



# NRL Aerosol Forecasting Update Part 2: Research and Development

**ICAP 9<sup>th</sup> Working Group Meeting**

**Lille, France**

**June 26-28, 2016**

## Monterey (Marine Meteorology):

<b>Anthony Bucholtz</b>	Radiative measurements, tactical decision aids	<b>Elizabeth Reid</b>	Deployments and analysis
<b>James Campbell</b>	Lidar studies, cirrus radiation	<b>Jeffrey Reid</b>	Microphysics, radiation, observability
<b>Edward Hyer</b>	Satellite data quality, biomass burning	<b>Mindy Surratt</b>	Satellite and model output processing
<b>Mayra Oyola (ASEE)</b>	Dust radiation	<b>Annette Walker</b>	Dust sources, operational outreach
<b>Jim Peak</b>	Statistical post-processing	<b>Doug Westphal</b>	Emeritus
<b>Dave Peterson</b>	Meteorology, biomass burning, remote sensing	<b>Peng Xian</b>	Reanalysis, multi-model ensemble

## Washington, DC (Remote Sensing):

<b>Maggie Anguelova</b>	Satellite retrievals
<b>David Kuhl</b>	Data assimilation for NWP, hybrid methods
<b>Karl Hoppel</b>	Data assimilation for NWP
<b>Juli I. Rubin</b>	Data assimilation and ensemble modeling
<b>Peter Caffrey</b>	Aerosol microphysics, modeling
<b>Ivan Savelyev</b>	Aerosol measurements

Extensive collaborations with our partners: Jianglong Zhang's group (UND), ONR funded MURI led by Steve Miller at CSU, Bob Holz and CIMSS (U of Wisconsin)...

# Navy Aerosol Modeling: From the global to the mesoscale

## Overview of Navy Aerosol Prediction:

### Global Modeling: Navy Aerosol Analysis Prediction System

NAAPS Operational  
Data Assimilation:  
NAVDAS-AOD

NAAPS Reanalysis  
Data Assimilation:  
NAVDAS-AOD

ENAAPS  
Data Assimilation:  
EAKF

ICAP Multi-Model  
Ensemble

### Mesoscale Modeling: Coupled Ocean Atmosphere Mesoscale Prediction System

COAMPS  
Operational Dust

MURI:  
Littoral  
Zone  
Prediction

COAMPS NAAPS

### Inline Aerosol Prediction: Navy Global Environment Model

NAVGEN  
with aerosol

# Global Aerosol Prediction: The power in ensembles

## Multi-Model Ensemble (Peng Xian's Talk)

### ICAP MME

- Valuable collaboration between forecast centers
- Independence across ensemble members
- Top performer

Provides reliable forecast guidance and serves as a good reference dataset (e.g. TIGGE NWP)

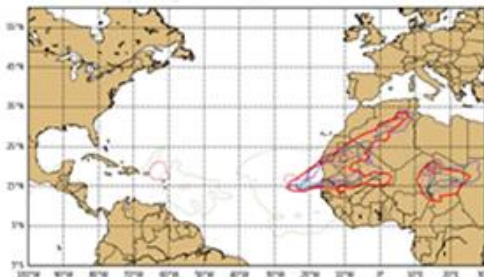
## Single Model Ensemble

### Ensemble NAAPS (ENAAPS)

- 20-80 ensemble members
- EAKF data assimilation
- Moving towards operations.

Using observations more effectively for data assimilation

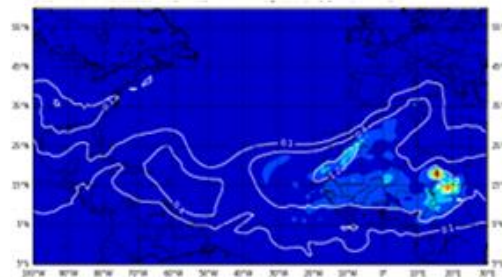
### Probabilistic Products



AOT Contour (0.8)



Dust Warning



Ensemble Standard Deviation

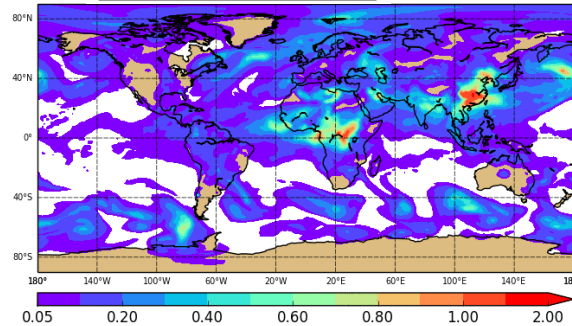


# Navy Global Aerosol Prediction: Ensemble NAAPS (ENAAAPS)

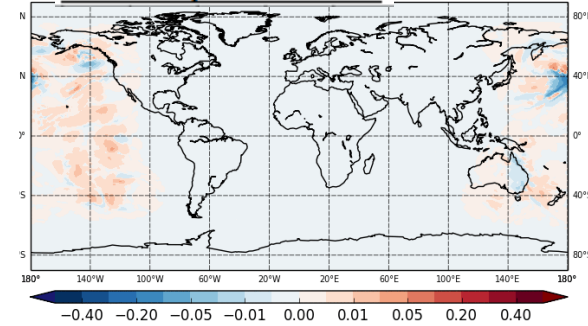
## Recent Developments:

