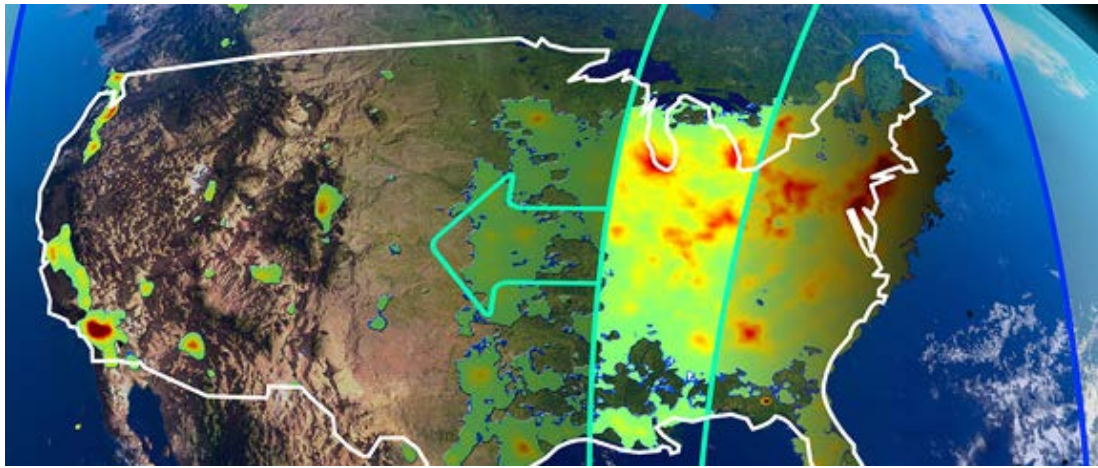


# Ozone Air Quality from TEMPO: Theory, Expectations, and Subtleties



**Peter Zoogman**

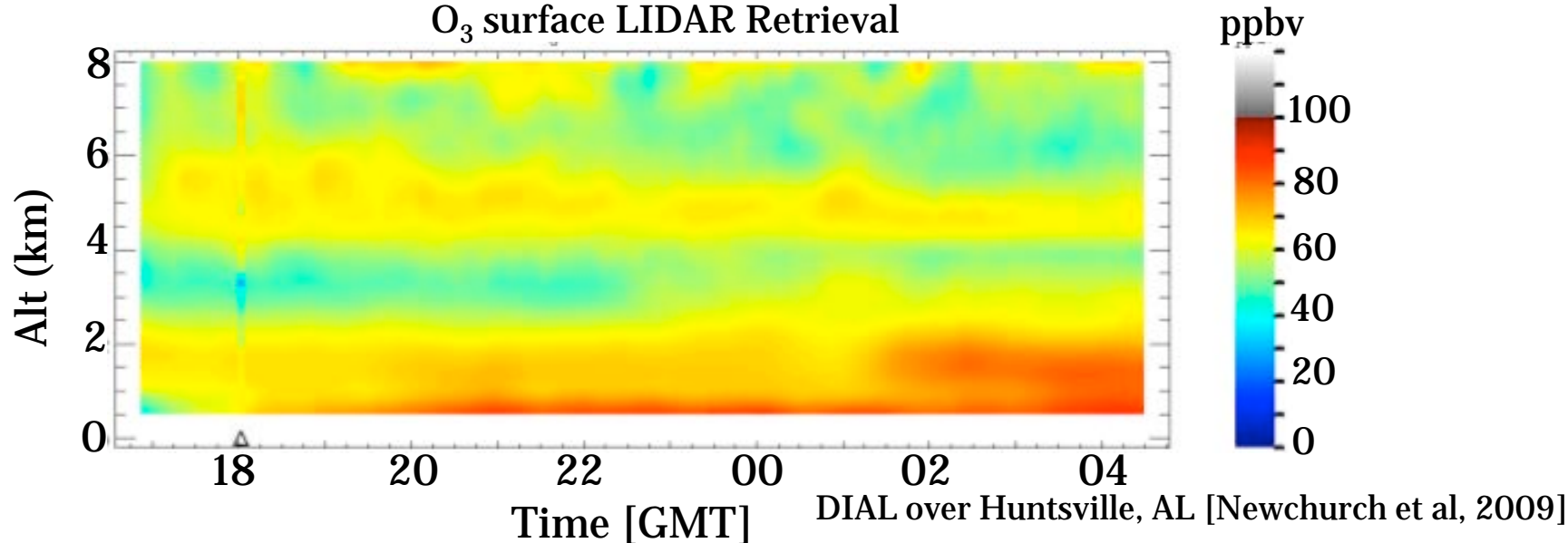
EPS 238

April 24, 2014

# The Difficulty of Ozone Air Quality from Space

- Ozone concentrations very heterogeneous both spatially and temporally

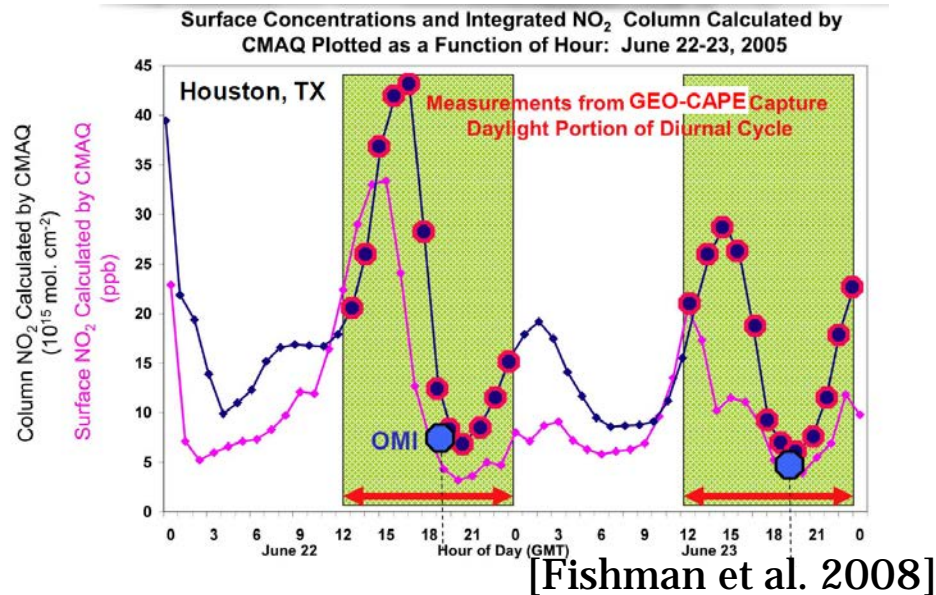
O<sub>3</sub> surface LIDAR Retrieval



Ozone chemistry complex and non-linear

Short timescales → large diurnal variation

Current network inadequate for air quality monitoring + science



# Observations from TEMPO

## Features:

- High temporal resolution
- Multispectral observations for increased vertical information



