

# Ozone and NO<sub>2</sub> OSSEs on a Regional/Urban Scale for GEO-CAPE

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AGU FALL MEETING  
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**Vijay Natraj<sup>1</sup>, Brad Pierce<sup>2</sup>, Allen Lenzen<sup>3</sup>, Susan Kulawik<sup>4</sup>,  
Helen Worden<sup>5</sup>, Xiong Liu<sup>6</sup>, Mike Newchurch<sup>7</sup>, Konstantin  
Vinnikov<sup>8</sup>**

1- Jet Propulsion Laboratory, California Institute of Technology, 4800 Oak Grove Drive, Pasadena, CA 91109

2- NOAA/NESDIS Center for Satellite Applications and Research, 1225 West Dayton Street, Madison, WI 53706

3- Space Science and Engineering Center, University of Wisconsin-Madison

4- Bay Area Environmental Research Institute, Moffett Field, CA 94035

5- National Center for Atmospheric Research, 3450 Mitchell Lane, Boulder, CO 80301

6- Harvard-Smithsonian Center for Astrophysics, 60 Garden Street, Cambridge, MA 02138

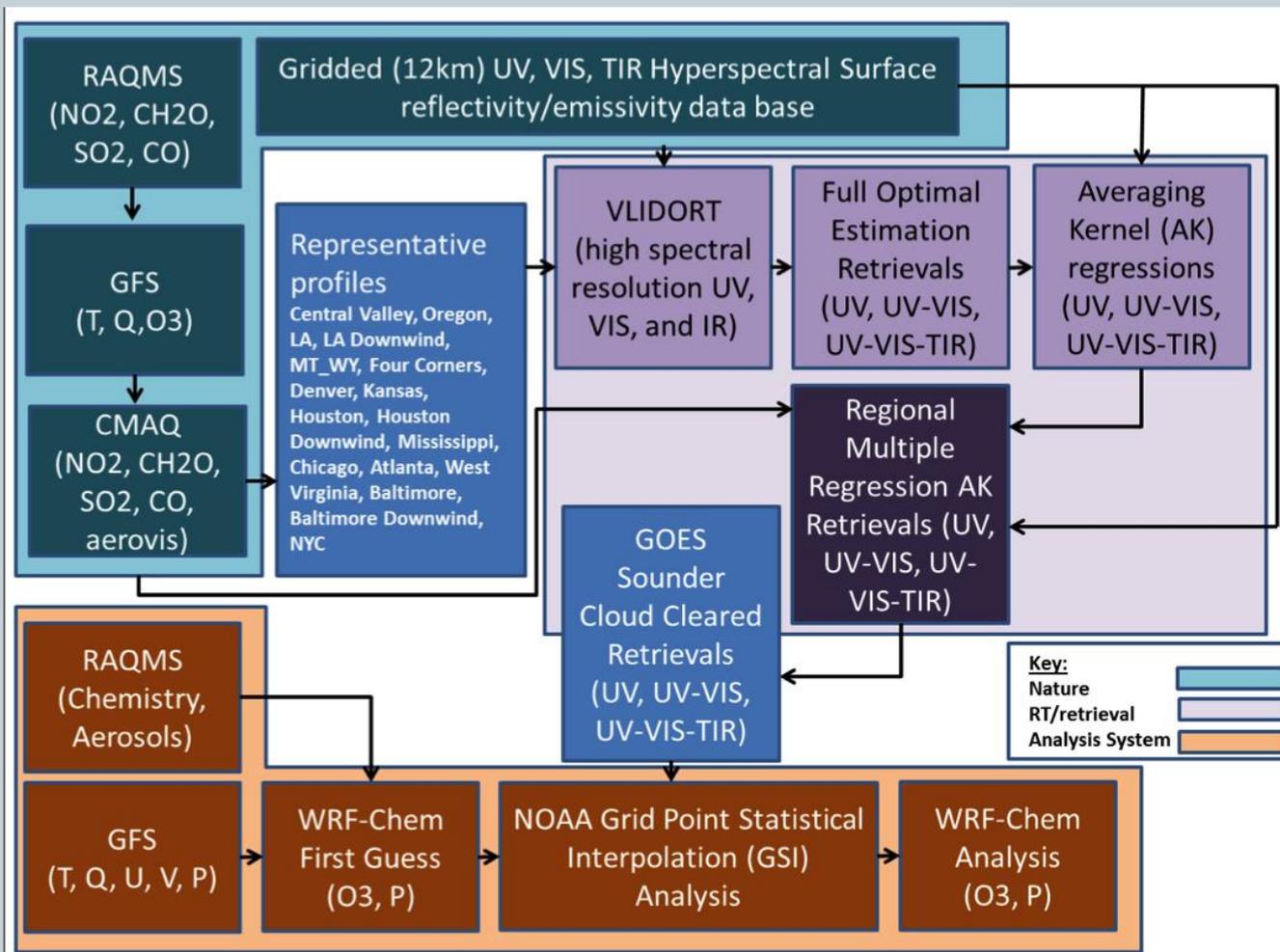
7- University of Alabama and Huntsville, 320 Sparkman Drive, Huntsville, AL 35805

8- University of Maryland, College Park, MD 20742



# OSSE Flow Chart

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# Goals

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- Utilize independent modeling systems for generation of Nature atmosphere and conducting assimilation impact experiments
- Account for realistic atmospheric variability, which requires evaluation of the nature runs with respect to observations
- Include realistic variability in the synthetic radiances, which requires using realistic albedos and emissivities
- Include realistic sensitivities, which requires generation of averaging kernels (AK) for each retrieval for use in assimilation studies



# Goals

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- Include realistic variability in the synthetic radiances, which requires using realistic albedos and emissivities
- Include realistic sensitivities, which requires generation of averaging kernels (AK) for each retrieval for use in assimilation studies



# Forward Modeling for $O_3$

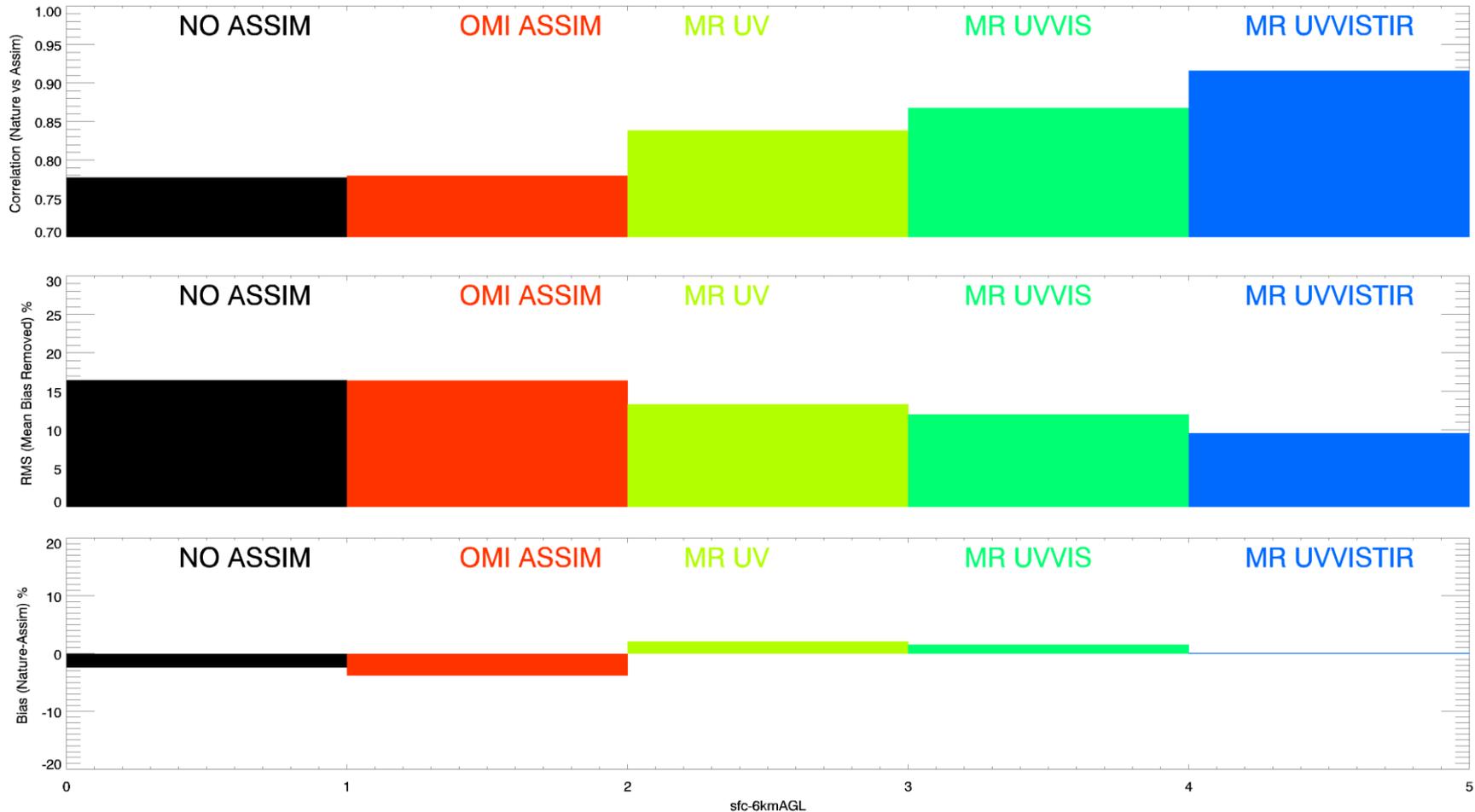
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- Use a set of representative profiles from 17 sites (hourly, every 3<sup>rd</sup> day of July 2011)
- Perform full radiative transfer (using LIDORT)/Optimal Estimation
- Develop multiple regression estimate of the averaging kernels
- Use AK regressions for the full Nature atmosphere (CONUS, hourly, every day of July 2011) to generate the regional multiple regression AK retrievals