- ENAAAPS-DART is moving towards operational implementation.
- Near real time cycling on Navy DSRC machines.
- Cycles with 80 ensemble members for assimilation
- Forecasts use 20 member subset.

ENAAAPS: AOT Analysis 2017031700

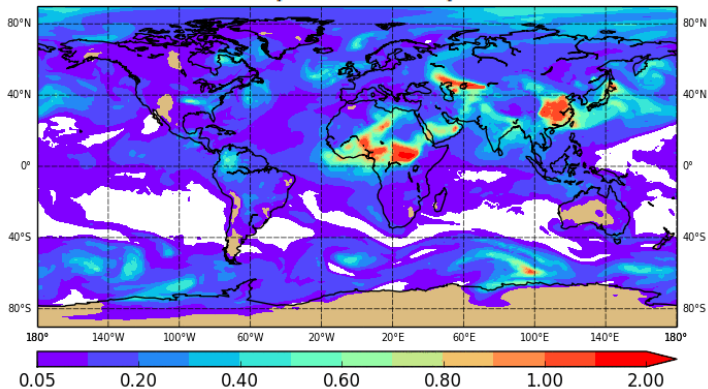


AOT Analysis Increment 2017031700

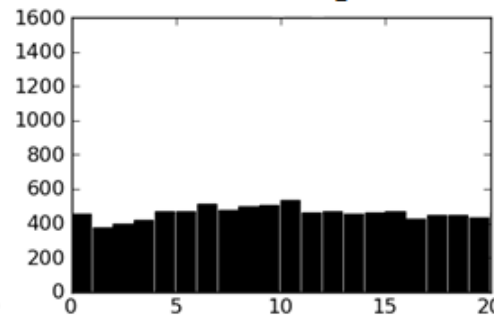


- Ongoing efforts include ensemble verification, ensemble distribution/spread.

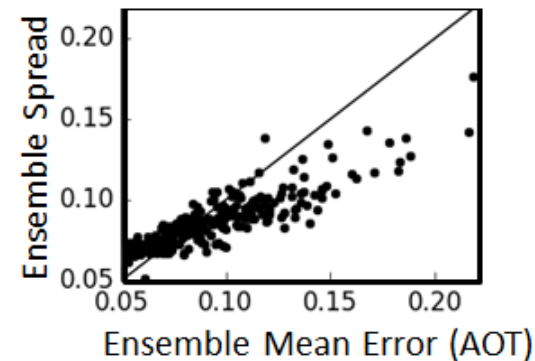
ENAAAPS AOT (144hr Forecast) 2017032112



Rank Histograms



Spread-Skill Relationship

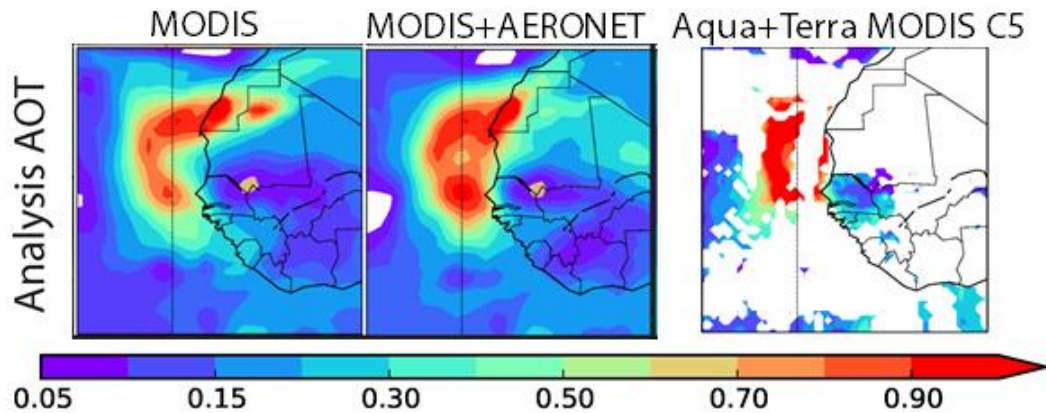
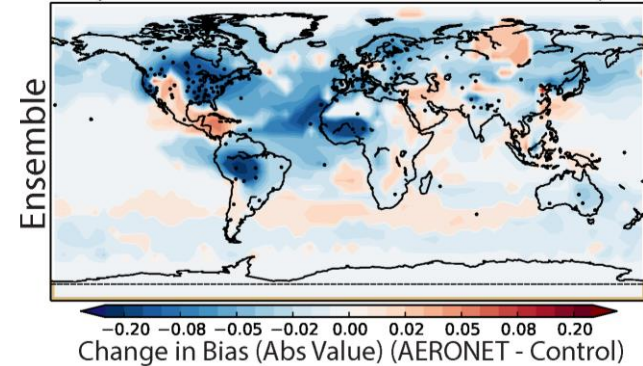


