

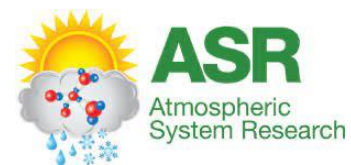


How Models Use (or Don't Use) Measurement Uncertainties

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October 10, 2024

Caveat: opinions expressed in this presentation are mine alone



Accounting for Measurement Uncertainty



- ▶ Modelers (mostly climate modelers) often treat aerosol measurements as “truth” with little to no discussion about measurement uncertainty and how it might impact the conclusions of their studies.
 - *Some aerosol instruments/measurement have relatively more uncertainty*
 - *The same instrument operated by different people / organizations and procedures could produce different levels of uncertainty*
- ▶ What is most useful is a single number describing measurement uncertainty, i.e., $\pm X \mu\text{g m}^{-3}$, $\pm X \%$, etc., (assuming random errors)
 - *Uncertainty that varies in time or space would be harder to account for*
- ▶ If a modeling paper accounts for measurement uncertainty, it is usually done by adding error bars. But often omitted if plots get too “cluttered / busy”.
- ▶ Reviewers could/should ask for this information, but often do not
 - *An issue for the modeling community as a whole*

Example: MAM4 Development

Geosci. Model Dev., 9, 505–522, 2016
www.geosci-model-dev.net/9/505/2016/
doi:10.5194/gmd-9-505-2016
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Geoscientific
Model Development



Description and evaluation of a new four-mode version of the Modal Aerosol Module (MAM4) within version 5.3 of the Community Atmosphere Model

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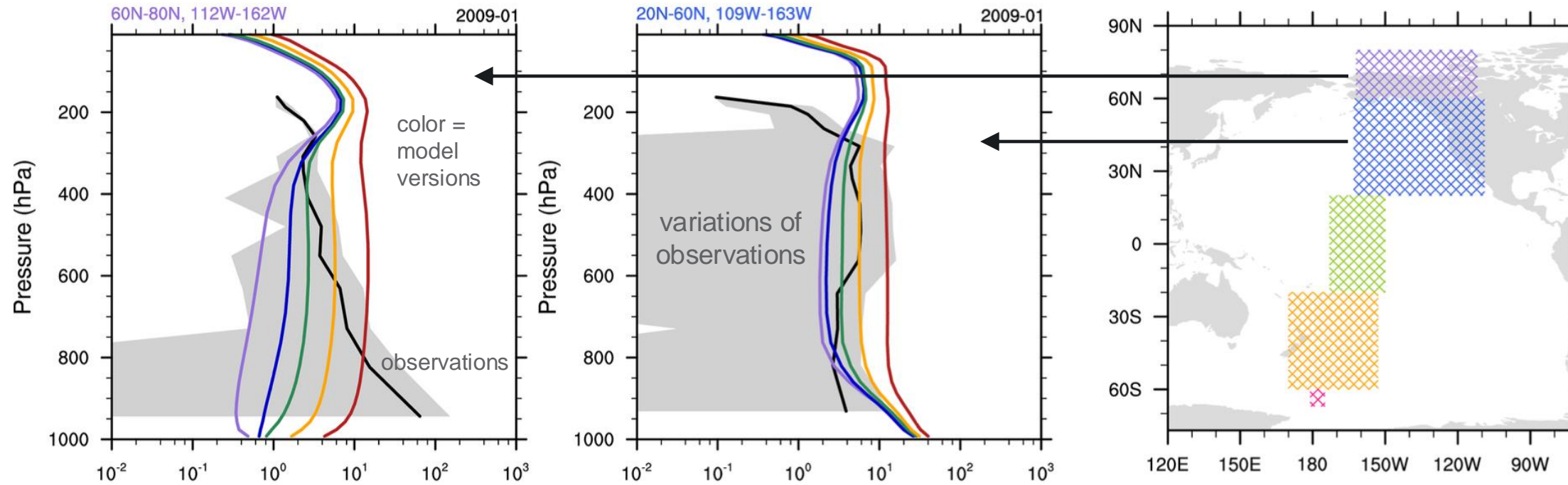
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Documentation of the current version of the Model Aerosol Model (MAM) now used in E3SM

Focuses on BC predictions since model parameterizes chemical aging to include hydrophobic and hydrophilic BC

