



# **Simultaneous Three-dimensional Variational Assimilation of Surface Fine Particulate Matter and MODIS Aerosol Optical Depth**

**Craig Schwartz, Zhiquan Liu, Hui-Chuan Lin  
NCAR/NESL/MMM**

**Stuart McKeen  
NOAA/ESRL, CIRES**

# Introduction

- Improve WRF-Chem aerosol forecasts by assimilating aerosol-related observations
- Assimilated 550 nm *aerosol optical depth (AOD)* from MODIS sensors onboard Aqua and Terra satellites
- Assimilated *surface  $PM_{2.5}$  observations* from the AIRNow network
- Assimilated these observations both individually and *concurrently*

# GOCART aerosol module

•The GOCART aerosol module is available within the WRF-Chem model and produces forecasts for **14 aerosol species**:

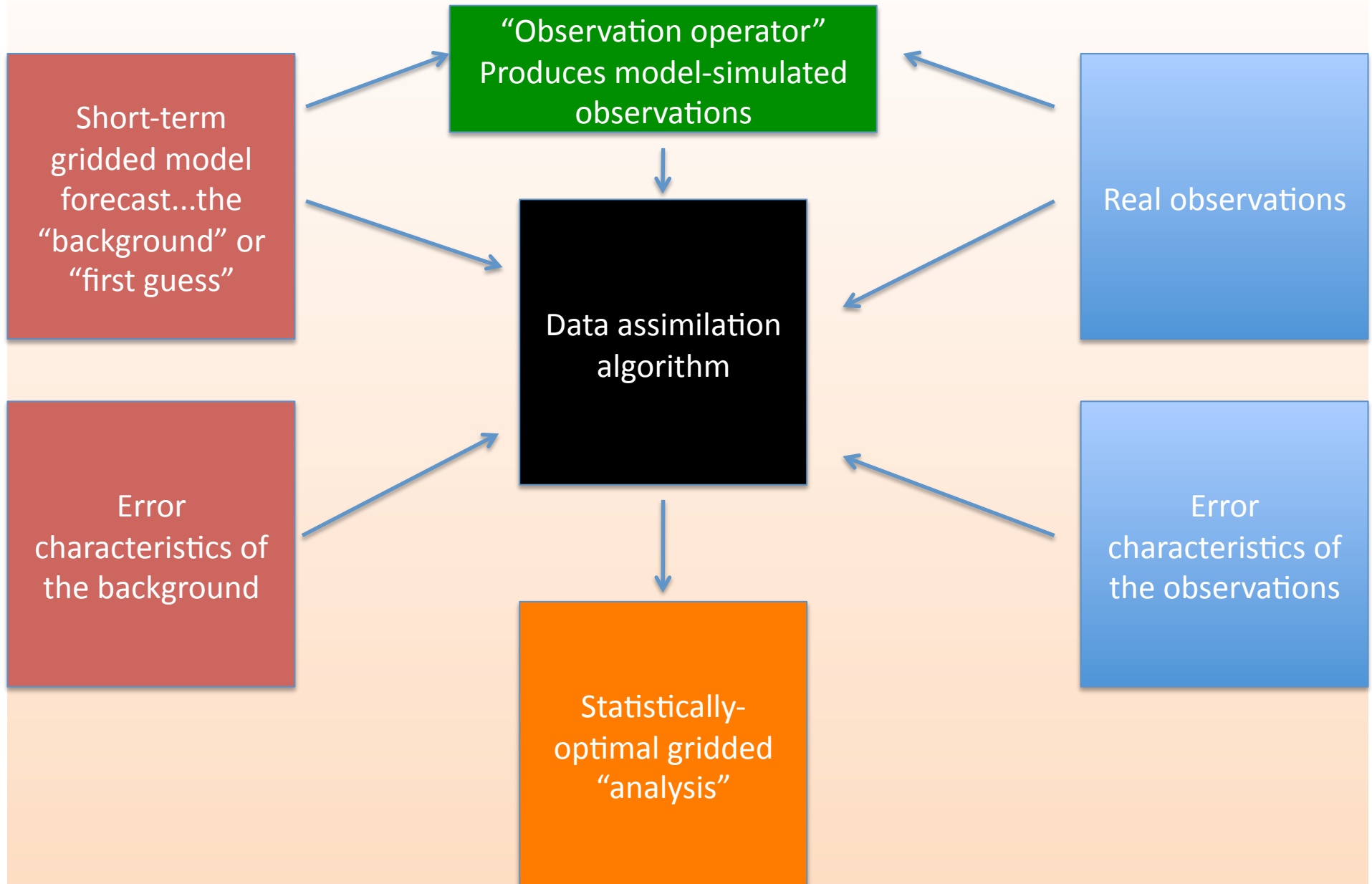
- Hydrophobic and hydrophilic organic carbon
- Hydrophobic and hydrophilic black carbon
- Sulfate
- Dust in 5 particle-size bins
- Sea salt in 4 particle-size bins



•Also produces forecasts of **unspeciated** contributions to  $PM_{2.5}$  when run within WRF-Chem

