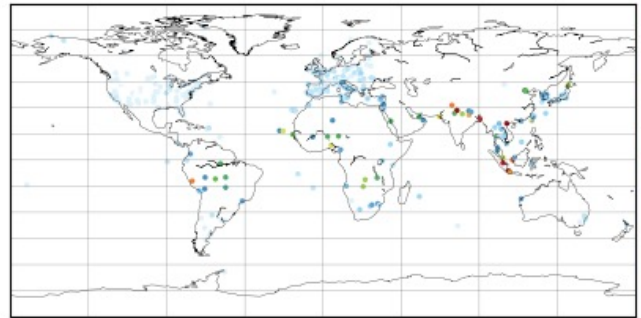


DA analysis bias wrt MODIS AOD



Sample Plots

AOD 500nm AERONET

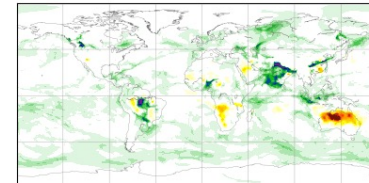


500 nm Aerosol Optical Depth (AOD) wrt AERONET aggregated over 30 days before and at 0018 UTC 11/03/2023

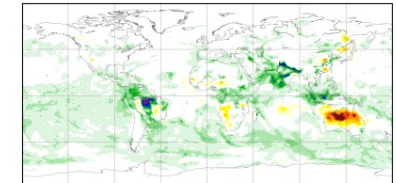
AOD 550nm GEOS and CAMS 550 nm

550 nm Aerosol Optical Depth (AOD) Bias wrt NASA/GEOS (left) and ECMWF/CAMS (right) Analysis on 11/03/2023

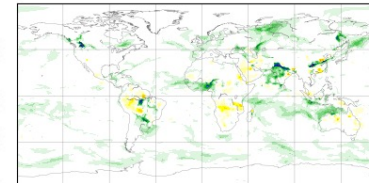
NODA 6hr fcst bias wrt NASA/GEOS



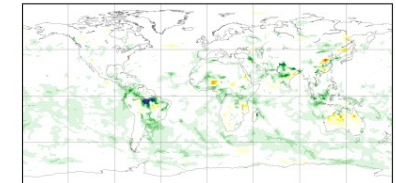
NODA 6hr fcst bias wrt ECMWF/CAMS



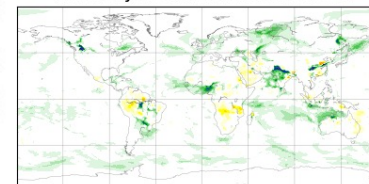
DA 6hr fcst bias wrt NASA/GEOS



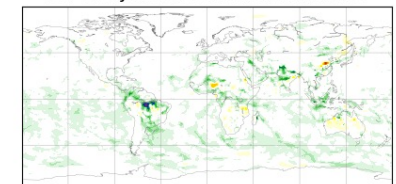
DA 6hr fcst bias wrt ECMWF/CAMS



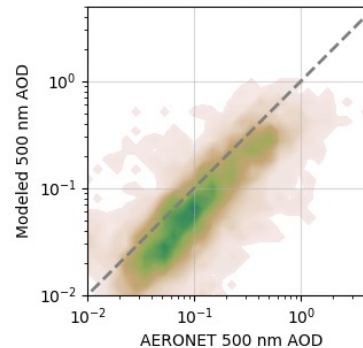
DA analysis bias wrt NASA/GEOS



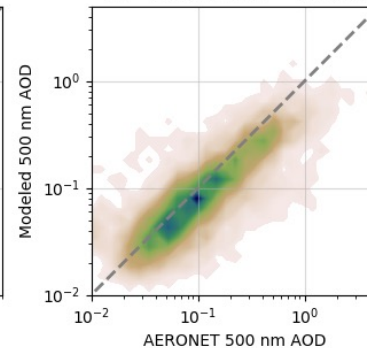
DA analysis bias wrt ECMWF/CAMS



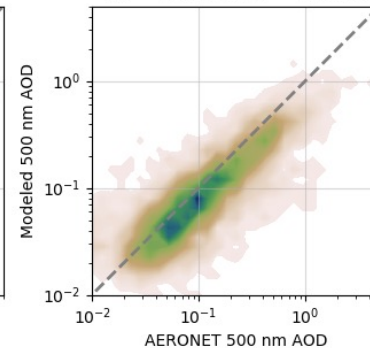
NODA 6hr fcst
($R^2 = 0.4983$, bias = -0.0698)