# Navy Global Aerosol Prediction: Ensemble NAAPS (ENAAAPS)

## Improved Data Assimilation Capability:

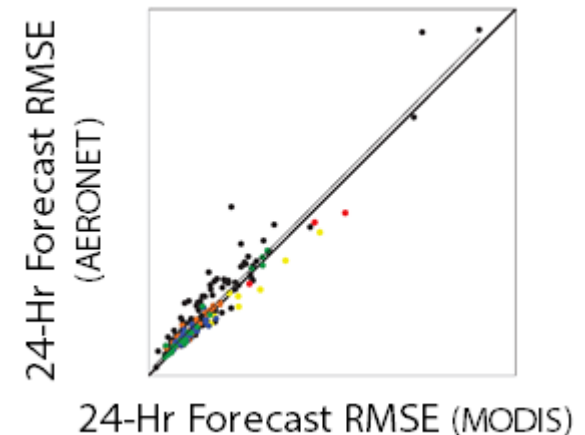
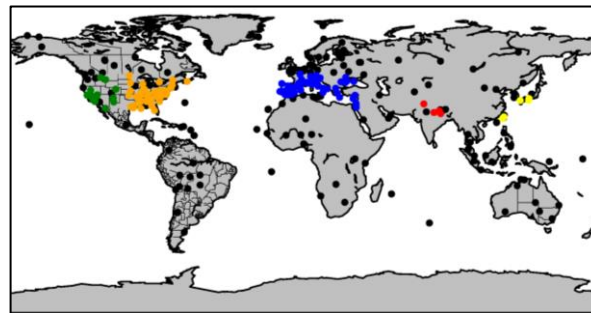
- Flow-dependent corrections.
- Ideal for assimilating sparse aerosol information (e.g. in-situ, LIDAR).
- AERONET is helpful for capturing extreme aerosol events.

**Error reductions relative to a no DA control for AERONET assimilation.**



Near Real Time  
AERONET (v3, L1.5)  
will be needed.

- AERONET may serve as a useful back-up network for assimilation.



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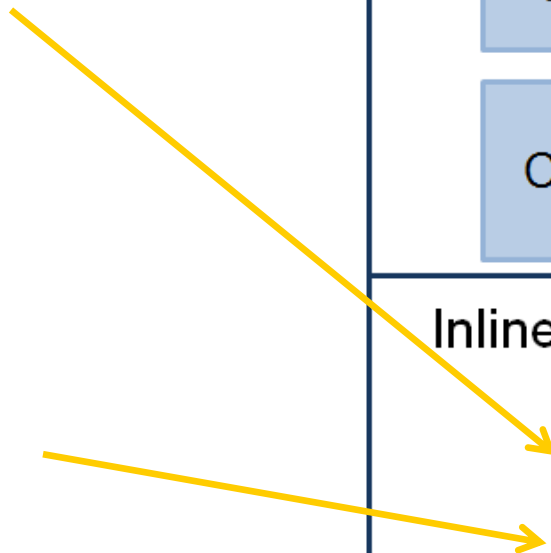
COAMPS  
Operational Dust