•The 3D GOCART fields can be used in data assimilation

# What is data assimilation?





# Assimilation concept

- Direct AOD and surface  $\text{PM}_{2.5}$  data assimilation with one-step procedure using NCEP's Gridpoint Statistical Interpolation (GSI) 3DVAR system
- Use the GOCART variables to derive model-simulated AOD and  $\text{PM}_{2.5}$  observations (at the observation locations)
- The community radiative transfer model (CRTM) was used to produce model-simulated observations of AOD



# Experimental design

- Four experiments

- 1) No data assimilation (continuous WRF-Chem forecast)
- 2) Assimilated surface  $\text{PM}_{2.5}$  observations
- 3) Assimilated 550 nm MODIS AOD observations
- 4) Assimilated both 550 nm MODIS AOD and surface  $\text{PM}_{2.5}$  observations

- Cyclic data assimilation with 6-hr cycles beginning 0000 UTC 01 June, ending 1800 UTC 14 July 2010 (~45 days)

- All 1800 UTC analyses initialized 48-hr WRF-Chem forecasts

- Meteorological initial and boundary conditions updated each cycle for all experiments from the 20-km NAM

- $\text{PM}_{2.5}$  observations assimilated each cycle, but 550 nm AOD observations primarily available at 1800 UTC

# Model configurations

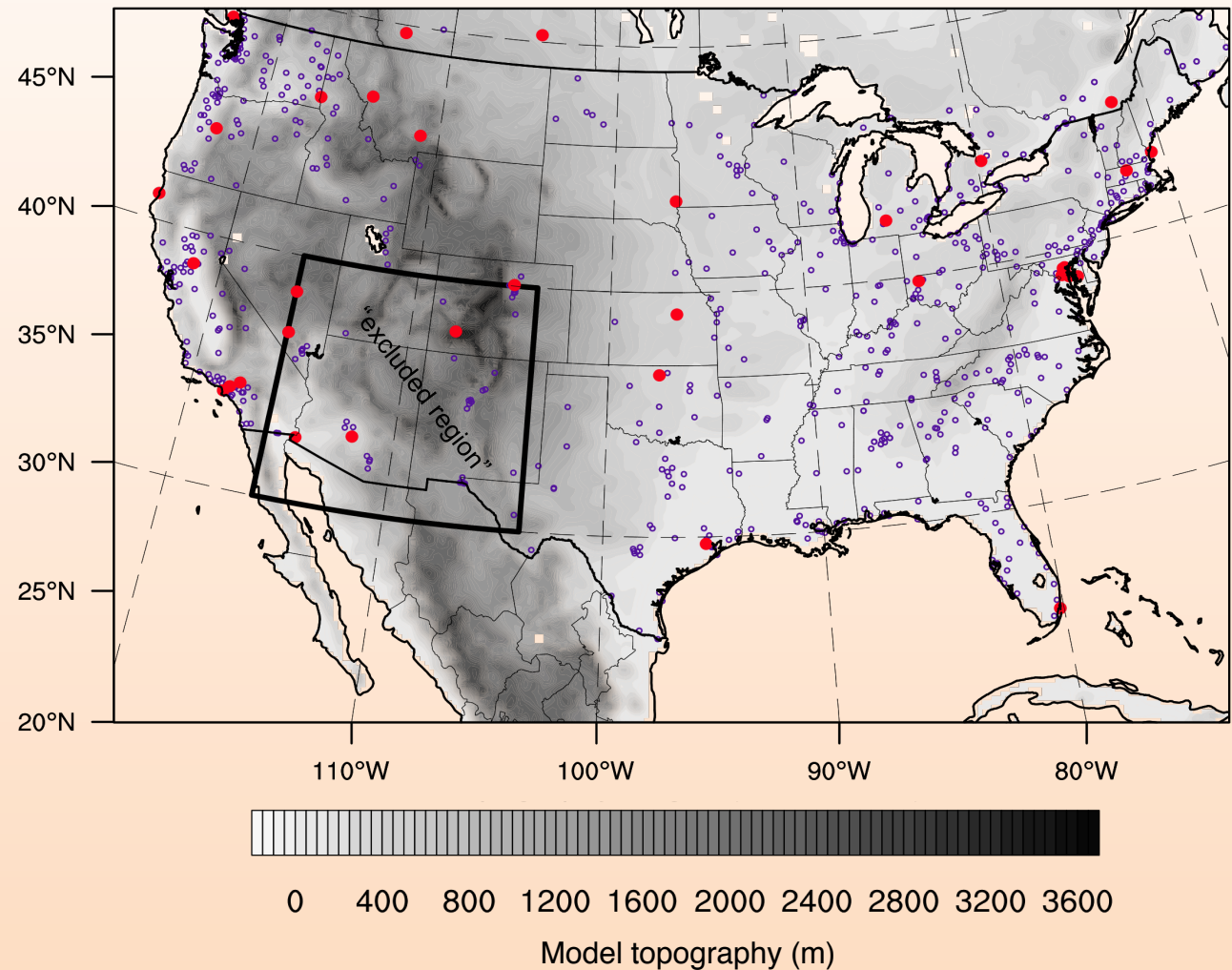
- Version 3.3 of WRF-Chem
- 20-km horizontal grid spacing, 41 vertical levels, 50 hPa top
- Simple GOCART chemistry (chem\_opt = 300)
- U.S. EPA NEI-2005 anthropogenic emissions
- Full set of meteorological parameterizations:
  - YSU PBL
  - WSM5 microphysics
  - RRTM longwave radiation
  - Goddard shortwave radiation
  - Noah land surface model
  - Grell-3D cumulus parameterization