DA 6hr fcst
($R^2 = 0.6048$, bias = -0.0530)



DA analysis
($R^2 = 0.6573$, bias = -0.0549)



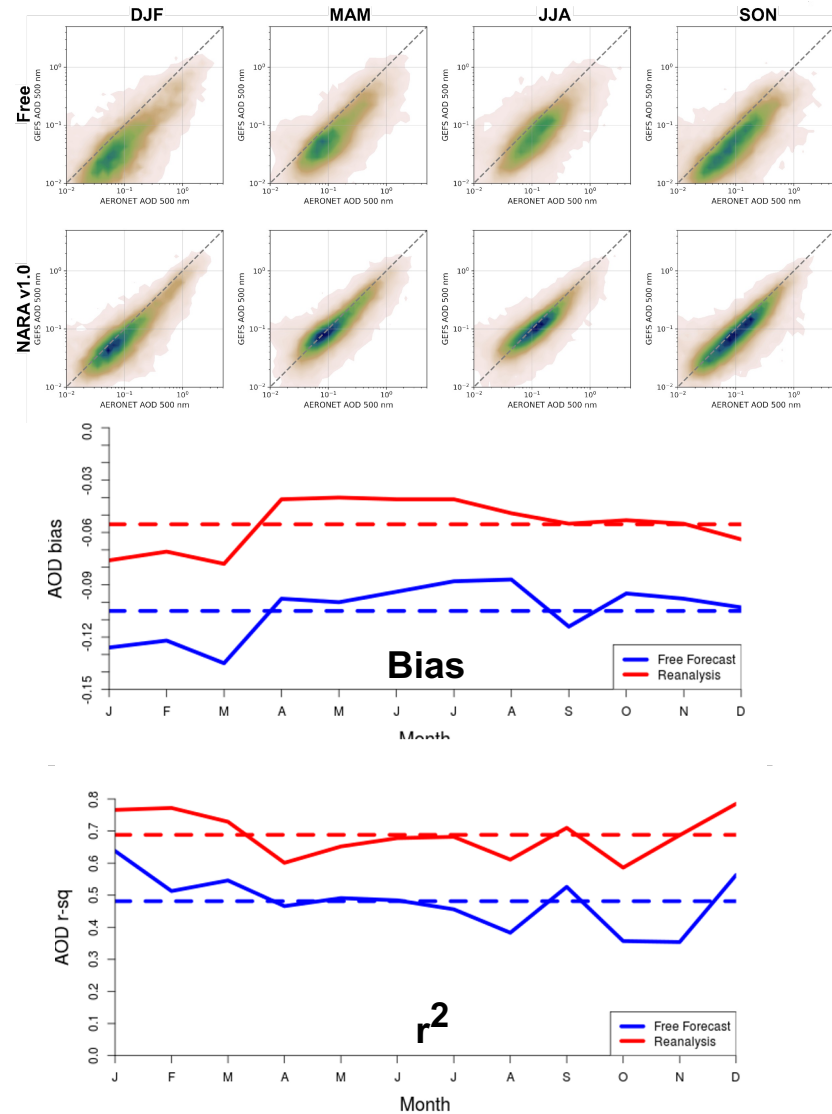
Components of the Reanalysis System

NARA v.1 (NOAA Aerosol ReAnalysis version 1)