## TEMPO Science Questions

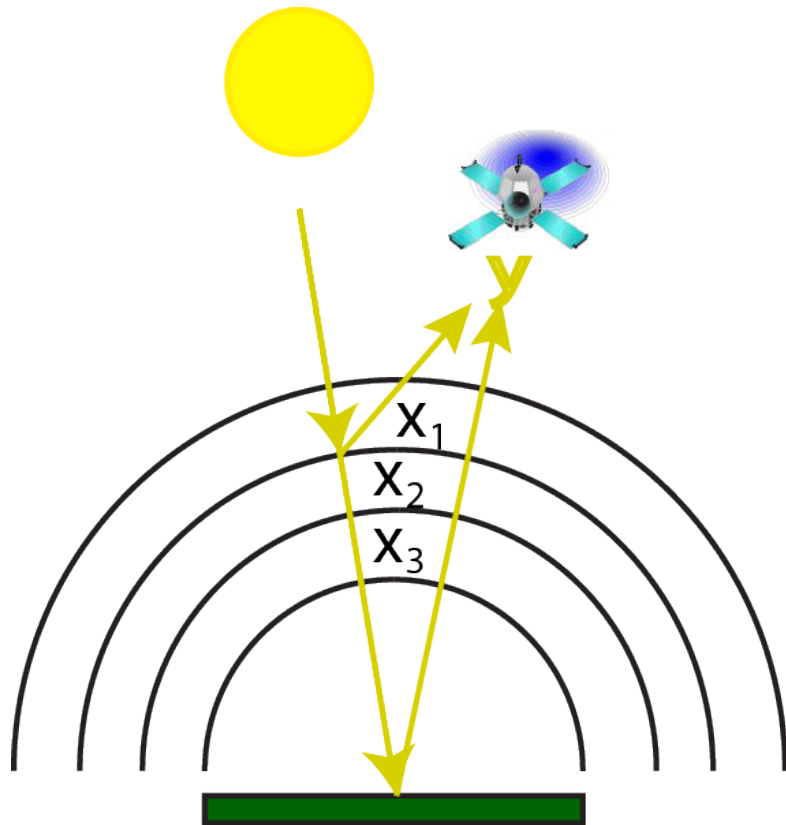
1. What are the temporal and spatial variations of **emissions** of gases and aerosols important for air quality and climate?
2. How do physical, chemical, and dynamical **processes** determine tropospheric composition and air quality over scales ranging from urban to continental, diurnally to seasonally?
3. How does air pollution drive **climate** forcing and how does climate change affect **air quality** on a continental scale?
4. How can observations from space improve air quality **forecasts and assessments**?
5. How does **intercontinental transport** affect air quality?
6. How do **episodic events**, such as wild fires, dust outbreaks, and volcanic eruptions, affect atmospheric composition and air quality?

# Use of Radiative Transfer Models In Optimal Estimation

Radiative Transfer model is necessary for  
satellite retrievals by optimal estimation

Forward model  $F$  relates  
concentrations  $\mathbf{x}$  to measurements  $\mathbf{y}$

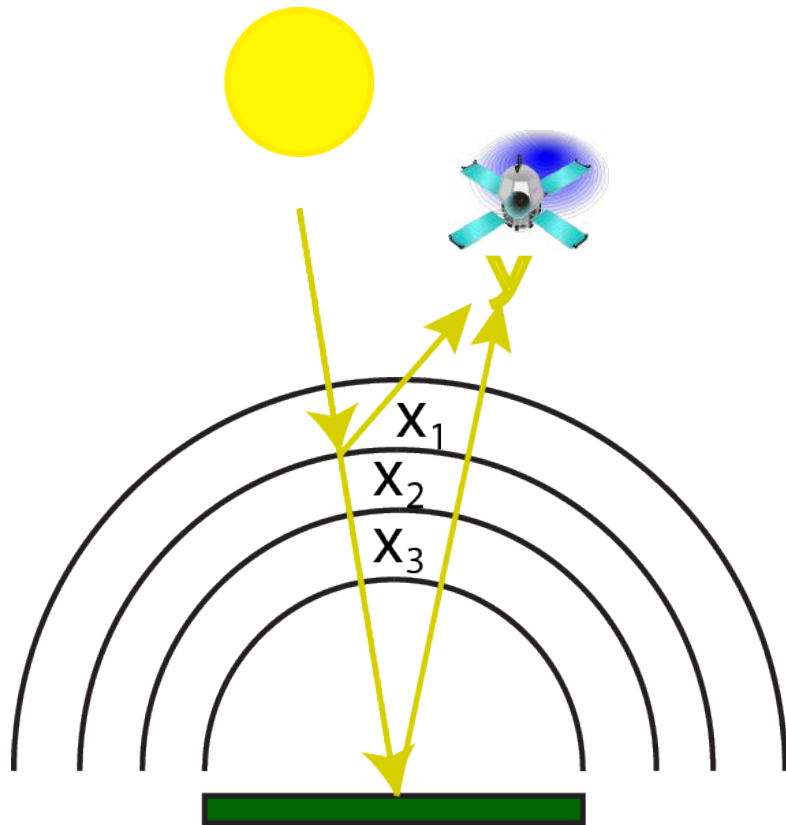
$$\mathbf{y} = F(\mathbf{x}, \mathbf{b}) + \text{error}$$