“Worf” from Star Trek

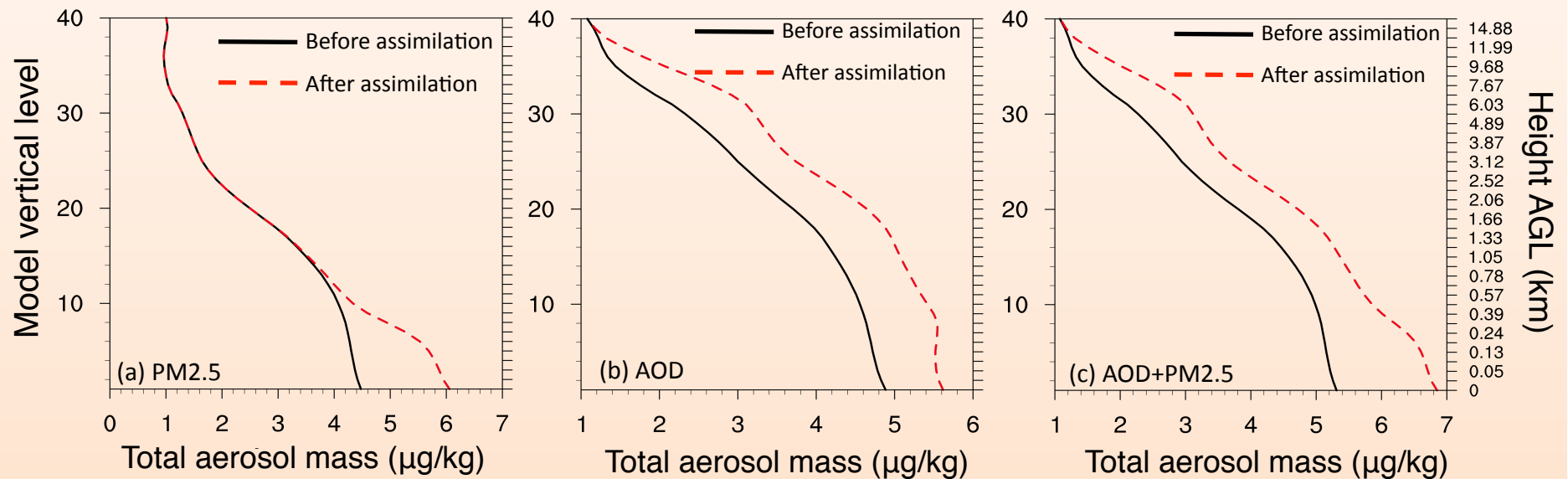
# Computational domain

- Purple dots: AIRNow sites with PM<sub>2.5</sub> measurements
- Red dots: AERONET sites with AOD measurements