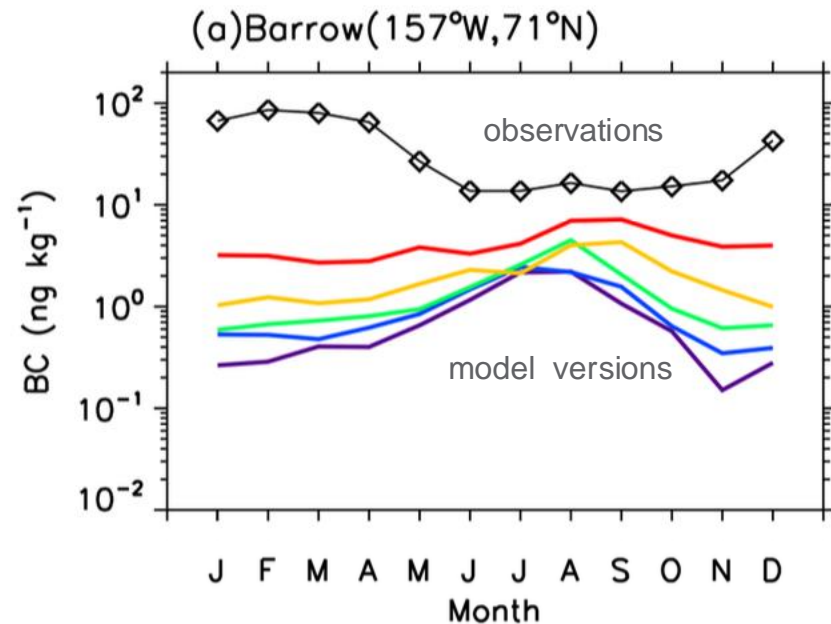
- ▶ Aircraft (7 campaigns) and surface observations (4 sites) used to evaluate aerosol predictions
- ▶ No mention of measurement uncertainty of BC measurements
- ▶ BC instruments likely different between aircraft campaigns and various measurement sites, so measurement uncertainty likely different as well

Example: MAM4 Evaluation



portion of
HIPPO flights

model means
over a box,
but aircraft
over flight
track



- ▶ Would be useful to include error bars quantifying measurement uncertainty, but in this case model errors are likely much larger than measurement uncertainties
- ▶ Not sure that cut-off sizes were for the BC instruments, and how that was accounted for when comparing with predictions

Example: E3SM Diagnostics

Geosci. Model Dev., 15, 4055–4076, 2022

<https://doi.org/10.5194/gmd-15-4055-2022>

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Geoscientific
Model Development



Earth System Model Aerosol–Cloud Diagnostics (ESMAC Diags) package, version 1: assessing E3SM aerosol predictions using aircraft, ship, and surface measurements