# Use of Radiative Transfer Models In Optimal Estimation

Radiative Transfer model is necessary for satellite retrievals by optimal estimation



Forward model  $F$  relates concentrations  $\mathbf{x}$  to measurements  $\mathbf{y}$

$$\mathbf{y} = F(\mathbf{x}, \mathbf{b}) + \text{error}$$

Retrieved value  $\hat{\mathbf{x}}$  minimizes the difference between measurement and computed measurement:

want minimum of:  $[\mathbf{y} - F(\hat{\mathbf{x}}, \hat{\mathbf{b}})]$

- 
- 
- 

$$\hat{\mathbf{x}} = \mathbf{x}_a + \mathbf{A}[\mathbf{x} - \mathbf{x}_a] + \text{error}$$

$\mathbf{A}$  is the averaging kernel matrix and is a function of  $\mathbf{F}$

# Information Content

Retrieved profile is a linear combination of the true profile  $\mathbf{x}$  and an *a priori* guess  $\mathbf{x}_a$

$$\mathbf{x}' = \mathbf{x}_a + \mathbf{A}(\mathbf{x} - \mathbf{x}_a) + \varepsilon$$

retrieval      *a priori*      true state      errors

Averaging Kernel matrix  $\mathbf{A}$   
quantifies the vertical information  
provided by a satellite retrieval

$$\mathbf{A} = \frac{\partial \mathbf{x}'}{\partial \mathbf{x}}$$

# Information Content

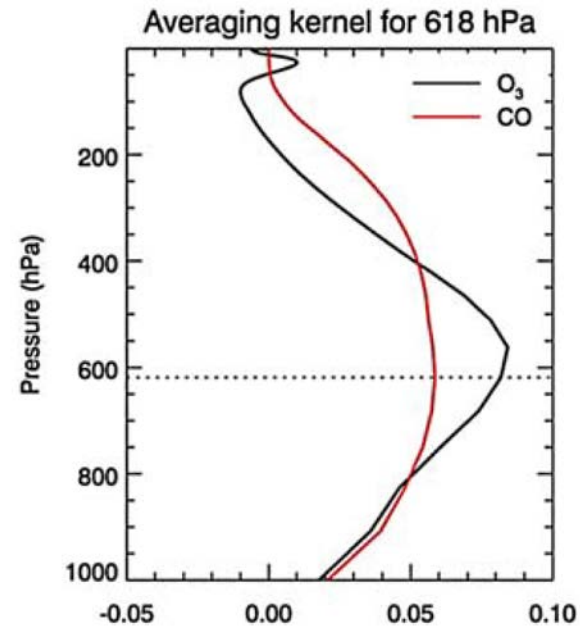
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↑ retrieval      ↑ *a priori*      ↑ true state      ↑ errors

Averaging Kernel matrix  $\mathbf{A}$  quantifies the vertical information provided by a satellite retrieval

$$\mathbf{A} = \frac{\partial \mathbf{x}'}{\partial \mathbf{x}}$$



[Zhang et al. 2010]

