

Update on the NASA GEOS Aerosol Modeling Activities

Peter Colarco

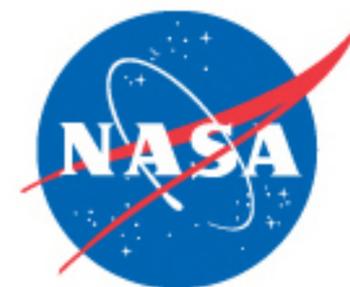
NASA GSFC, Atmospheric Chemistry and Dynamics Laboratory

with contributions from:

Arlindo da Silva, Patricia Castellanos, Anton Darmenov, Virginie Buchard (GMAO)

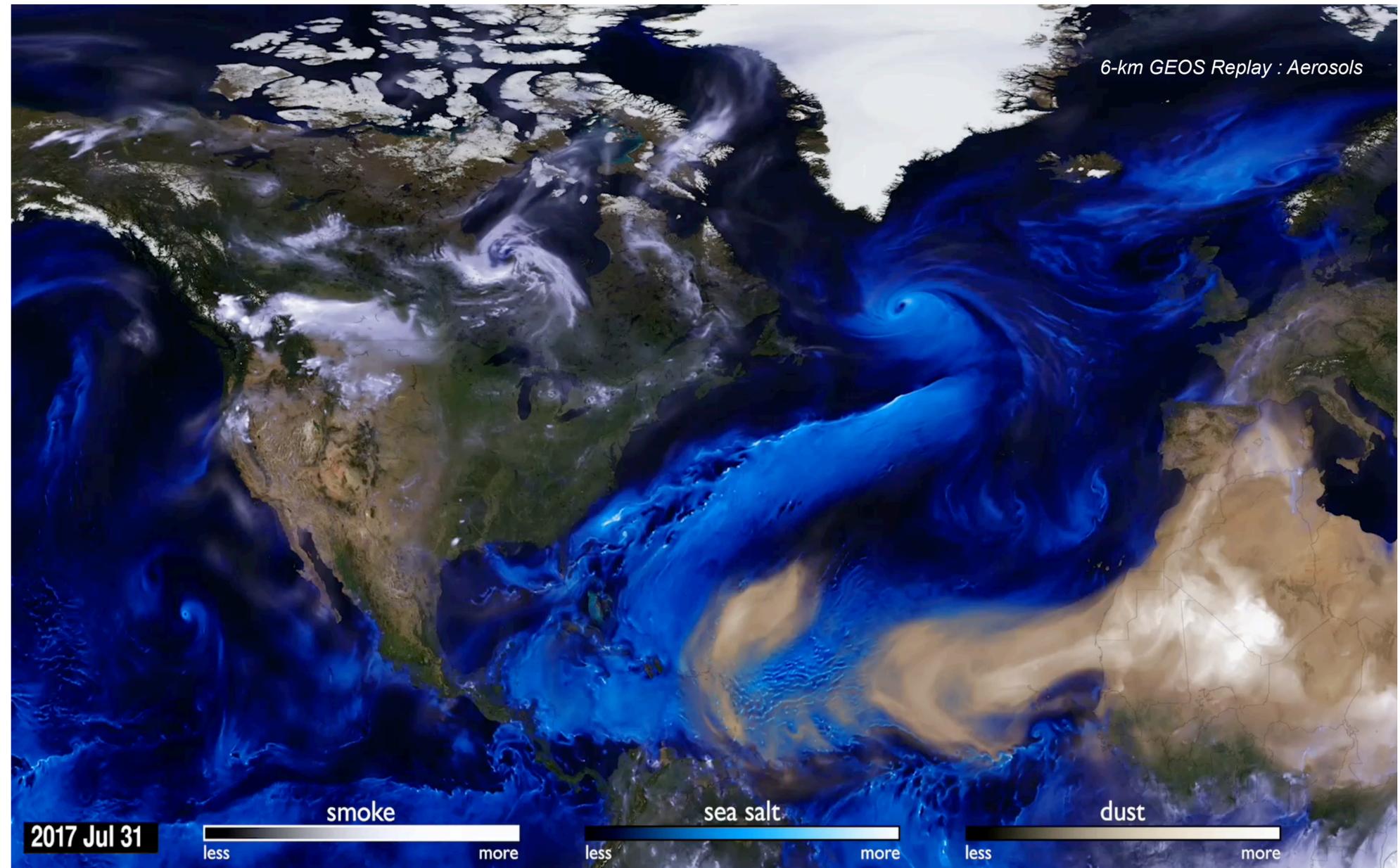
Huisheng Bian, Sampa Das, Ed Nowottnick, Adriana Rocha Lima (ACDL)

Valentina Aquila (American University)



Outline

- *Group: Who we are*
- *Roadmap: Where we've been*
- *Model Architecture and Status*
- *Aerosol Module Development and Plan*
- *Aerosol Assimilation*
- *Field Campaign Support*
- *Reanalysis*
- *Dessert?*



The Goddard Aerosol Team

GMAO



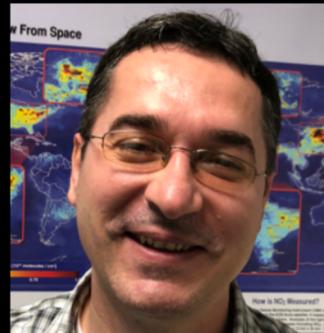
Arlindo



Virginie



Patricia



Anton



Karla



Aish



Ravi

Atmospheric Chemistry and Dynamics Lab



Pete



Adriana



Ed



Mian



Huisheng

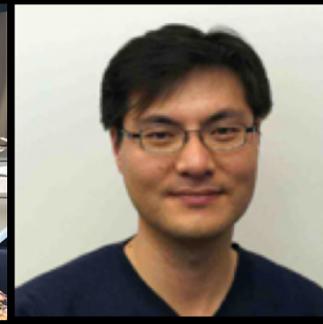


Melanie

Data Assimilation
Composition OSSEs
Modeling
Field Campaigns



Sampa



Dongchul

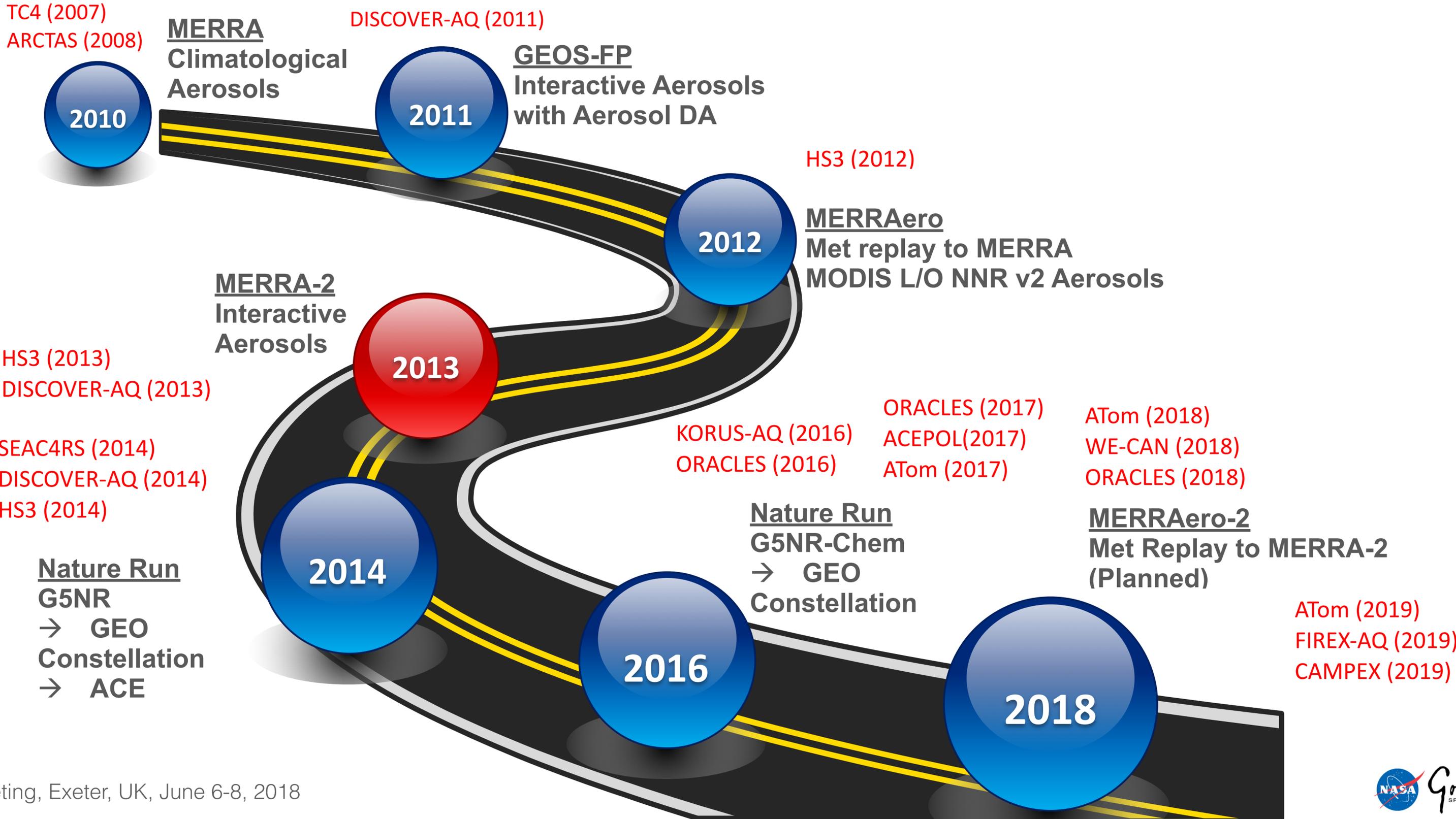


Valentina



Xiaohua

Aerosol Milestones in GEOS



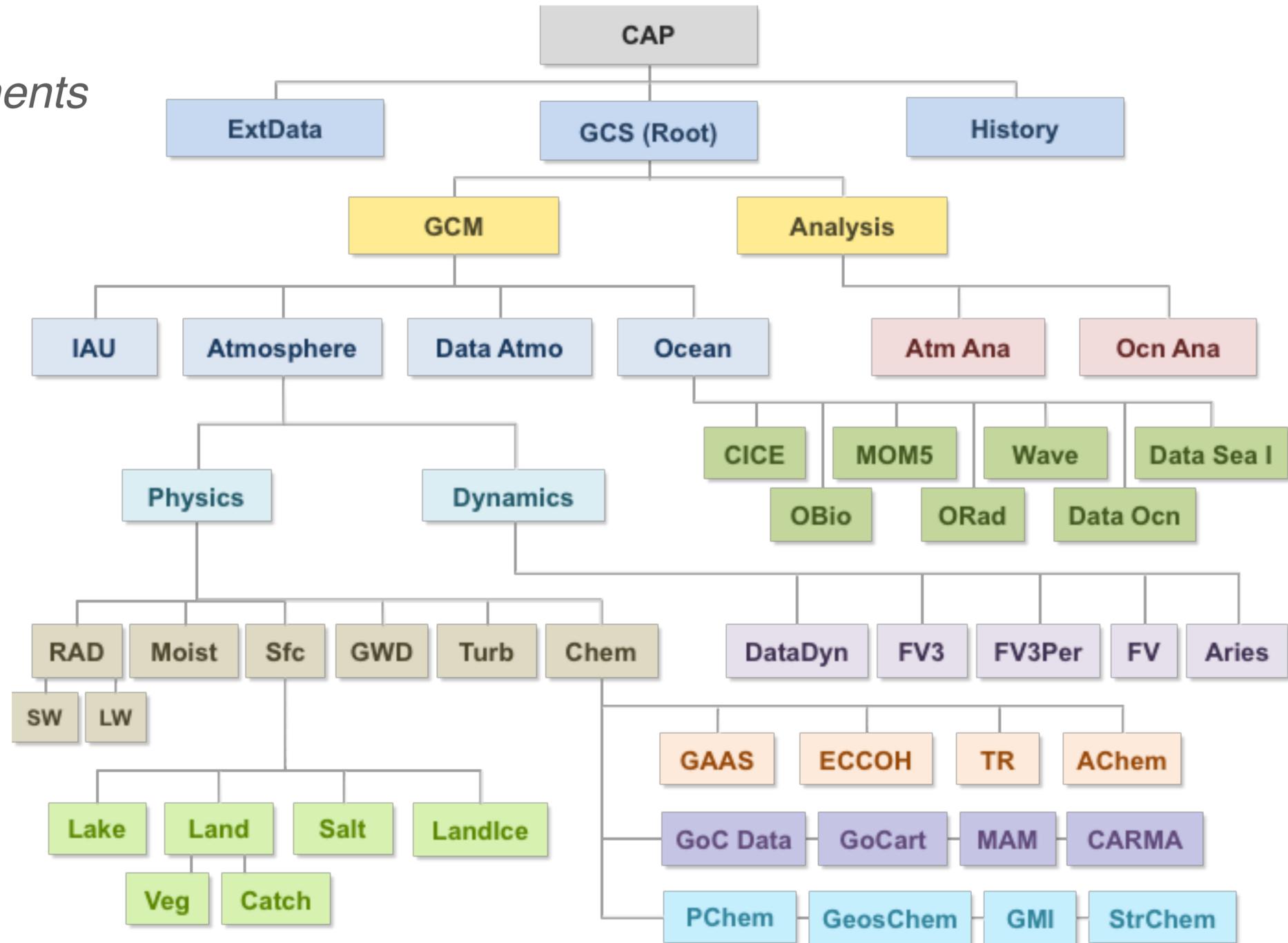
GEOS Model Architecture

GEOS is a hierarchy of ESMF components

- An infrastructure for building GEOS applications:
 - Standardized component interfaces
 - Low level data containers for data sharing
 - Grid classes for the physical domain
 - Parallel communication
 - Others: Regridding, Logging, Calendar

The MAPL layer interface to ESMF

- Provides an abstraction of software issues including:
 - Generic Initialize/Finalize/Run
 - Simplified hierarchy (creation of child components)
 - IO Layers (Asynchronous file server output)
 - Regridding transforms (grids and tiles)
 - Profiling (Performance and Memory)
 - Input (ExtData) / Output (History)



GEOS Comprehensive Architecture

GEOS Model Architecture

GEOS is a hierarchy of ESMF components

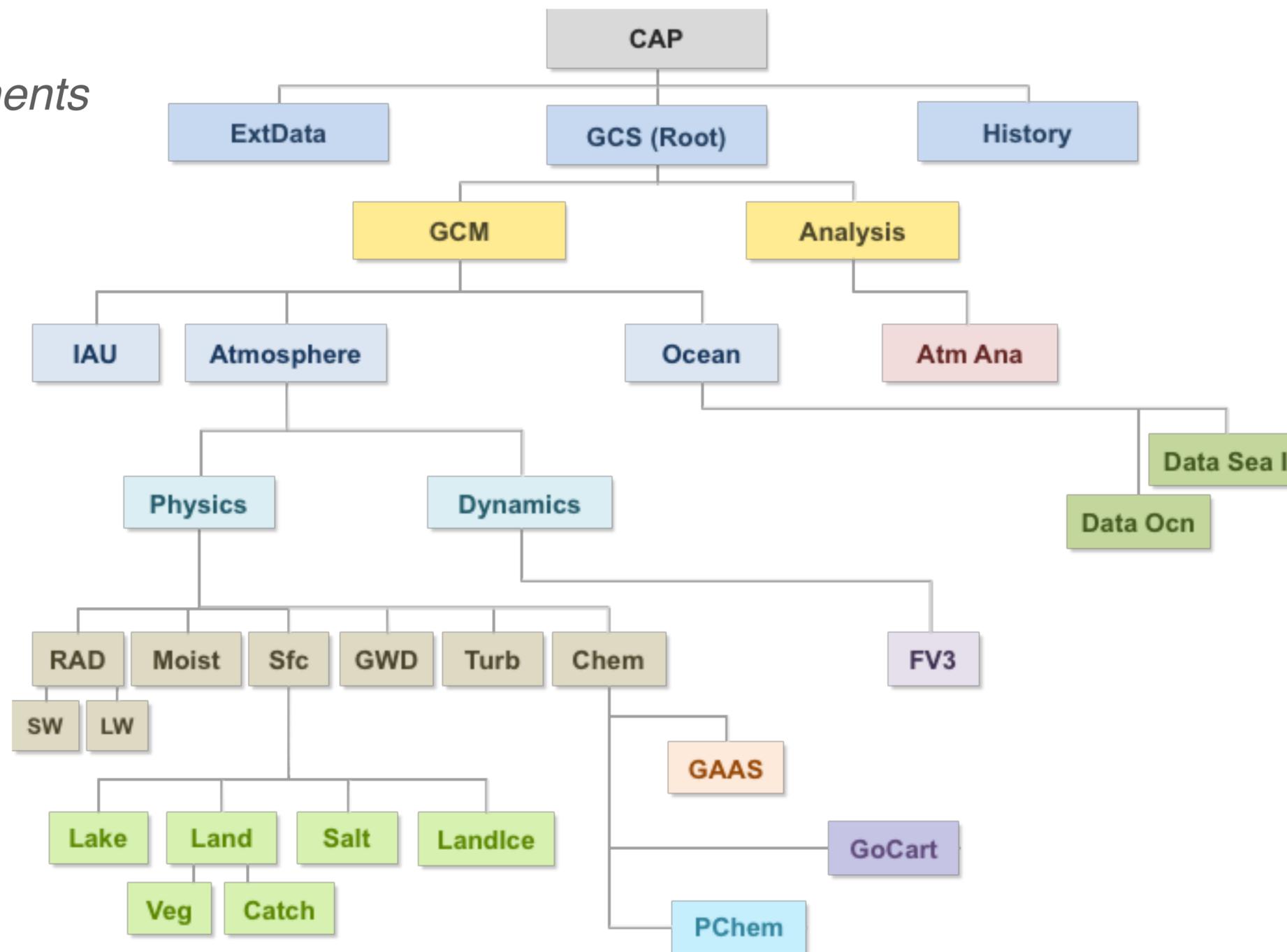
- An infrastructure for building GEOS applications:
 - Standardized component interfaces
 - Low level data containers for data sharing
 - Grid classes for the physical domain
 - Parallel communication
 - Others: Regridding, Logging, Calendar

The MAPL layer interface to ESMF

- Provides an abstraction of software issues including:
 - Generic Initialize/Finalize/Run
 - Simplified hierarchy (creation of child components)
 - IO Layers (Asynchronous file server output)
 - Regridding transforms (grids and tiles)
 - Profiling (Performance and Memory)
 - Input (ExtData) / Output (History)