# Impact of Ozone Assimilation: sfc-6km Results

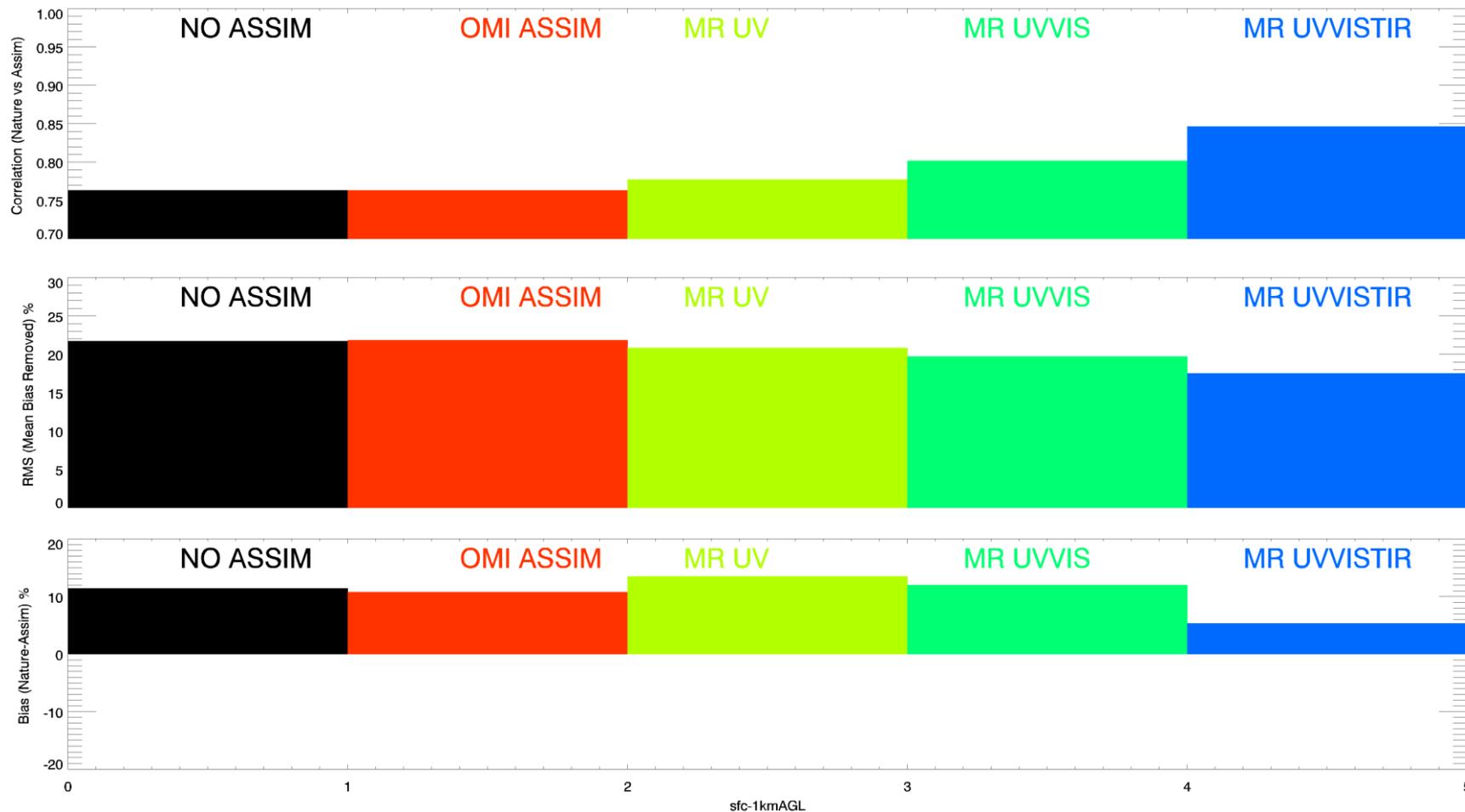
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# Impact of Ozone Assimilation: sfc-1km Results

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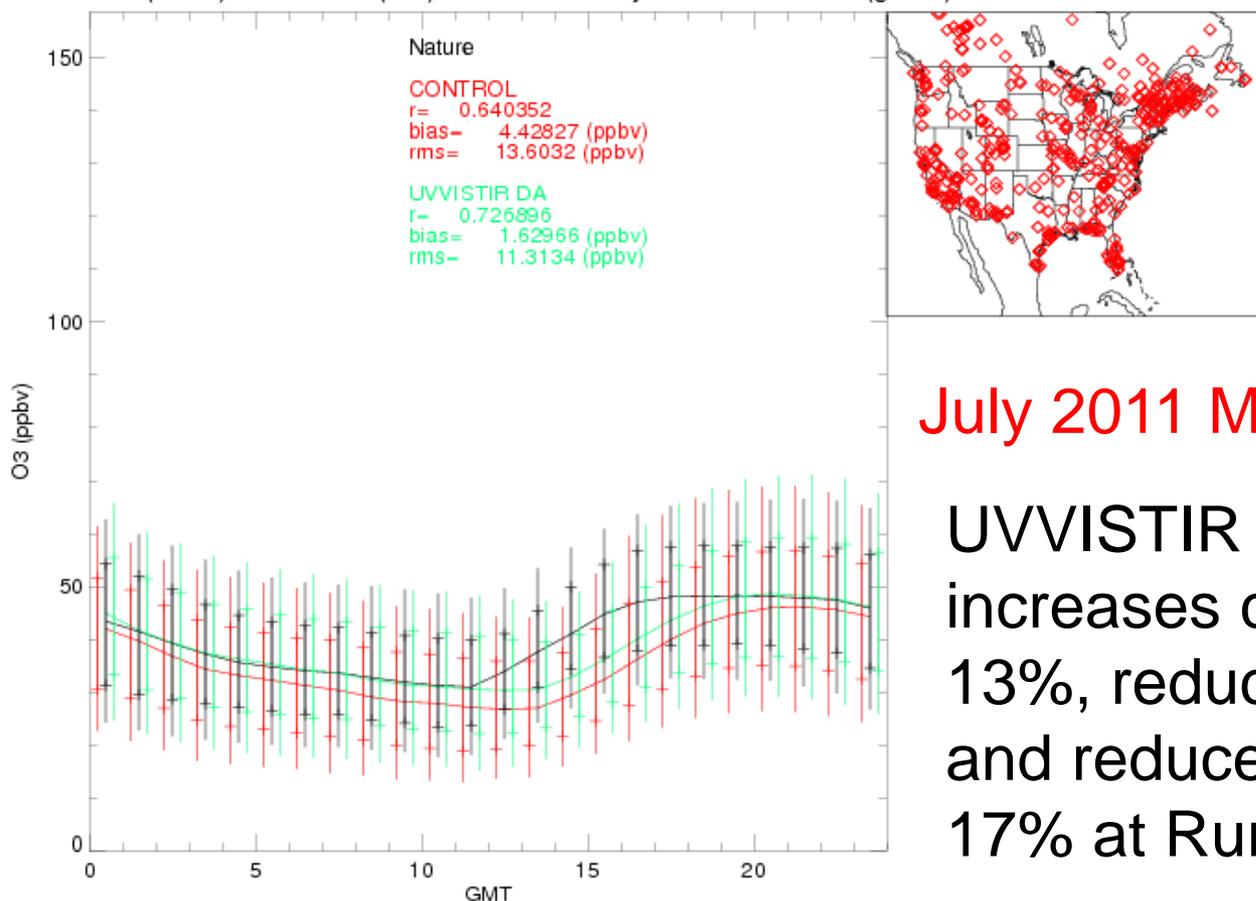