# Information Content

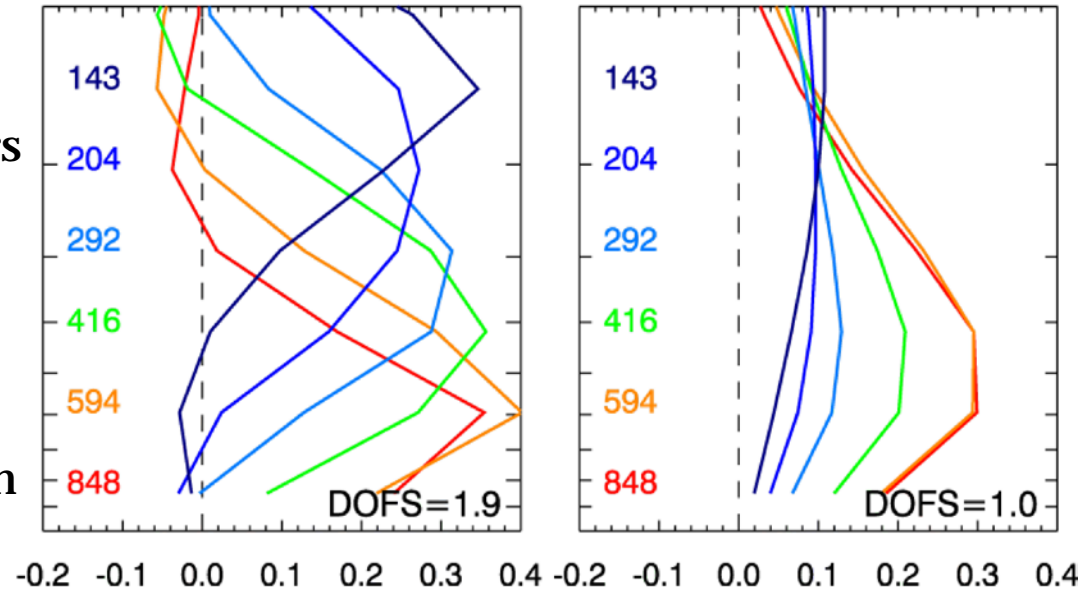
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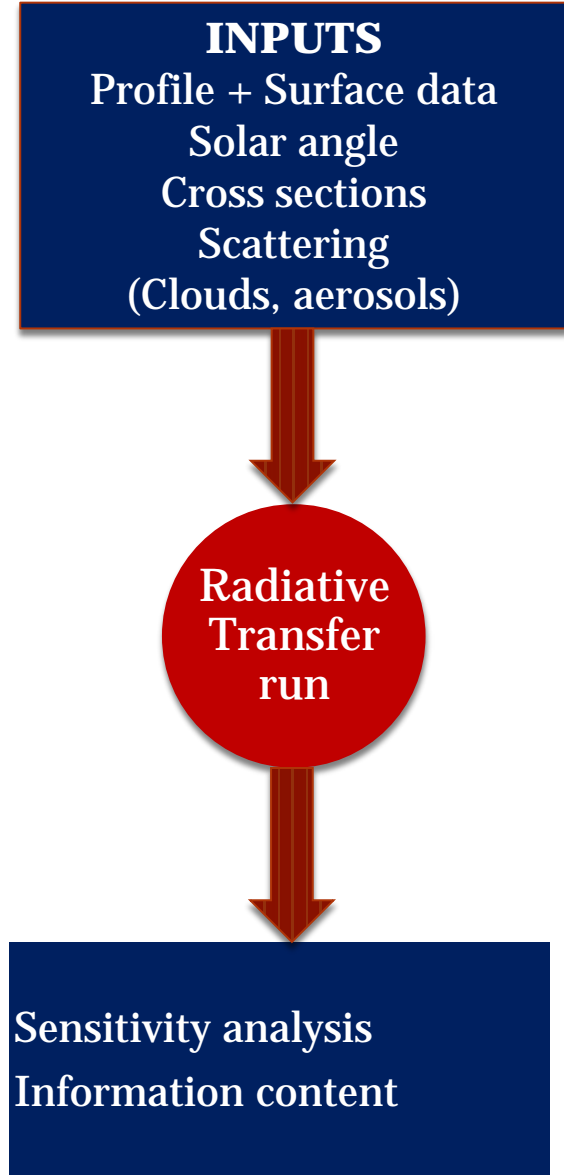
$$\mathbf{A} = \frac{\partial \mathbf{x}'}{\partial \mathbf{x}}$$