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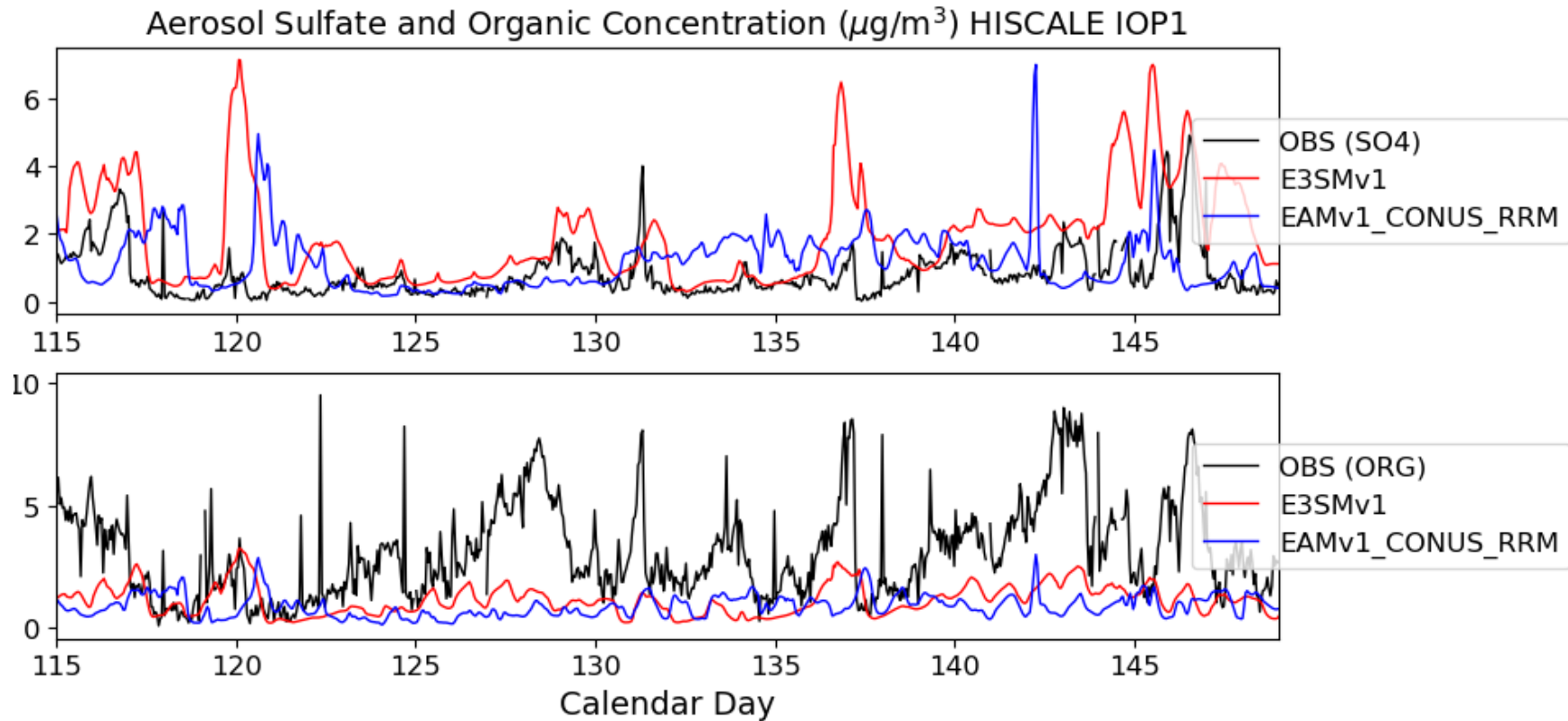
Documentation of new E3SM diagnostics package using ARM data

Version 2 now available that includes ACI metrics

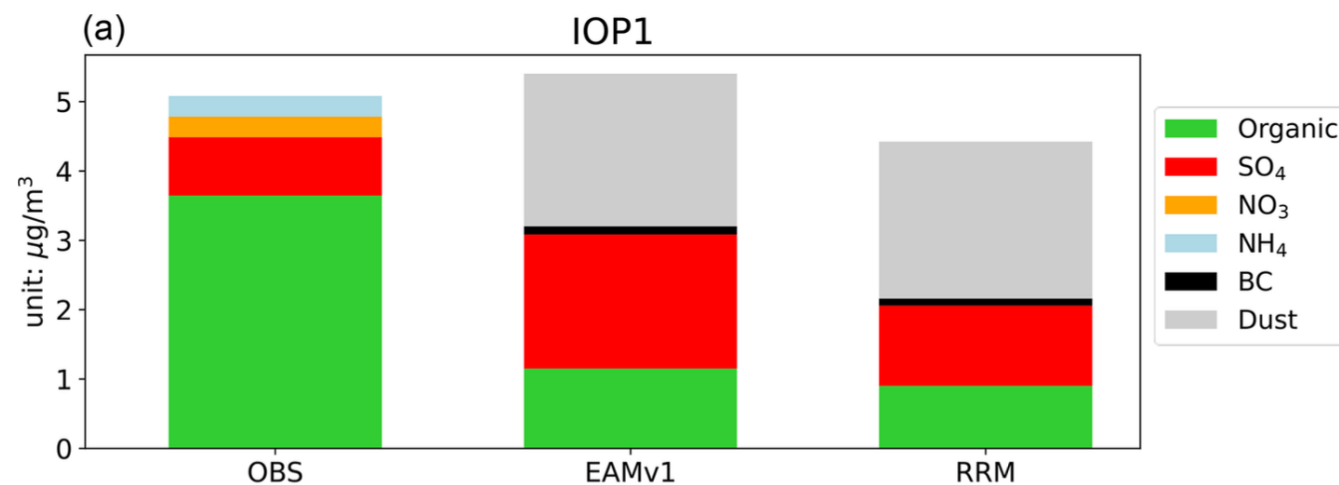
- ▶ Series of aircraft, ship, and surface “simulators” and automated statistics and plots
- ▶ Creates apples-to-apples comparisons, e.g., having same cut off sizes for ACSM measurements and predictions that use modal size distributions
- ▶ Does not account for measurement uncertainty. Assumes statistical measures of variation are larger than measurement uncertainty