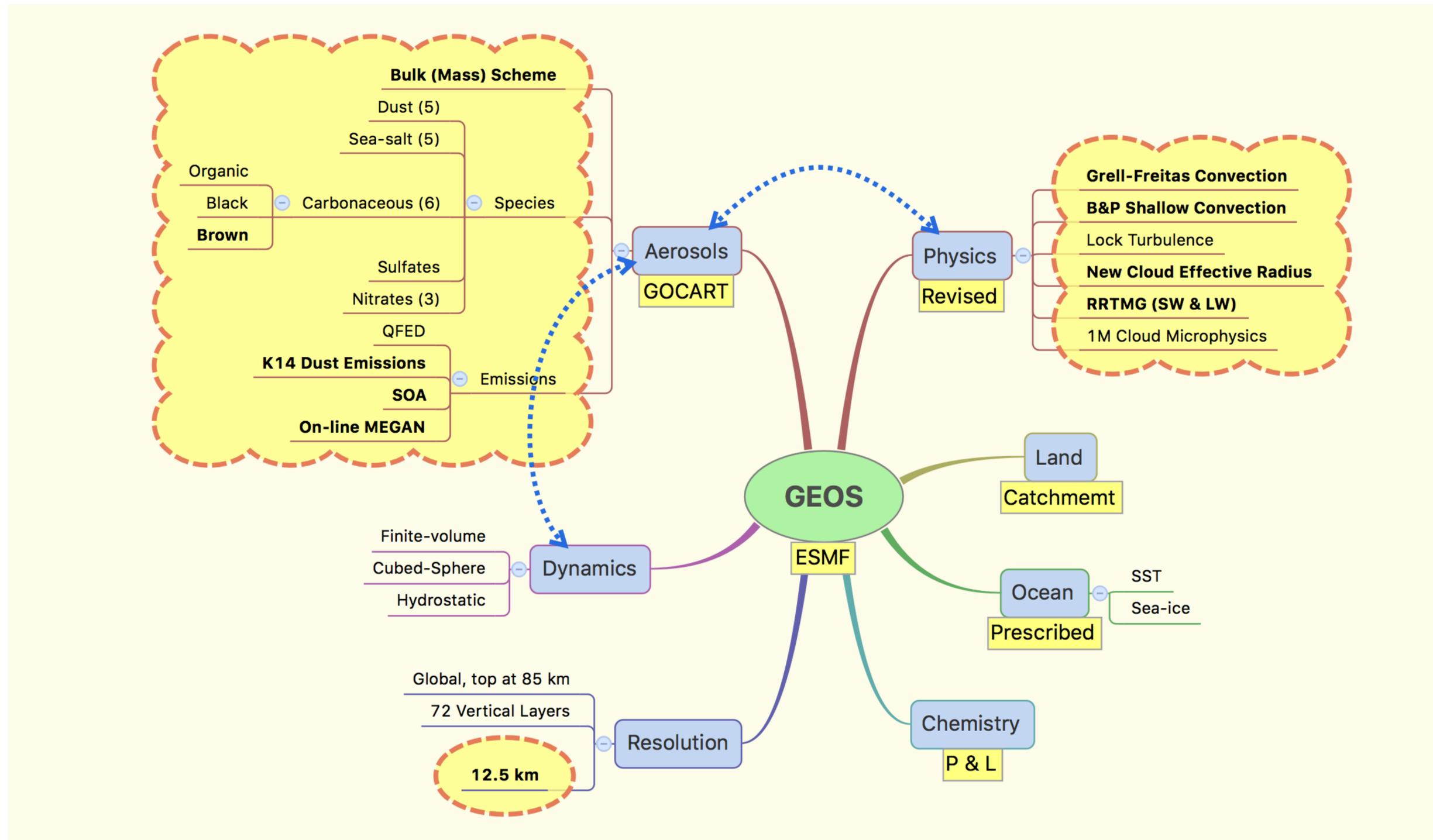
Architecture permits flexibility

- For example:
 - NWP configuration
 - S2S configuration (coupled ocean)
 - CCM configuration (advanced chemistry)
 - CTM configuration (offline met fields)



GEOS NWP Configuration

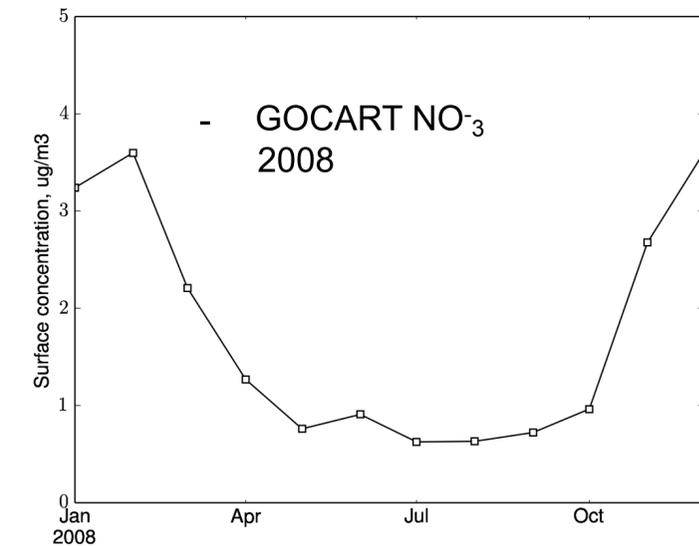
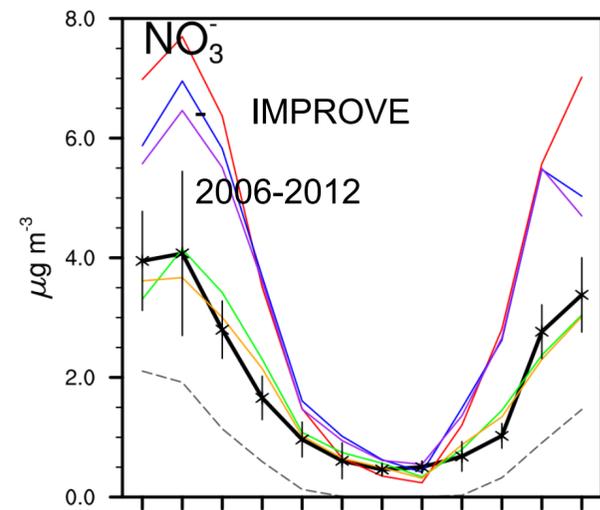
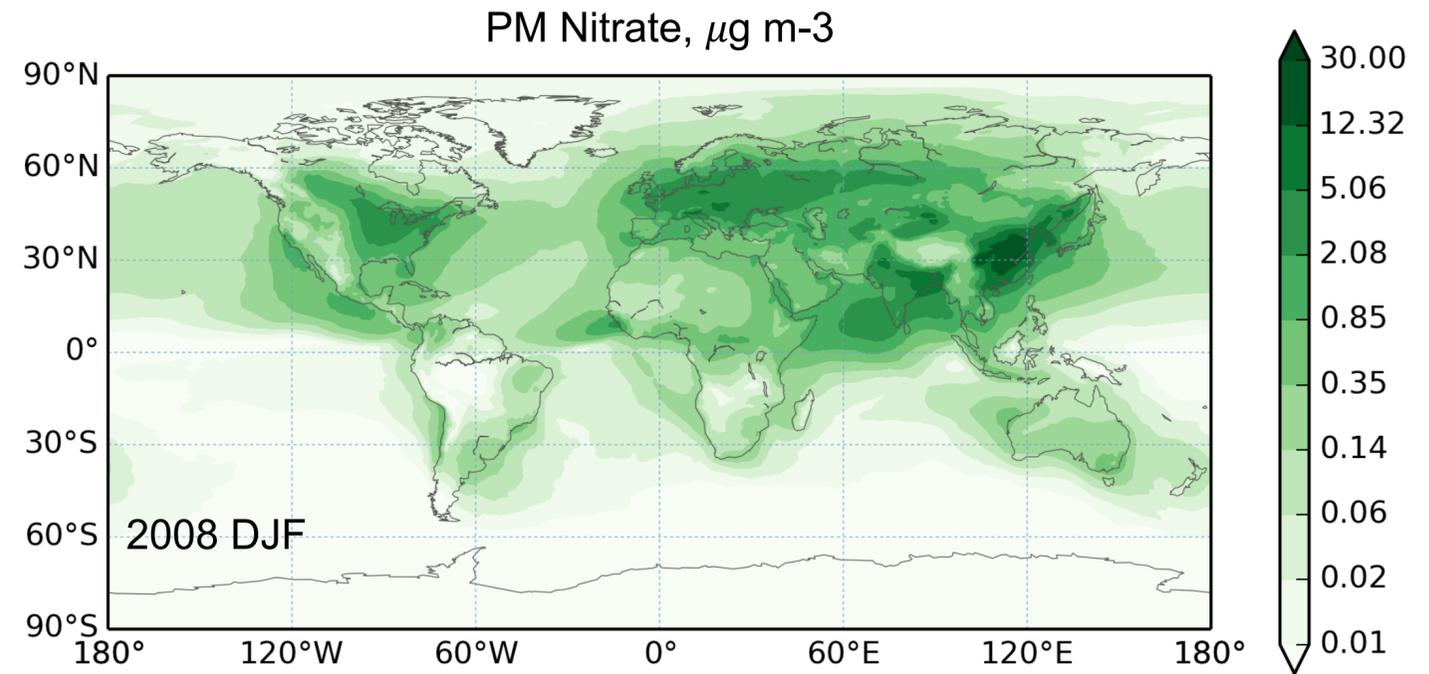
GEOS Next NWP Configuration



Aerosol Model Development

Prognostic Nitrate Aerosols

- 5 tracers added (NH_3 , NH_4 , aerosol nitrate/ NO_3 an: 0-0.5 μm , 0.5-4 μm , 4-10 μm)
- RPMARES aerosol thermodynamics (SO_4 - NO_3 - NH_4 - H_2O)
- Heterogeneous reactions on dust and sea salt particles
- Nitric acid (HNO_3) is from monthly GMI output
- Refractive indices of NH_4NO_3 from Lacis et al. (1997)



Measured (Paulot et al., 2016) and modeled GEOS/GOCART particulate nitrate concentrations in Bondville.

Aerosol Model Development

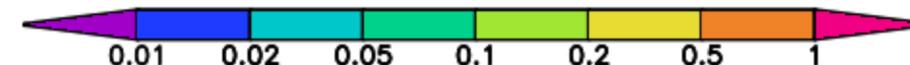
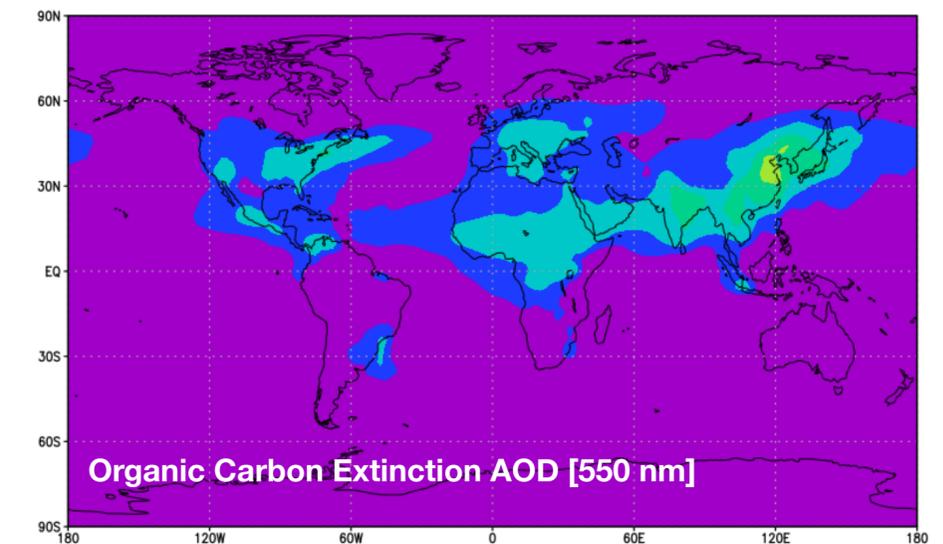
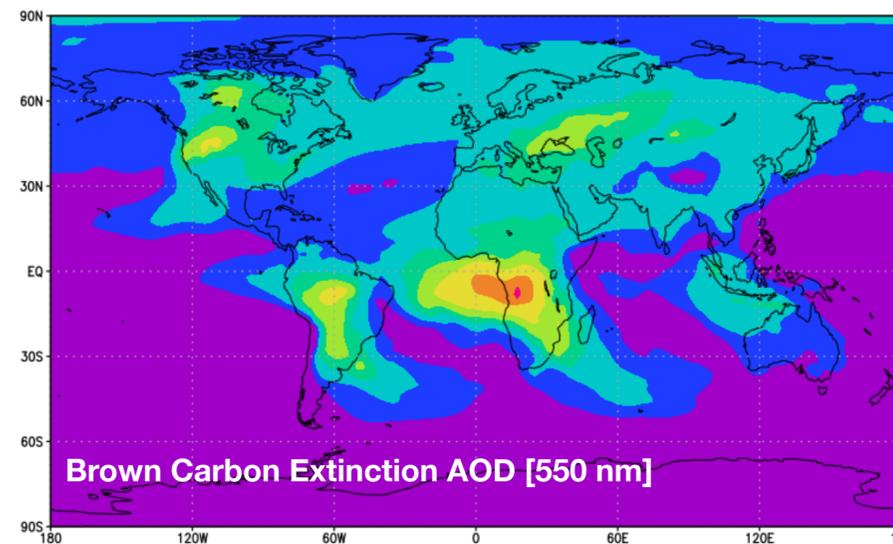
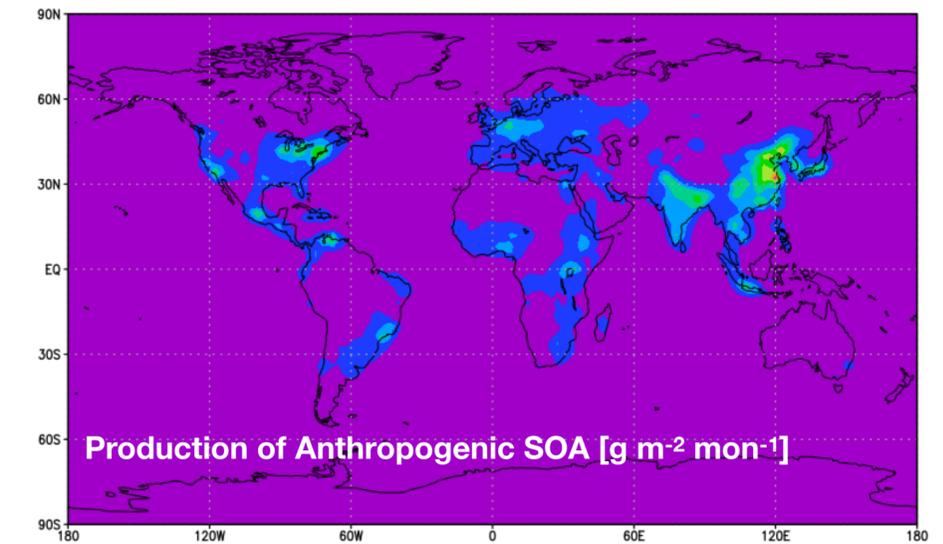
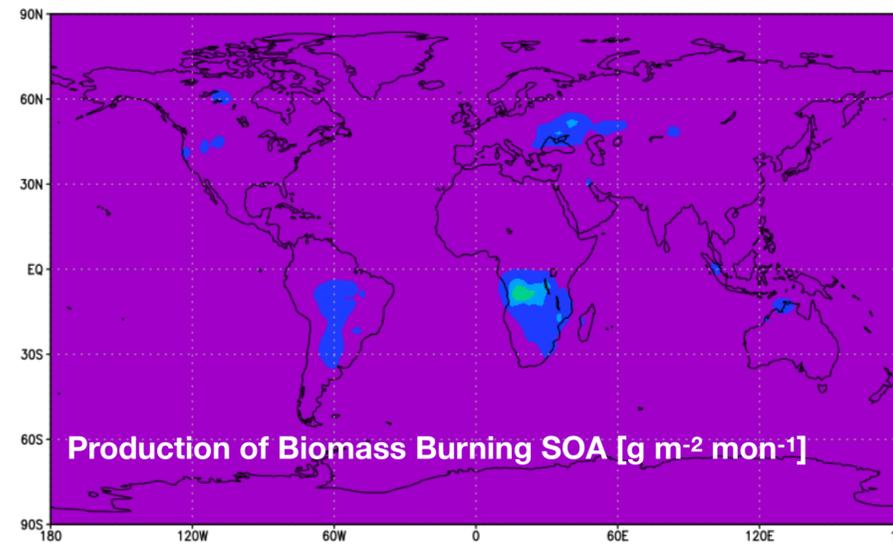
Prognostic Nitrate Aerosols

- 5 tracers added (NH_3 , NH_4 , aerosol nitrate/ NO_3an : 0-0.5 μm , 0.5-4 μm , 4-10 μm)
- RPMARES aerosol thermodynamics ($\text{SO}_4\text{-NO}_3\text{-NH}_4\text{-H}_2\text{O}$)
- Heterogeneous reactions on dust and sea salt particles
- Nitric acid (HNO_3) is from monthly GMI output
- Refractive indices of NH_4NO_3 from Lacis et al. (1997)

Updates to Carbonaceous Aerosols

- Anthropogenic SOA from oxidation of VOC emissions scaled from anthropogenic and biomass burning CO emissions (after Hodzic and Jimenez 2011)
- Biogenic SOA from online MEGAN provided by HEMCO component
- Re-tuning of OA:OC ratio based on ATom observations
- 2 tracers added from brown carbon (hydrophilic and hydrophobic)