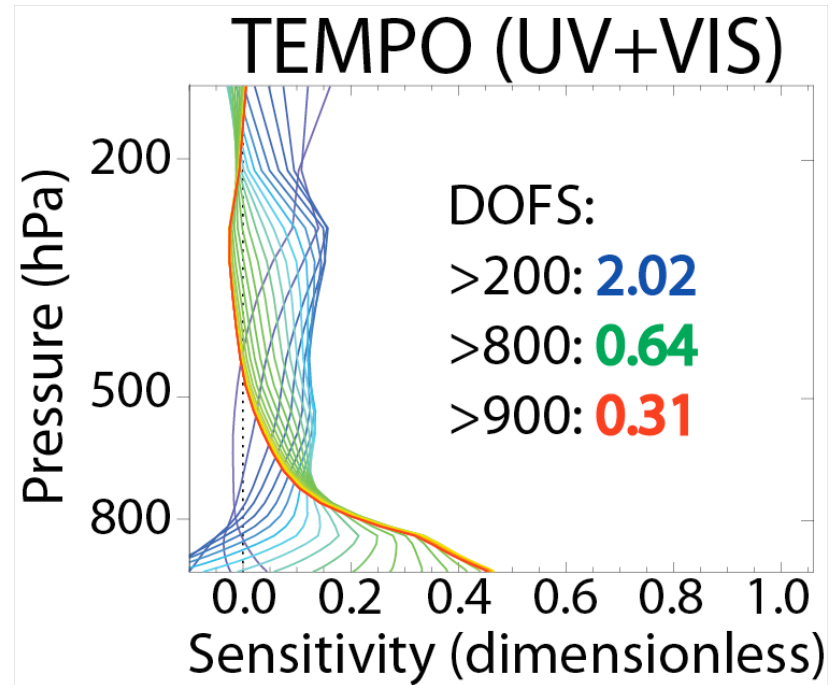
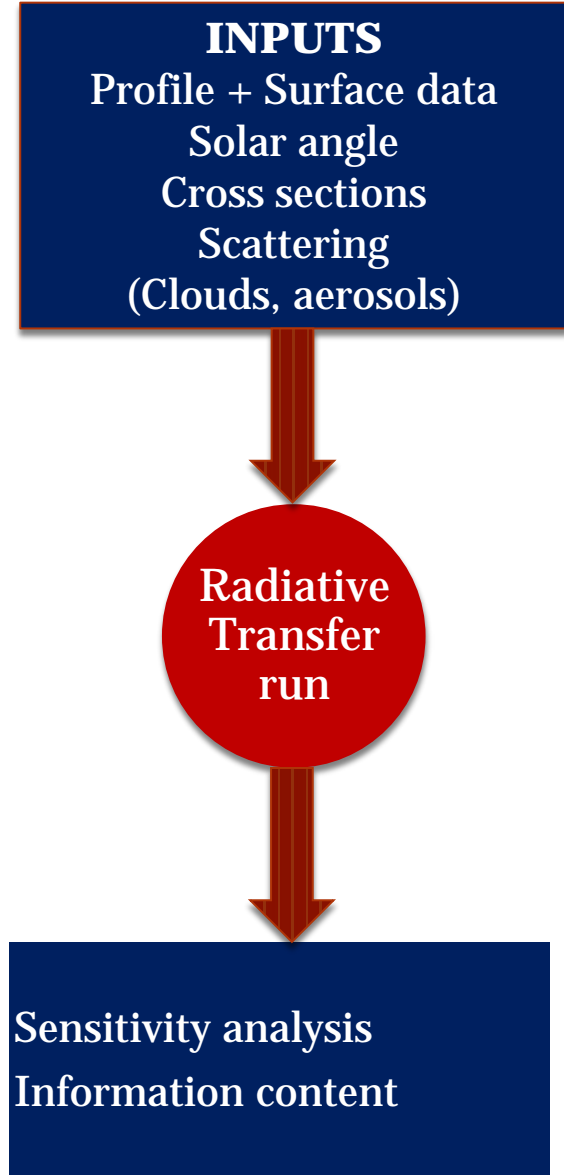
[Zhang et al. 2010]