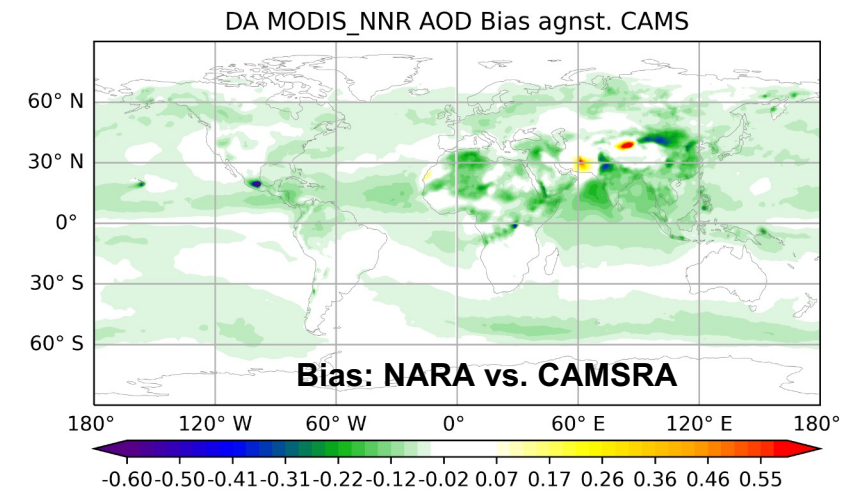
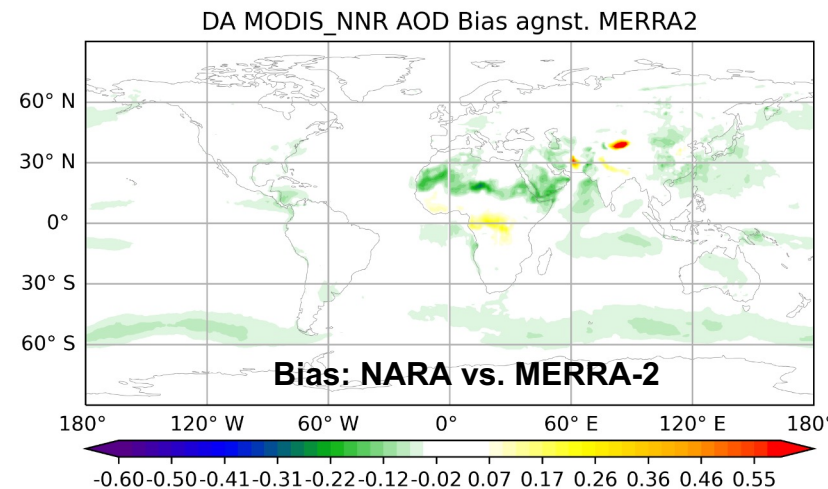
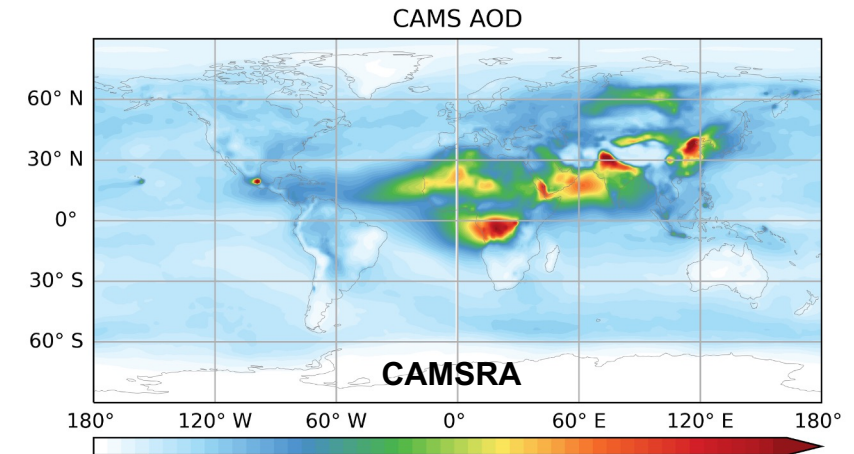
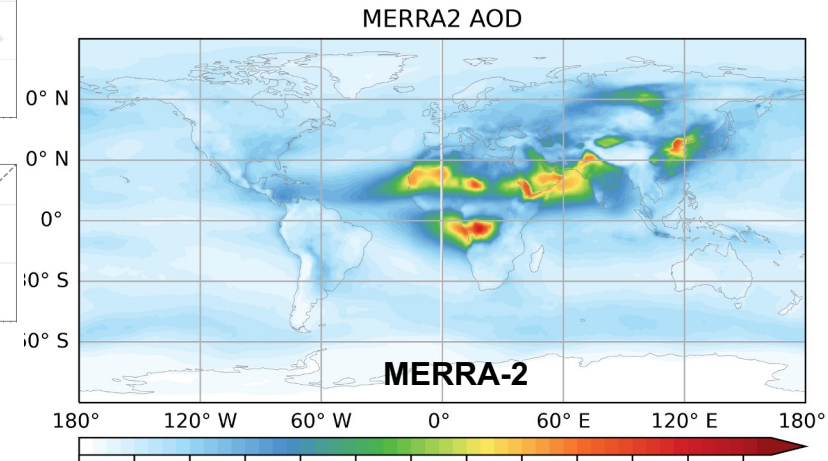
- ❑ **MODEL:** same as NRT.
- ❑ **OBSERVATIONS:** NASA GMAO's Neural Network Retrievals (NNR) of AOD
 - Multi-wavelengths AODs obtained from satellite radiances trained on AERONET using neural network approach (but used only AOD 550nm).
- ❑ **ASSIMILATION:** similar to NRT but 40 members
 - Prototype reanalysis for 2016, now ongoing project for 2018-2022 with UFS-Aerosols model and NOAA-SNPP VIIRS AOD 550nm retrievals.