# Impact of UVVISTIR Assimilation: Rural Sites



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Rural Median  
NATURE (black) CONTROL (red) UVVISTIR 54lay PBL Inflation DA (green)



ASSIM —  
Control —  
Nature —

## July 2011 Mean Diurnal Cycle

UVVISTIR assimilation increases correlation by 13%, reduces bias by 63%, and reduces rms error by 17% at Rural sites

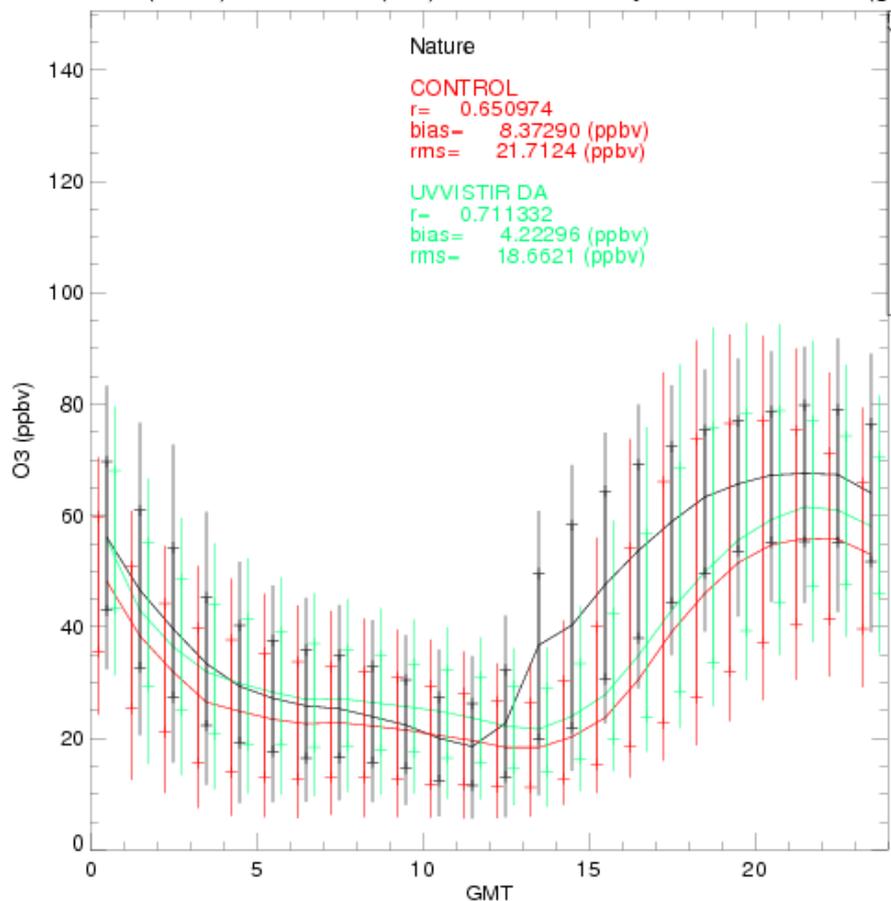


# Impact of UVVISTIR Assimilation: Urban Sites



9

Urban Median  
NATURE (black) CONTROL (red) UVVISTIR 54lay PBL Inflation DA (green)



ASSIM ———  
Control ———  
Nature ———

## July 2011 Mean Diurnal Cycle

UVVISTIR assimilation  
increases correlation by 9%,  
reduces bias by 50%, and  
reduces rms error by 14% at  
Urban sites



# Forward Modeling for NO<sub>2</sub> I

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- O<sub>3</sub> simulations required 8 hrs per day (~15 hrs daylight) per station using 44 CPUs
- NO<sub>2</sub> has significantly larger spatial variability
- AK regression unlikely to produce good results
- Need to investigate fast forward modeling approaches



# Forward Modeling for NO<sub>2</sub> II

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- Spectral region: 400–490 nm (TEMPO spectral range)
- Forward modeling approaches
  - LIDORT
  - Exact single scattering + two-stream multiple scattering (2S-ESS)
  - 2S-ESS + cross sections convolved to TEMPO spectral resolution (2S-ESS convolved)



# 2S-ESS Model

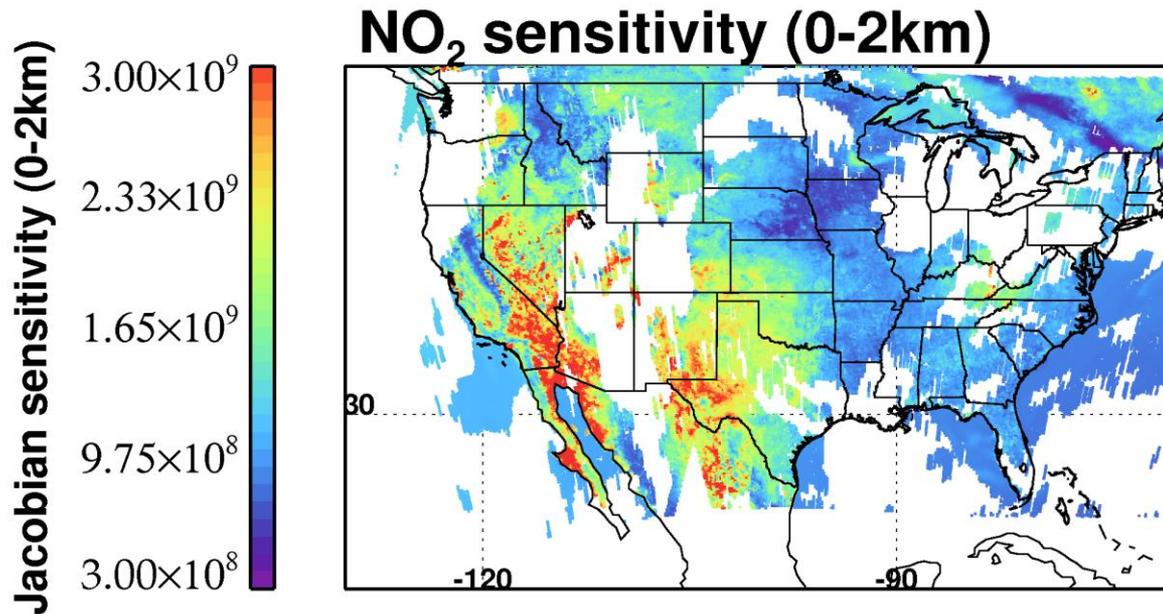
12

- Exact computation of the single scattering using all moments of the phase function
- Two-stream approximation for multiple scattering
- Accurate single scatter calculation captures forward peak of aerosol phase function
- Two-stream model completely analytic except for BVP (which is also optimized)
- Technique used, e.g., for water vapor retrievals over LA basin from CLARS measurements