COAMPS NAAPS

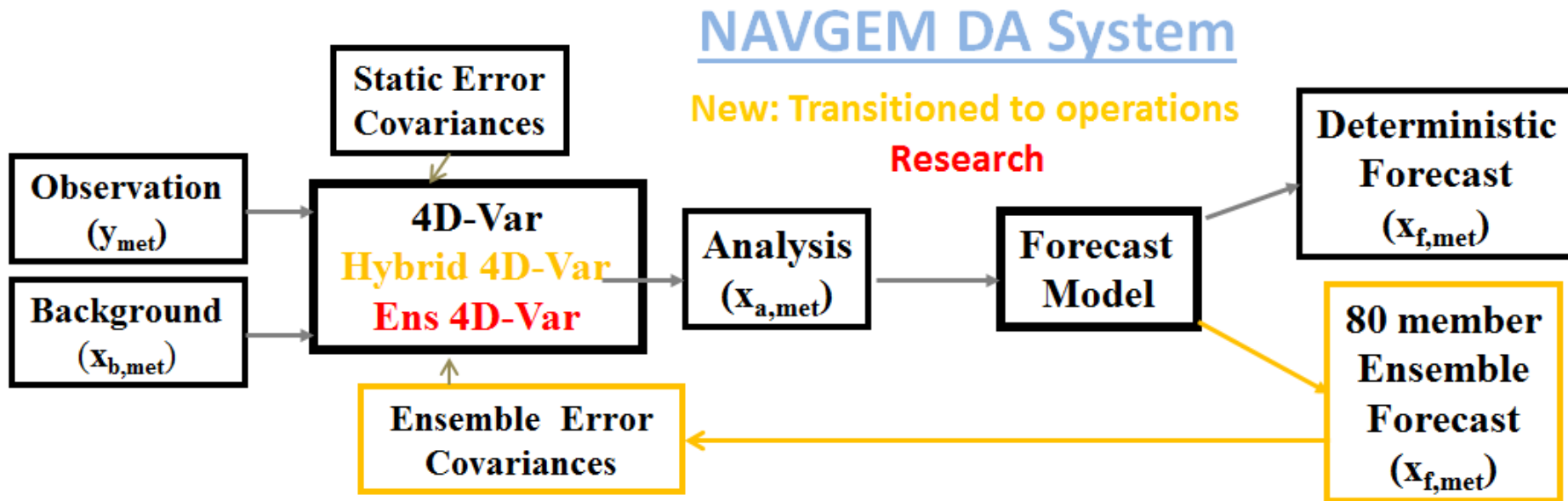
MURI:  
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Prediction

### Inline Aerosol Prediction: Navy Global Environment Model

NAVGEM  
with aerosol



# ENAAPS and Numerical Weather Prediction



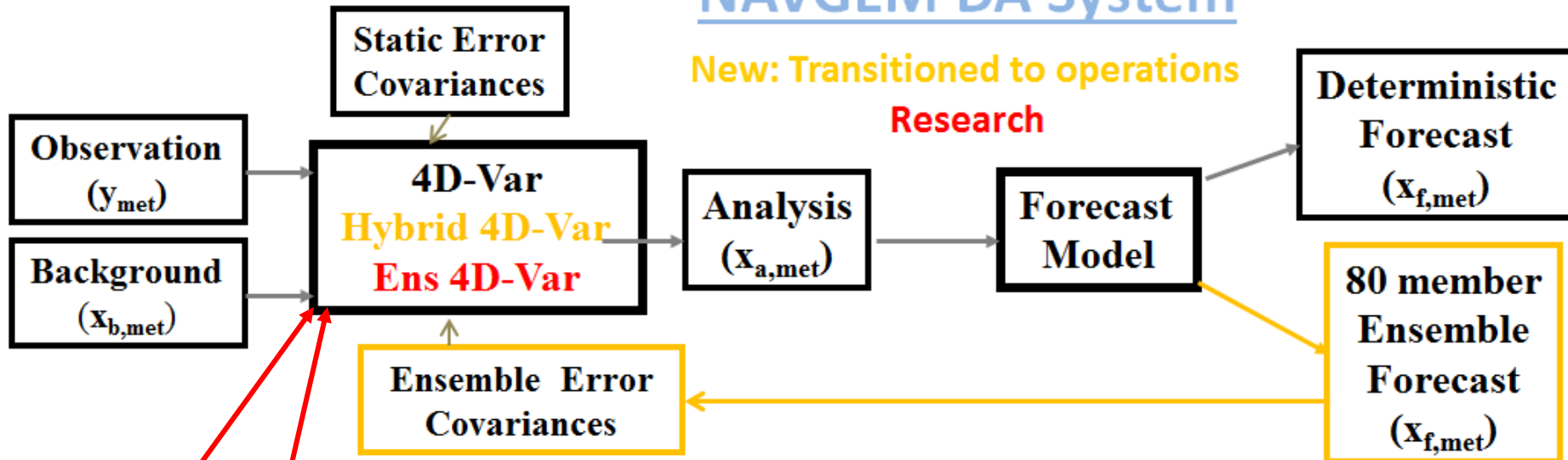
- Hybrid 4D-Var Data Assimilation has transitioned to operations as part of NAVGEM 1.4.
- Having an operational 80 member NAVGEM forecast is key for getting ENAAPS to operations.
- There is ongoing research into an Ens 4D-Var (no TLM/adjoint) that is a joint effort between NRL Monterey and DC.