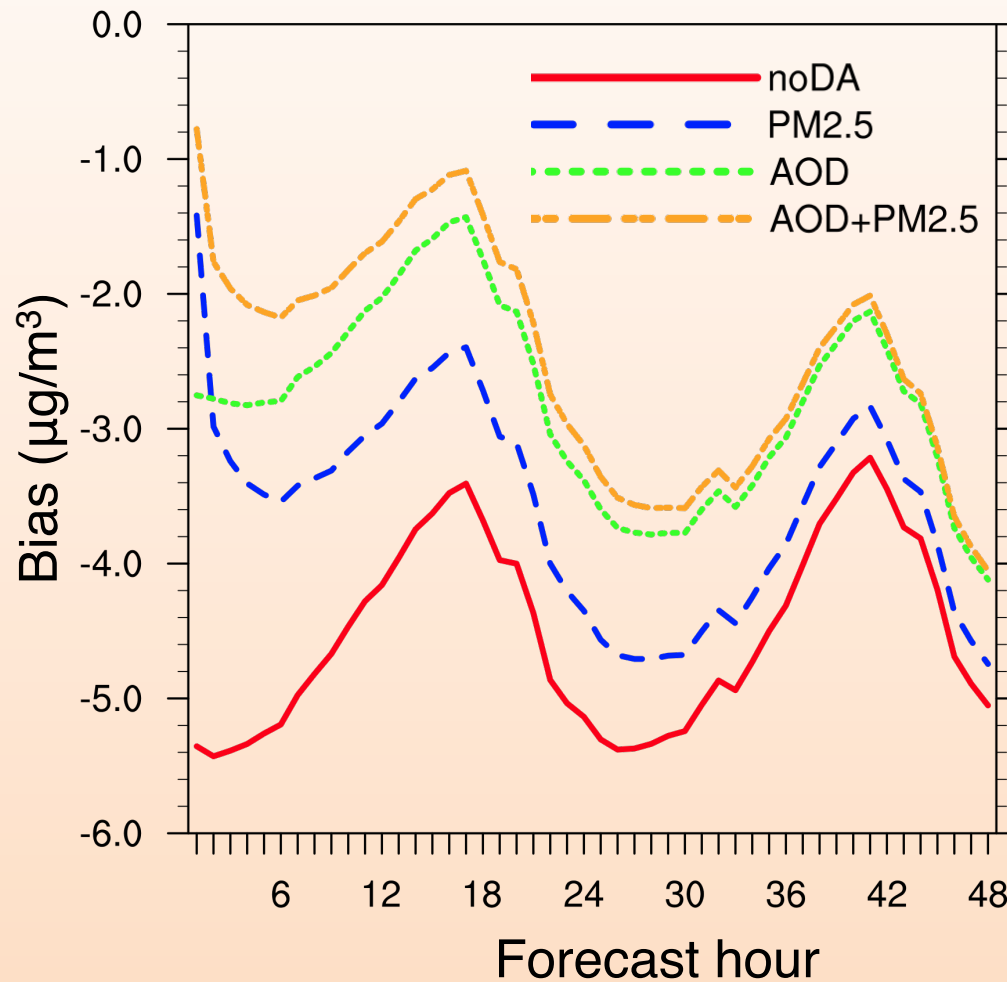
# Mean PM<sub>2.5</sub> concentrations

- Domain average PM<sub>2.5</sub> concentrations, averaged over all 1800 UTC analyses



