

# Aerosol Data Assimilation Over Oceans

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# Acknowledgment

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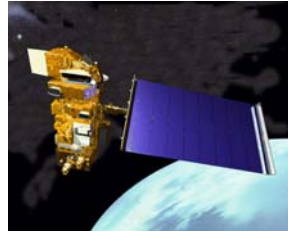


We are grateful to Yoram Kaufman of GSFC, father of modern day aerosol remote sensing, for his thoughtful review and excellent suggestions.

# Aspects of aerosol science

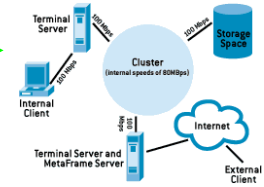


In situ

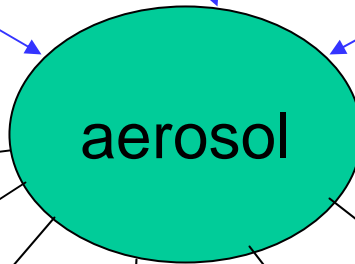


Satellite

Data assimilation



Model



Clouds

Bio-sphere interaction...

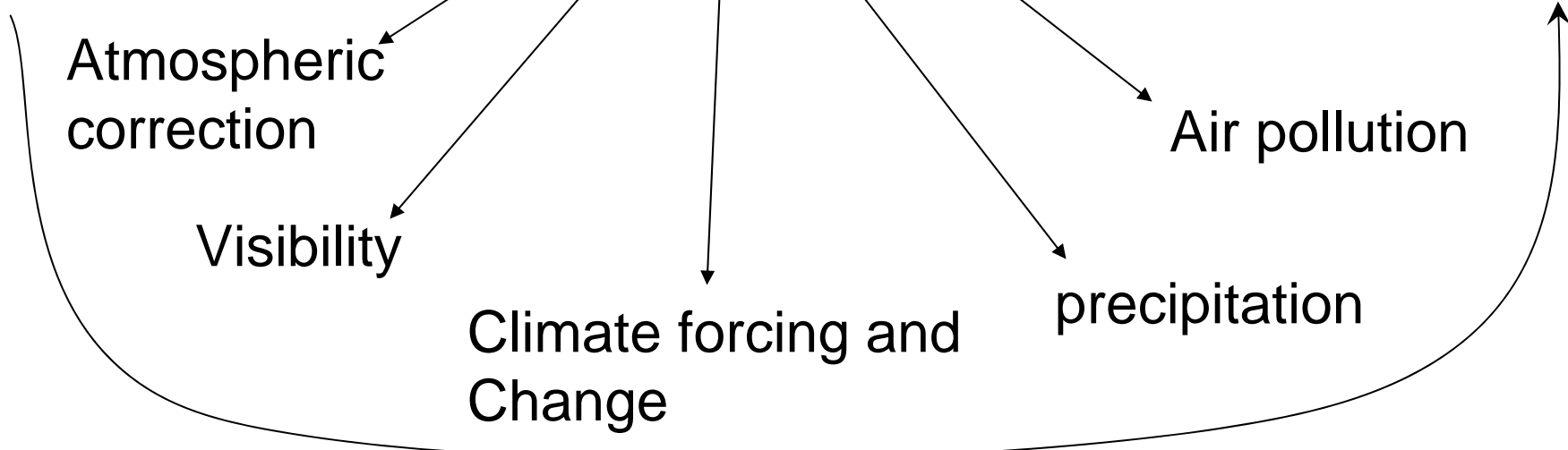
Atmospheric correction

Air pollution

Visibility

precipitation

Climate forcing and Change





# Background

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- NRL Aerosol Analysis and Prediction System (NAAPS)
- MODIS level II aerosol optical depth (AOT) is best suitable for near real-time aerosol data assimilation.
- NRL Atmospheric Variational Data Assimilation System (NAVDAS)

# Why MODIS?



- Satellite observations have been used in retrieving aerosol optical properties such as optical depth and size parameters.
- Examples of satellite aerosol retrievals: AVHRR, GOES, TOMS, SeaWiFs, MISR, POLDER, SAGE, VIRS, MODIS....
- Most of retrievals are limited to either limited number of channels (e.g. AVHRR, GOES), coarse resolution (e.g. VIRS) or suffering calibration difficulties (e.g. GOES).
- *MODIS has 36 channels and detects aerosols and retrieves properties with high accuracy (over oceans,  $\pm 0.03 \pm 0.05\tau$ ) [Remer et al., 2002].*
- *Key: Near real time (through NRTPE - the Near Real Time Processing Effort)*

# Aerosol Forecasting Approach

## NRL Aerosol Analysis and Prediction System (NAAPS)

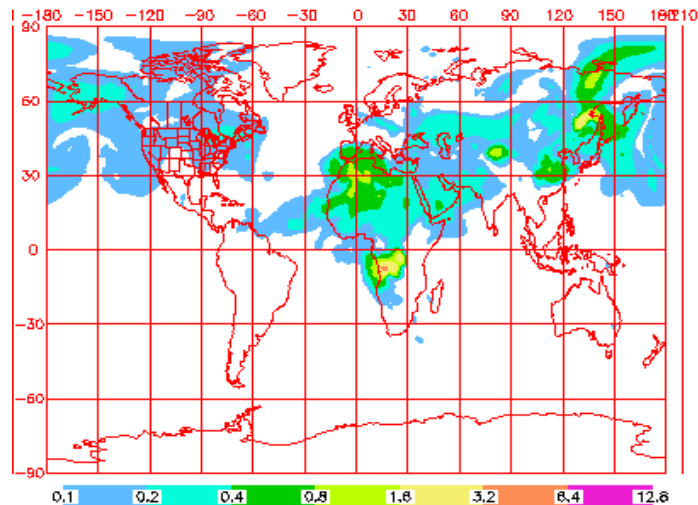


- Apply physically based regional and global aerosol models:  
Emphasis on source functions and transport phenomenology
- Emphasis on aerosol particles that impact visibility:
  - Dust
  - Smoke
  - Sulfate
  - Sea salt
- Focus on operational capability and real-time data streams
- World's only truly operational global aerosol model, 5-day forecast at FNMOC

# NRL Aerosol Analysis and Prediction System (NAAPS)

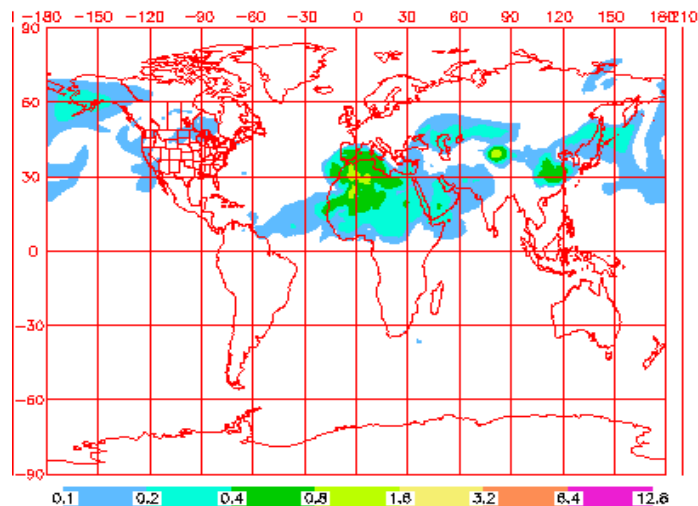
Total  
AOT

NAAPS Total Optical Depth for 00:00Z 27 May 2006  
Contoured at 0.1, 0.2, 0.4, 0.8 etc.