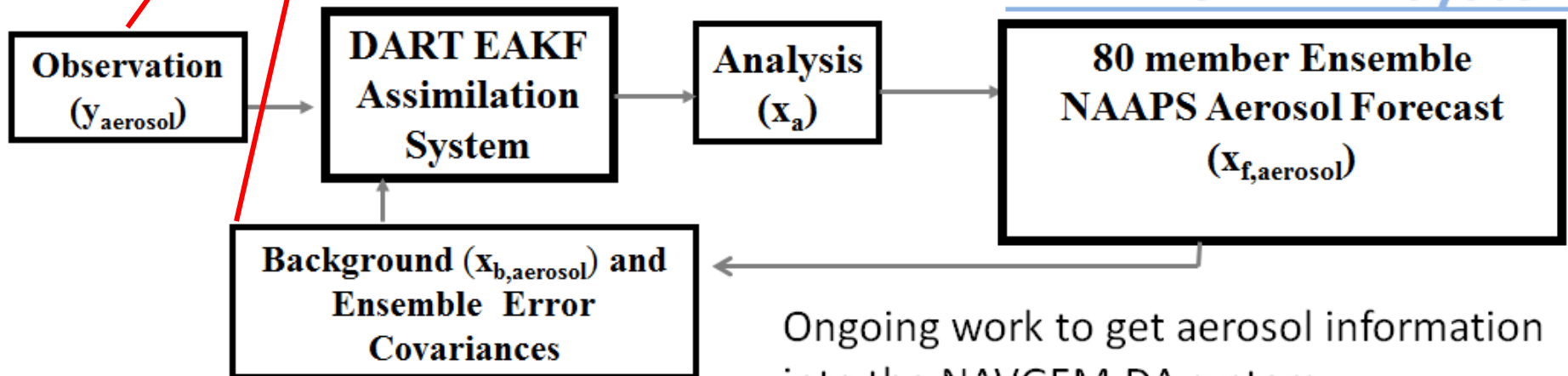
# ENAAPS and Numerical Weather Prediction

## NAVGEM DA System

New: Transitioned to operations  
Research



## ENAAPS-DART System



Ongoing work to get aerosol information into the NAVGEM DA system.

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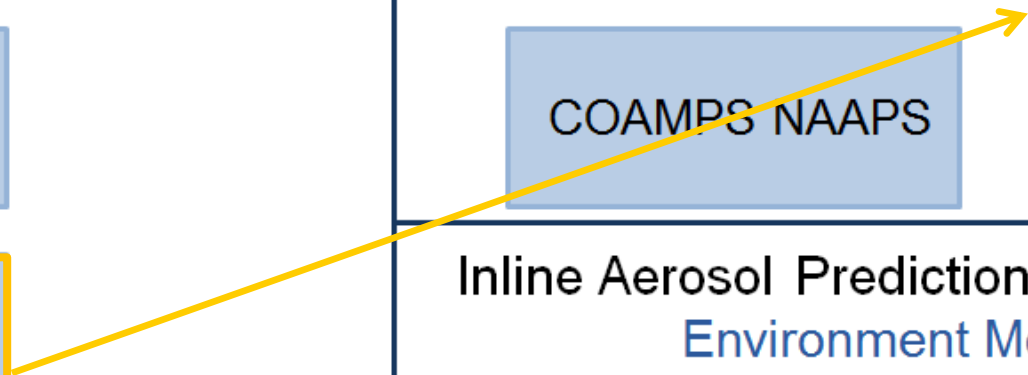
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# Navy Mesoscale Aerosol Prediction: MURI Ensemble Data Assimilation

Multidisciplinary University Research Initiatives (MURI) program funded by ONR:

Improve forecasting of aerosol in the complex littoral environment (CSU)