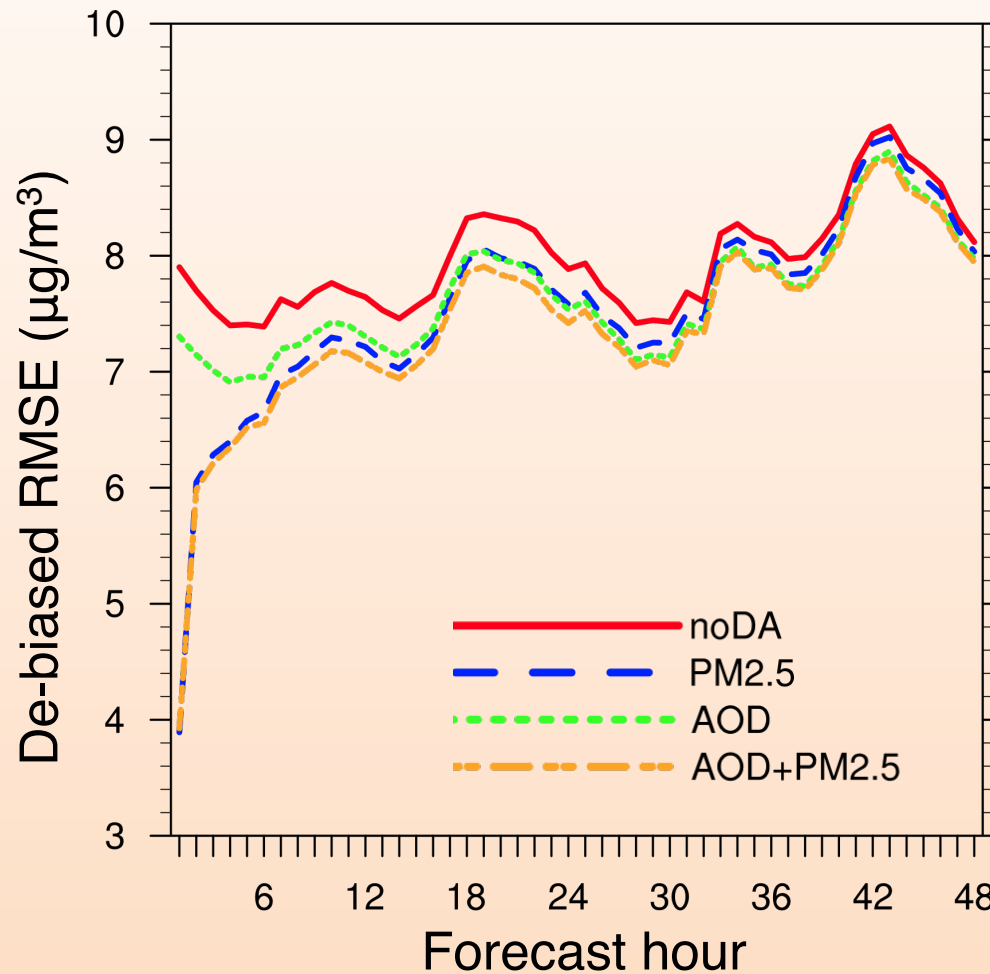
## Aggregate bias for PM<sub>2.5</sub>

- Domain averaged and aggregated over all 1800 UTC forecasts



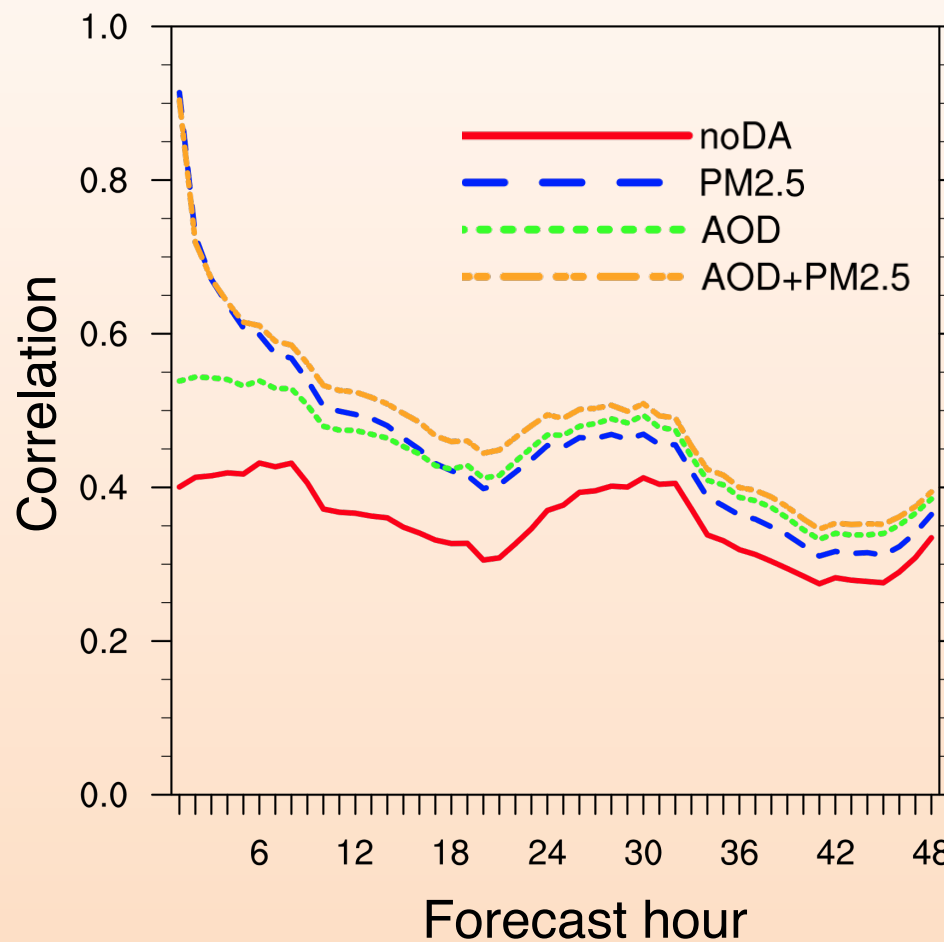
# Aggregate de-biased RMSE for