# Real-time OSSE Estimates of Sensitivity

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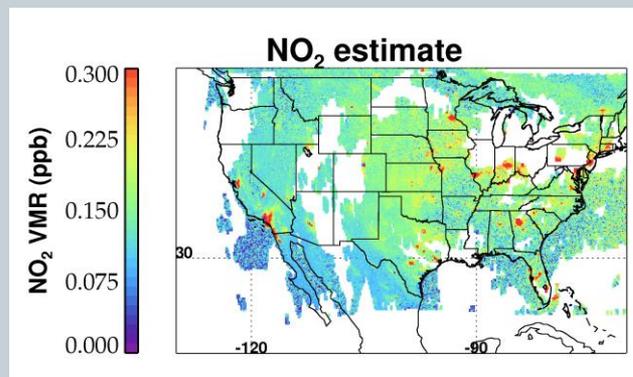
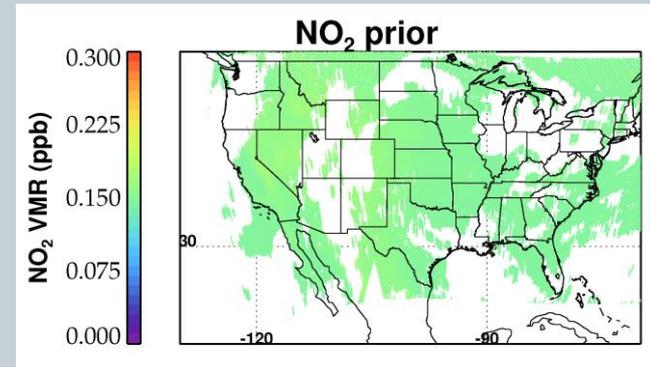
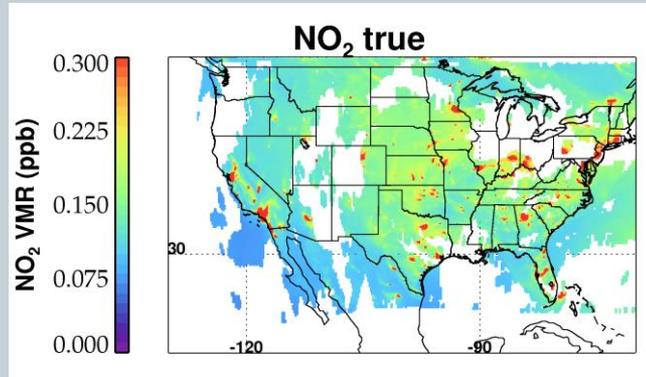


- Calculates Jacobians including aerosols and viewing geometry using fast RT system
- Better estimates what a satellite will actually see, which varies by location, time, and composition. Empty areas have thick cloud cover
- OSSEs will ingest results for better estimates of satellite performance

July 18, 2011 2 pm local time

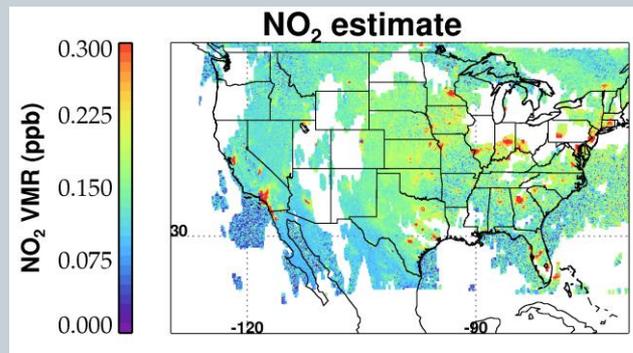
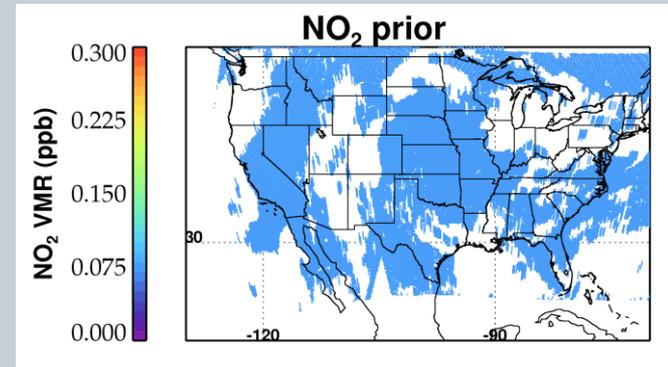
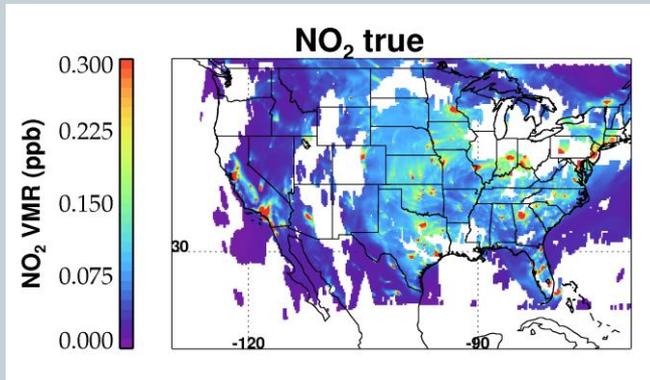


# Total Column Retrievals



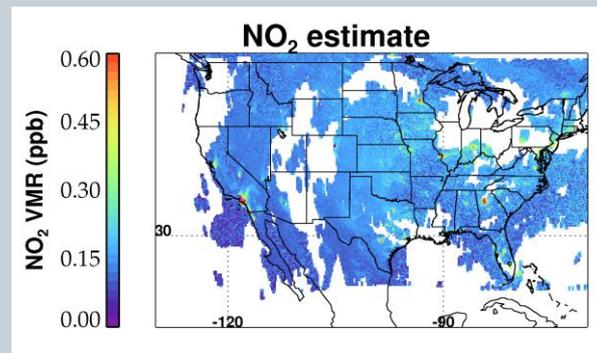
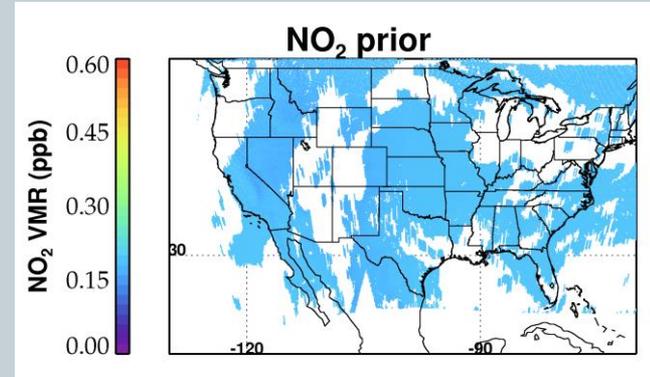
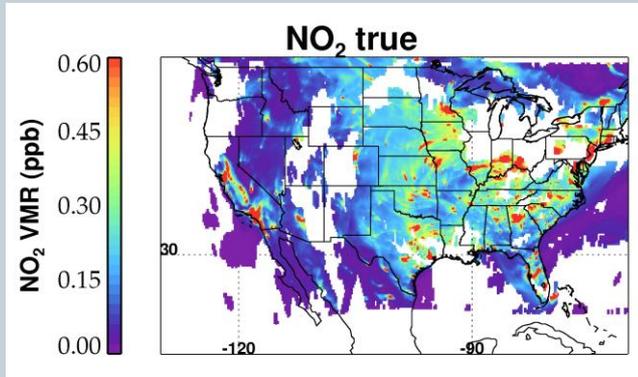


# Tropospheric Column Retrievals





# Lowermost Troposphere (0-2 km) Retrievals





# Conclusions

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- Full UV-VIS-TIR retrievals showing positive impact on surface  $O_3$
- Regional OSSE system showing realistic complexity
- $NO_2$  retrievals underway
- We find real satellite data sensitivity varies substantially, e.g. by aerosol optical depth, cloud cover, albedo, and viewing geometry
- Using a fast RT, we now estimate complete sensitivity (using scene dependent AKs) during OSSE simulations