-120 1.000E-01; 1.280E+01 [ 3.547E-04, 3.832E+00, 7.879E-02] UNITLESS

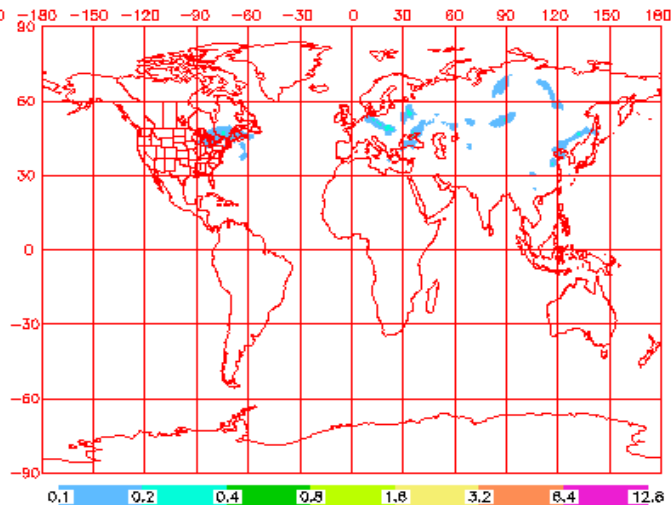
NAAPS Dust Optical Depth for 00:00Z 27 May 2006  
Contoured at 0.1, 0.2, 0.4, 0.8 etc.



-120 1.000E-01; 1.280E+01 [ 4.809E-04, 1.019E+00, 4.422E-02] UNITLESS

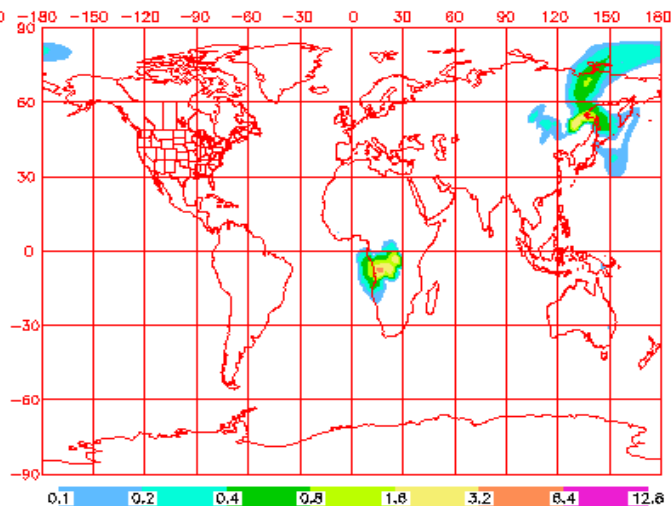
Dust  
AOT

NAAPS Sulfate Optical Depth for 00:00Z 27 May 2006  
Contoured at 0.1, 0.2, 0.4, 0.8 etc.



-120 1.000E-01; 1.280E+01 [ 1.239E-04, 3.175E-01, 1.100E-02] UNITLESS

NAAPS Smoke Optical Depth for 00:00Z 27 May 2006  
Contoured at 0.1, 0.2, 0.4, 0.8 etc.