Example: E3SM Evaluation

Plot generated by ESMAC Diags



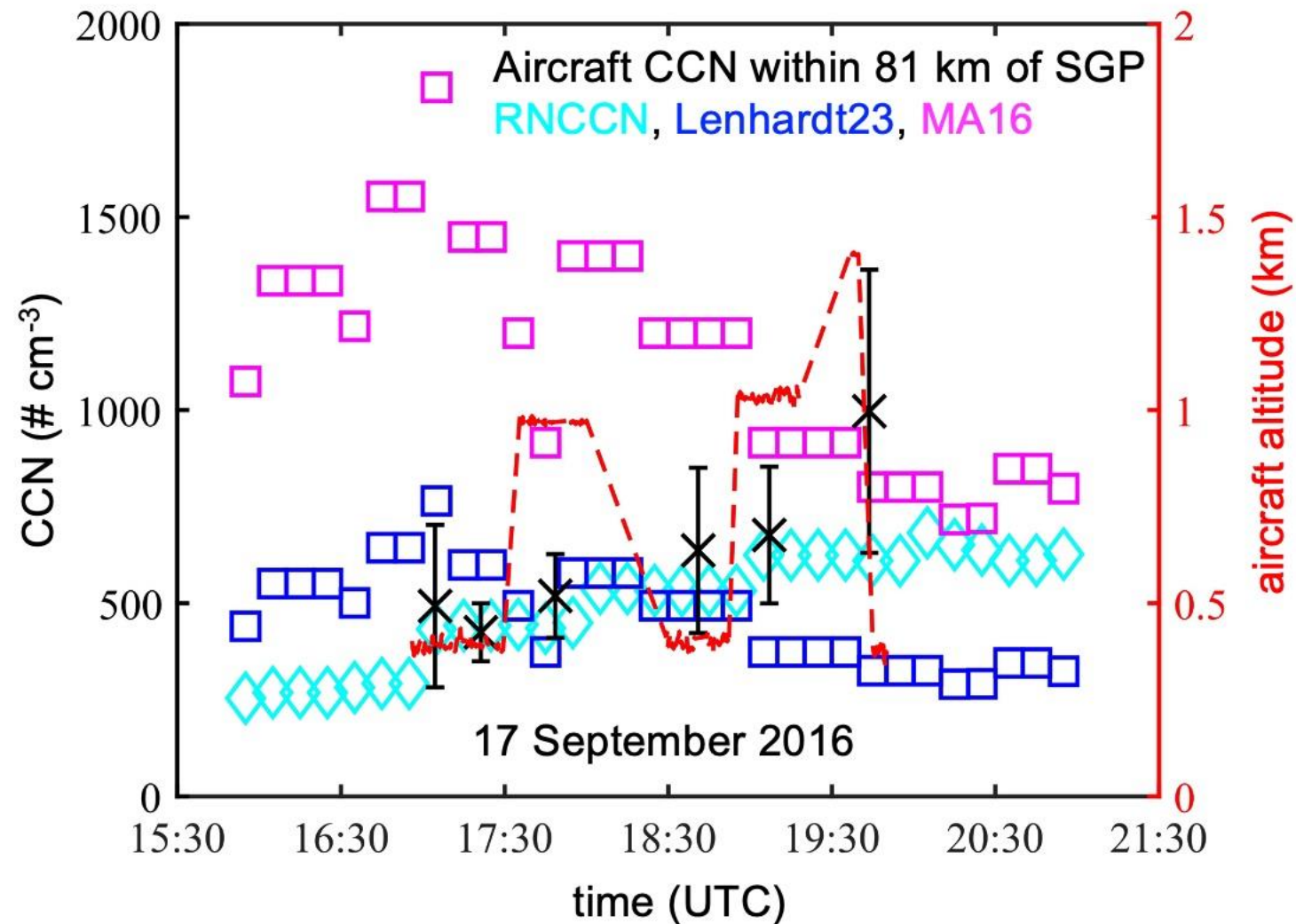
- ▶ Comparison between ACSM and model predictions for HI-SCALE campaign
- ▶ Would be useful to include error bars quantifying measurement uncertainty (uncertainty due to spatial representativeness is another story)



- ▶ How does one best communicate measurement uncertainty in these types of plots that summarize all data?