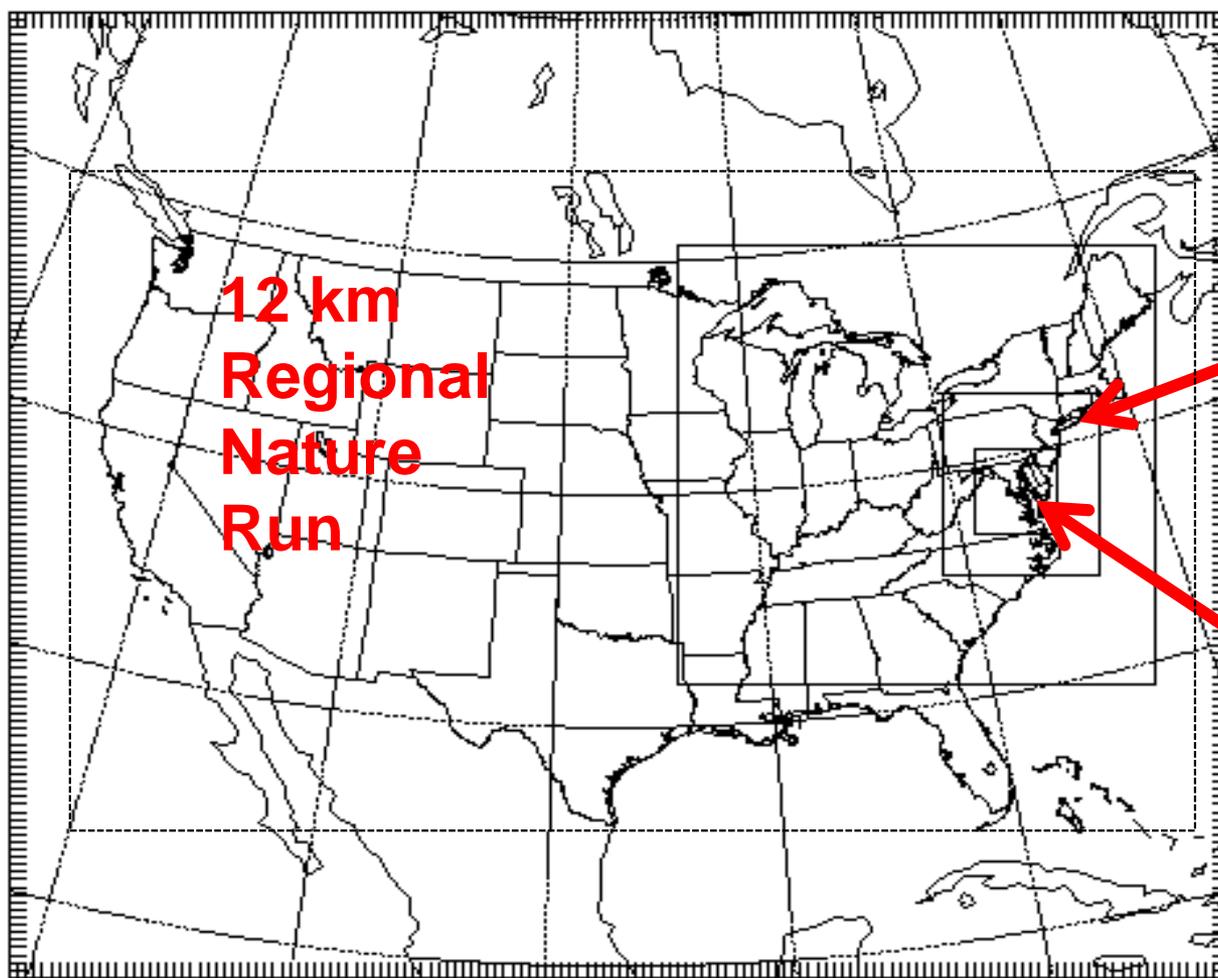
# Backup Slides

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# Nature Run

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**12 km  
Regional  
Nature  
Run**

**4 km  
down  
scaling**

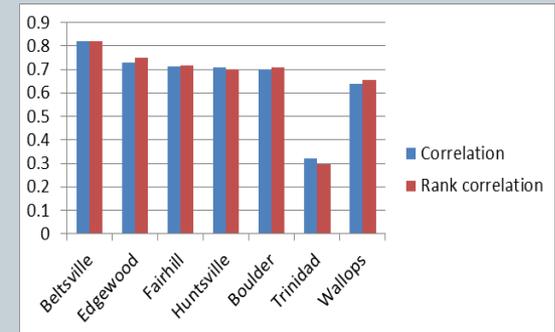
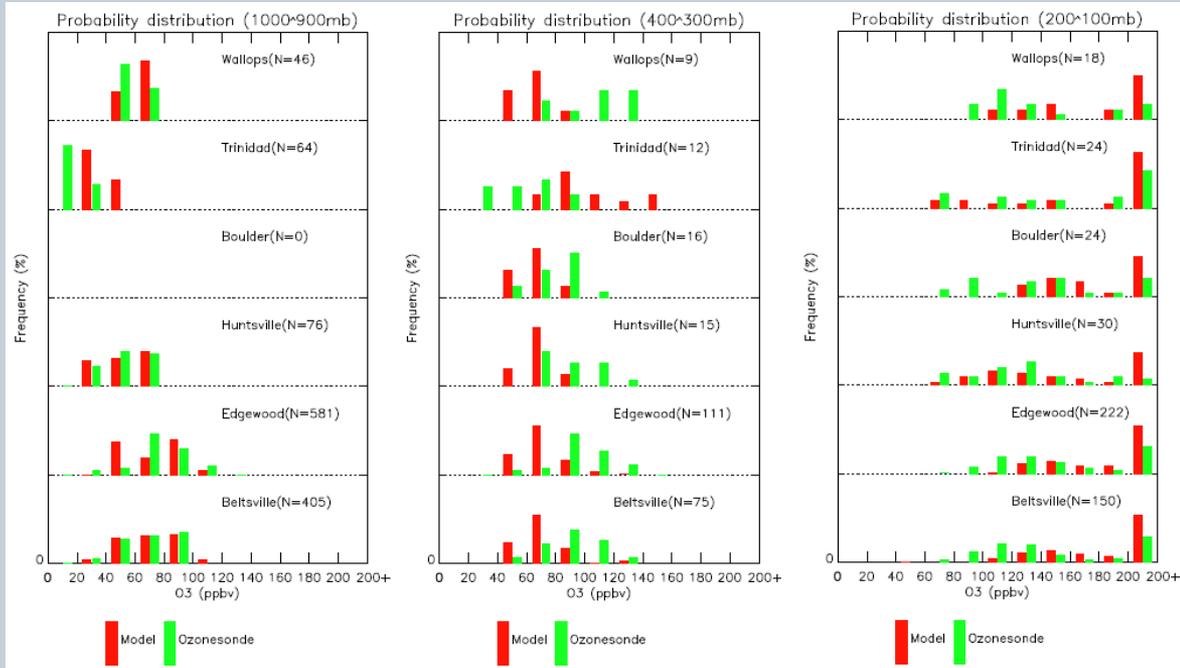
**1.33 km  
Urban  
Nature Run**

**Courtesy: K. Pickering/C. Loughner**

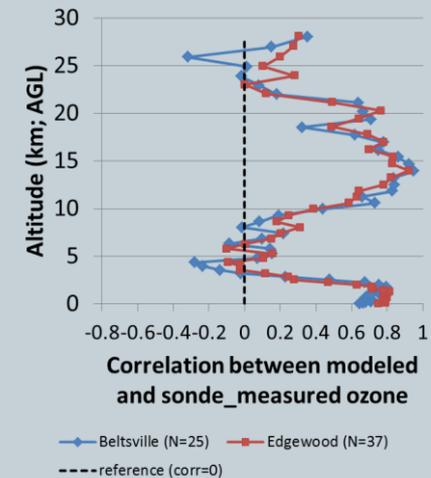


# Quantifying Accuracy and Representativeness of Regional Nature Run

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Correlation between model and EPA-monitored surface ozone (July 2011)