-120 1.000E-01; 1.280E+01 [ 2.560E-04, 3.782E+00, 2.157E-02] UNITLESS

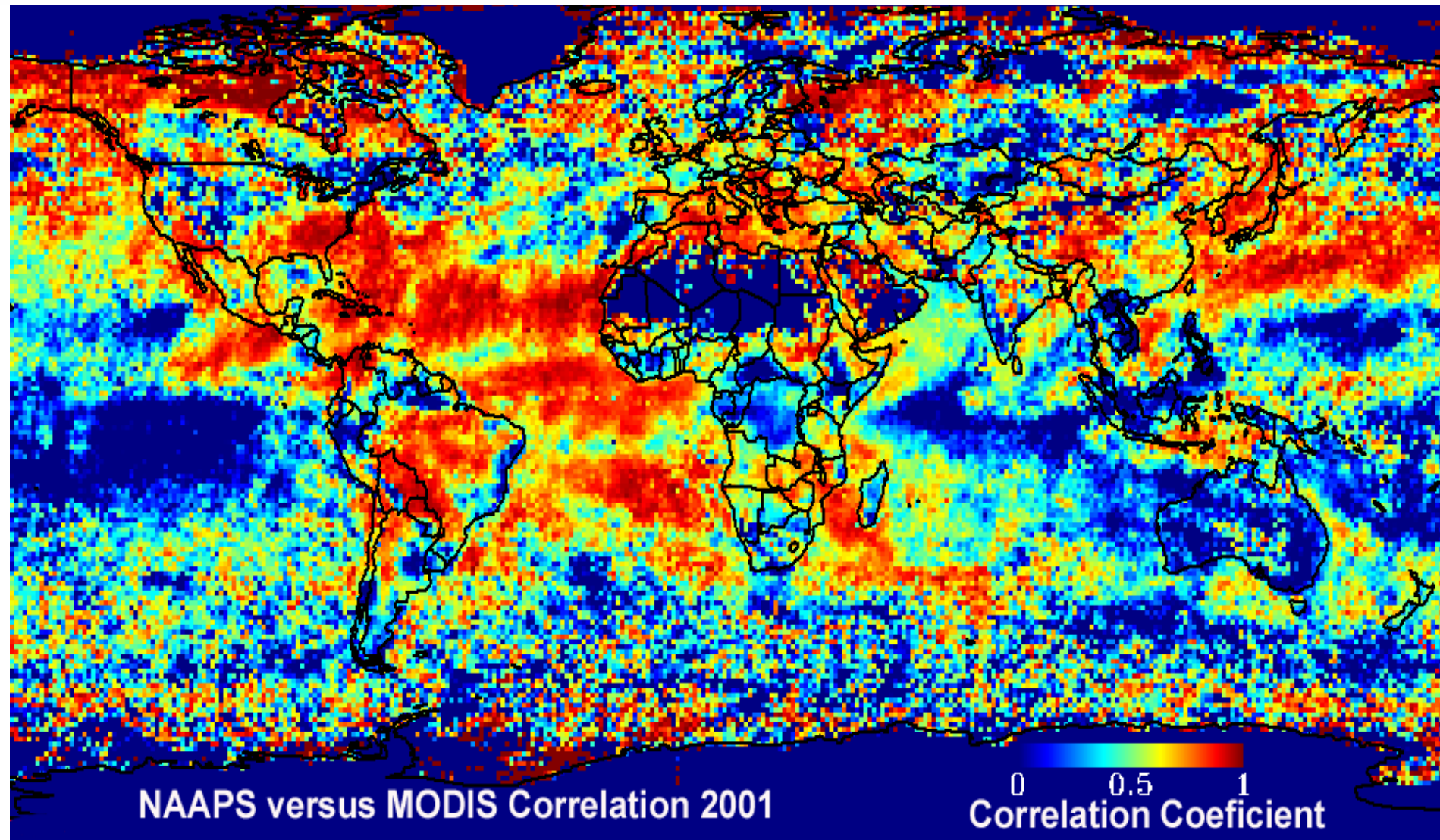
Sulfate  
AOT

Smoke  
AOT



# NAAPS Performance

## Monthly Correlations: Climate Model View



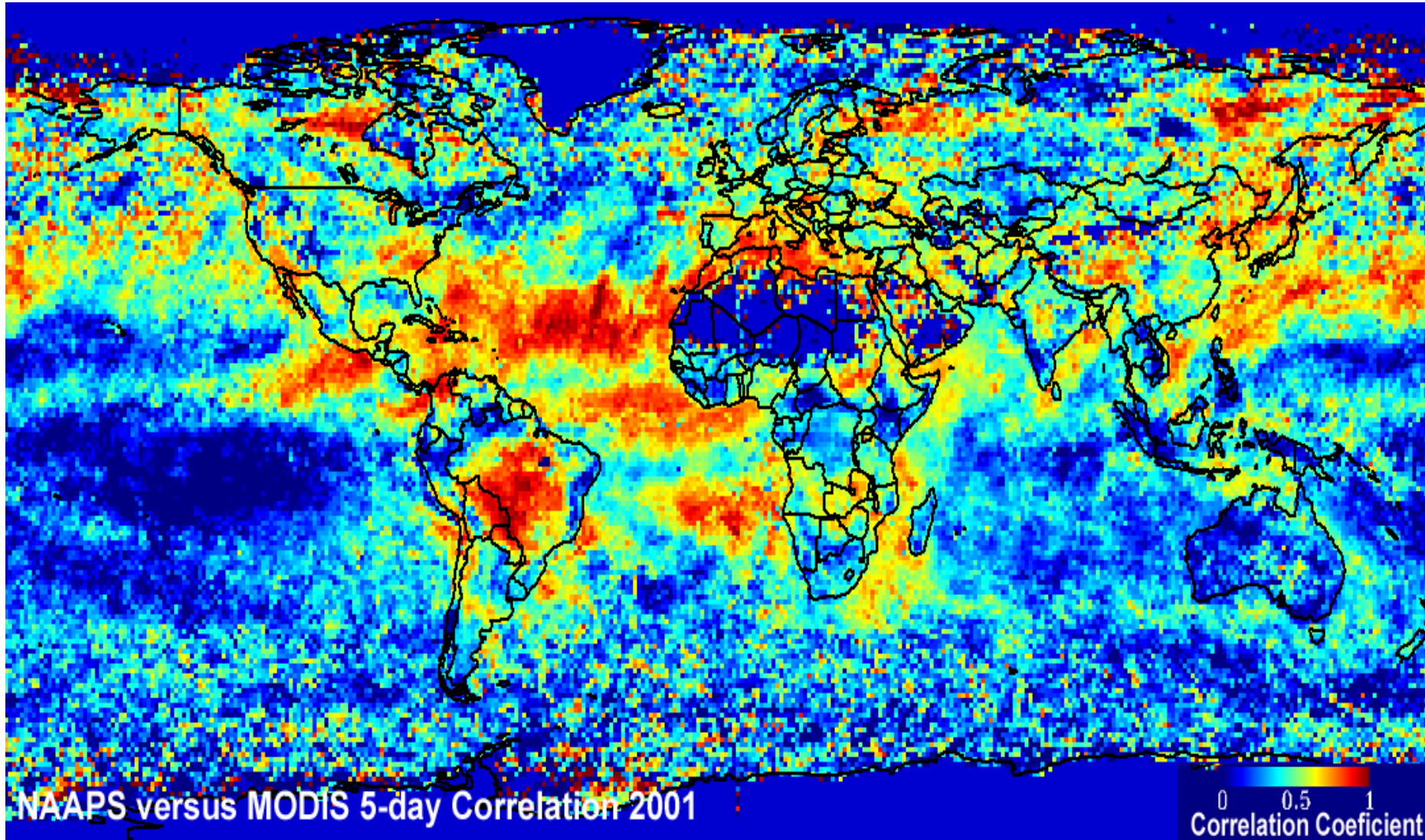
NAAPS versus MODIS Correlation 2001

0 0.5 1  
Correlation Coefficient



# NAAPS Performance

## 5-day Correlations: Forecast Model View



# Step 1: Understanding your data source



- MODIS level II aerosol optical depth (AOT) is best suitable for near real-time aerosol data assimilation.
- However, MODIS (MODerate-resolution Imaging Spectroradiometers) satellite data have uncertainties, especially in the regions with cirrus clouds, coastal waters and complicated land features.
- An objective analysis of MODIS data is necessary to estimate the true benefits and uncertainties of MODIS data before implementing them into aerosol analysis-forecast applications.

# Aerosol retrieving procedures



- Assume surface characteristics (Lower boundary condition)
- Assume aerosol properties (phase function, absorption, etc)
- Know meteorological conditions (wind, clouds, etc)
- Apply radiative transfer calculation and inverse retrieving algorithm