August 2008



Aerosol Model Development

Prognostic Nitrate Aerosols

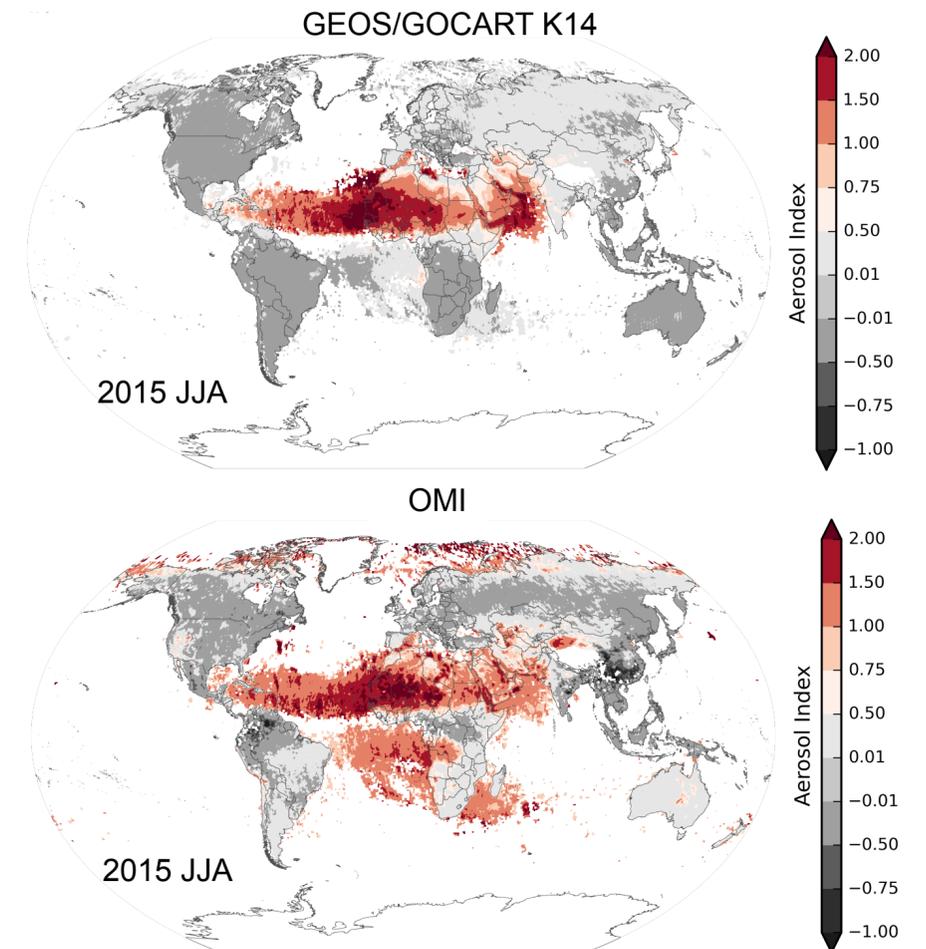
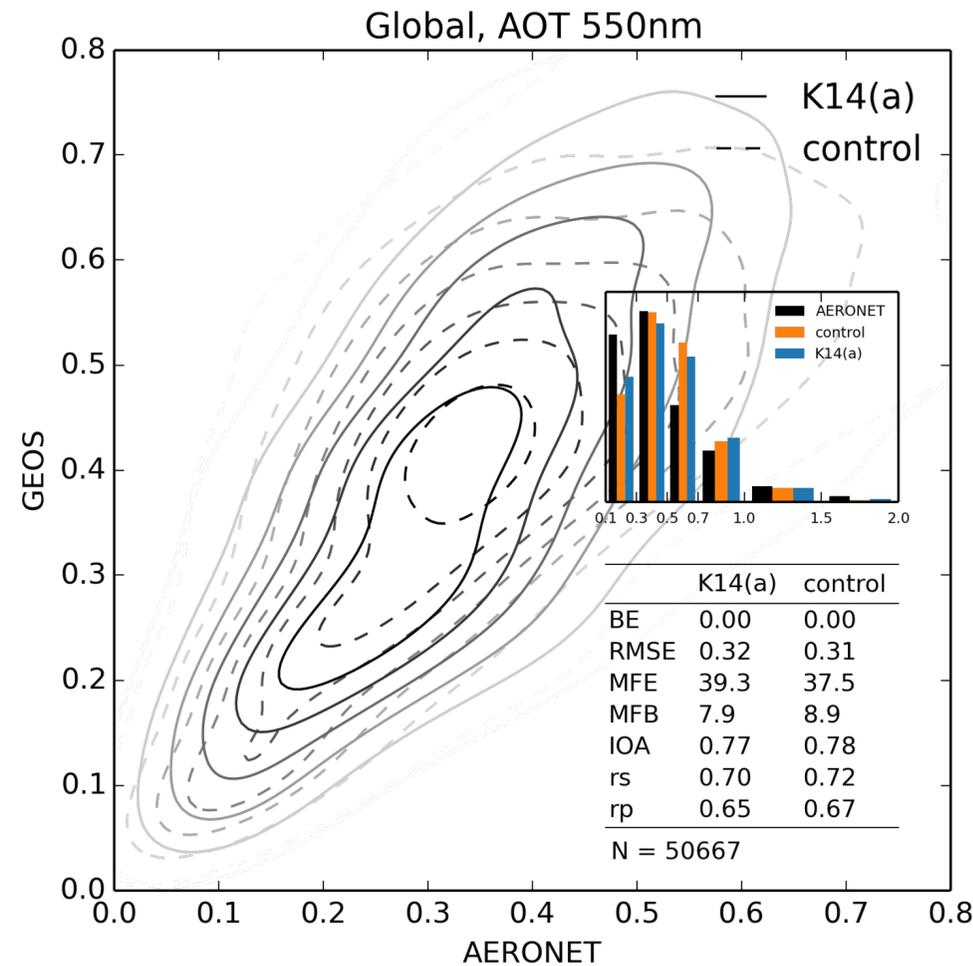
- 5 tracers added (NH_3 , NH_4 , aerosol nitrate/ NO_3 an: 0-0.5 μm , 0.5-4 μm , 4-10 μm)
- RPMARES aerosol thermodynamics (SO_4 - NO_3 - NH_4 - H_2O)
- Heterogeneous reactions on dust and sea salt particles
- Nitric acid (HNO_3) is from monthly GMI output
- Refractive indices of NH_4NO_3 from Lacis et al. (1997)

Updates to Carbonaceous Aerosols

- Anthropogenic SOA from oxidation of VOC emissions scaled from anthropogenic and biomass burning CO emissions (after Hodzic and Jimenez 2011)
- Biogenic SOA from online MEGAN provided by HEMCO component
- Re-tuning of OA:OC ratio based on ATom observations
- 2 tracers added from brown carbon (hydrophilic and hydrophobic)

Physically-based Dust Emissions

- Roughness, soil-texture, and vegetation cover aware scheme after Kok (2014)
- Implement Kok (2011) initial particle size distribution
- Scheme is found to perform well in GEOS system



Aerosol Model Development

Prognostic Nitrate Aerosols

- 5 tracers added (NH_3 , NH_4 , aerosol nitrate/ NO_3 an: 0-0.5 μm , 0.5-4 μm , 4-10 μm)
- RPMARES aerosol thermodynamics (SO_4 - NO_3 - NH_4 - H_2O)
- Heterogeneous reactions on dust and sea salt particles
- Nitric acid (HNO_3) is from monthly GMI output
- Refractive indices of NH_4NO_3 from Lacis et al. (1997)

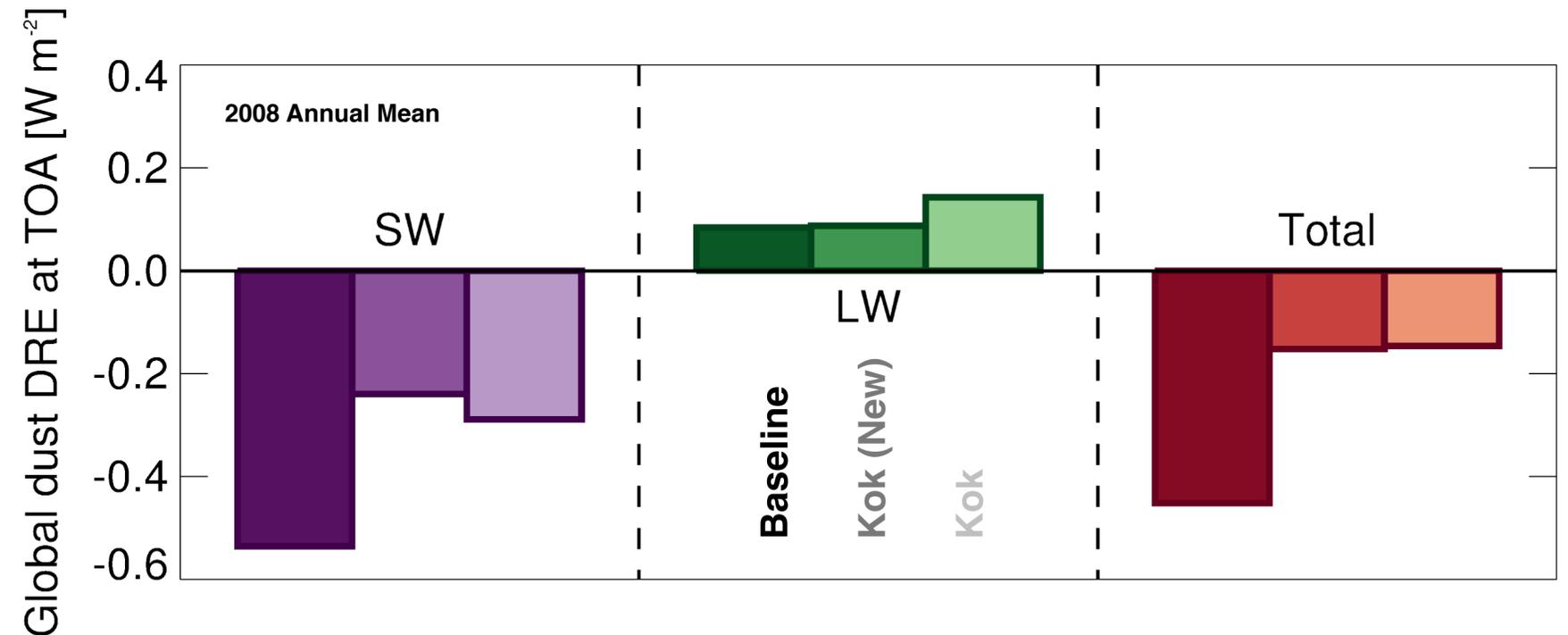
Updates to Carbonaceous Aerosols

- Anthropogenic SOA from oxidation of VOC emissions scaled from anthropogenic and biomass burning CO emissions (after Hodzic and Jimenez 2011)
- Biogenic SOA from online MEGAN provided by HEMCO component
- Re-tuning of OA:OC ratio based on ATom observations
- 2 tracers added from brown carbon (hydrophilic and hydrophobic)

Physically-based Dust Emissions

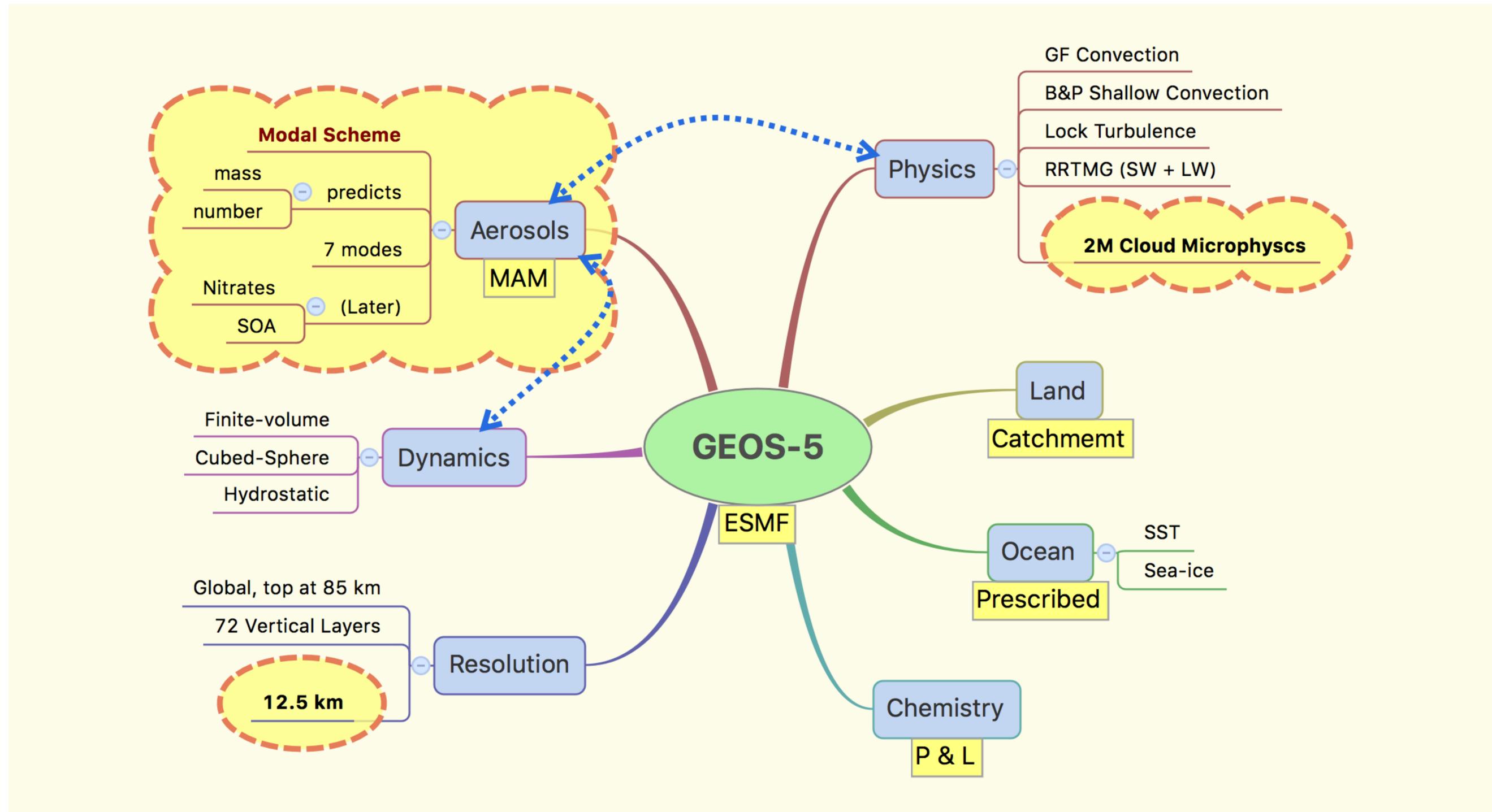
- Roughness, soil-texture, and vegetation cover aware scheme after Kok (2014)
- Implement Kok (2011) initial particle size distribution
- Scheme is found to perform well in GEOS system
- Developing new dust optical properties

Global Dust Direct Radiative Effect at TOA

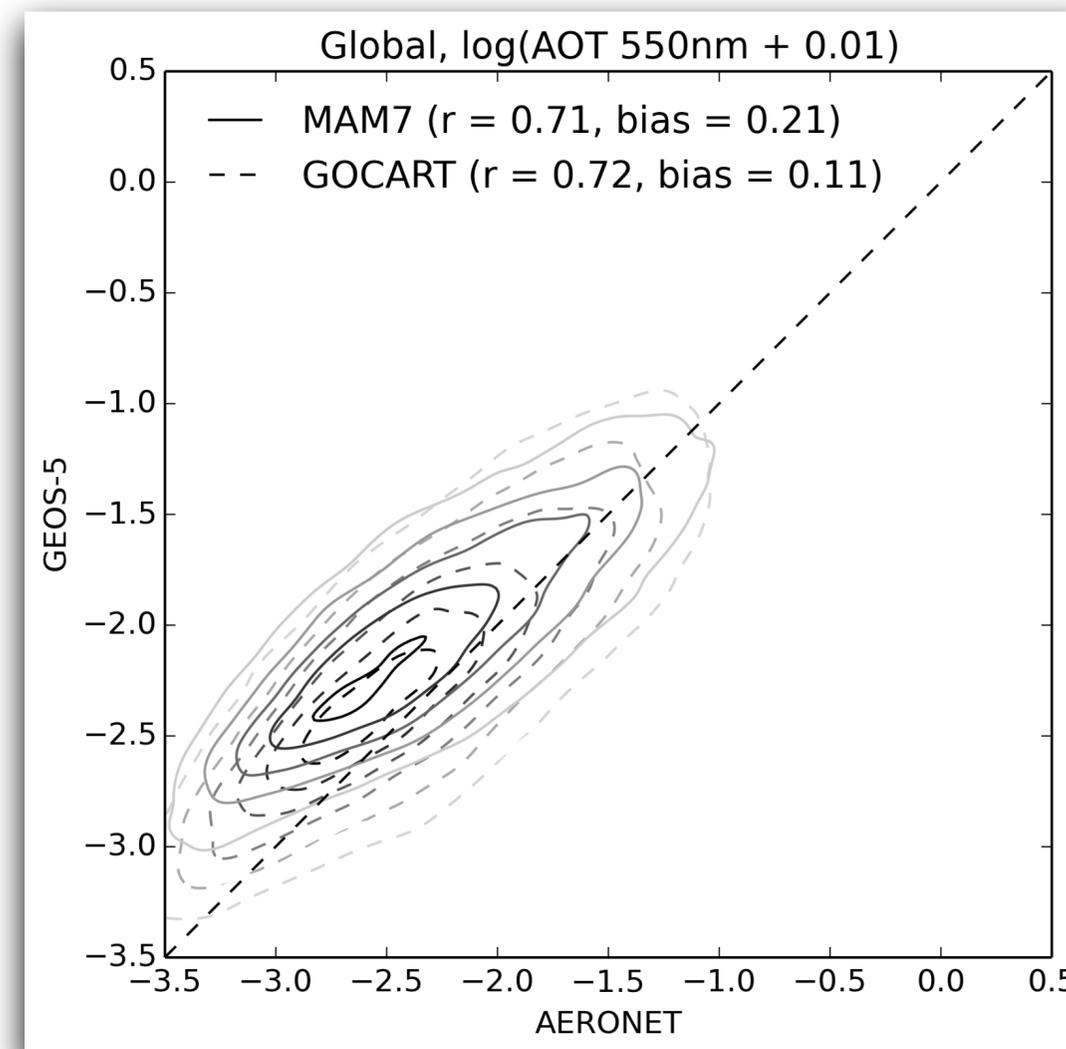
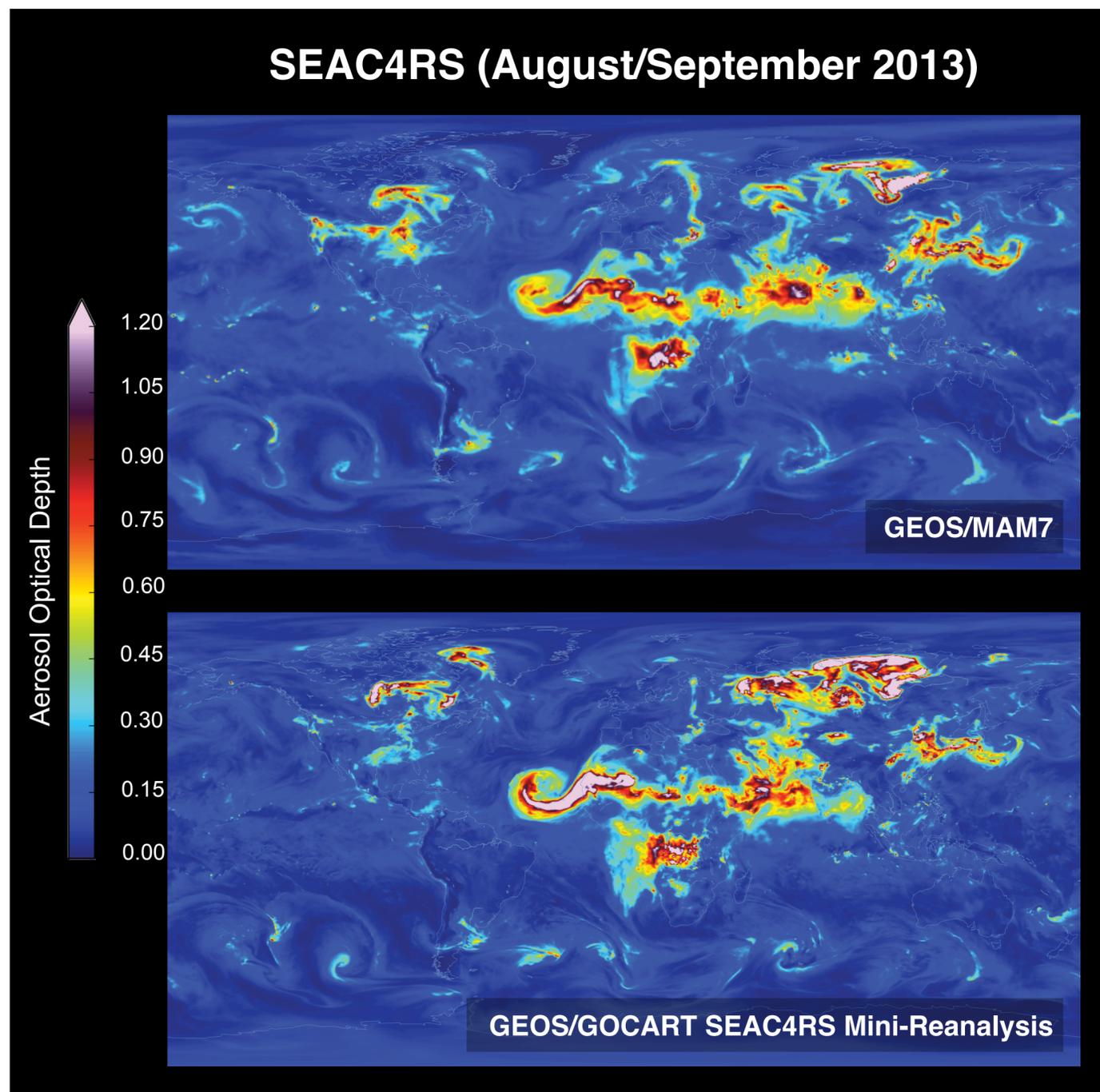