PM<sub>2.5</sub>

- Domain averaged and aggregated over all 1800 UTC forecasts



# Aggregate correlation for PM<sub>2.5</sub>

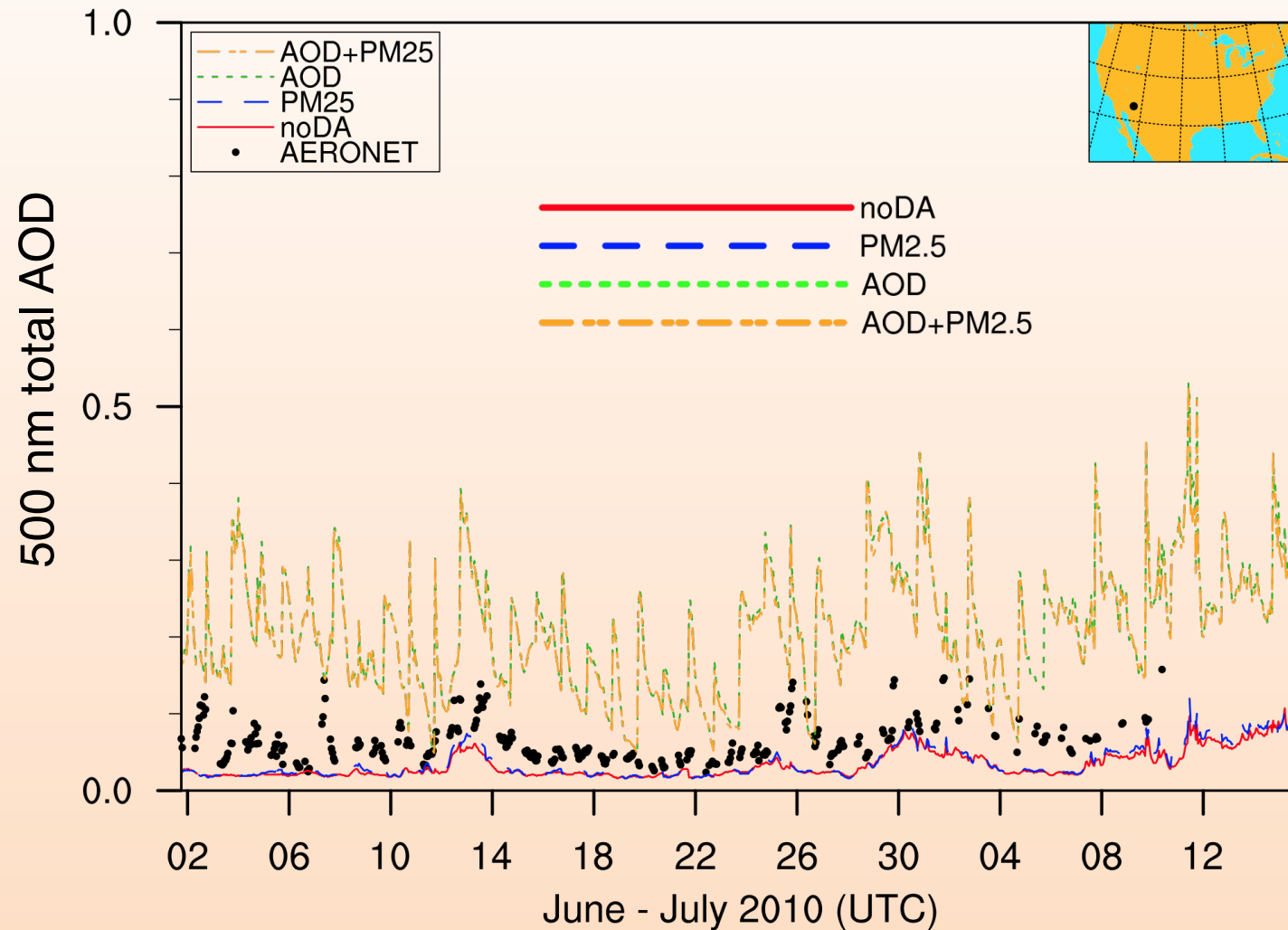
- Domain averaged and aggregated over all 1800 UTC forecasts