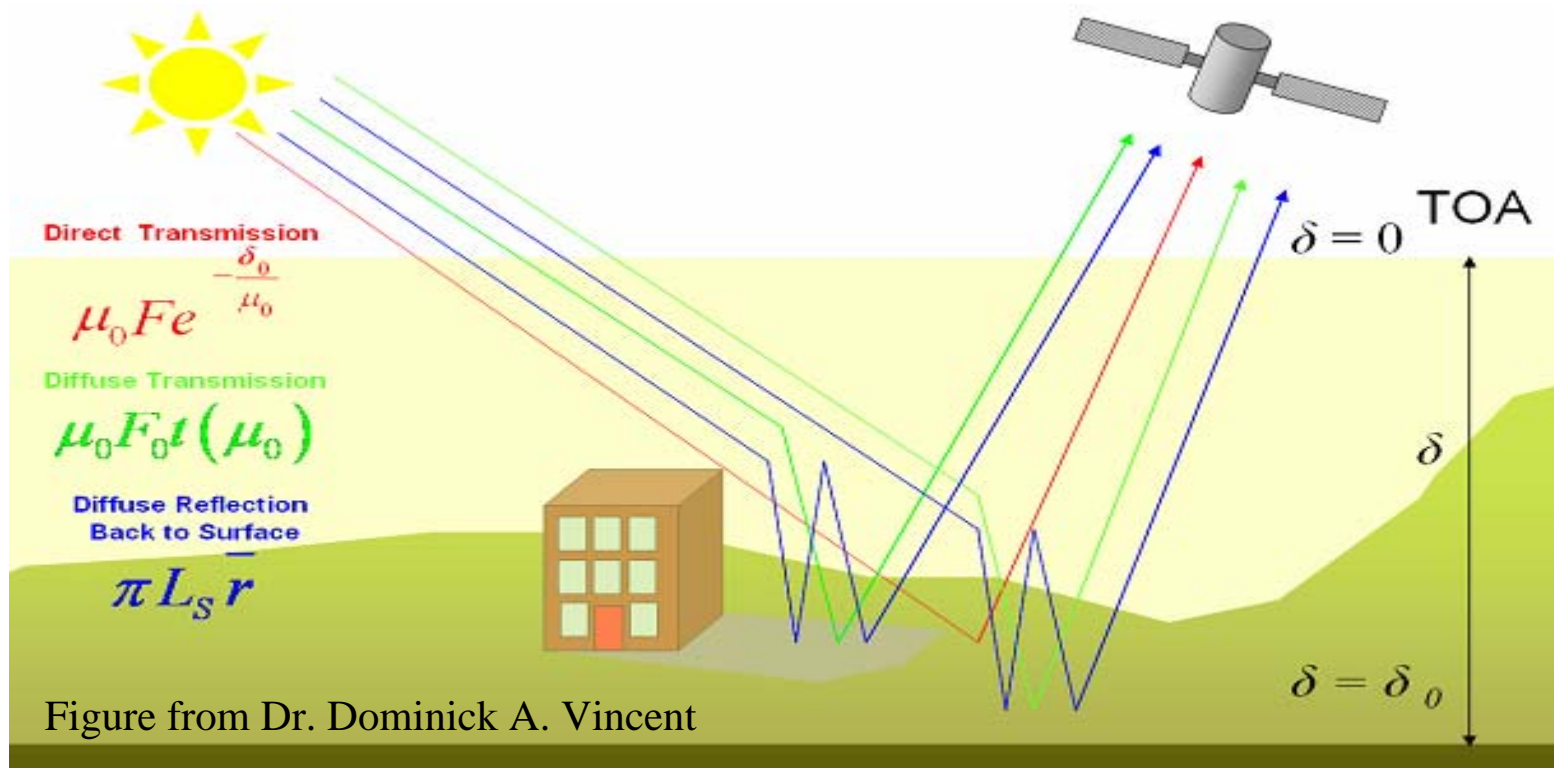
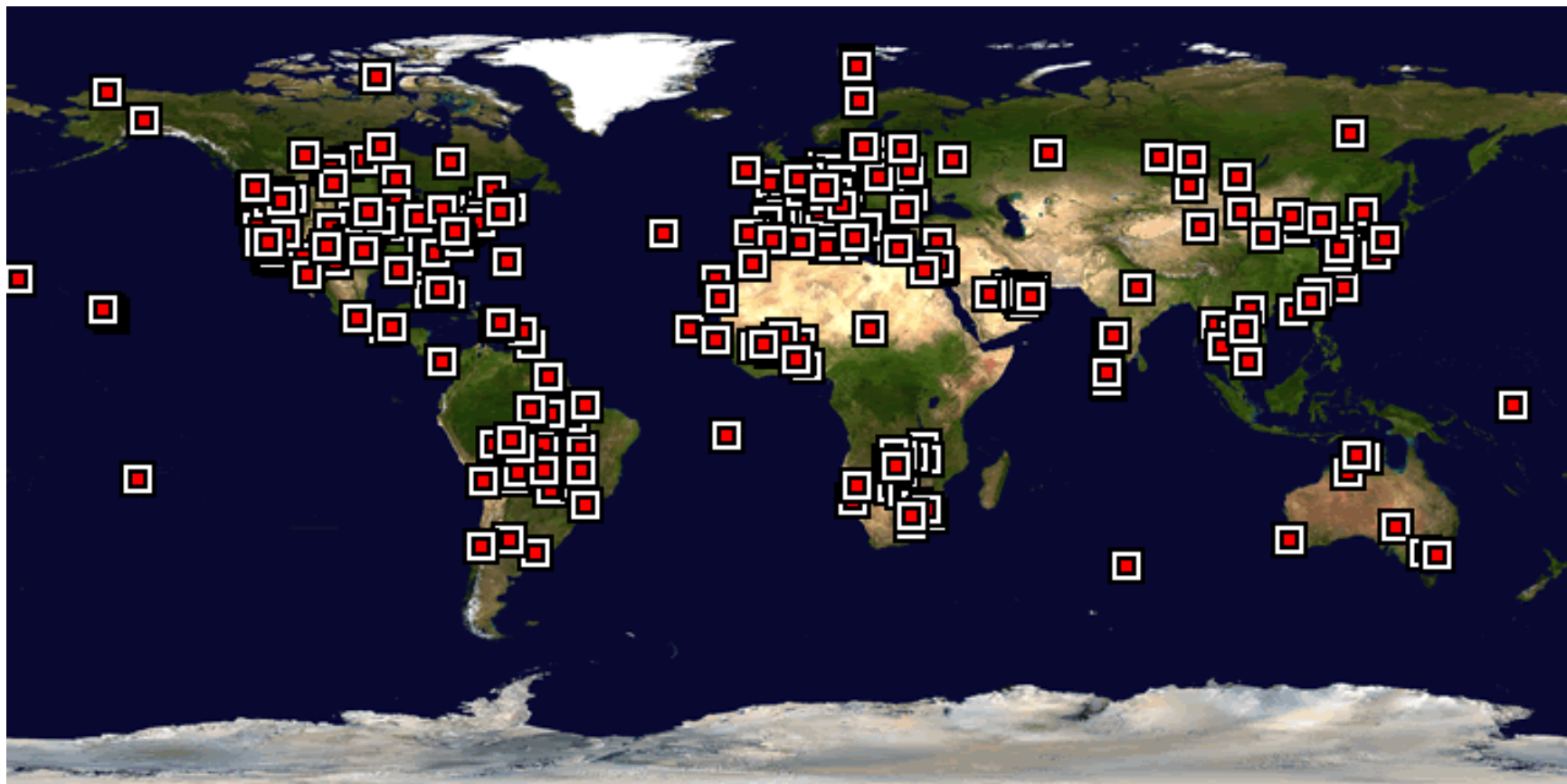