# Simulated Retrievals



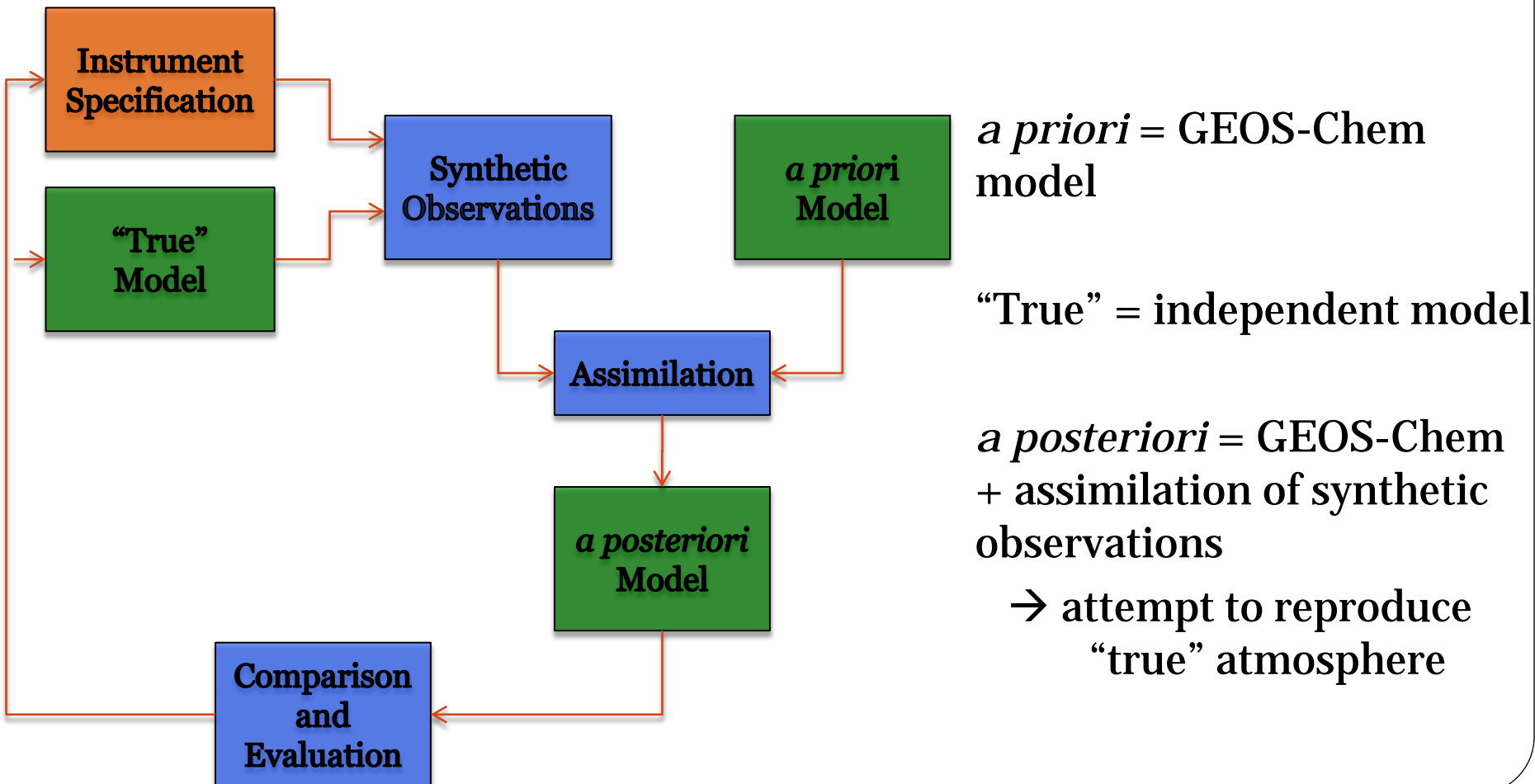
# Simulated Retrievals



[Natraj et al, 2011]