Correlation between model and ozonesondes at Beltsville and Edgewood

July 2011 Regional Nature run captures the variability of upper troposphere/lower stratosphere (200-100 mb) and boundary layer (1000-900 mb) ozone well but underestimates free tropospheric (400-300 mb) variance

Courtesy: M. Newchurch/L. Wang



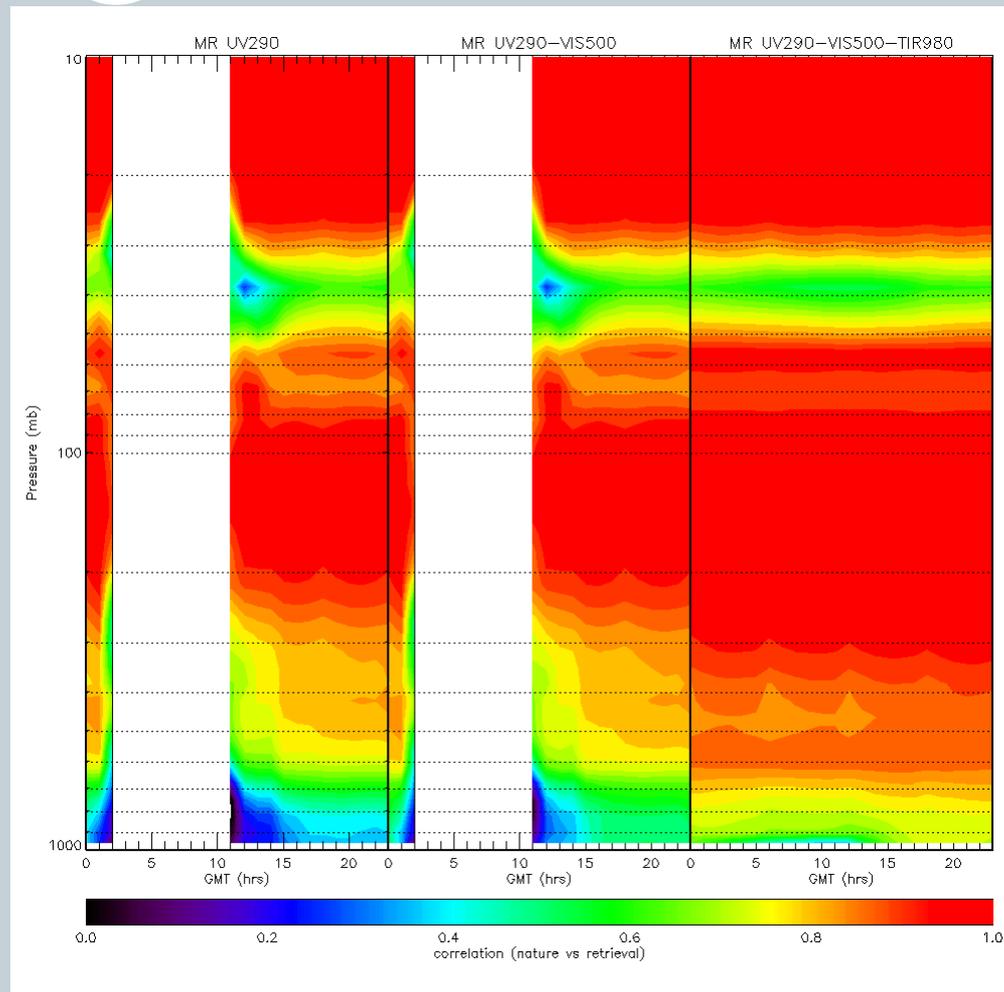
# Nature/Retrieval Correlations

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Regional  
Multiple  
Regression AK  
Retrievals  
(UV, UV-VIS,  
UV-VIS-TIR)

Diurnally resolved correlations between the Regional Nature Run and GEOCAPE O<sub>3</sub> retrievals for July 2011 show:

- UV-VIS-TIR shows the highest correlations in the mid and lower troposphere
- UV-VIS shows improvement over the UV only retrievals below 800mb

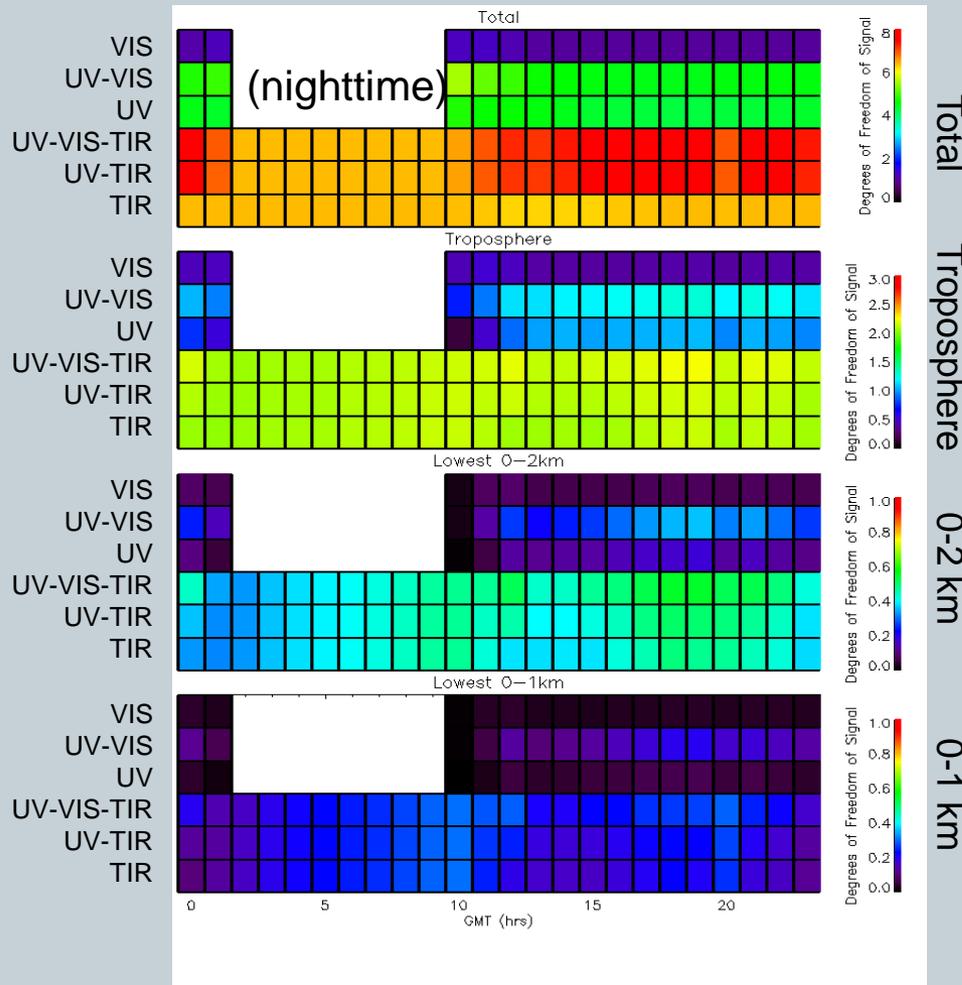


More details in H. Worden's poster



# Multispectral O<sub>3</sub> Retrievals

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Full Optimal Estimation Retrievals (UV, UV-VIS, UV-VIS-TIR)

**Diurnally resolved Degrees of Freedom for Signal (DOFS) for different pressure ranges and spectral combinations for all GEOCAPE Regional OSSE sites (no VIS, UV, or UV/VIS retrievals between 02-09Z)**