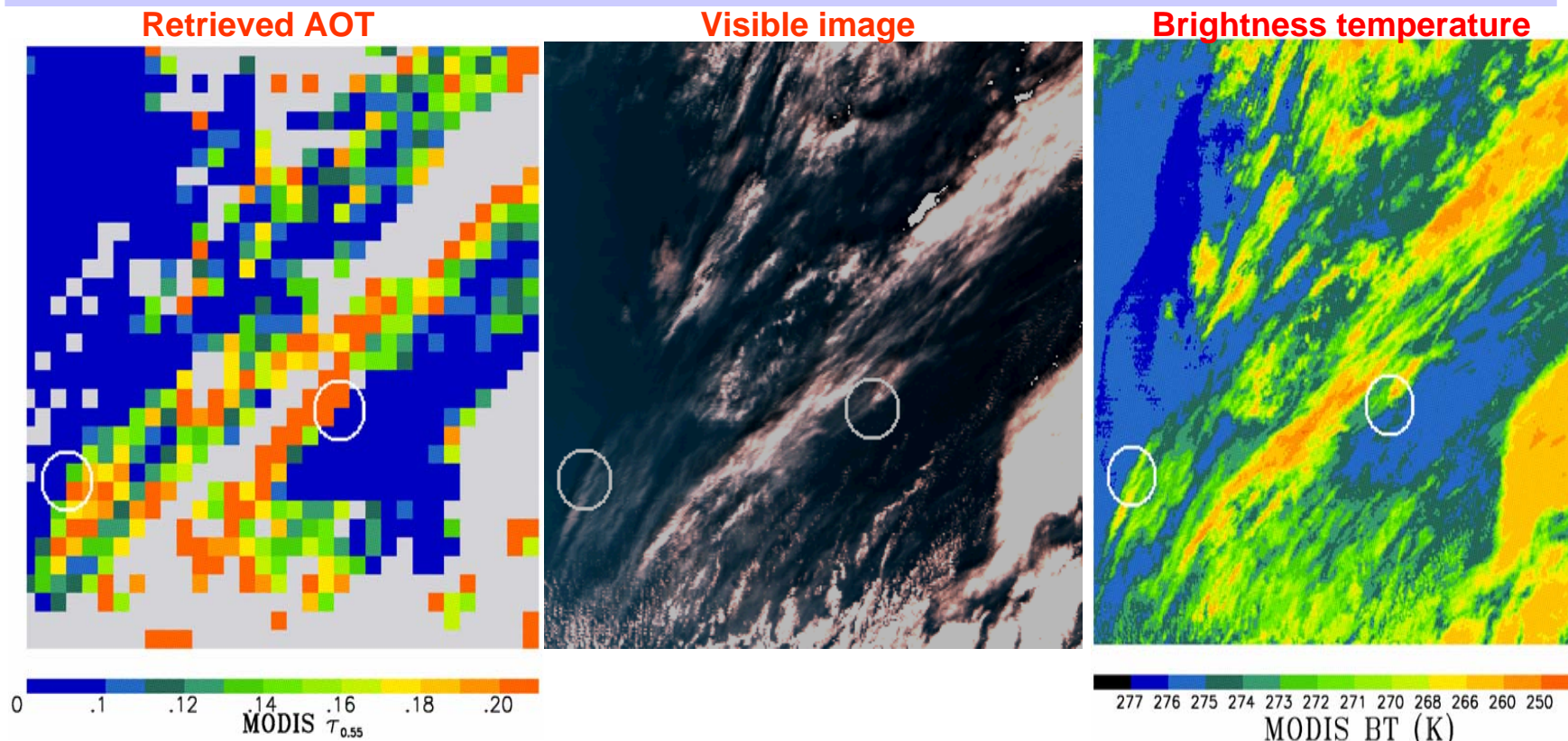
Figure from Dr. Dominick A. Vincent





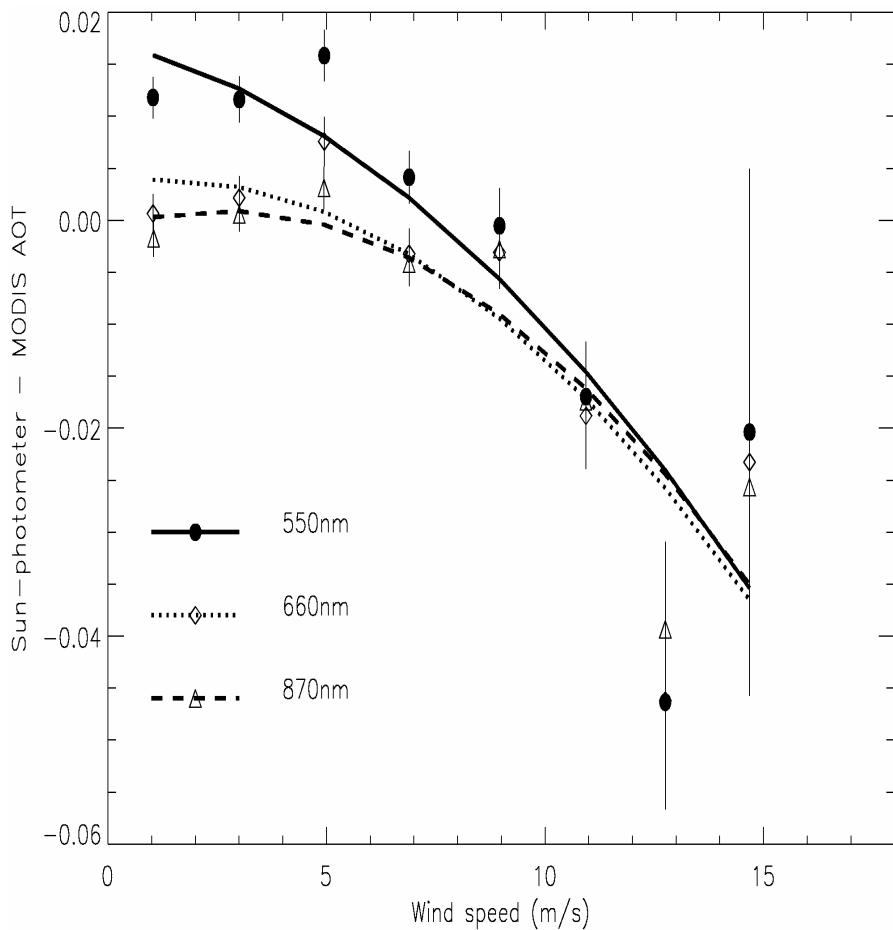
# Uncertainties in MODIS aerosol products due to cloud artifacts

- Cloud fraction effect could result in a 10-20% overestimation in monthly mean aerosol optical depth of MODIS retrieval over cloud free oceans. Local errors can be as high as a factor of two.
- This cloud-contaminated AOT is still widely used in the aerosol modeling community.