NARA v.1 Evaluations and Comparisons

AOD 500nm: Free Run and NARA v.1 vs. AERONET

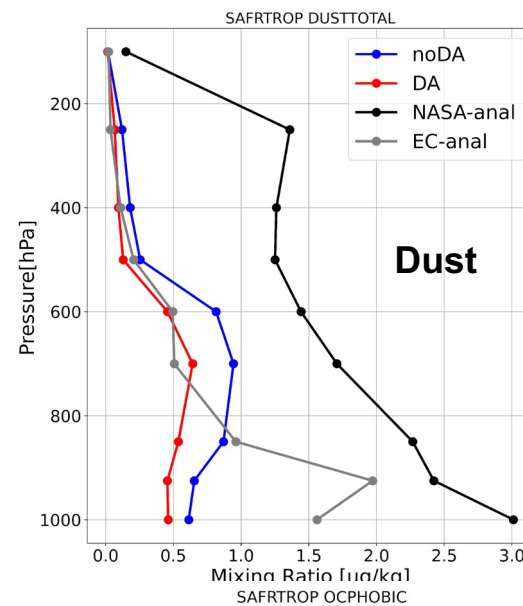
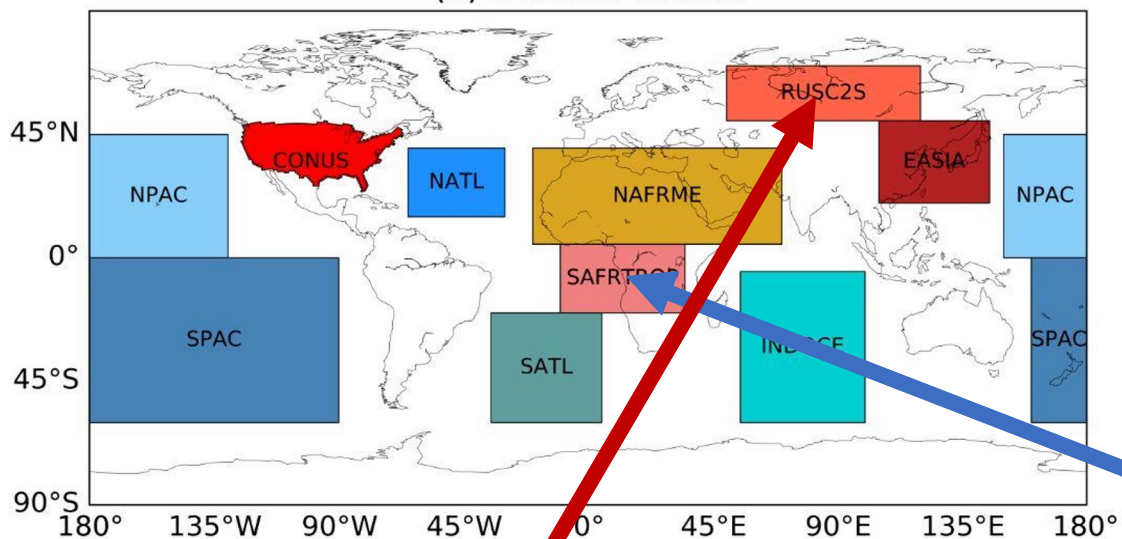