- **Baseline** - Default GOCART initial particle size distribution
- **Kok** - New dust particle size distribution
- **Kok (New)** - New dust particle size distribution with candidate new optical properties

Modal Aerosol Microphysics in GEOS

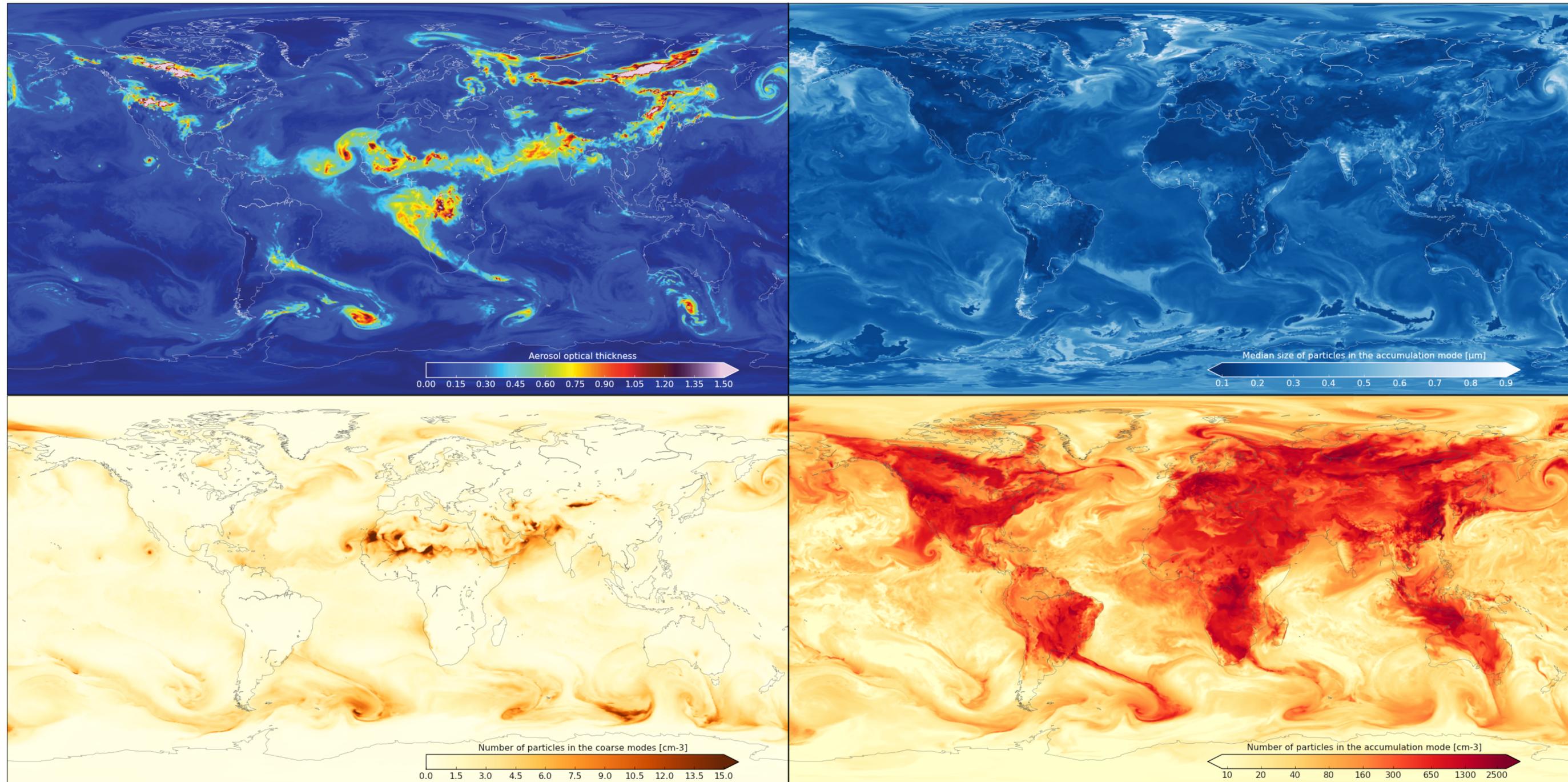


Modal Aerosol Microphysics in GEOS



- Aerosol optical depth from GEOS aerosol simulations and reanalysis, including a modeling experiment with aerosol microphysics (MAM7)
- MAM7 results agree well with the reanalysis and the AERONET observations

Modal Aerosol Microphysics in GEOS

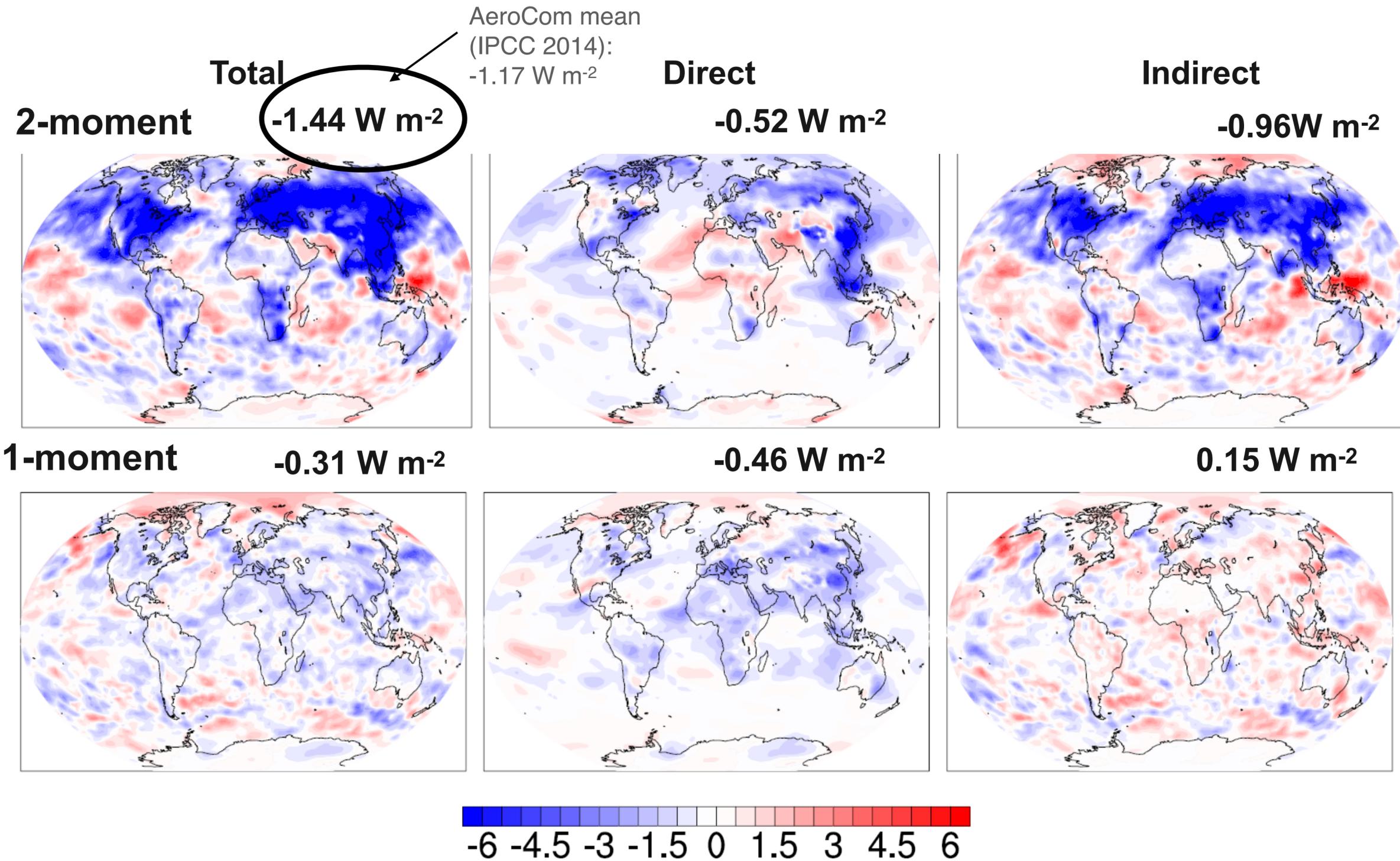


Modal Aerosol Microphysics in GEOS

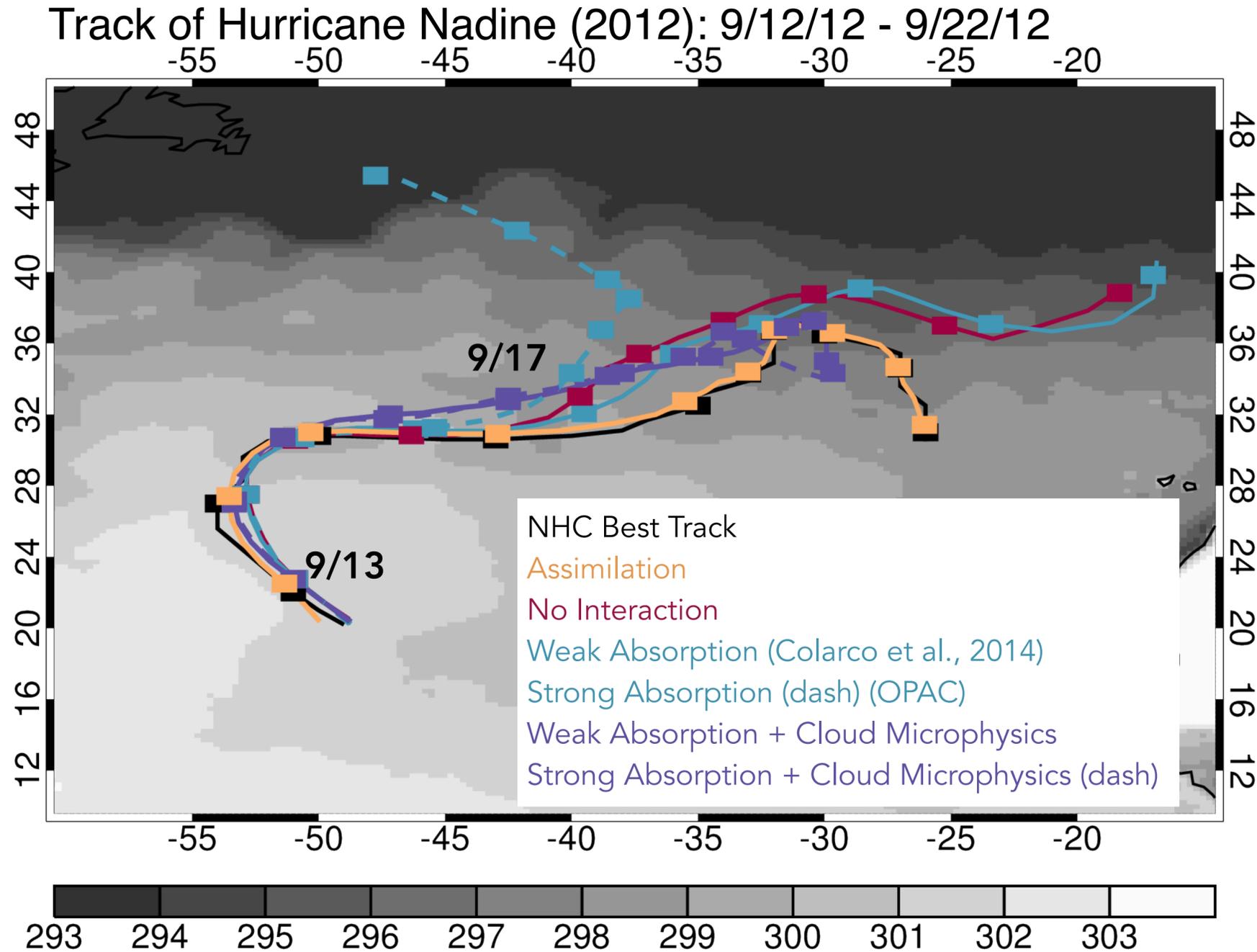
With MAM-enabled aerosol microphysics GEOS is now able to simulate the aerosol effect on clouds and climate

Further development:

- prognostic precipitation
- Fully integrated aerosol scavenging.
- Integration of 2M with the GF convective parameterization and shallow cumulus schemes.
- Prognostic graupel and hail.
- Ice nucleation on organics and biological material.
- Develop metrics to evaluate the indirect effect in production systems.



Impact of 2-Moment Cloud Microphysics on Hurricane Track



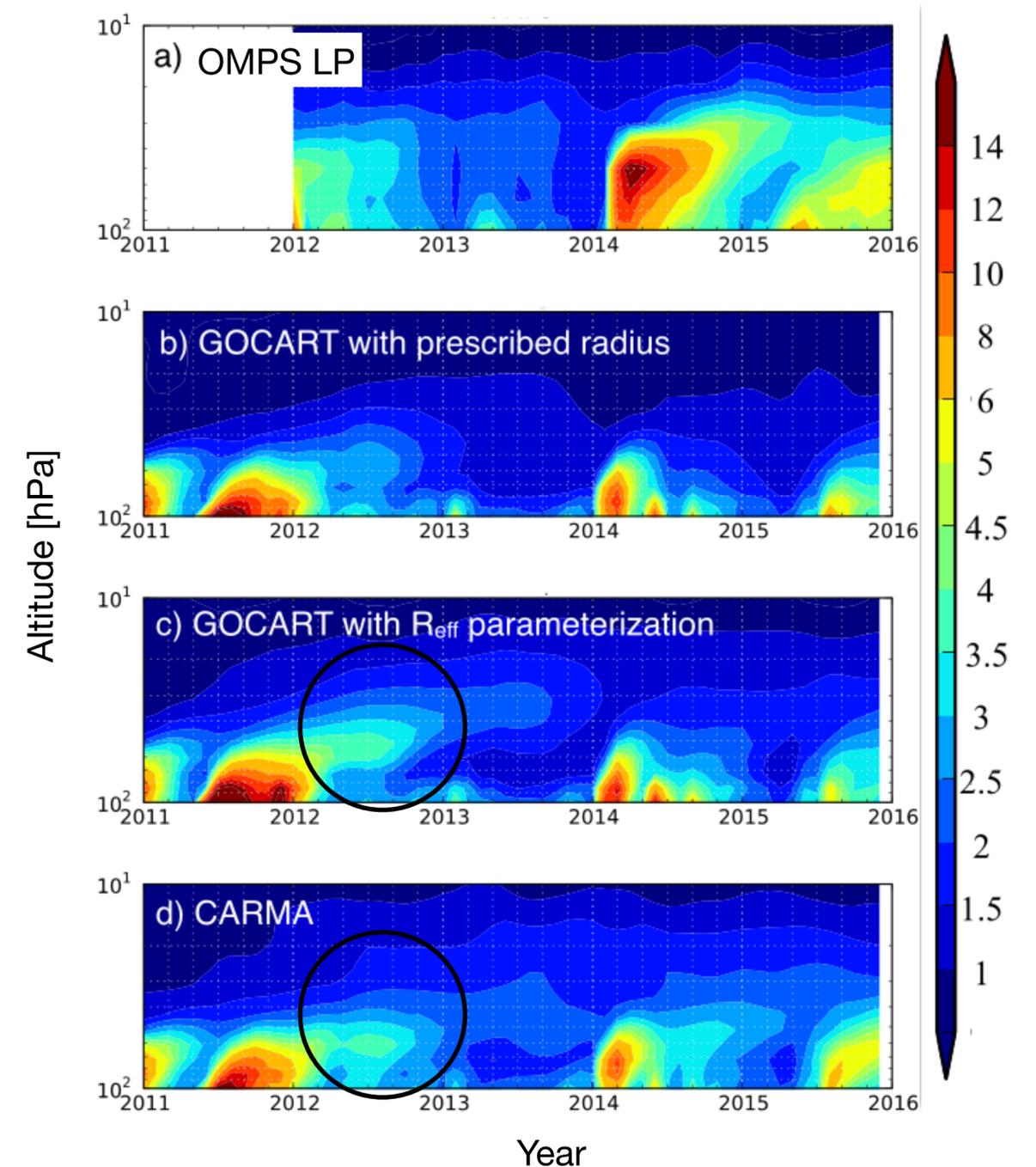
Nowotnick et al. 2018, in press, JAS

Using the NASA GEOS AGCM & assimilation system, the sensitivity of Hurricane Nadine (2012) to varying dust optical properties and the inclusion of a 2-moment cloud microphysics scheme was explored:

- Nadine's track showed strong sensitivity to assumed dust optical properties when only aerosol-radiation impacts are included
 - The more absorbing dust introduced a shortwave temperature perturbation that impacted Nadine's structure and steering flow
- When aerosol-cloud interactions were added, the track exhibited little sensitivity to dust optical properties
 - Enhanced longwave atmospheric cooling from clouds counters shortwave atmospheric warming from dust