Example: Derived Measurements

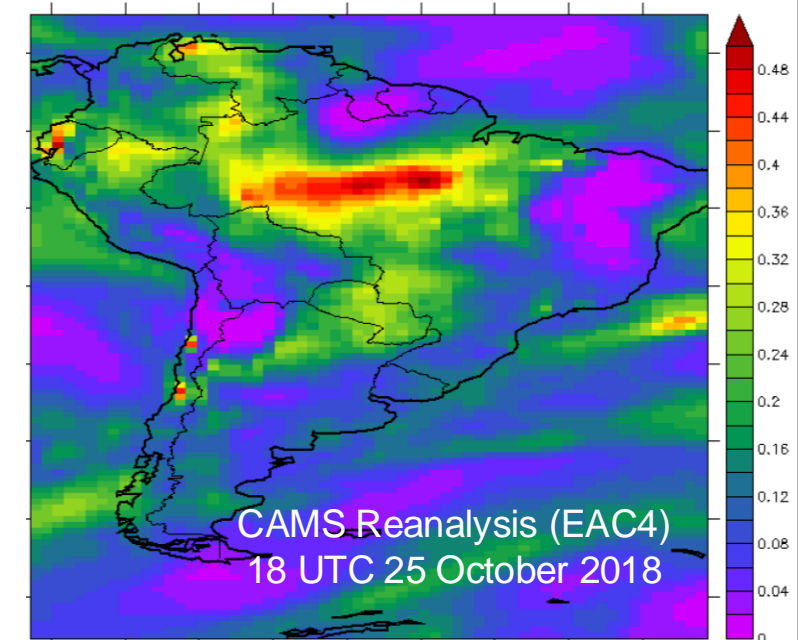
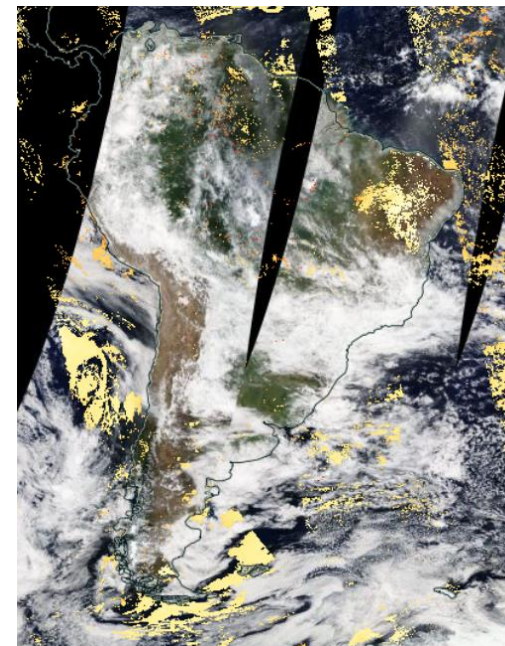
RNCCN Vertical CCN profile VAP
evaluated against in situ CCN
measurements