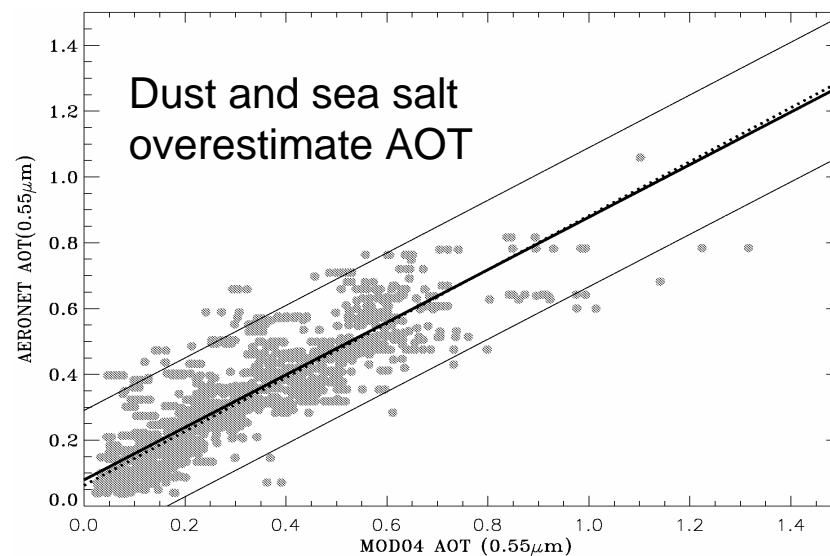
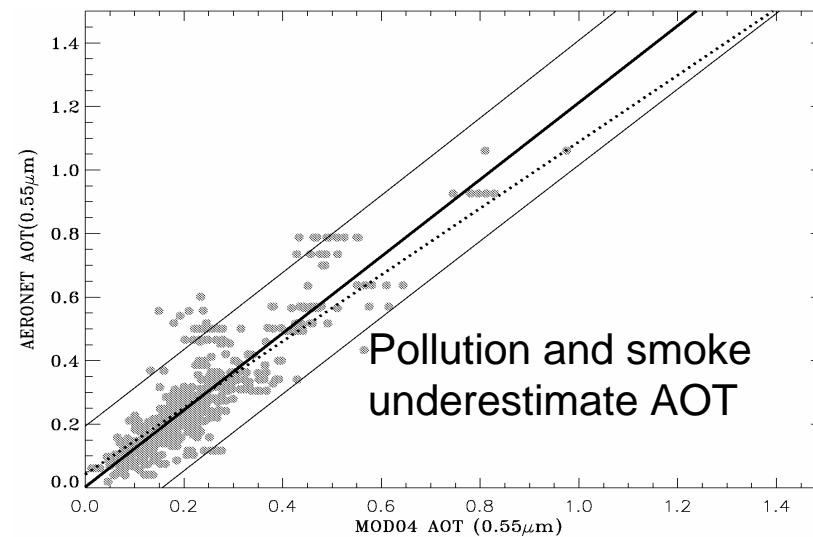


# Uncertainties in MODIS aerosol products due to other artifacts

## Identify & quantify uncertainties (1) Near surface wind speed



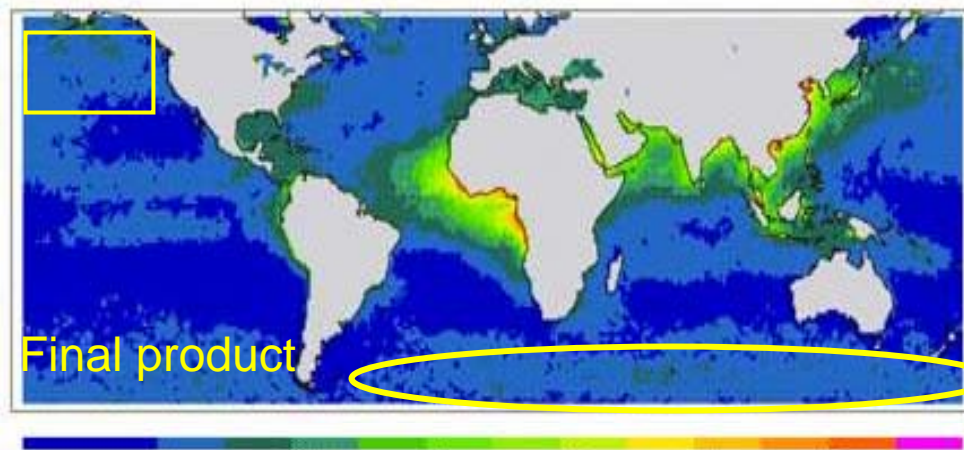
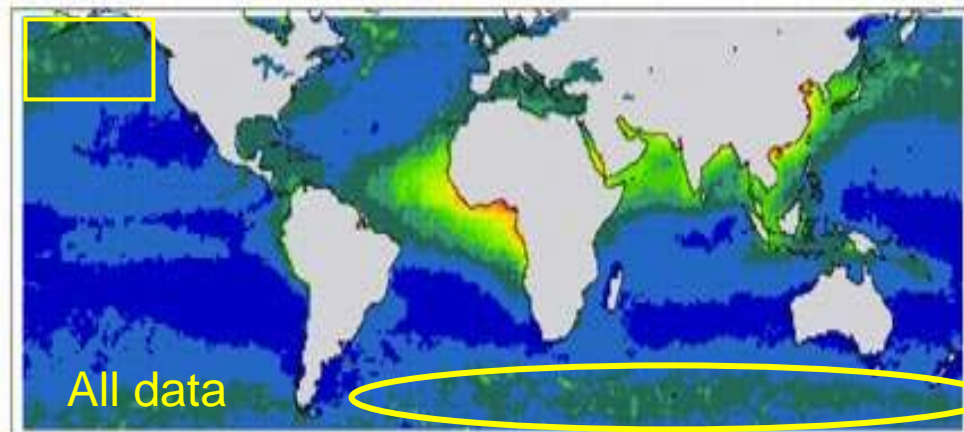
## Identify & quantify uncertainties (2) Aerosol microphysics



# Impact of QA and Aggregation on Assimilated Data



- We begin with NRTPE MYD04 AOD data. Shown is 2005 annual average.
- QA: Data are screened using spatial tests and thresholds.
- Empirical corrections are made based on satellite and NOGAPS environmental data.
- End result, more than 50% correction in southern oceans and Asian outflow to the north Pacific. 15-20% reduction in error globally.