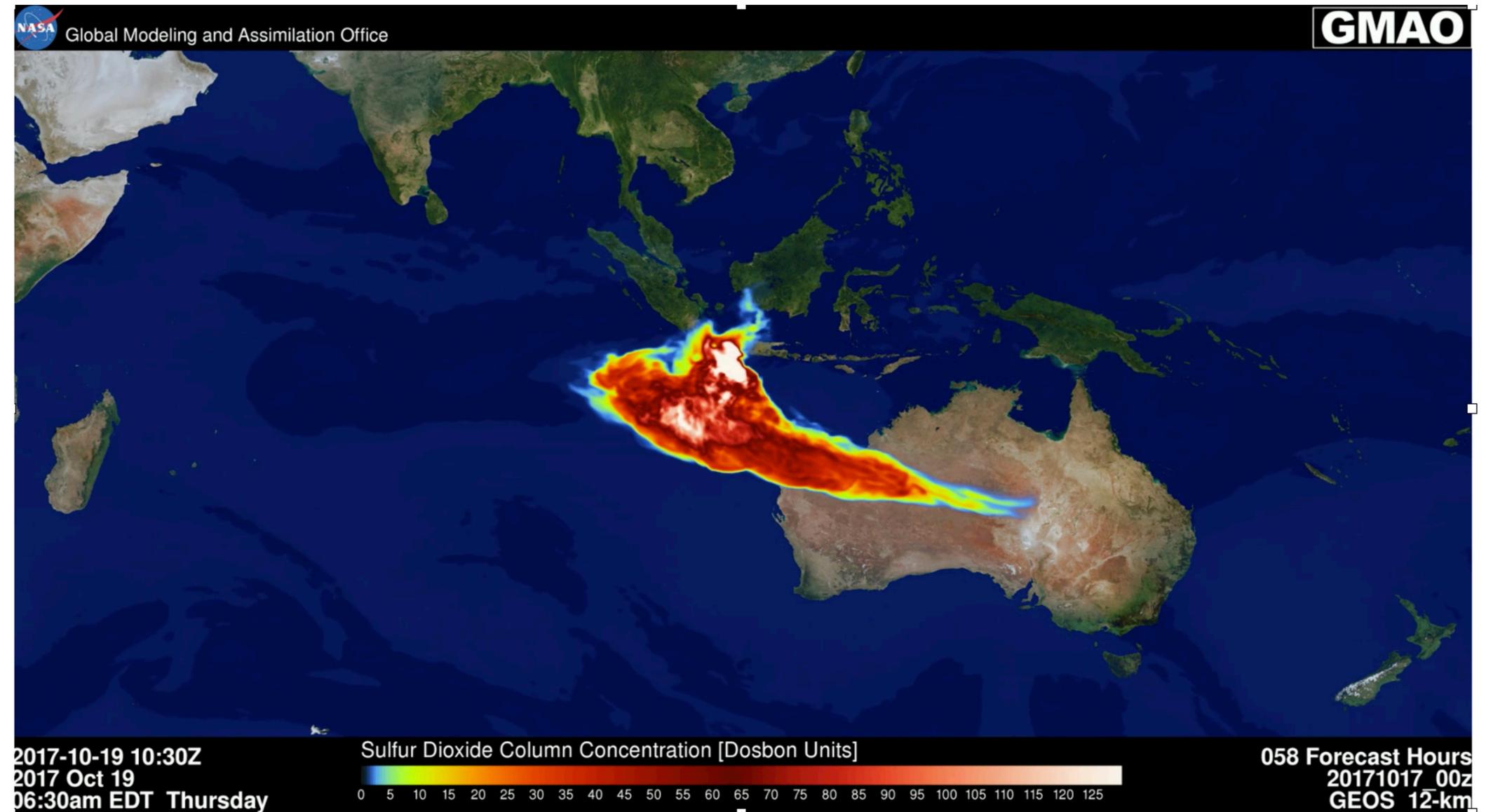
Sectional Aerosol Microphysics

- Stratospheric sulfate aerosol source mechanism via OCS oxidation added in StratChem module and coupled to radiation
 - *Coupling with GMI mechanism is ongoing*
 - Now provides capability to simulate background stratospheric composition and perturbations, which can be compared with OMPS-LP observations
 - Mechanism is coupled to GOCART (bulk) and CARMA (sectional) aerosol modules, which themselves are coupled via surface area to StratChem; *coupling to MAM (modal) module and GMI mechanism ongoing*
 - Use of higher order CARMA mechanism to improve representation of evolving aerosol size in GOCART is being test



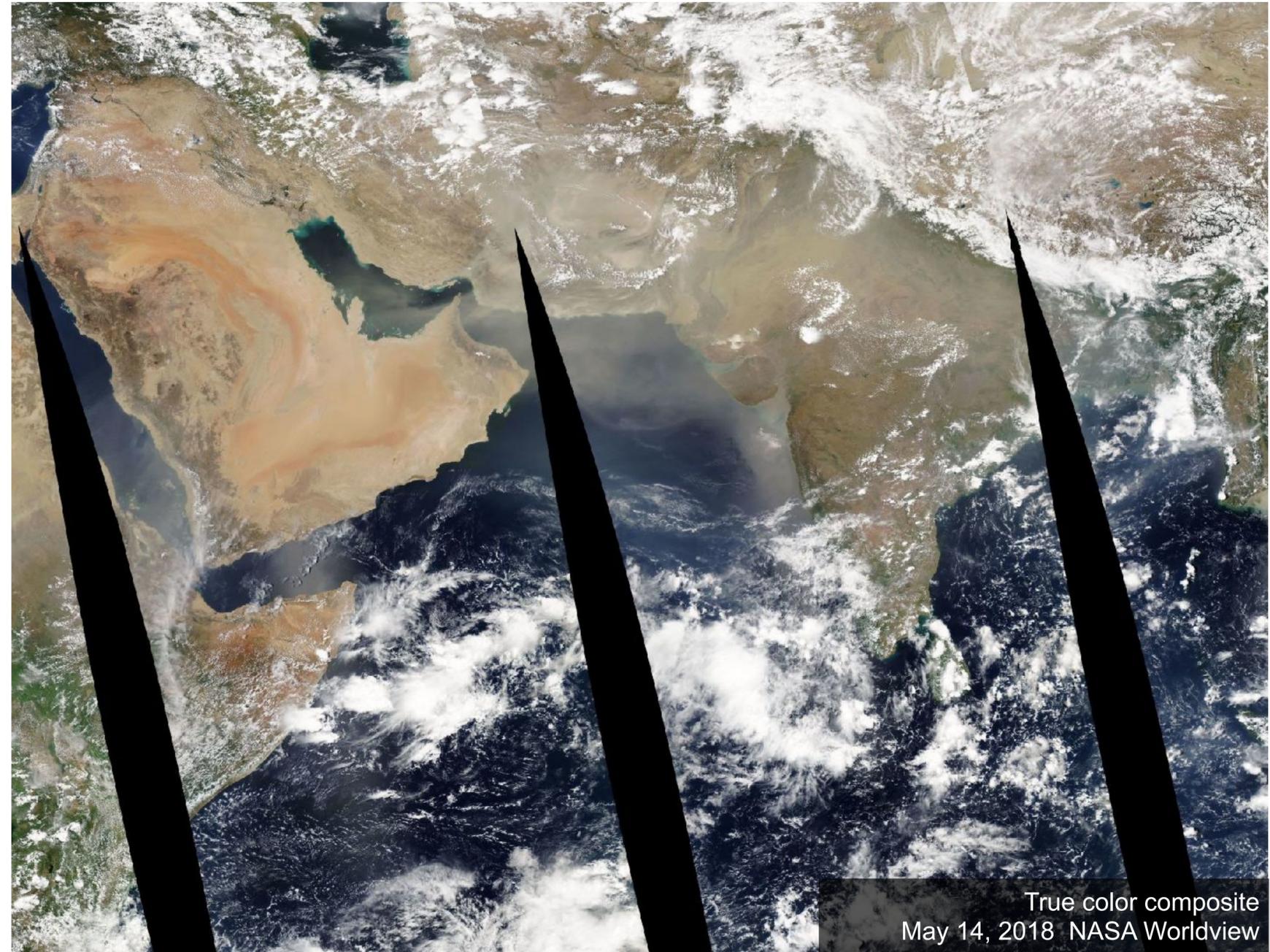
NRT Volcanoes

- None of the operational global aerosol modeling centers have a clear mandate to provide forecasts in event of a major volcanic eruption — this is the purview of the VAACS, who have as a mission to forecast ash distributions for (mainly) aviation purposes
- We are watching the increased seismic activity in Bali at Mt. Agung, which was the third largest volcanic eruption of the 20th century in 1963



Future aerosol development

- Improve in-cloud and below-cloud wet removal in GOCART and MAM coupled with Moist Physics
- Couple aerosol schemes with the more comprehensive GMI and GEOS-Chem chemistry modules
- Extend MAM to include numerically efficient implementation of nitrate aerosols
- Complete integration of speciation in CARMA sectional model
- Use fire weather and flammability indexes to modulate fire emissions
 - *Complementary MAP project to tie biomass burning emissions to dynamic vegetation model*
- Wave model
 - *Implement sea-state based parameterization of primary marine aerosols emissions that predict size and composition (organic and inorganic fractions)*
 - *Strengthen ocean-atmosphere coupling through the implementation of physically based and explicitly resolved air-sea interface*



Aerosol Observing System

Aerosol Optical Depth (AOD) is the most commonly available observable

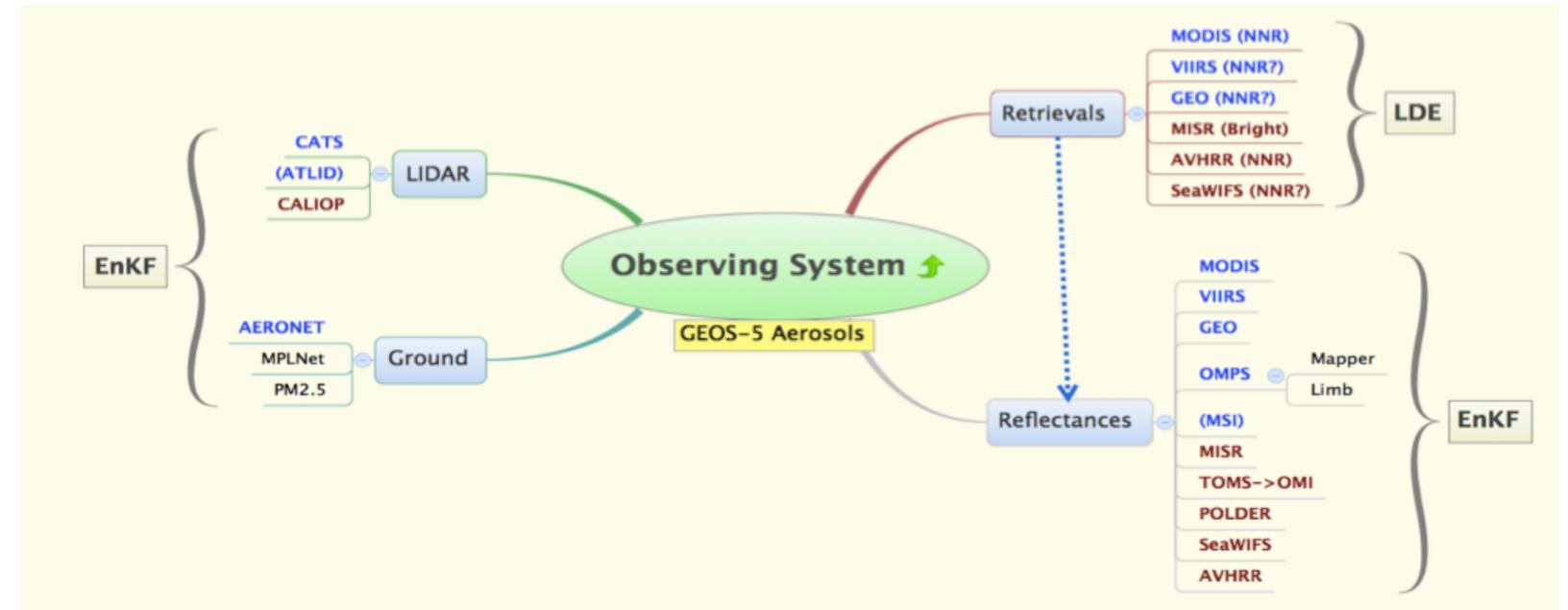
- Vertically integrated mass weighted by extinction coefficient, summed over multiple species: **low observability**

Radiance assimilation:

- Vector scattering calculations needed for UV-VIS measurements are **computationally demanding**
- Surface BRDF characterization is a challenge

Surface PM 2.5

- Single level
- Often plagued by **representativeness errors**



Lidar measurements provide vertical info

- Spatial **coverage is poor** (pencil thin)
- Attenuated backscatter again requires optical assumptions which are not directly measured
 - ✓ HSRL concept is promising

Neural Net for AOD₅₅₀ Empirical Retrievals

□ Ocean Predictors

- Multi-channel
 - ~~Operational AOD retrieval~~
 - TOA reflectances
 - Solar and viewing geometry:
 - Glint
 - Solar
 - Sensor
 - Cloud fraction (<70%)
 - Wind speed
- Target: AERONET
- $\eta = \log(\text{AOD}+0.01)$

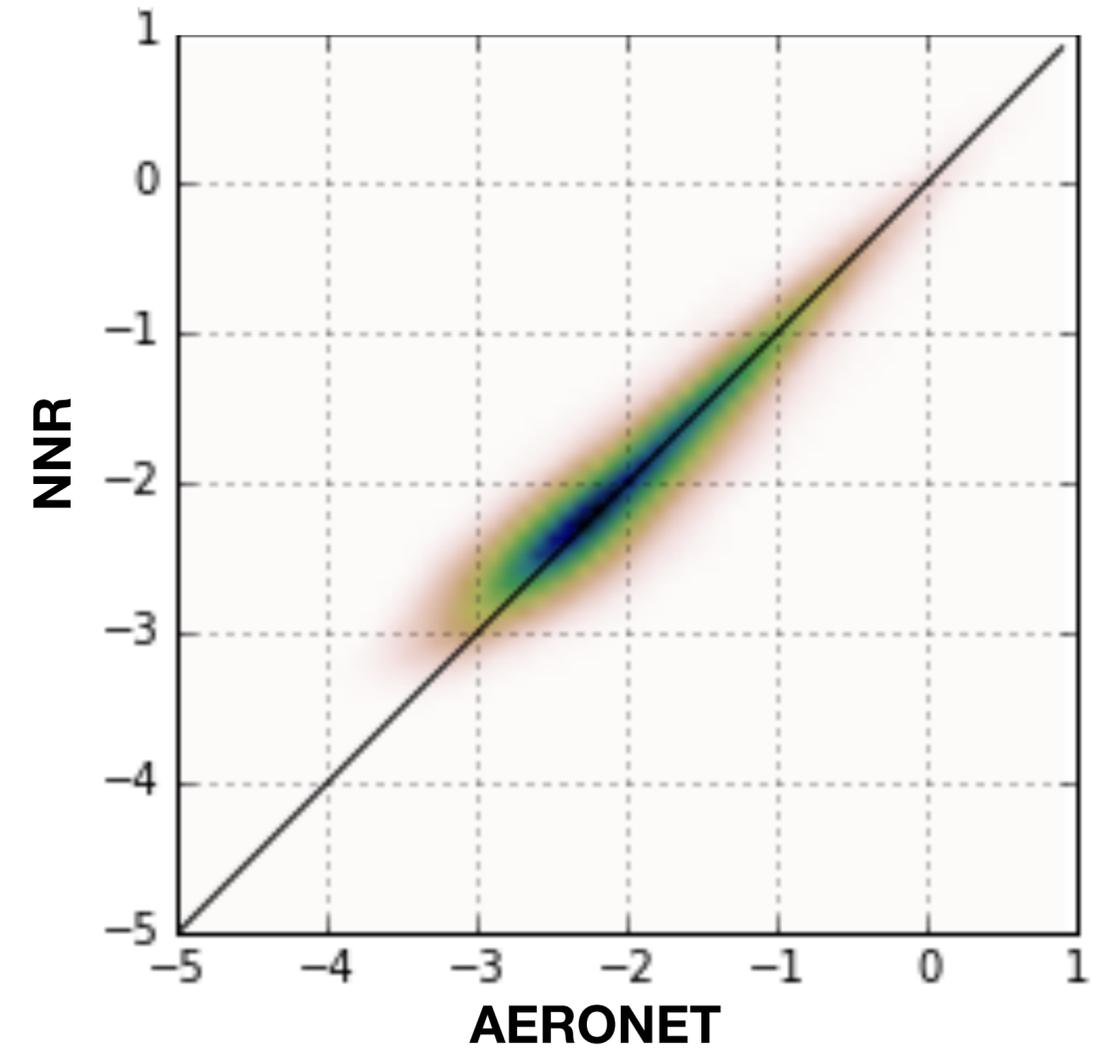
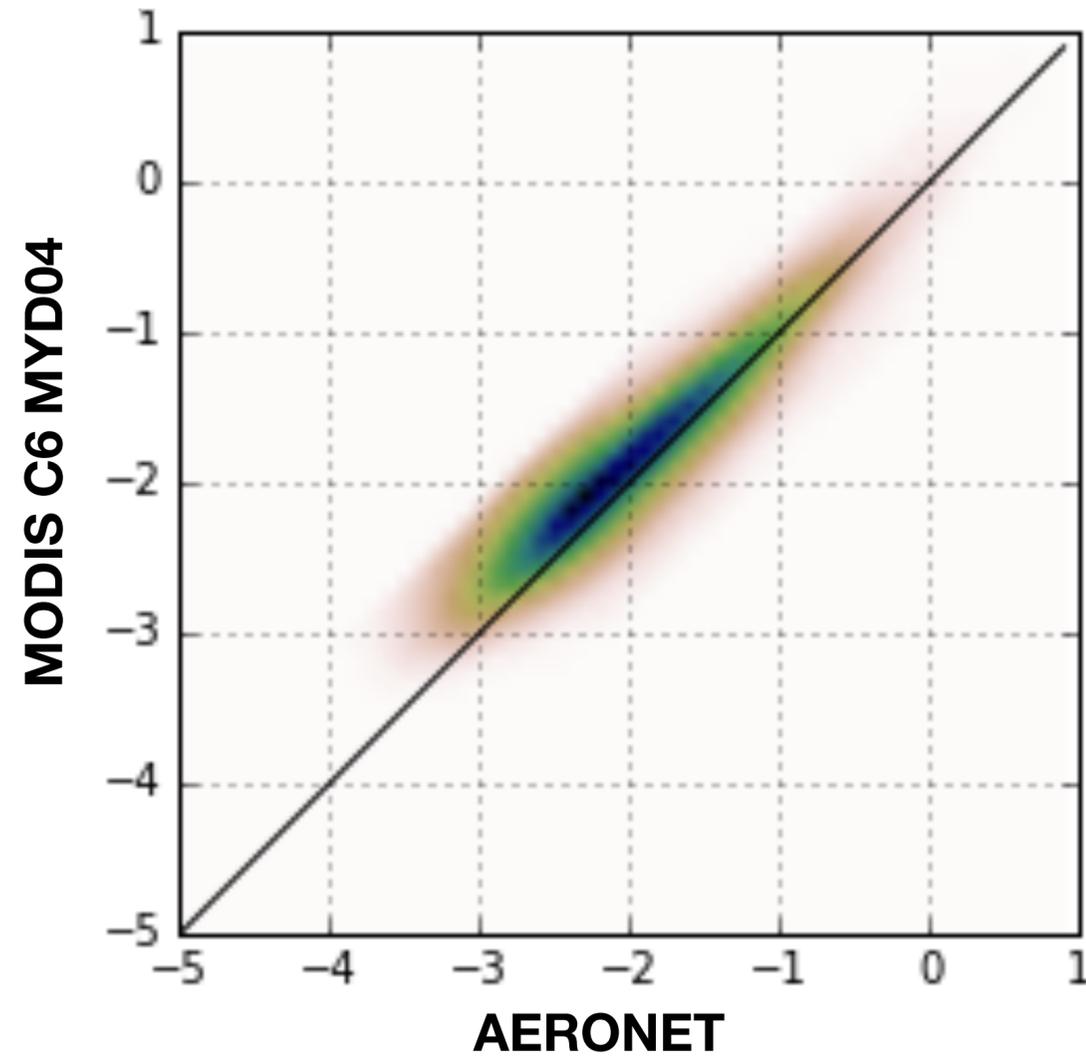
□ Land Predictors