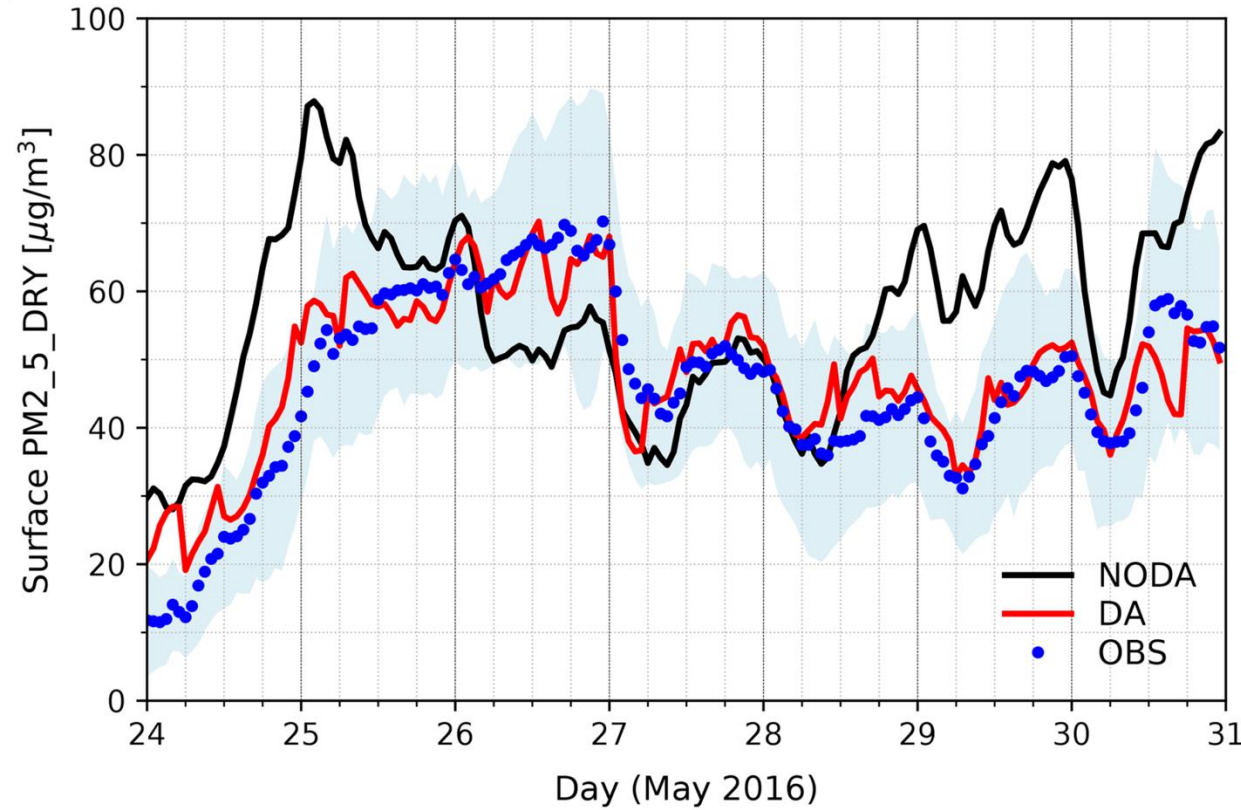
- ▶ Some VAPs are based on multiple datastreams, each with their own measurement uncertainty
- ▶ How is VAP uncertainty defined and is that more complicated for modelers to understand?

Data Assimilation

- ▶ Data assimilation (DA) approaches “nudge” model predictions towards observations
- ▶ Measurement (also spatial representativeness) uncertainty becomes very important when using DA ... goes directly into complicated mathematical equations
- ▶ Weather models have sophisticated DA schemes that account for known measures of uncertainty for a wide range of meteorological instrumentation (in situ vs satellite)
- ▶ DA for aerosols is still in its infancy, in part because the spatiotemporal availability of aerosol measurements is far less than for meteorological quantities
- ▶ Some global aerosol models use DA using satellite AOD that subsequently makes assumptions to apportion AOD increments to aerosol specie mass
- ▶ Some groups exploring DA using surface PM_{2.5} networks