0.1 0.2 0.3 0.4 0.5 0.7

MODIS Optical Depth



# *NRL Atmospheric Variational Data Assimilation System*



- System has been designed to optimally utilize present and future satellite sensors.
- Determine the best estimate (**analysis**) of the current state of the atmosphere given a current forecast (**background**) and some **observations**.
- Improve forecasts by improving initial conditions

# NAVDAS

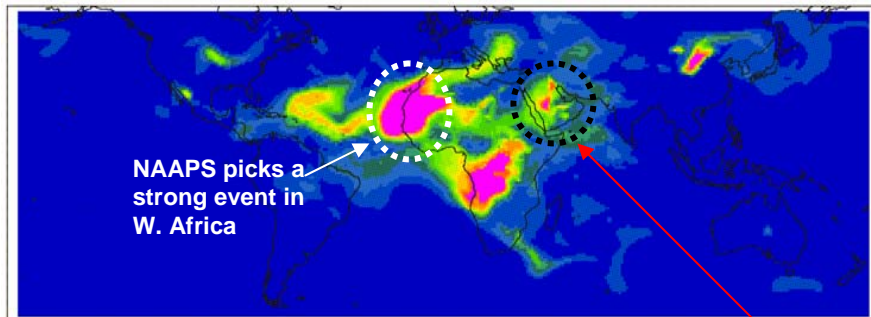
$$\mathbf{x}_a = \mathbf{x}_b + \mathbf{P}_b \mathbf{H}^T [\mathbf{H} \mathbf{P}_b \mathbf{H}^T + \mathbf{R}]^{-1} [\mathbf{y} - H \{ \mathbf{x}_b \}]$$

- **Observation errors (R) are determined from sun-photometer observations**
- **Back ground errors (P) are determined from both sun-photometer observations (error variance) and MODIS aerosol product (error correlation length)**
- **H (forward operator) is partitioned based on FAROP (Forecast of Aerosol Radiative Optical Properties)**

# Step 2: Preliminary results on aerosol data assimilation

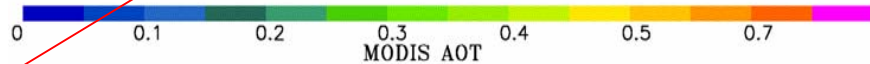
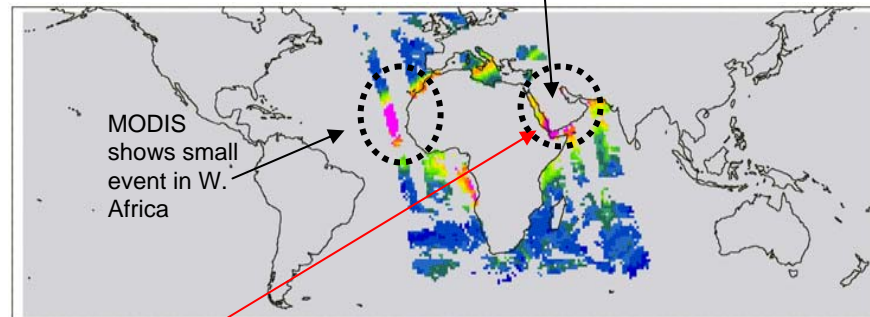
## Application of modified MODIS AOT

NAAPS first guess of AOT (12-h fcst) for 12Z, July 19, 2005

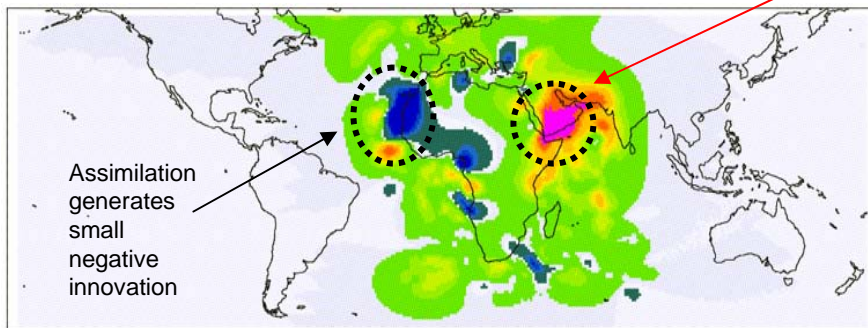


NAAPS predicts low AOT in SW Asia but MODIS observes high AOT (big event) in the Red Sea and the Gulf of Aden

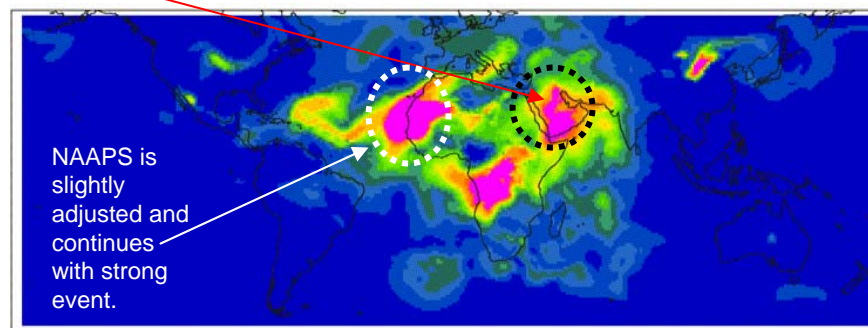
MODIS retrieved AOT for 9-15Z, July 19, 2005



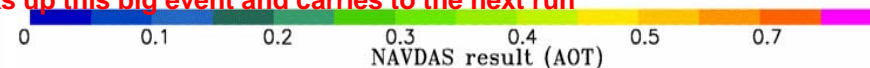
NAVDAS output (NAAPS first guess + MODIS assimilation)



NAAPS updated AOT analysis (NAVDAS output + first guess)



AOT assimilation results in spreading the event in SW Asia, then updated NAAPS also picks up this big event and carries to the next run

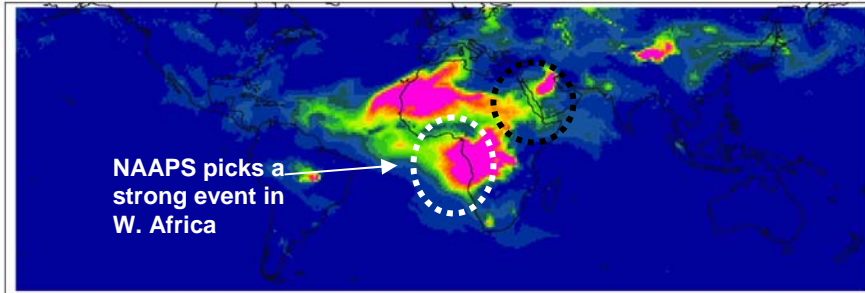


Conclusion: the preliminary result looks very promising and more work is going on.