AOD 550nm: NARA v.1, MERRA-2, and CAMSRA June - August 2016

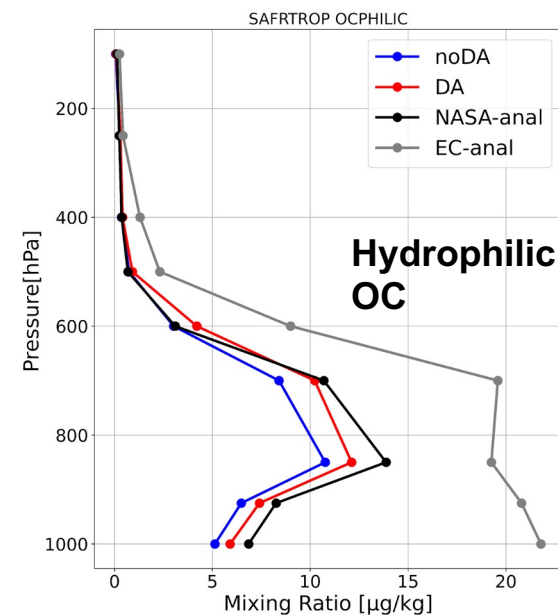
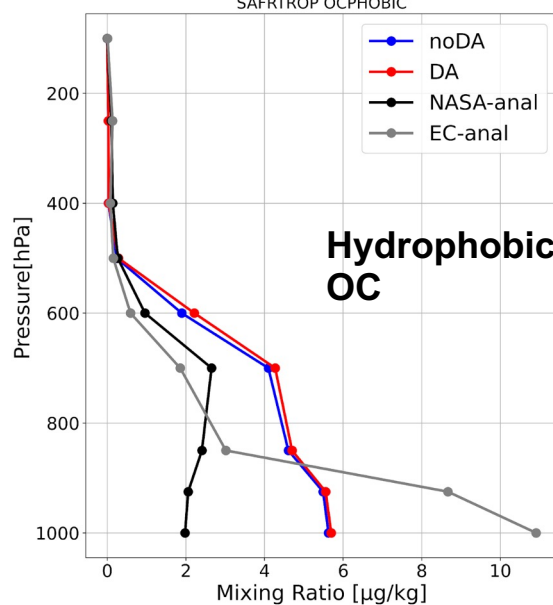
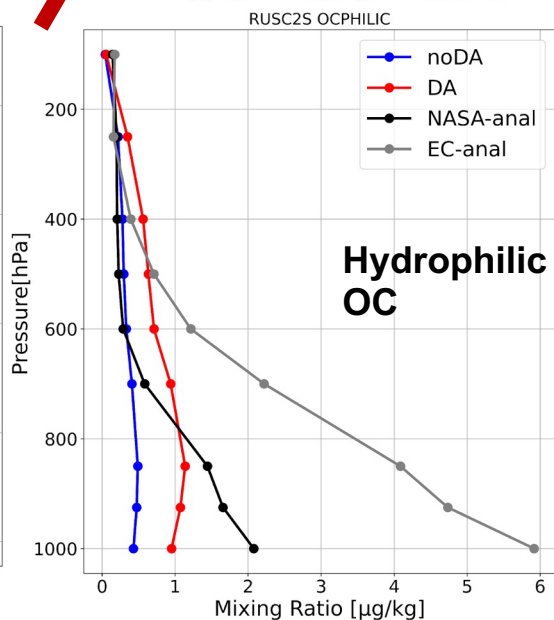
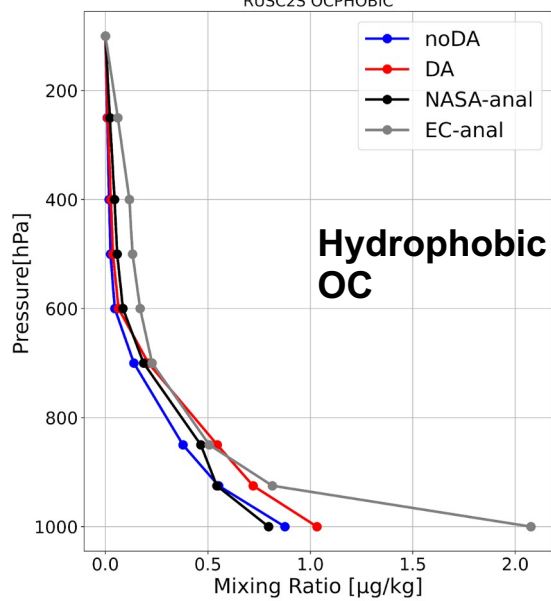