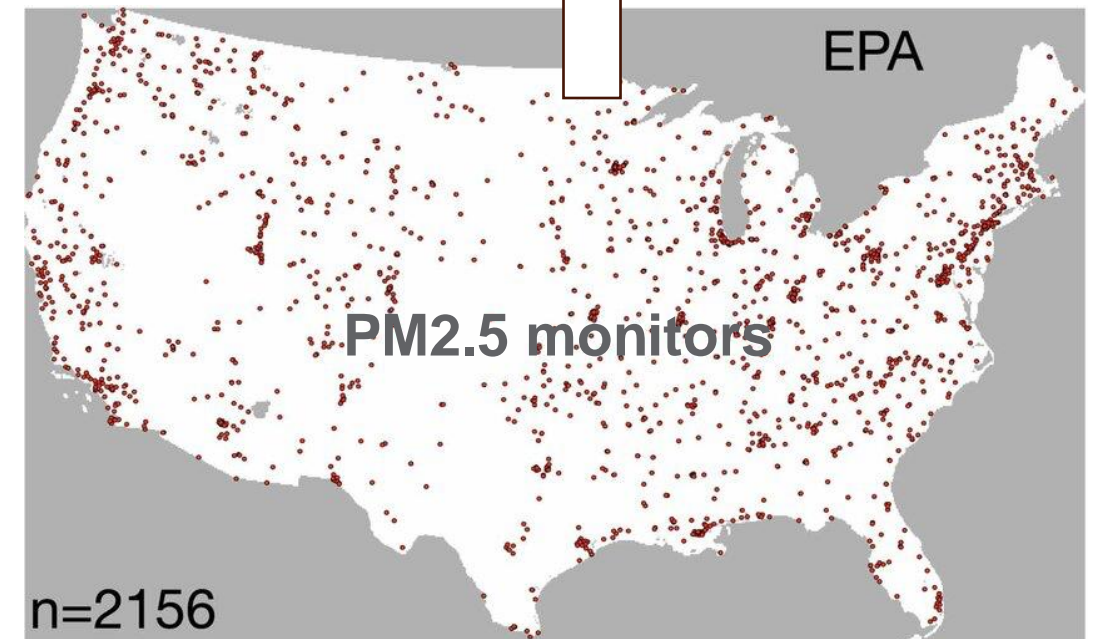
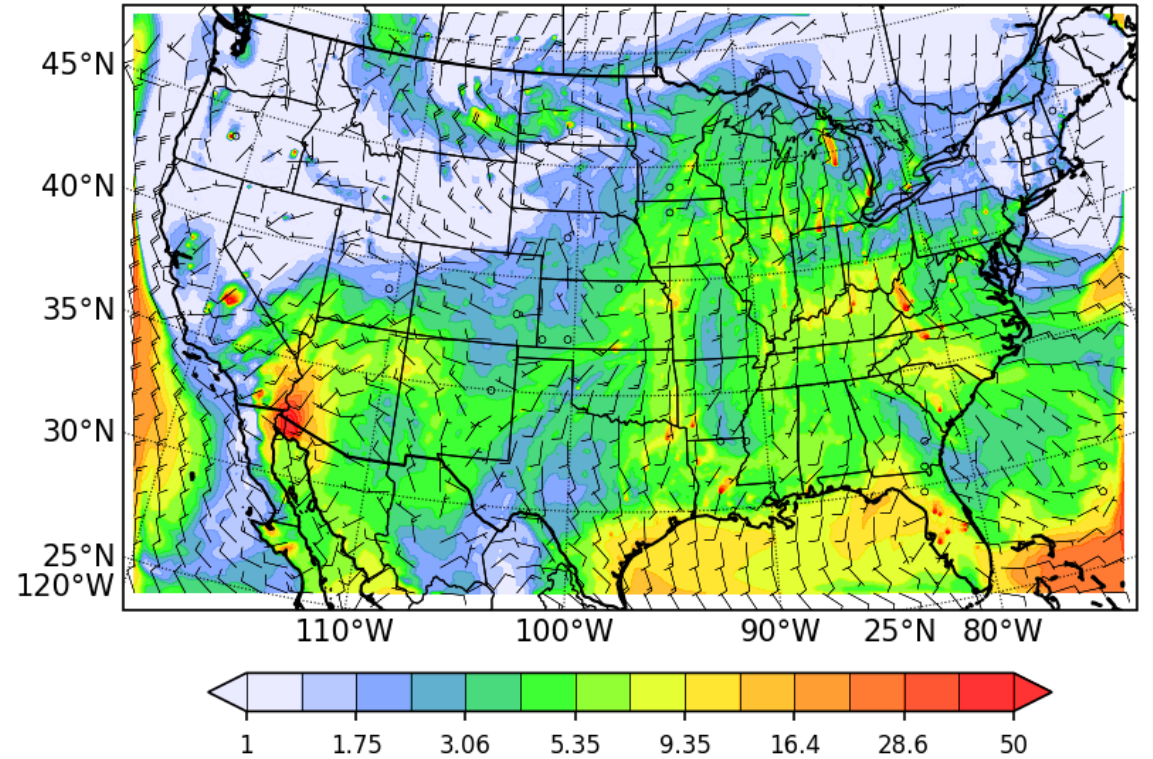


Example: WRF-Chem



- ▶ Assume DA improves PM2.5 prediction between observation stations
- ▶ Use DA to improve initial conditions or create aerosol analyses
- ▶ What happens above the surface?

PM2_5_DRY_SFC at surface 2024-06-28 23:00 ($\mu\text{g}/\text{m}^3$)
Forecast initialized at: 2024-06-28 00:00 UTC



What's the Future?

- ▶ Even though modelers do not use measurement uncertainty in their analysis as much as they should, having that information is still important
- ▶ Need to make measurement uncertainty easy to find
- ▶ Future DA efforts with aerosols will need this information

Note: Measurement Uncertainty \neq Observational Uncertainty (which is often used by global modelers)

In journal articles, “observational uncertainty” often refers to variations of observations within a region ... so it is more like a statement of spatial variability. This is used for meteorological quantities, but less so for aerosol properties.