- Multi-channel
 - ~~Operational AOD retrieval~~
 - TOA reflectances
 - Solar and viewing geometry:
 - Solar
 - Sensor
 - Cloud fraction (<70%)
 - Surface Albedo or BRDF Kernels
- Target: AERONET
- $\eta = \log(\text{AOD}+0.01)$



Neural Net for AOD₅₅₀ Empirical Retrievals

MODIS Neural Net AOD₅₅₀ Retrievals trained on AERONET



From LEO to GEO: Calibration Transfer

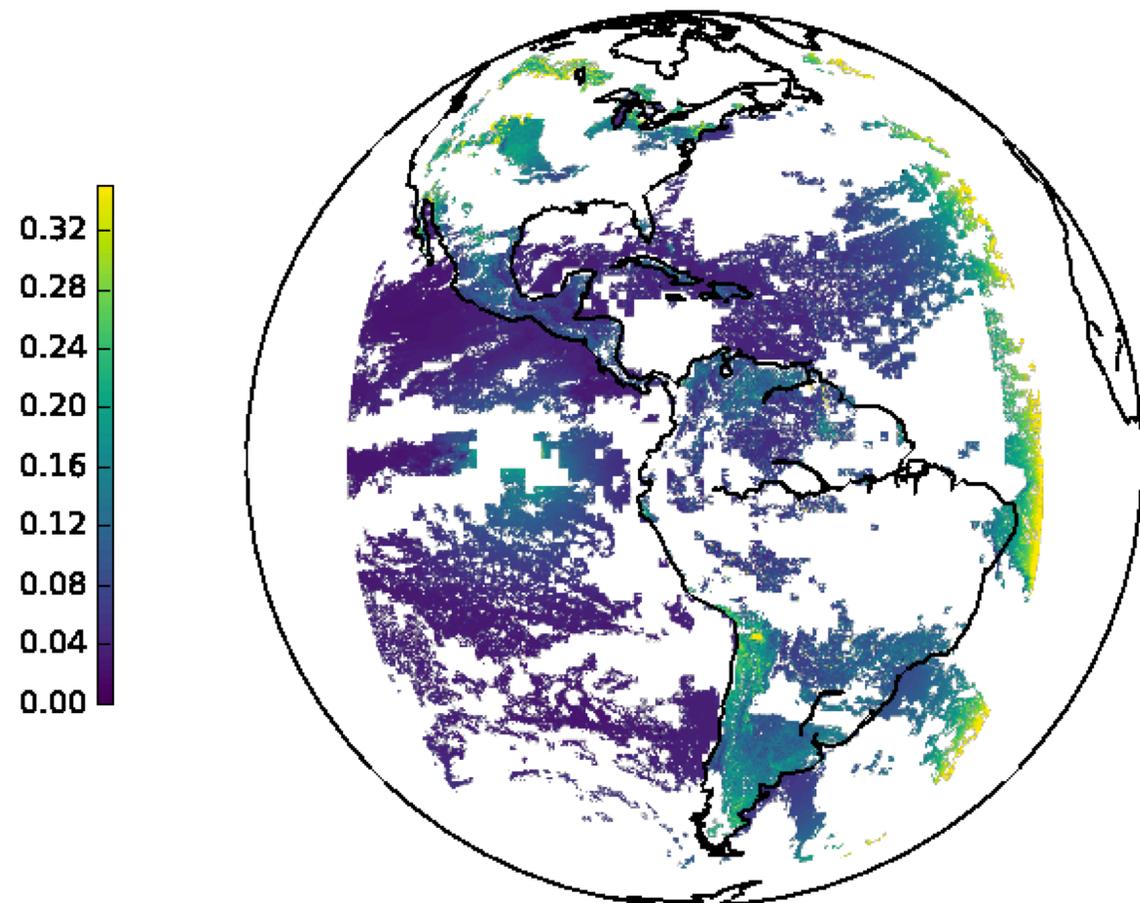
NRT SatCORPS cloud cleared GOES-16 and AHI-8 TOA reflectances

- Provided by NASA Langley SatCORPS Group (R. Palikonda, W. Smith)
- 1 full disk scan per hour

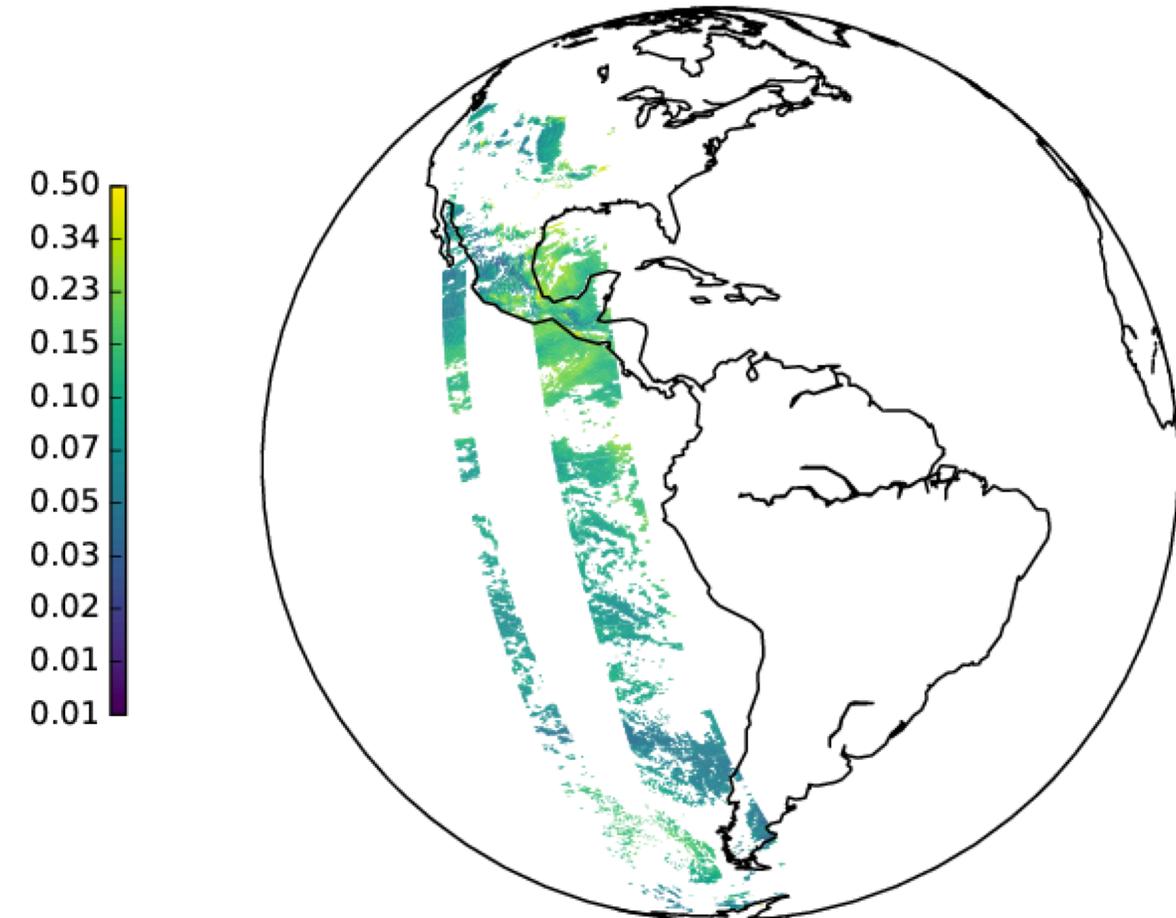
Use MODIS-NNR AOD as targets for training GEO Reflectance observations

INPUTS → **TARGETS**

GOES-16 TOA 640 Reflectance 2018-03-11 20Z



MODIS Aqua NNR AOD 2018-03-11 20Z

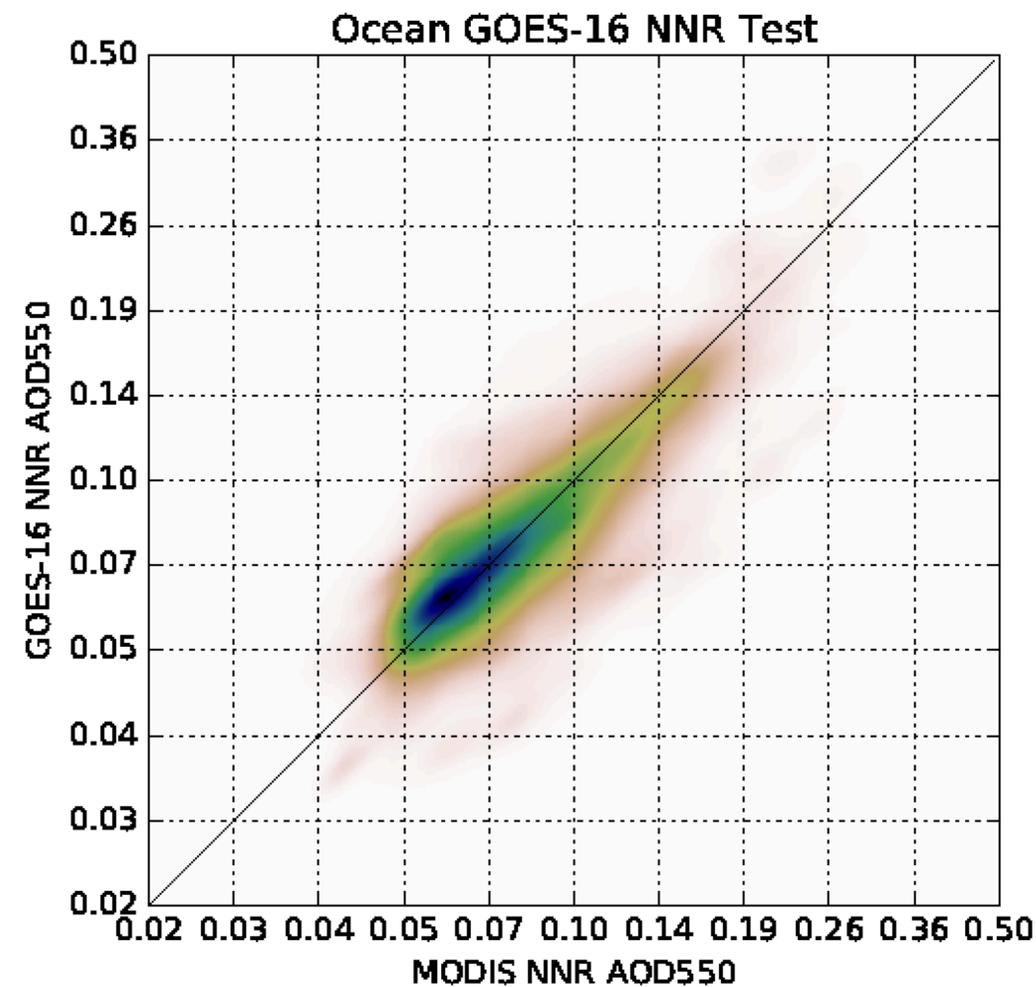


From LEO to GEO: Calibration Transfer

NRT SatCORPS cloud cleared GOES-16 and AHI-8 TOA reflectances

- Provided by NASA Langley SatCORPS Group (R. Palikonda, W. Smith)
- 1 full disk scan per hour

Use MODIS-NNR AOD as targets for training GEO Reflectance observations



Preliminary Test with Ocean Data

- Trained NNR with 2-months of MODIS/GOES-16 collocated observations
- ~100K data points
- Currently only 640, 860, and 1600 nm channels provided
- No water vapor correction

*High priority for going to ops
(notionally Fall 2018)*

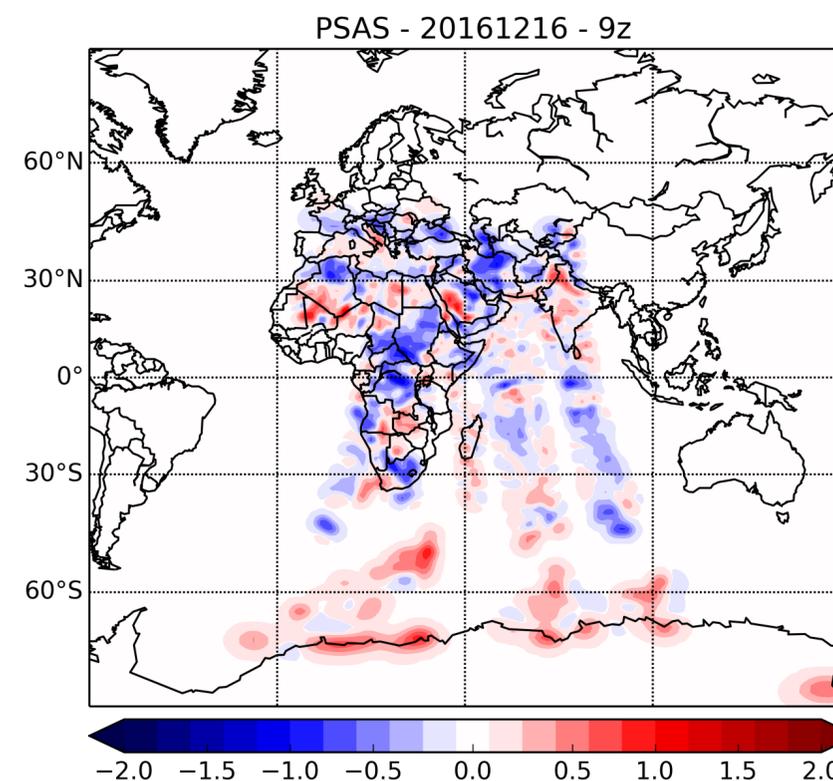
Aerosol EnKF

As part of GMAO's hybrid system, aerosol ensemble members are produced as a matter of routine

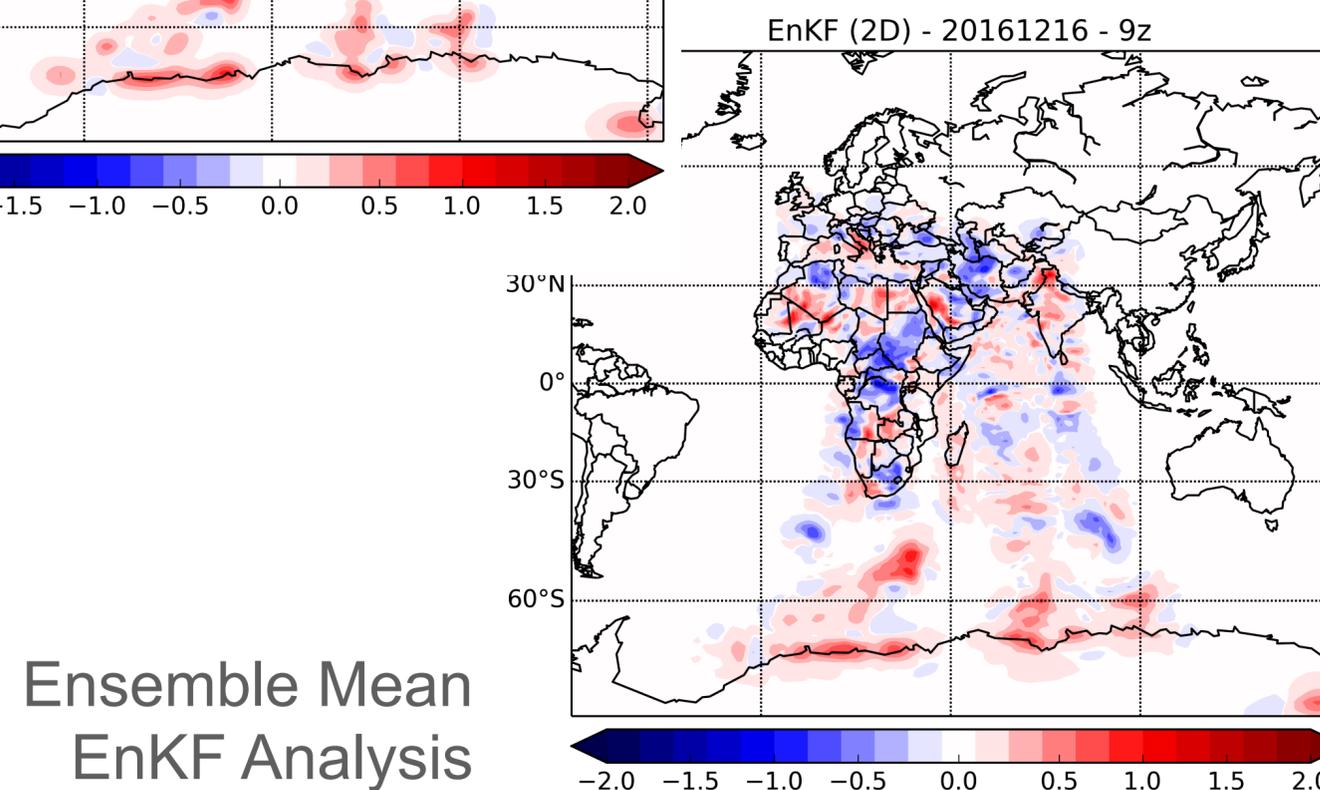
The same Whitaker-Hamill EnKF used for the hybrid Meteorological assimilation has been adapted for aerosols

Target observation systems

- Multi-spectral AOD: 470, 550 and 870 nm
- Lidar attenuated backscatter
- Sensors: MODIS, VIIRS, GEO, CATS/CALIOP, TropOMI