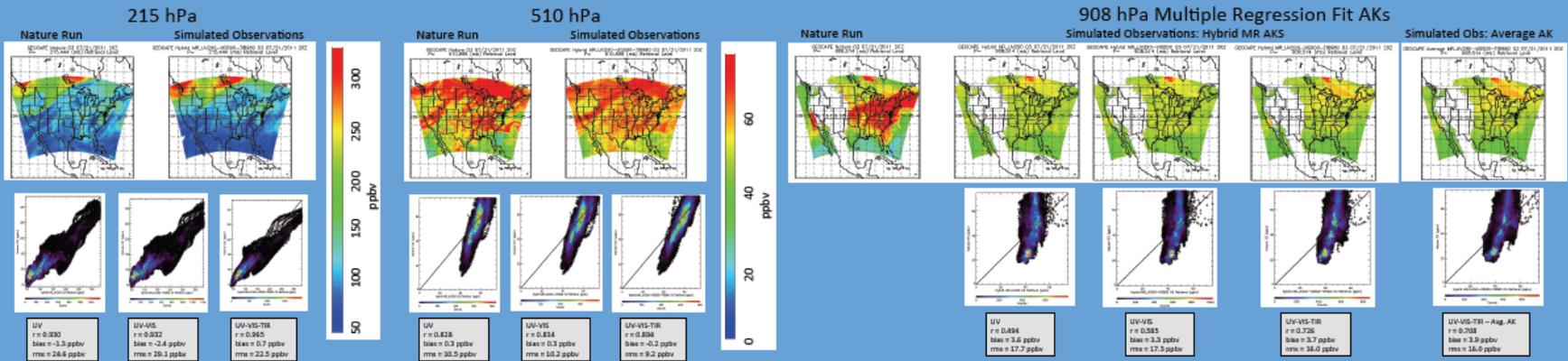
**Note UV/VIS has the same spectral range and noise as TEMPO.**



# AK Prediction

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Simulated Observations:  
GEO-CAPE Nature Run w/AK



- Multiple regression works best for surface – 681 hPa
- Combinations of fit AK in lower troposphere and average AK above allow simulated observations for different wavelength combinations
- UV-VIS-TIR provides highest correlation between simulated observations and nature run

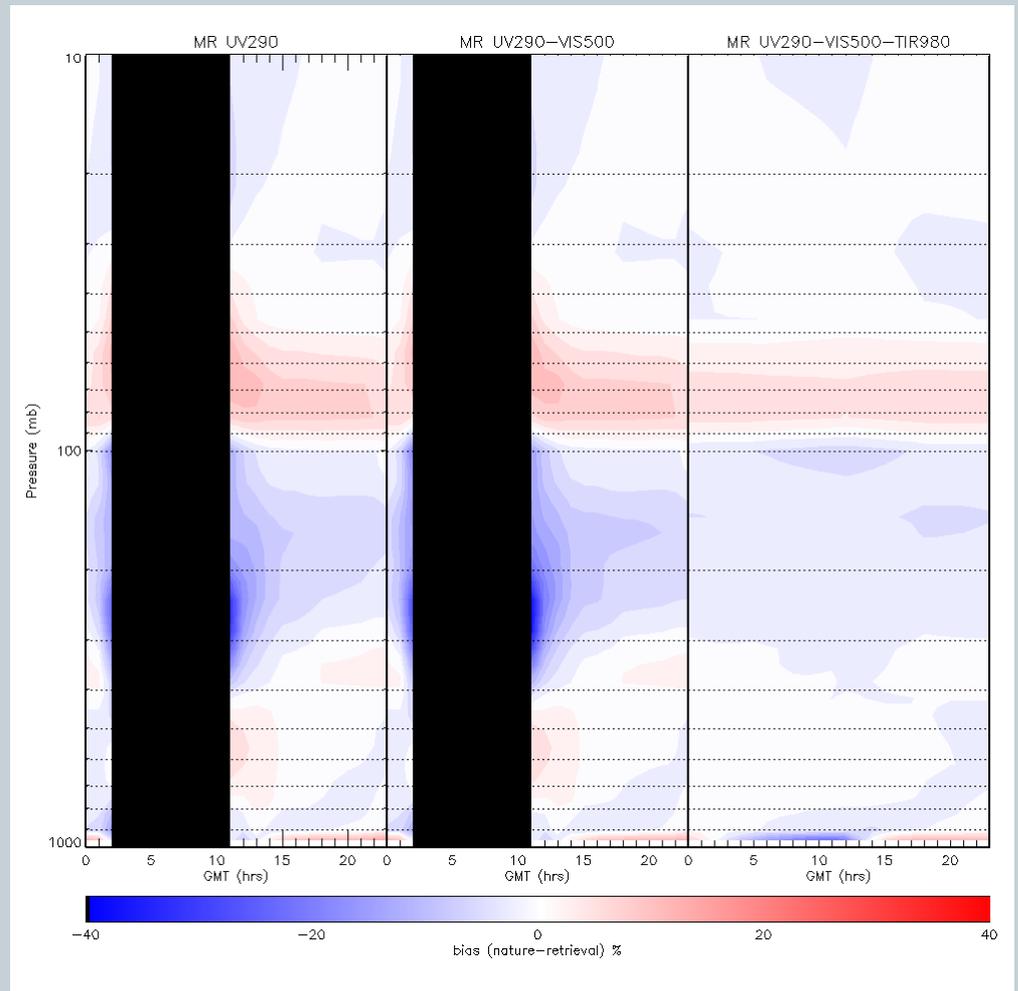


# Retrieval Biases

## Regional Multiple Regression AK Retrievals (UV, UV-VIS, UV-VIS-TIR)

Diurnally resolved biases between the Regional Nature Run and GEOCAPE O3 retrievals for July 2011 show generally low biases (<20%) except:

- between 200-300mb at sunrise and sunset (UV and UV-VIS only)
- at the surface (underestimate daytime and overestimate nighttime O3)





# Data Assimilation I

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WRF-Chem  
Analysis  
(O<sub>3</sub>, P)

- Initial RAQMS/WRF-CHEM/GSI GEOCAPE UV-VIS-TIR retrieval assimilation experiments have been conducted for early July, 2011
  - Currently assuming 30% observational errors and only assimilating retrievals below 100mb due to large initial adjustments in the lower stratosphere
  - Statistical analysis show positive impacts on surface ozone sampled at US EPA AIRNow sites



# Data Assimilation II

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WRF-Chem  
Analysis  
(O<sub>3</sub>, P)

## ■ Future plans

- Improve observation error estimate using error estimates from Full Optimal Estimation retrieval for select stations
- Assess impact of restricting assimilation of retrievals to below local tropopause to mitigate impact of poor vertical resolution in WRF-Chem in the lower stratosphere
- Conduct regional UV and UV-VIS O<sub>3</sub> assimilation studies



# Accomplishments for Ozone OSSE

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- 12 km and 1 km Nature simulations were evaluated with respect to observations during the 2011 NASA DISCOVER-AQ campaign.
- Diurnally resolved high spectral resolution UV/VIS/TIR forward modeling at 14 representative sites using ozone, NO<sub>2</sub>, HCHO, SO<sub>2</sub>, aerosol, water vapor, and temperature profiles from the Regional Nature run has been completed.
- TIR, UV, VIS, UV/TIR, UV/VIS, and UV/VIS/TIR ozone retrievals have been generated and evaluated with respect to the Nature run profiles.



# Accomplishments for Ozone OSSE

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- Averaging Kernel (AK) regression based on instrument and observing parameters has been developed using retrievals from 14 representative sites.
- Data assimilation shows positive impacts on surface ozone sampled at US EPA AIRNow sites.