NARA v.1 Comparisons

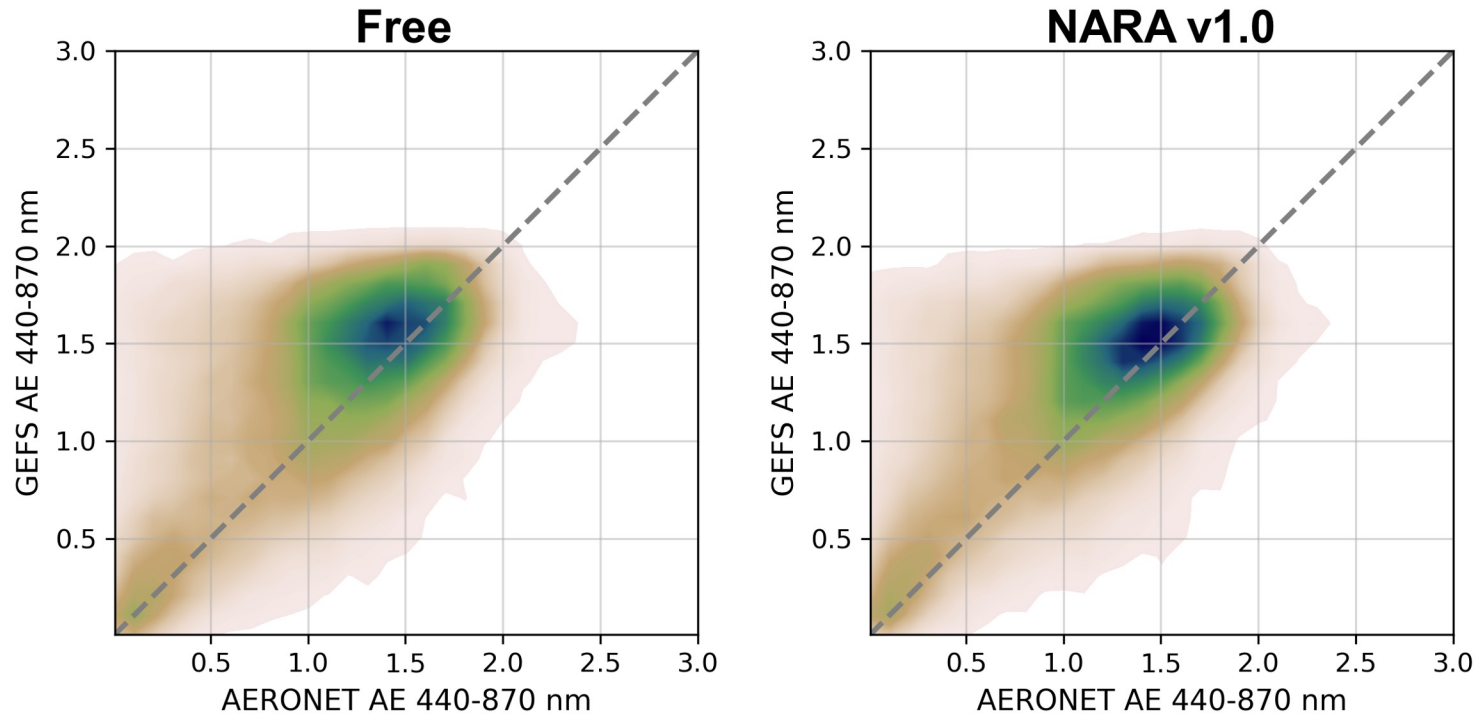
(a) Domain masks



Free Run
NARA v.1
MERRA-2
CAMSRA



NARA v.1 vs. AERONET



$$AE(\lambda_1, \lambda_2) = - \frac{\log(AOD(\lambda_1)/AOD(\lambda_2))}{\log(\lambda_1/\lambda_2)}$$