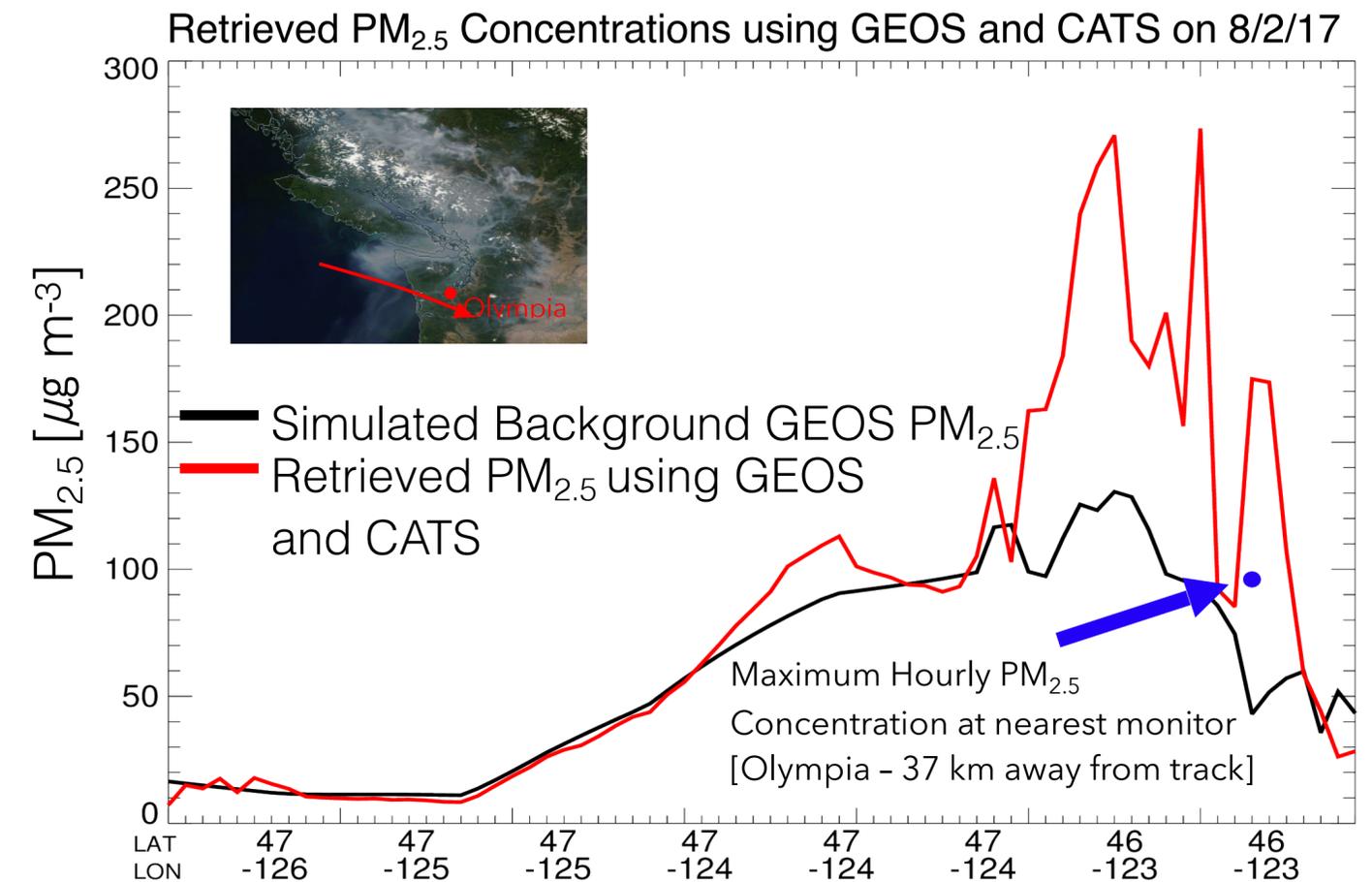
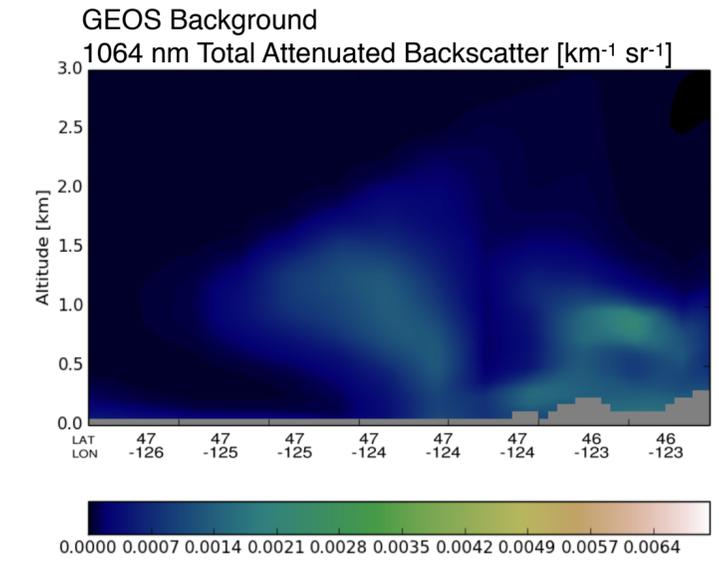
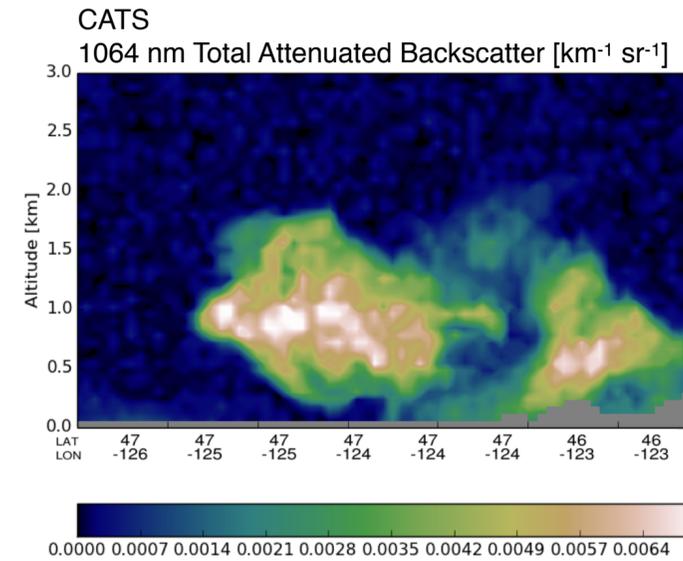
Current PSAS
Based Analysis



Ensemble Mean
EnKF Analysis

Retrievals of Surface Mass Concentration using GEOS and CATS

- Using vertical profiles of total attenuated backscatter from the CATS lidar on the ISS, we have developed a 1-D ensemble based (1-D EnsVar) retrieval technique that produces vertically resolved estimates of aerosol optical quantities and mass concentrations using the GEOS aerosol modeling system
- Recently, we have built on this capability to retrieve speciated aerosol quantities, with a focus on surface air quality
- In this example, the GEOS background simulated the vertical extent of a smoke plume over the Pacific NW US, but failed to match the intensity observed by CATS
- After incorporating CATS observations, retrieved surface $PM_{2.5}$ concentrations increased where the plume was observed at the surface
- This technique demonstrates the utility of having NRT lidar products for air quality forecasting applications



Field Campaign Support

Global 5-day chemical forecasts

- O₃, aerosols, CO, CO₂, SO₂
- Constituents transported on-line, radiatively interactive
- Nominally 12.5 km



Global Modeling and Assimilation Office **GMAO**

Weather | Seasonal | Reanalysis | Mission Support

Navigation

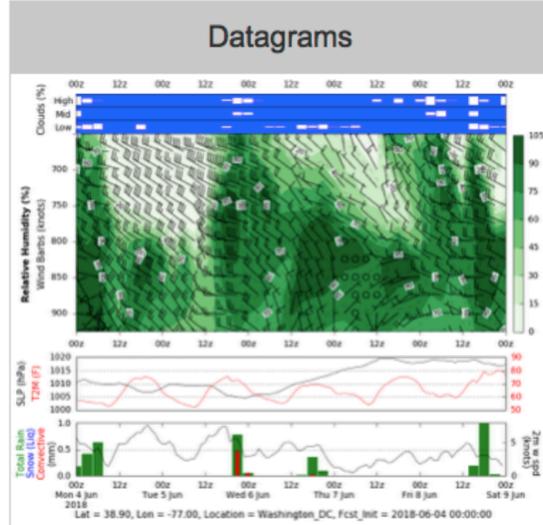
- » Datagrams
- » WxMaps
- » Chem Maps
- » Observing System Stats
- » Radiances Monitoring
- » Observation Impacts
- » WMS Viewer: GEOS Aerosols

Data Access

- » HTTPS
Assimilation | Forecast
- » OPeNDAP
Assimilation | Forecast
- » FTP (No Password)
Assimilation | Forecast

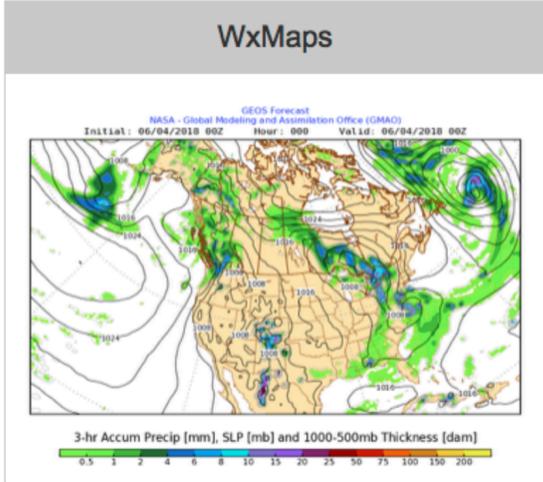
Weather Analyses and Forecasts

Datagrams



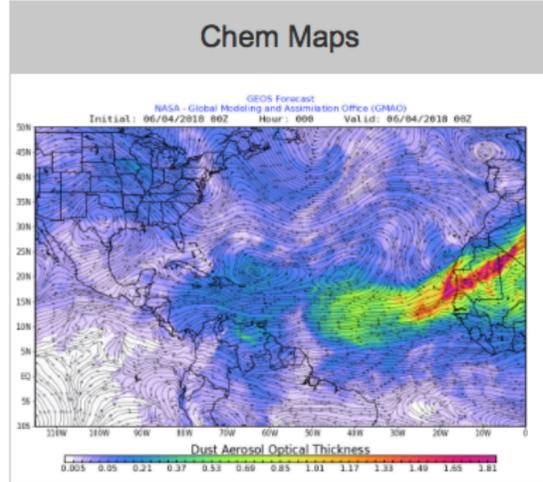
Clouds (%)
Relative Humidity (%)
SLP (mb)
Total Rain, Snow, Convective
Mon 4 Jun 2018
Lat = 38.90, Lon = -77.00, Location = Washington_DC, Fcst_init = 2018-06-04 00:00:00

WxMaps



3-hr Accum Precip [mm], SLP [mb] and 1000-500mb Thickness [dam]

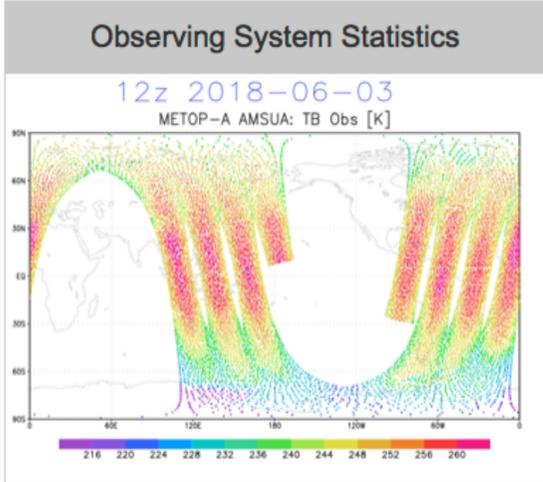
Chem Maps



Dust Aerosol Optical Thickness

Observing System Statistics

12z 2018-06-03
METOP-A AMSUA: TB Obs [K]



<https://fluid.nccs.nasa.gov/weather>

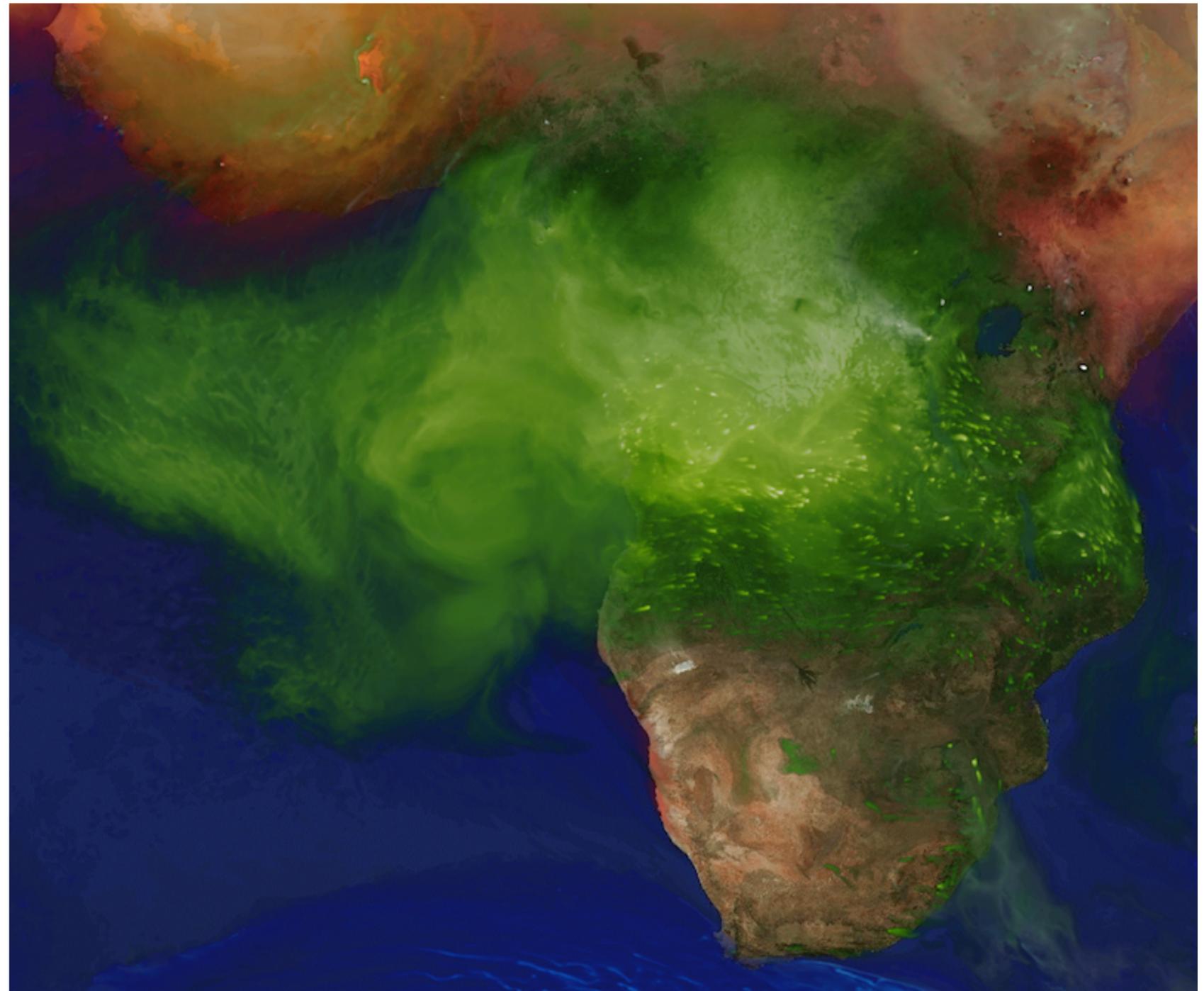
Field Campaign Support

Global 5-day chemical forecasts

- O₃, aerosols, CO, CO₂, SO₂
- Constituents transported on-line, radiatively interactive
- Nominally 12.5 km

QFED real-time biomass emissions

- Top-down algorithm based on MODIS Fire Radiative Power (Aqua/Terra)
- FRP emission factors tuned by means of inverse calculation based on MODIS AOD data
- Daily mean emissions, NRT
- Prescribed diurnal cycle
- BB emissions are deposited in the PBL



Field Campaign Support

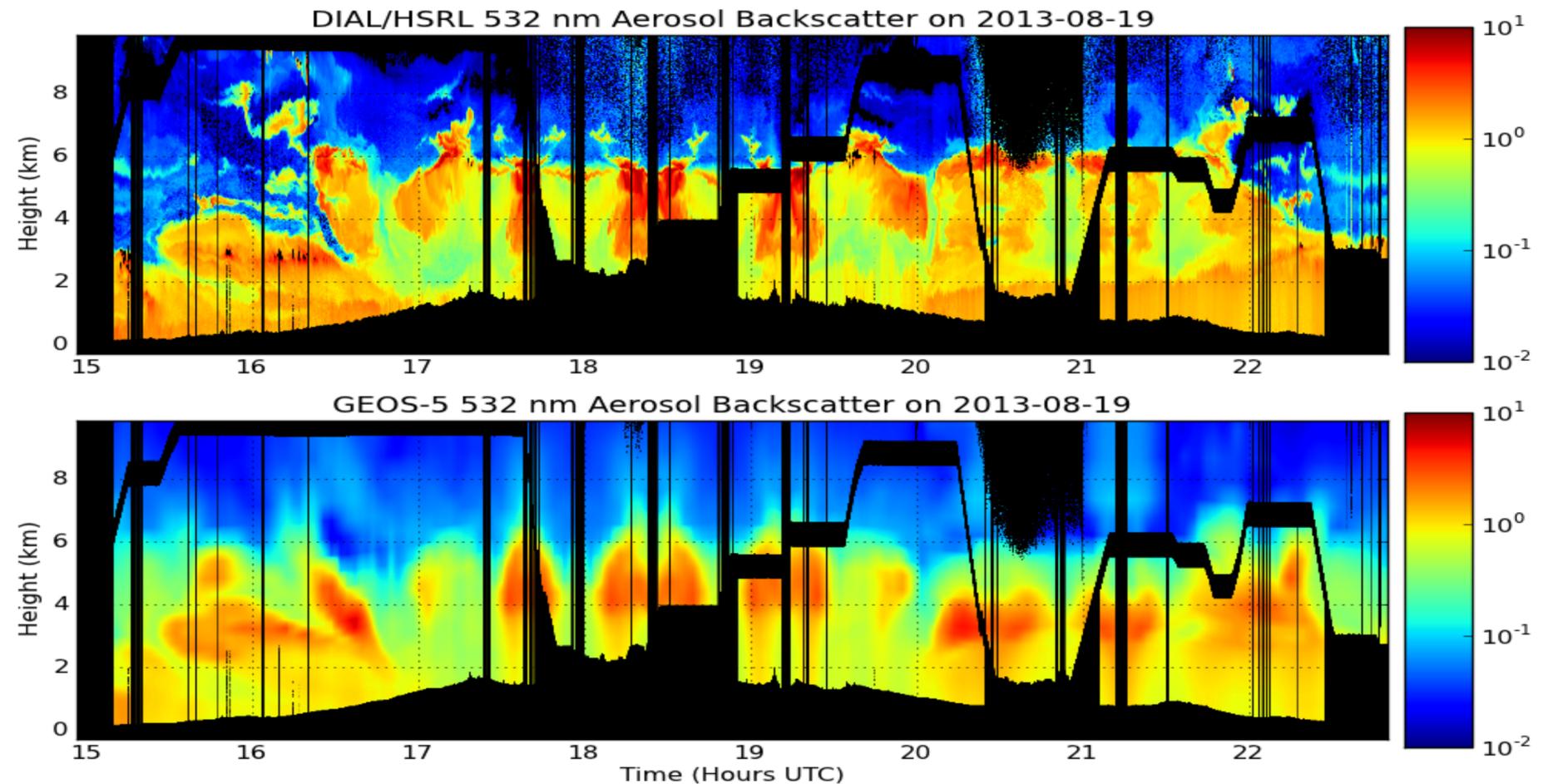
Global 5-day chemical forecasts

- O₃, aerosols, CO, CO₂, SO₂
- Constituents transported on-line, radiatively interactive
- Nominally 12.5 km