**Goal:** Produce high resolution 3D analysis of aerosol fields/uncertainty.

**Approach:** Coupled atmosphere-aerosol-chemistry ensemble DA.

**Models:** WRF-Chem, CSU RAMS.

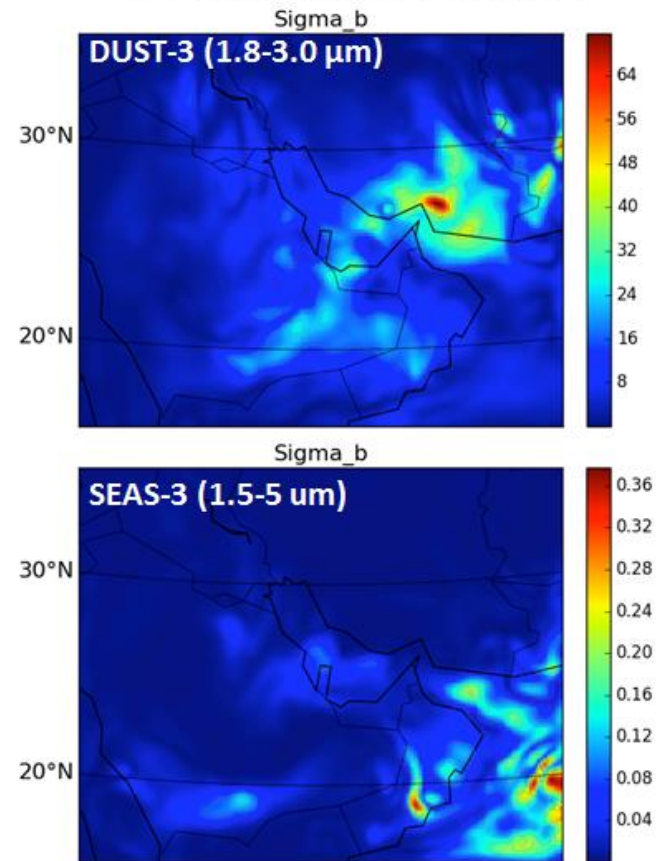
**DA:** EnKF (Maximum Likelihood Ensemble Filter)

**Challenge:** Can data assimilation exploit environmental parameter correlations to overcome observational shortfalls and provide a high-resolution 3D analysis of aerosol fields?

**Strategy:**

1. Use probabilistic forecasts to get aerosol vertical distribution since AOT is 2D.
2. For adequate high-resolution aerosol data assimilation need additional information about vertical distribution.
3. Assimilate MW all-sky satellite radiance observations
4. All-sky primarily impacts clouds, but through coupled atmosphere-aerosol ensemble forecast error correlation it also impacts aerosol 3D fields.

6-hour Forecast Uncertainty at 850 hPa  
WRF-Chem + GOCART (32 ensembles)  
Valid 0600 UTC on 4 Aug 2016



Results from Milija Zupanski-CIRA

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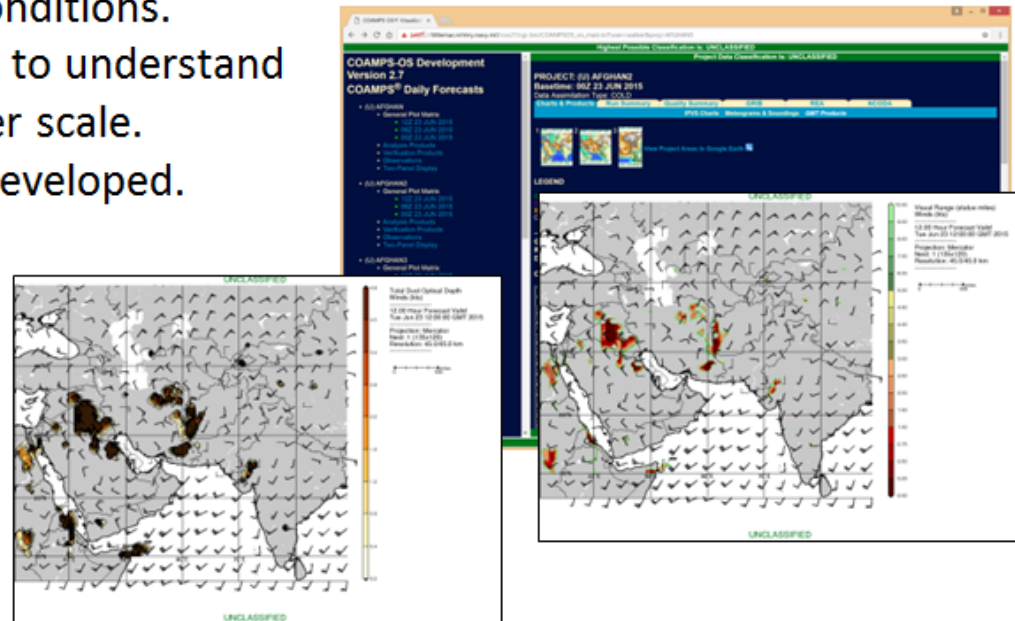
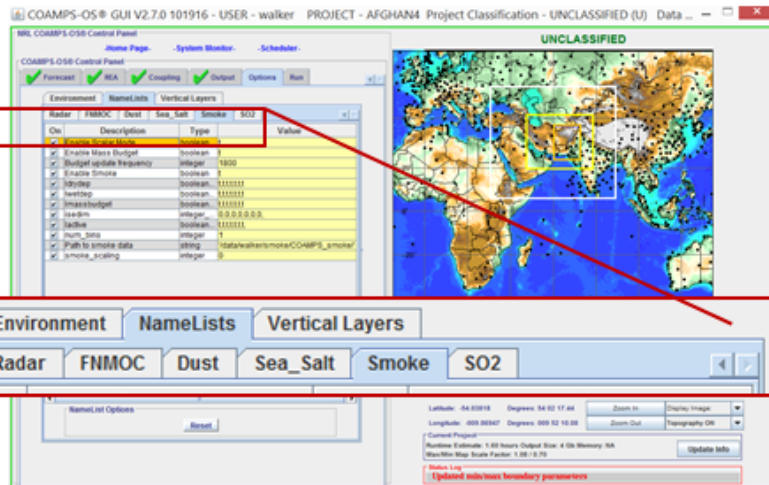
NAVGEN  
with aerosol