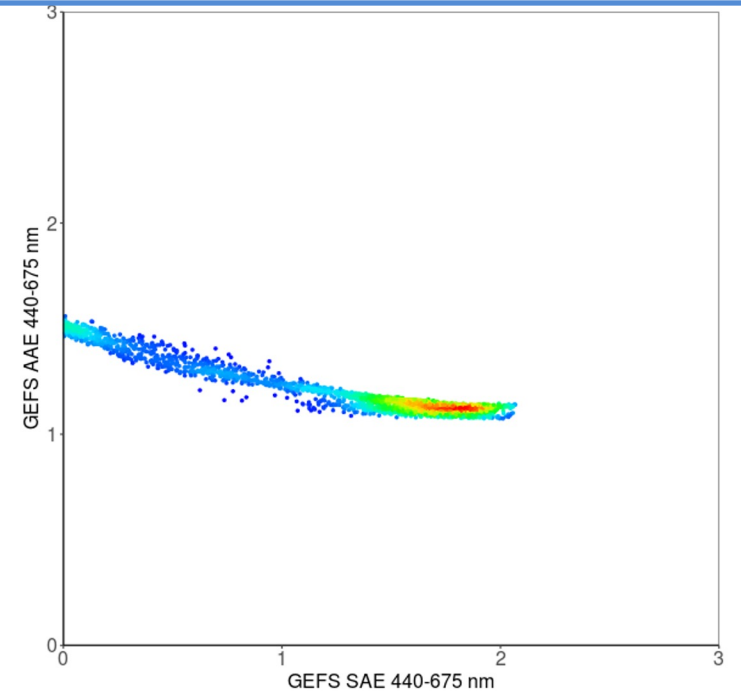
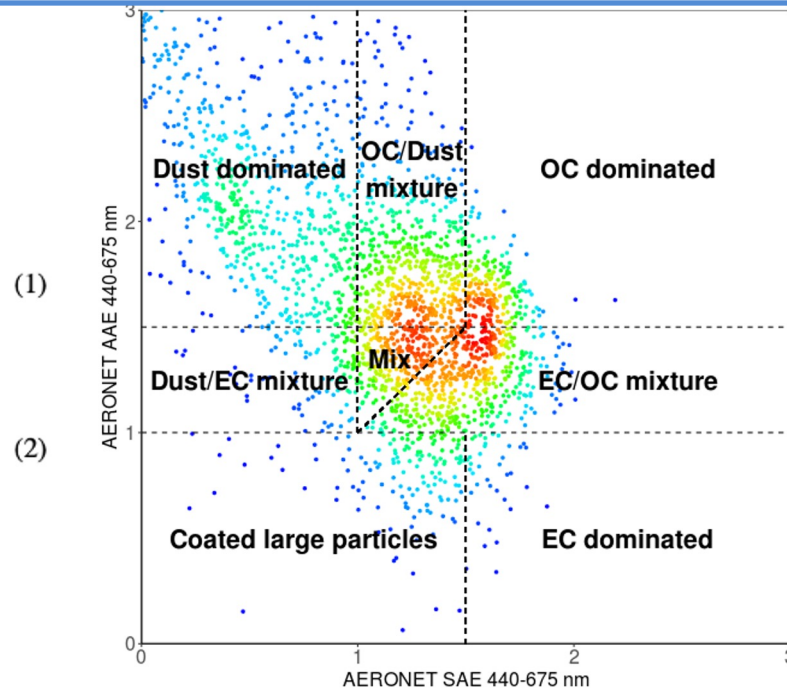
Ångström Exponent

- Large scatter against AERONET.
- Marginal impact of the assimilation of AOD 550 nm on AE i.e. size distribution and composition of particles.

NARA v.1 vs. Almucantar AERONET

$$AAE = -\frac{\log\left(\frac{AAOD(\lambda_1)}{AAOD(\lambda_2)}\right)}{\log\left(\frac{\lambda_1}{\lambda_2}\right)}$$

$$SAE = -\frac{\log\left(\frac{SAOD(\lambda_1)}{SAOD(\lambda_2)}\right)}{\log\left(\frac{\lambda_1}{\lambda_2}\right)}$$