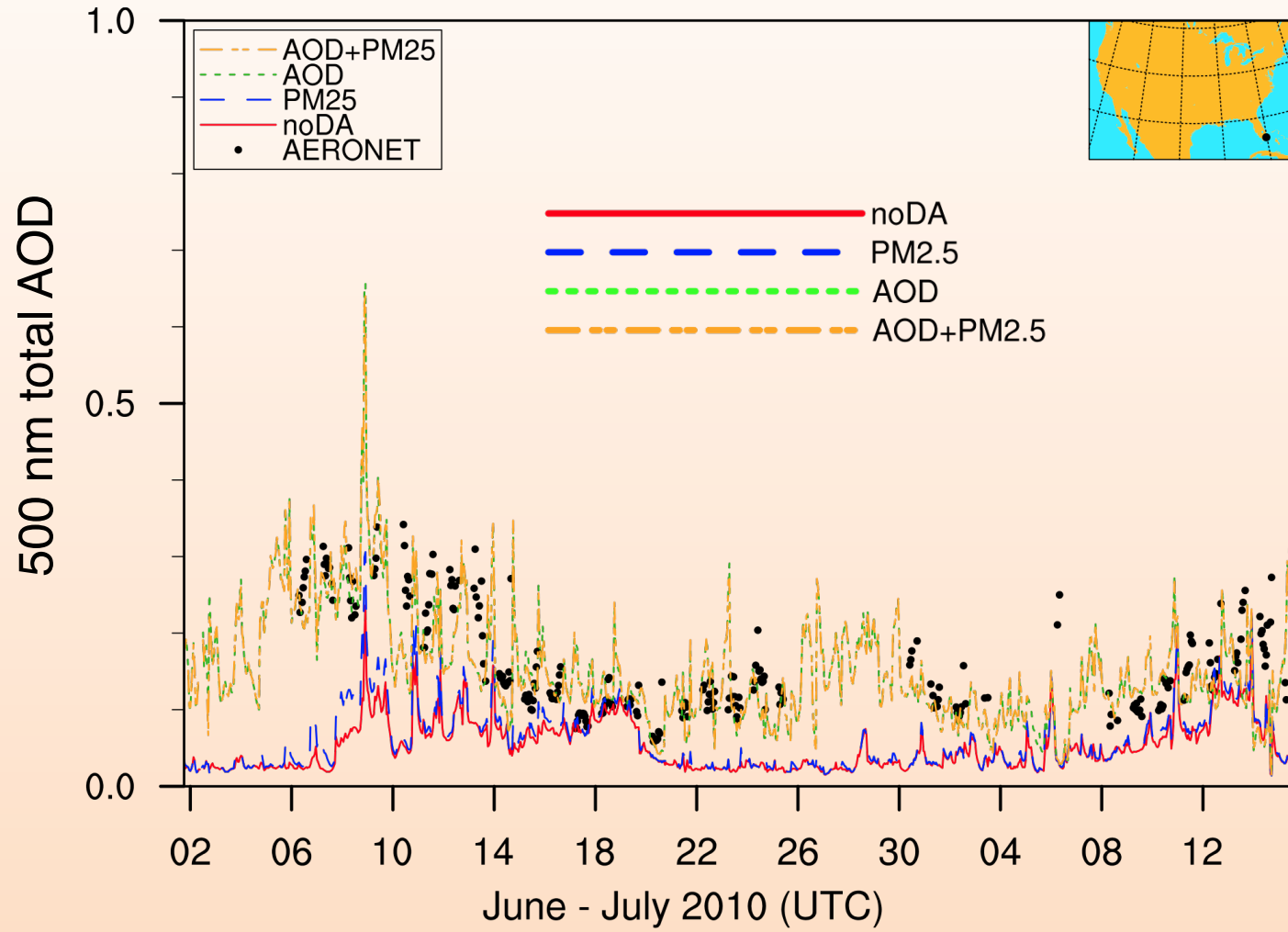
# AOD—Maricopa AERONET site

- Model curves are 0-23 hr forecasts initialized at 1800 UTC



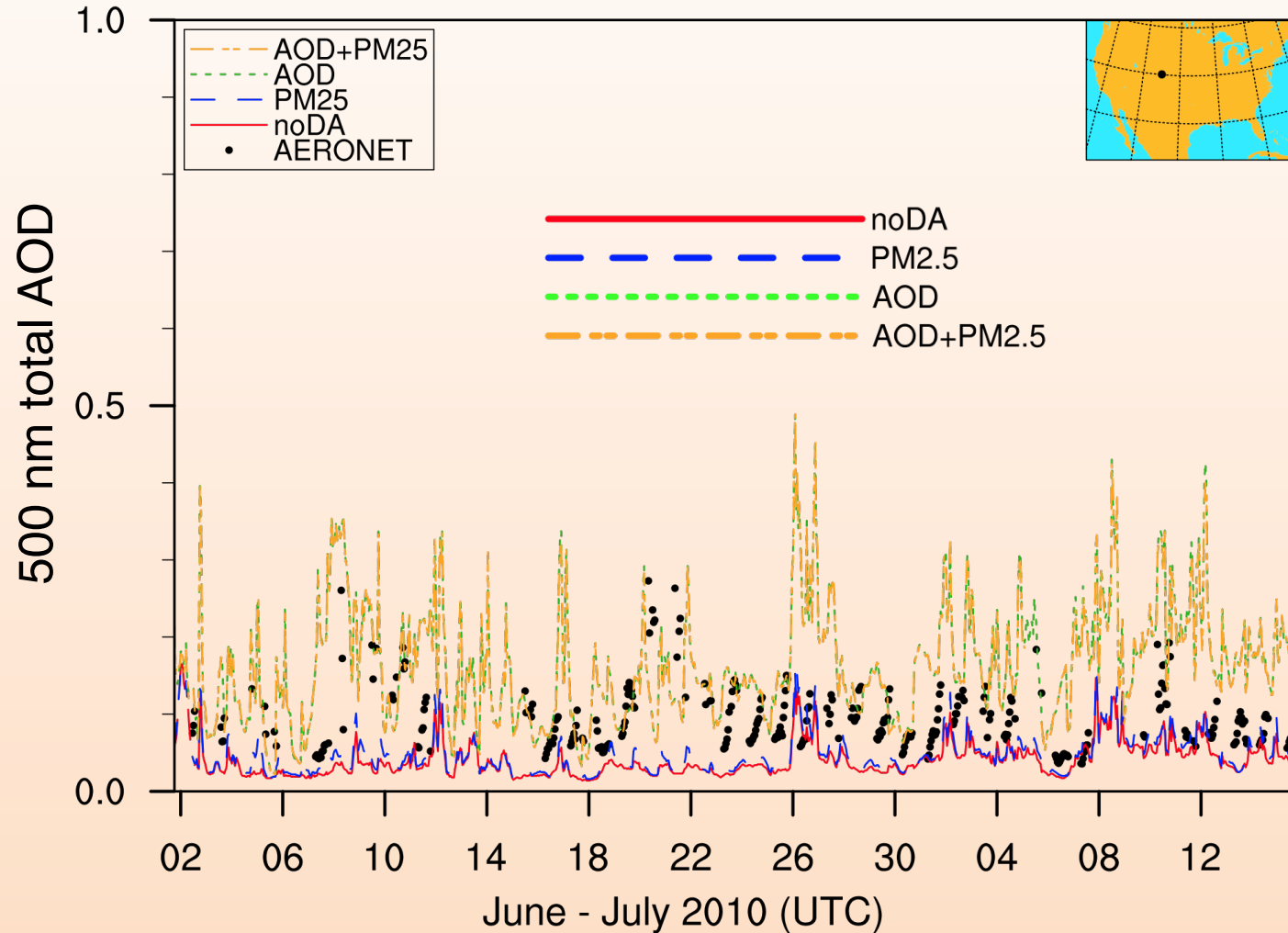
# AOD—Key Biscayne AERONET site

- Model curves are 0-23 hr forecasts initialized at 1800 UTC



## AOD—Boulder AERONET site

- Model curves are 0-23 hr forecasts initialized at 1800 UTC



## Conclusions

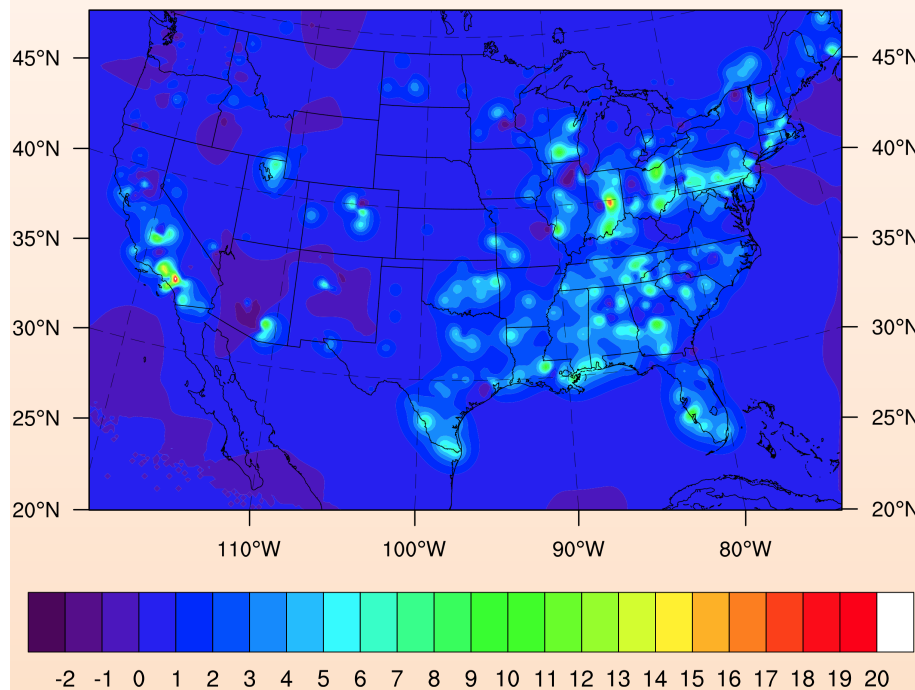
- Both individual and simultaneous assimilation of AOD and PM<sub>2.5</sub> observations improved surface PM<sub>2.5</sub> forecasts
- Assimilating AOD improved AOD forecasts