# COAMPS with NAAPS Aerosol Species

## Support for new COAMPS v5.6 aerosol prediction module in COAMPS-OS

- COAMPS with dust, operational since 2001.
- COAMPS now supports all 4 NAAPS aerosol species (dust, smoke, sea salt, SO<sub>2</sub>).
- Allows for NAAPS as COAMPS boundary conditions.
- NAAPS and COAMPS can be used together to understand aerosol from the large scale to a much finer scale.
- New aerosol visualization products were developed.



New option tabs in COAMPS GUI for each aerosol species:  
Dust, Smoke, Sea Salt, SO<sub>2</sub>

AOT and visual range are the primary graphics products.

# Ongoing Efforts in Global Modeling

Working towards efficient processing:

Forecast Efficiency  
with Inter-dependent  
Tasks

Satellite and Model  
Output/Input

Workflow Management  
with Cylc

Setup

Obs Processing

Data Assimilation

Forecast

Ensemble

Post-Processing

Obs Sensitivity

Cleanup

NAVGEN flow



# Ongoing Efforts in Global Modeling

Working towards efficient processing:

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## Geo-located Information Processing System (GeoIPS™)

A new Python-based system for Operational and R&D processing of data with latitudes and longitudes

**Generalized:** *The same code can be applied for all datasets (model and satellite datasets).*

**Extendable:** *Addition of new datasets, products, and sensors is straightforward.*

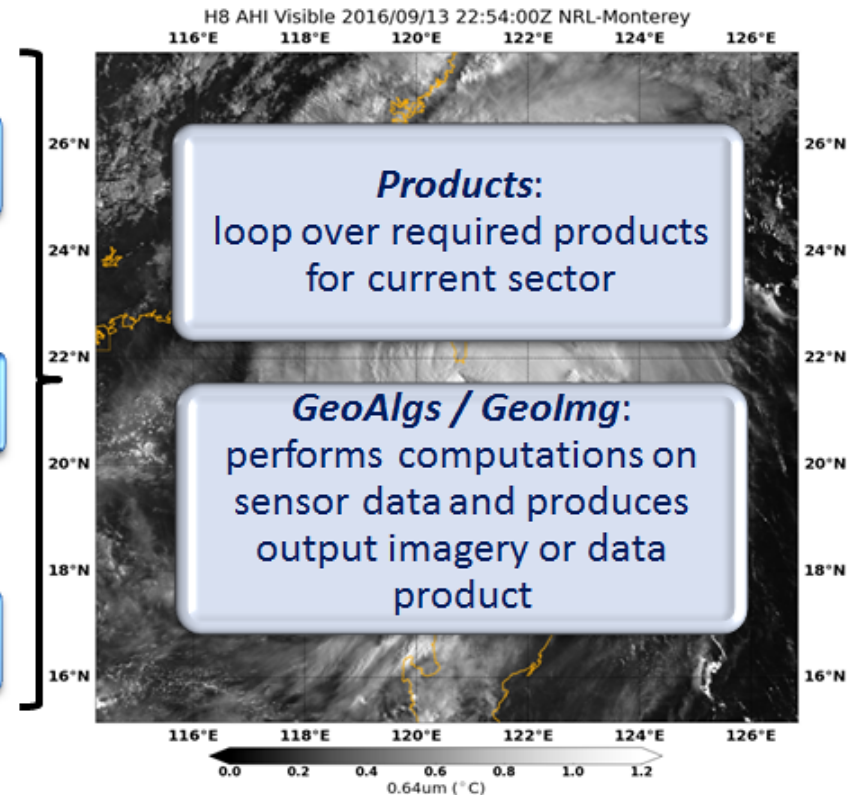
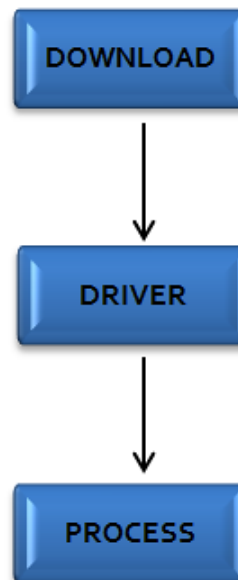
**Easy to Use:** *Can run without knowledge of the code.*