# Backup Slides

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# NO<sub>2</sub> OSSE Developments II

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- Computational time (one scenario):
  - LIDORT: 219 minutes
  - 2S-ESS: 295 seconds
  - 2S-ESS convolved: 78.5 seconds
- Computational time (one day, full domain):
  - LIDORT: > 8 years!
  - 2S-ESS: ~ 70 days
  - 2S-ESS convolved: 18 days
- With a 10x speed-up, we can perform calculations for one month for the entire domain in ~ two months



# How do we get 10x speed-up?

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- Optimize optical property initialization (mainly, aerosol phase function moments)
- Perform interpolation of aerosol phase function instead of moments
- Perform profile-independent operations (e.g. reading in of large aerosol optical property tables) only once
- Remove redundant copying of data between variables



# How do we get 10x speed-up?

32

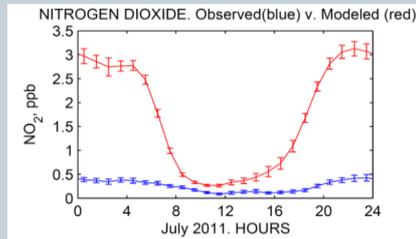
- Implement MPI interface to use multiple processors
- Compute solar geometry early and only perform further calculations for daytime scenarios
- Only consider cloud-free scenarios
- Balance the number of points on each processor to optimize processor utilization
- Only output data to netcdf file for clear and daytime scenarios



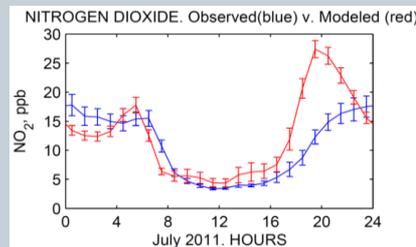
# Quantifying Accuracy and Representativeness of Regional Nature Run

33

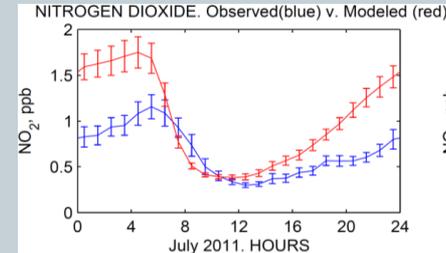
**PINNACLE, NY. Park Forest**



**BIRMINGHAM, AL. Urban**

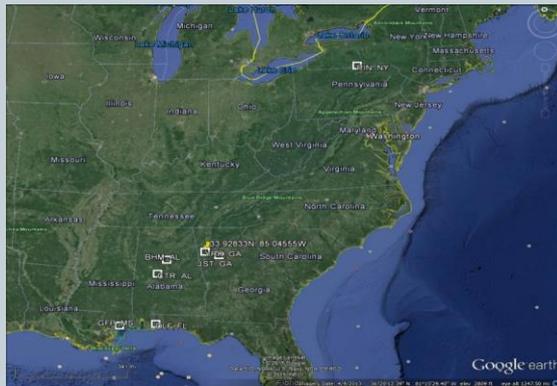


**CENTERVILLE, AL. Rural**

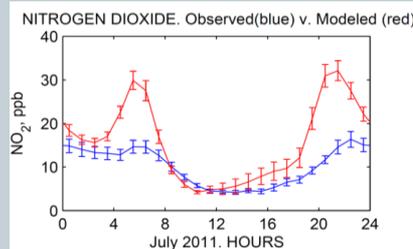


**Observed & Modeled (Nature run) diurnal cycle of NO<sub>2</sub>**

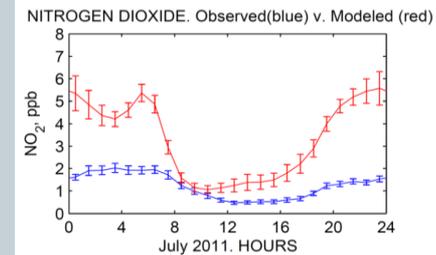
## STATIONS MAP



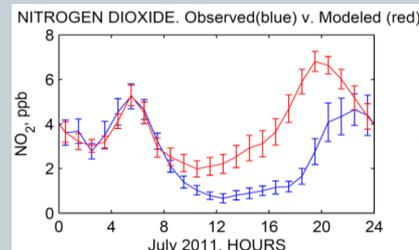
**ATLANTA, GA. Urban**



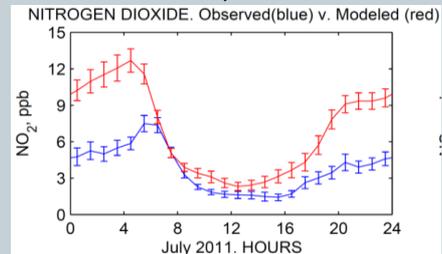
**YORKVILLE, GA. Rural**



**PENSACOLA (OLF), FL. Urban**



**GULFPORT, MS. Urban**



- The model systematically overestimates NO<sub>2</sub> concentrations but correctly reproduces shape of diurnal cycle and differences of NO<sub>2</sub> concentrations between rural and urban locations.
- Modeled and observed daily variability in diurnal cycle of NO<sub>2</sub> concentrations are quite consistent.

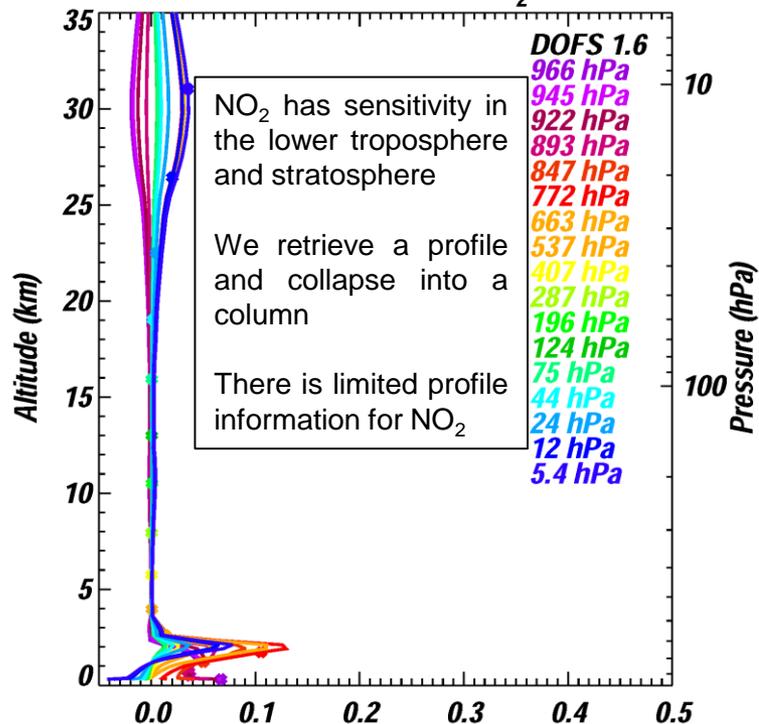
**Courtesy: K. Vinnikov/R. Dickerson/N. Krotkov**



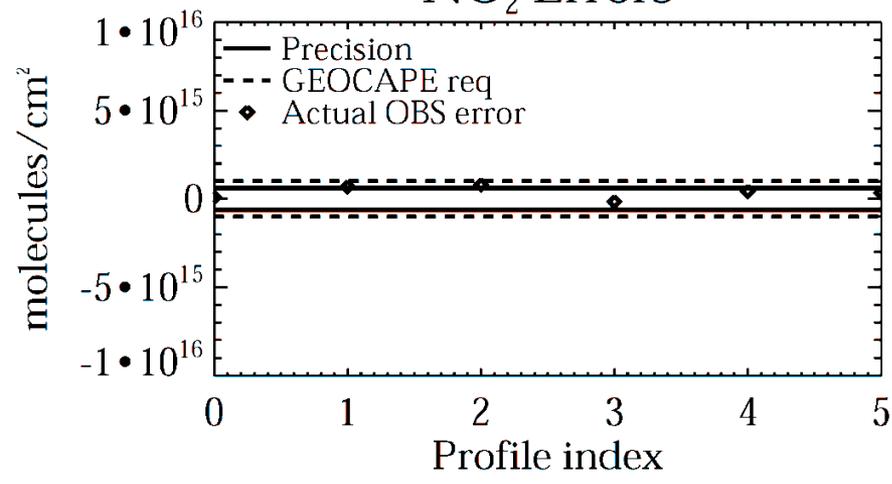
# NO<sub>2</sub> Retrievals: First Results

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## Rows of A for NO<sub>2</sub>



## NO<sub>2</sub> Errors



- Preliminary retrievals with TEMPO instrument characteristics meets GEOCAPE requirements for column precision (OBServation error includes precision and error from aerosols, albedo)
- Work underway on increasing computational efficiency to meet processing demands for full domain