- Considering the overall aerosol forecasts, concurrent assimilation of both AOD and PM<sub>2.5</sub> unequivocally produced the best results
- See Schwartz et al. (2012) in JGR for more information



# Mean PM<sub>2.5</sub> analysis increments

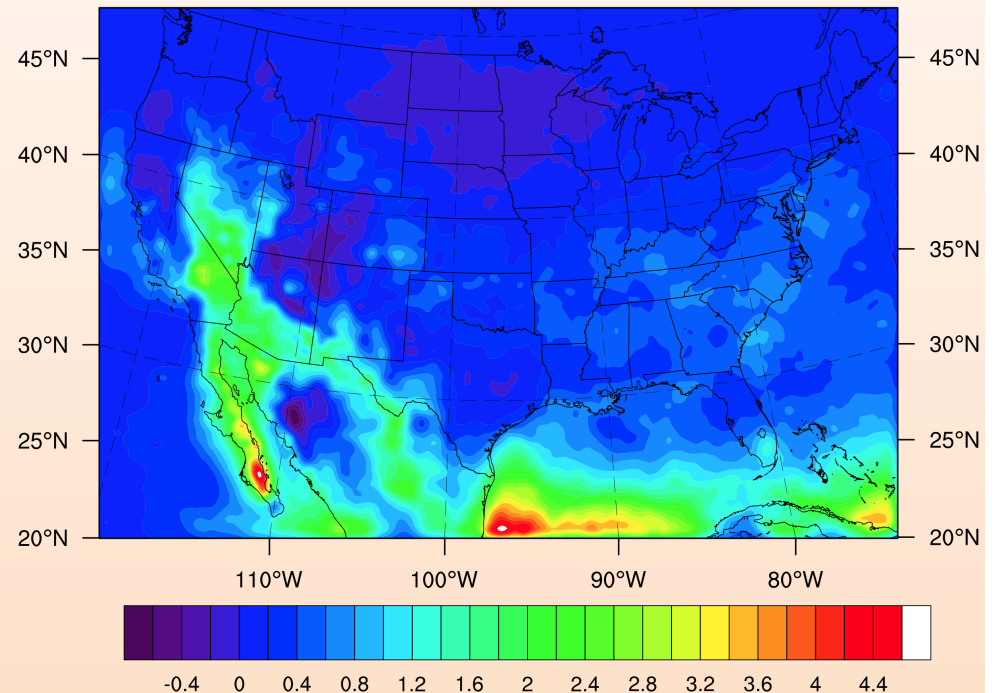
- PM<sub>2.5</sub> analysis increments averaged over all 1800 UTC analyses
- Lowest model level

PM<sub>2.5</sub> assimilation



Mean PM<sub>2.5</sub> increment (µg/m<sup>3</sup>)

AOD assimilation



Mean PM<sub>2.5</sub> increment (µg/m<sup>3</sup>)

# Mean AOD Bias

• 0-24-hr forecasts averaged over the entire period