# Geo-located Information Processing System (GeoIPS™)

A new Python-based system for Operational and R&D processing of data with latitudes and longitudes

New features/versions in development:

1. **Open-source release:** *Facilitates collaboration across organizations.*
2. **Data fusion:** *combine multiple datasets into a single product.*
3. **Quantitative data output:** *currently imagery-based output. New capabilities will be used for data ingestion into models/data assimilation*



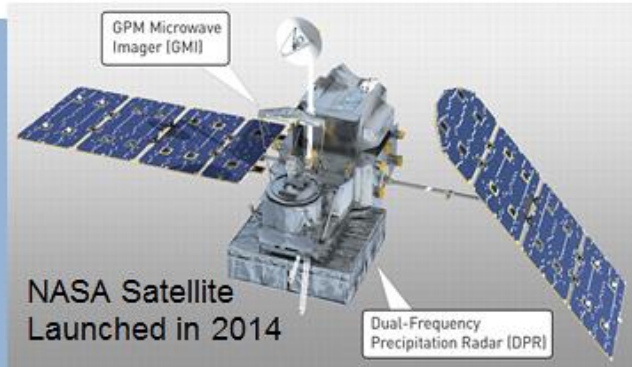
Super Typhoon Meranti



# Satellite Retrievals of Aerosol Relevant Parameters

## WindSat

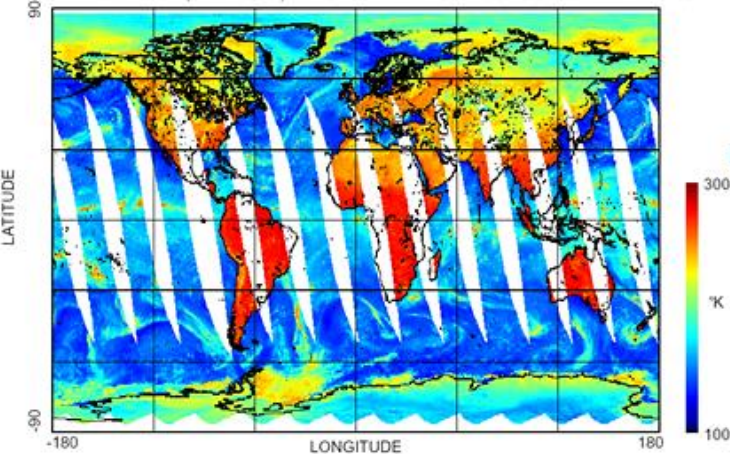
- Developed by NRL Remote Sensing Division
- 11+ years and counting archive of global brightness temperatures



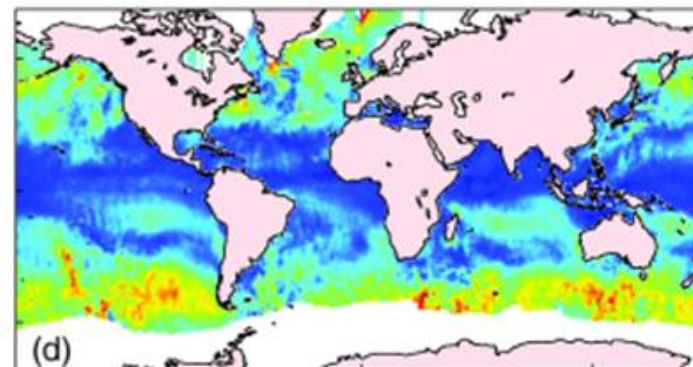
WindSat and GMI combined to improve spatial coverage, retrievals were calibrated to remove bias.

## Brightness Temperature, $T_B$ [K]

WINDSAT TDR (146AFBBDA) FORE ASC 37.0 GHz HPOL 12/23/2003 04973-04986



## Whitecap Fraction



Sea Salt Emissions,  
Monahan  
Source  
Function

- There are several lines of development/research for Navy aerosol prediction from the global (NAAPS/ENAAPS) to the mesoscale (COAMPS/MURI).
- We see ensembles as an important part of aerosol prediction moving forward, in the continued collaboration through the ICAP-MME and also through ENAAPS development and ongoing littoral zone work.
- ENAAPS is moving towards operations, is now capable of NRT forecasts.
- Forecast efficiency in the runs themselves, I/O, and visualization are an important focus (Cylc implementation, Netcdf, GeolPS processing).
- Expansion of the Navy aerosol community to DC, Remote Sensing division and other university partners has enabled new research and development with remote sensing products and data assimilation for aerosol/NWP.