QFED real-time biomass emissions

- Top-down algorithm based on MODIS Fire Radiative Power (Aqua/Terra)
- FRP emission factors tuned by means of inverse calculation based on MODIS AOD data
- Daily mean emissions, NRT
- Prescribed diurnal cycle
- BB emissions are deposited in the PBL

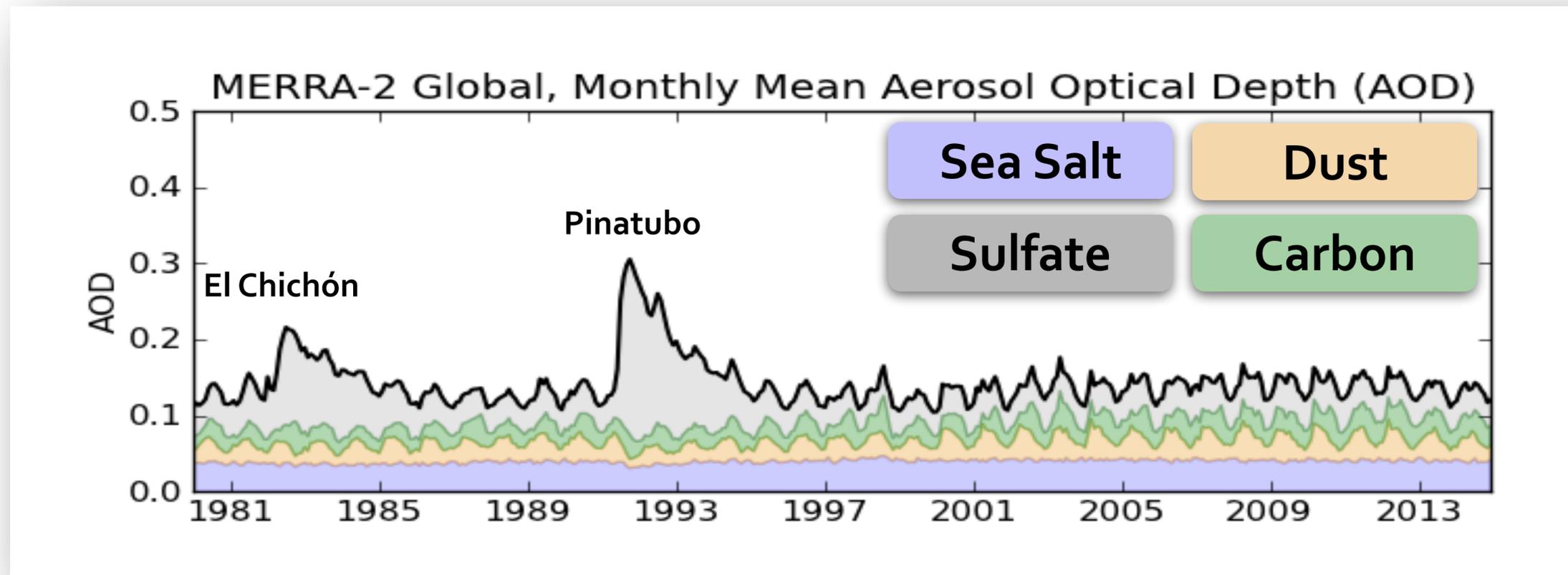
Since 2007 supported field missions include: TC4, ARCTAS, GloPac, ATTREX, DISCOVER-AQ, HS3, SEAC4RS, ATom, ORACLES



Comparison of observed (top) and simulated (bottom) aerosol backscatter for a slight during the 2013 SEAC4RS campaign.

MERRA-2 Global Mean AOD Analysis: 1980 - Onward

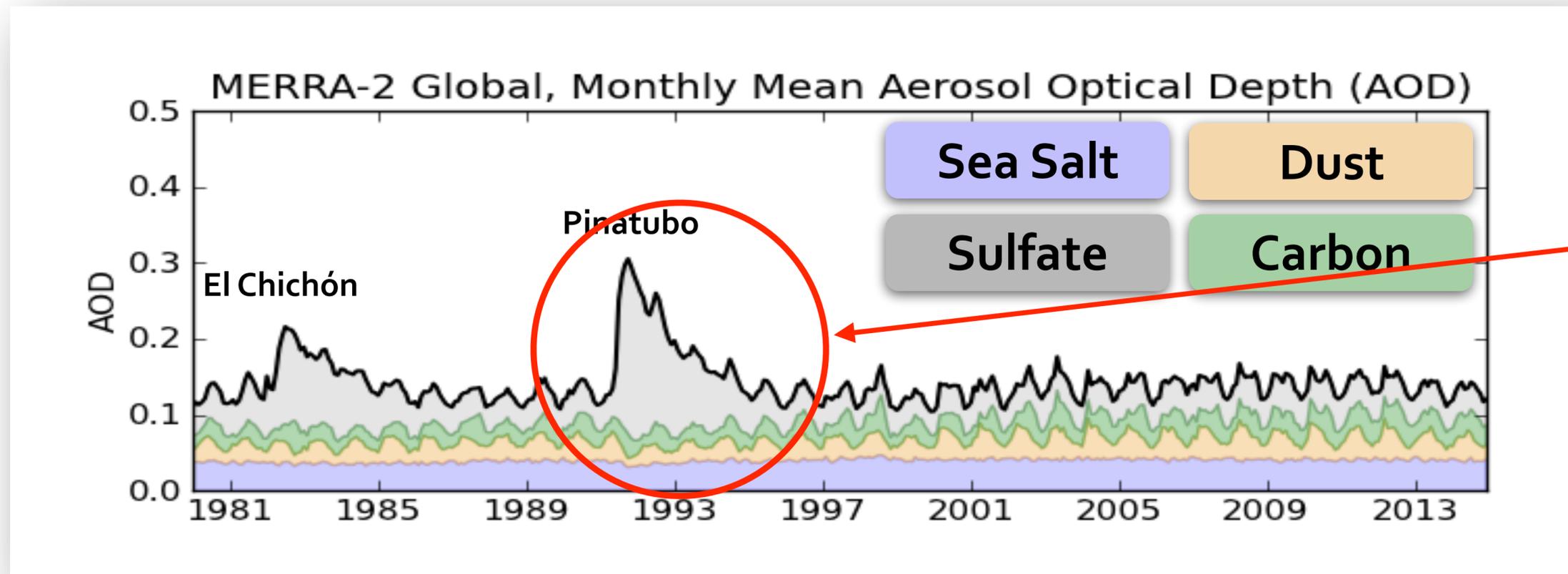
- Unique amongst its peers, the MERRA-2 reanalysis now includes an aerosol reanalysis for the modern satellite era (1980 – onward).
- Aerosols are ***coupled*** to the meteorological reanalysis (both radiatively and through emissions/loss processes).





MERRA-2 Global Mean AOD Analysis: 1980 - Onward

- Unique amongst its peers, the MERRA-2 reanalysis now includes an aerosol reanalysis for the modern satellite era (1980 – onward).
- Aerosols are ***coupled*** to the meteorological reanalysis (both radiatively and through emissions/loss processes).

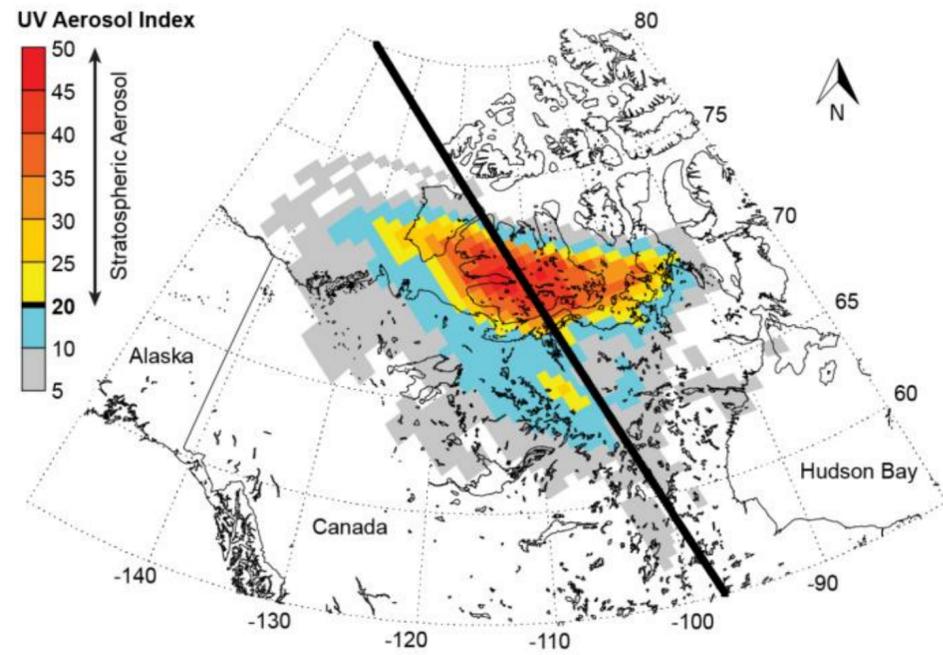
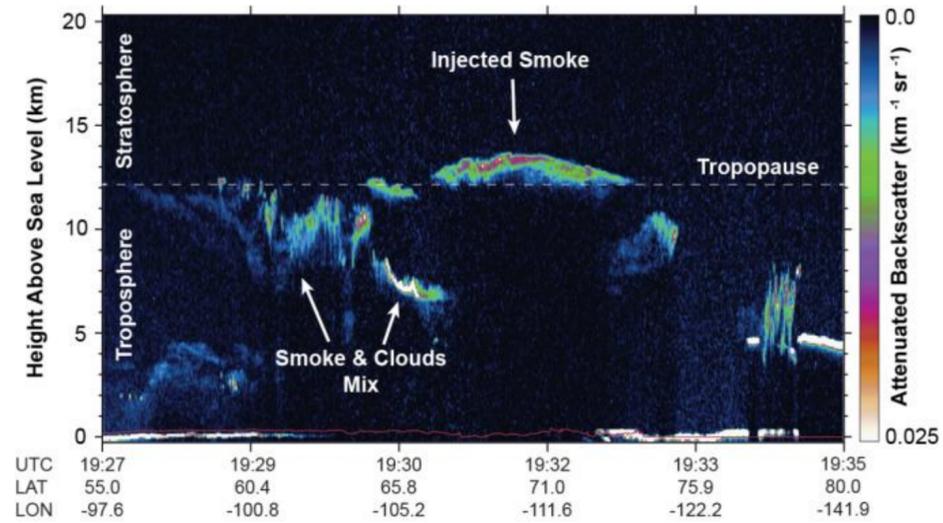


Errors in aerosol properties and vertical distribution propagate to mis-apportionment of aerosol species

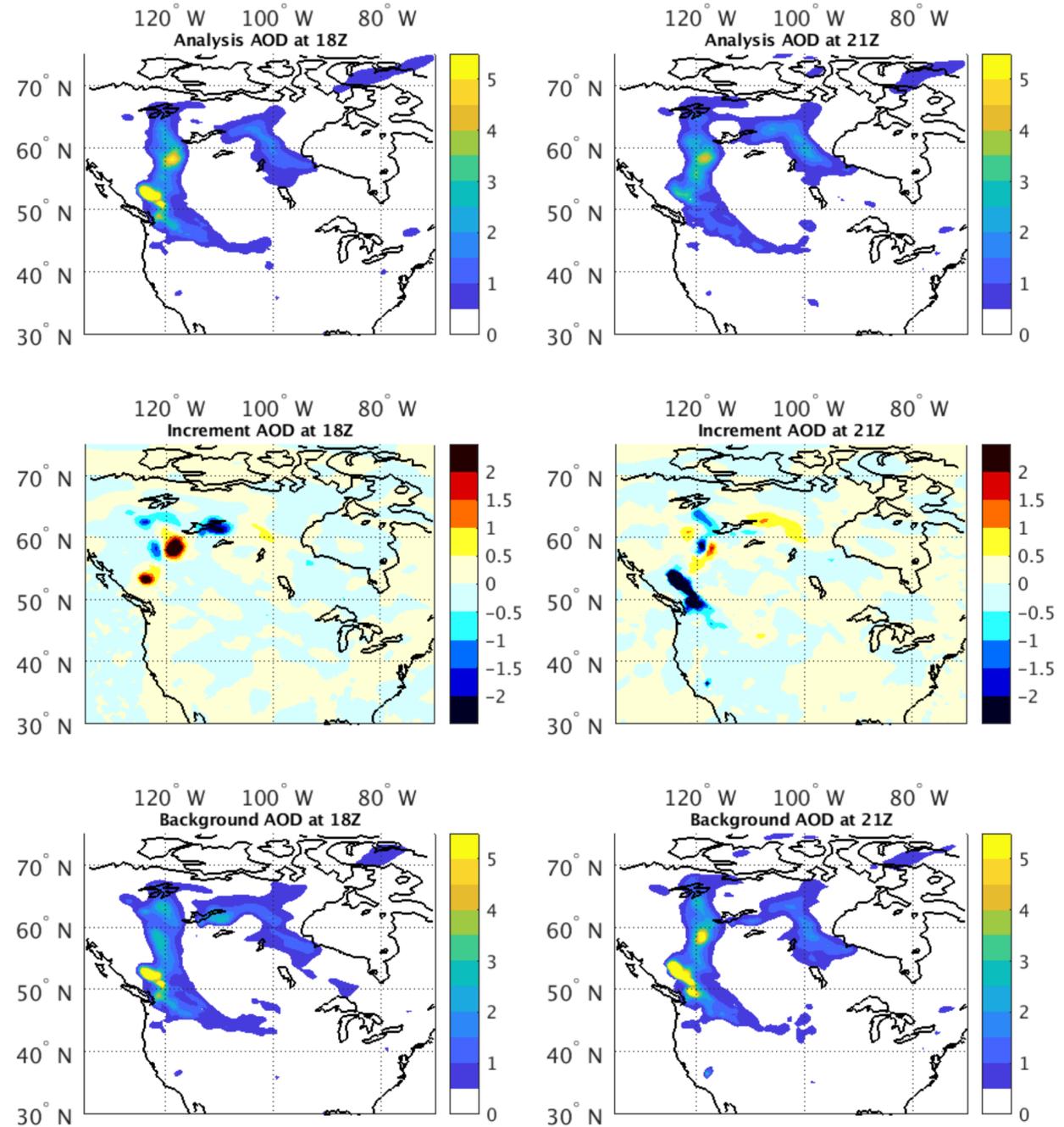


Example: 2017 Canadian Pyro-Cb Event

Observations: 20170814

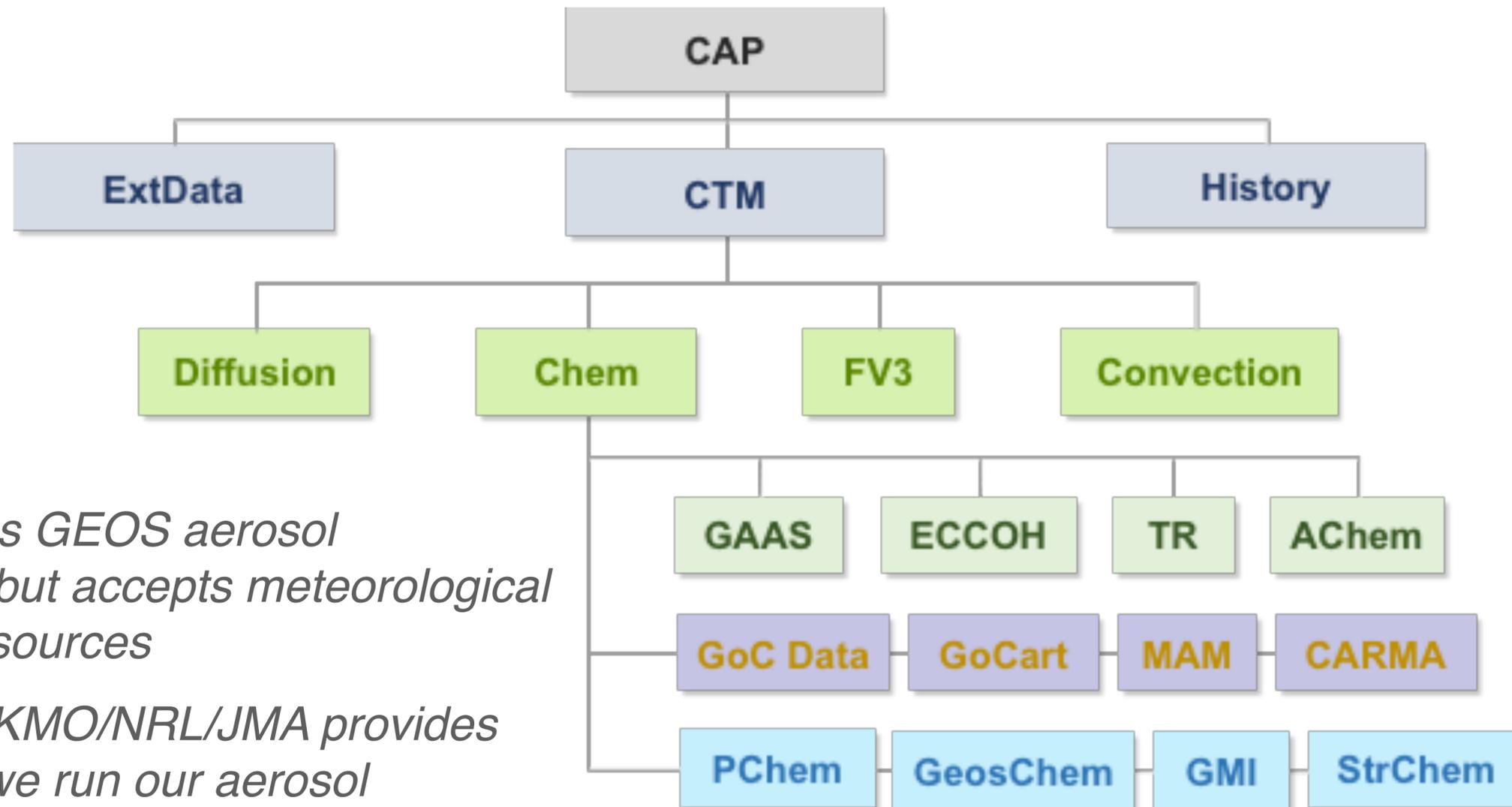


MERRA-2: 20170812





GEOS-CTM Framework



GEOS-CTM exercises GEOS aerosol (chemistry) modules but accepts meteorological inputs from arbitrary sources

Example: ECMWF/UKMO/NRL/JMA provides its meteorology and we run our aerosol packages we can quantify simulation errors resulting from meteorology

Alternative: Provide your aerosol algorithms and we run against GEOS meteorology