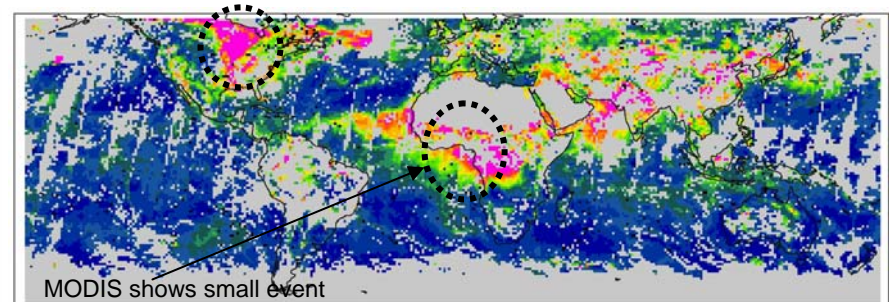
# Step 2: Preliminary results on aerosol data assimilation

## Five day forecast

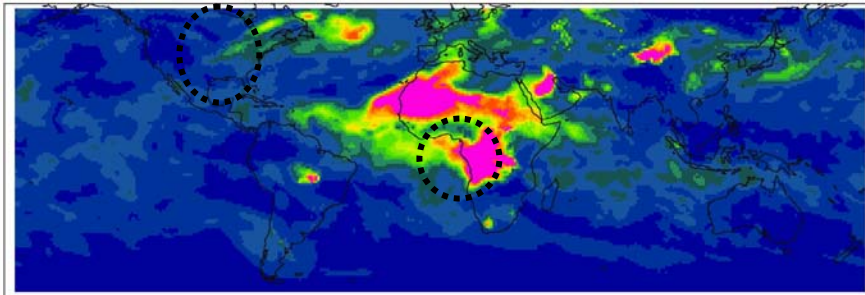
NAAPS AOT (120-h fcst) for 18Z, July 19, 2004



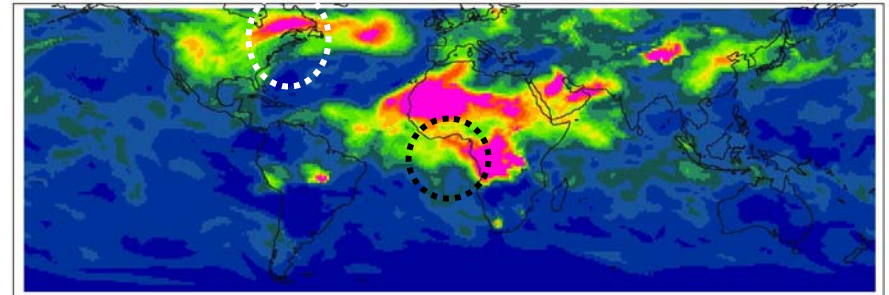
MODIS retrieved AOT for July 17-19, 2004



ECL=100 km; BEV=0.1 $\tau$ +0.1



ECL=385 km; BEV=0.3 $\tau$ +0.1



Conclusion: the preliminary result looks very promising and more work is going on.



# Future plans



1. Aerosol climatology (Vertical partitioning, adjoint of observation operator H)
2. Background error analysis
3. Extend to over land data assimilation
4. Examine aerosol forecast skill with and without aerosol assimilation
5. Link source functions to assimilation corrections

# Summary of Year One Progress



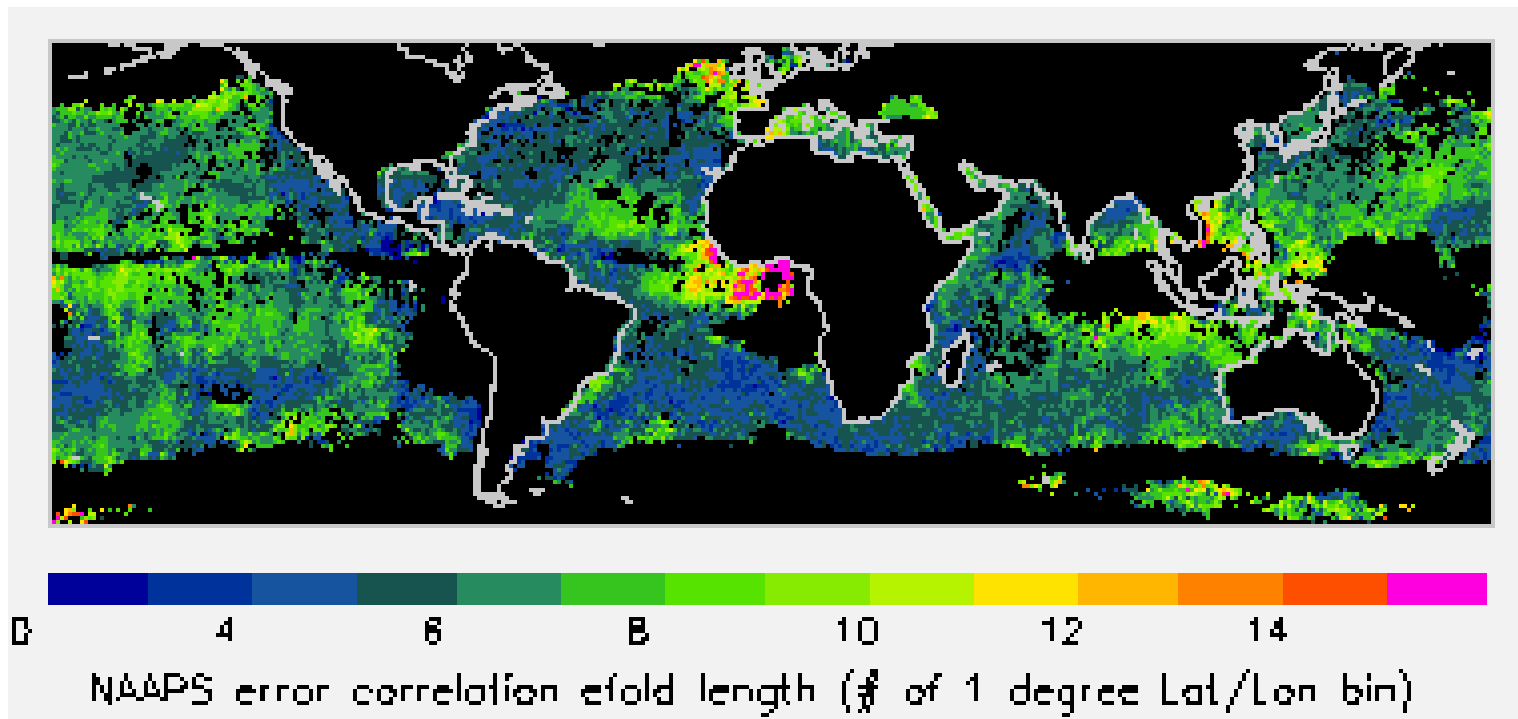
Empirical correction and quality control procedures were applied and the absolute difference between SP and MODIS  $\tau$  reduced 10-20%. Empirical corrections include corrections for artifacts due to cloud contaminations and biases that related near surface wind speed and the ratio of small mode to total aerosol optical depth. QCQA procedures include cloud screen, stand-alone check, buddy check and other QCQA checks.

After applying empirical corrections and QA procedures, the aerosol plumes at the roaring 40's and some high northern latitudes are significantly reduced indicating cloud contamination and biases due to near surface wind speed patterns could be responsible for a large portion of the high aerosol optical depth plumes observed over that regions.

This study sets the stage for the future data assimilation study that<sup>21</sup> uses MOD04/MYD04 aerosol products

# Error statistics

- Need: (1) MODIS/NAAPS error variance  
(2) NAAPS error correlation e-fold length



**(Sep. – Dec. 2004)**