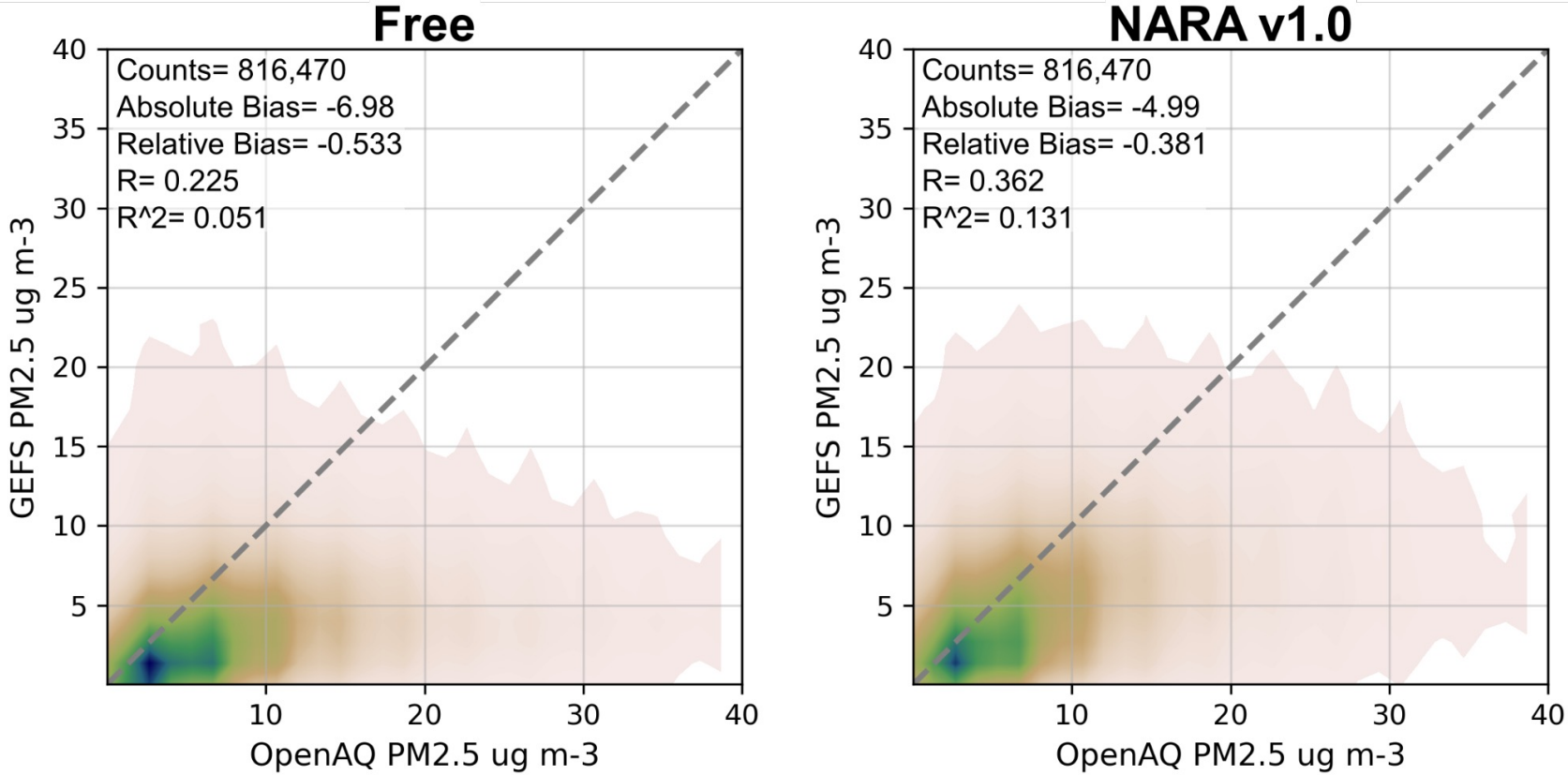


Absorption Ångström Exponent - expression of aerosol composition
Scattering Ångström Exponent - expression of particle size distribution

(Cazorla et al., Atmos. Chem. Phys., 13, 9337–9350, 2013)

- Poor representation of absorption by aerosols in the model.
- As on the previous page, assimilation of AOD 550 nm has practically no impact on size distribution of particles and their composition (Free Run, not shown, nearly identical to the analysis).
- How accurately can impact of aerosols on radiation be represented in this model?

NARA v.1 vs. OpenAQ



Equally poor or worse statistics for aerosol species vs. IMPROVE network over North America

Summary

- Reanalyses differ markedly when the actual concentrations of aerosol species are compared though they tend to concur on AOD 550nm.
- Bulk aerosol schemes such as GOCART have poor representation of aerosol absorption.
- These two conclusions put in doubt accuracy of modeling aerosol-meteorology interactions with the current parameterizations.