# Observing System Simulation Experiment

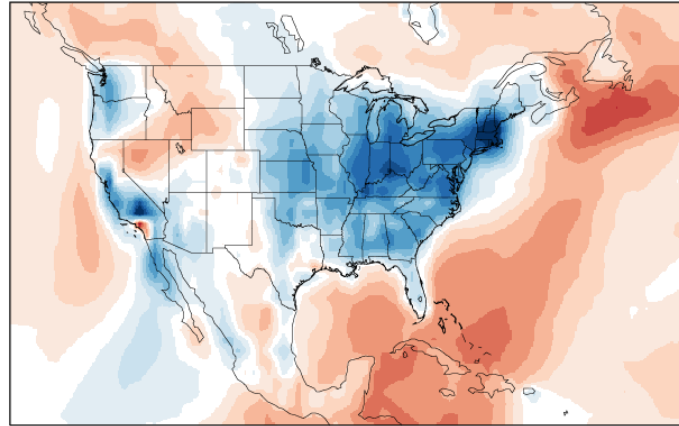
- What additional information is provided by a new instrument?



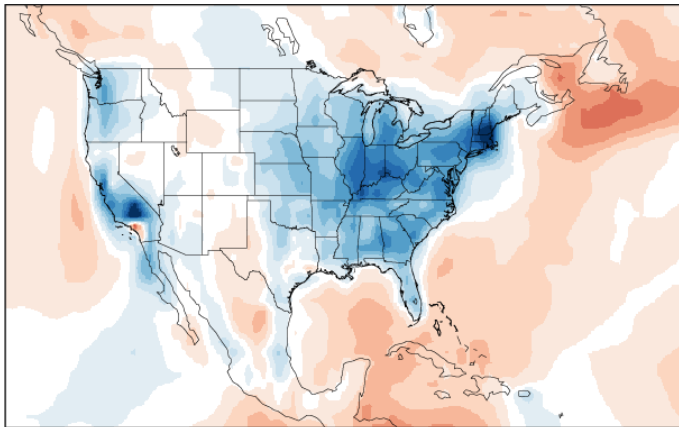
# Air Quality Information from GEO

Error in Surface MDA8 Ozone averaged for July 2001

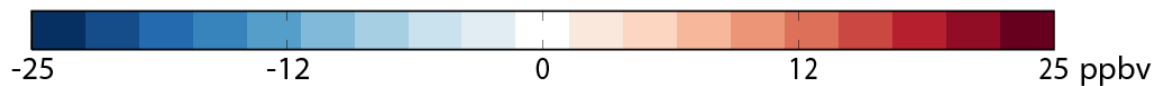
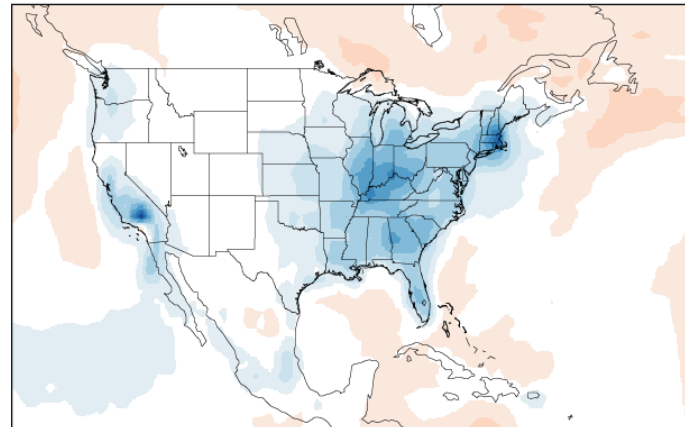
*a priori* RMSE: 8.0 ppbv



LEO UV+Vis+TIR RMSE: 6.5 ppbv

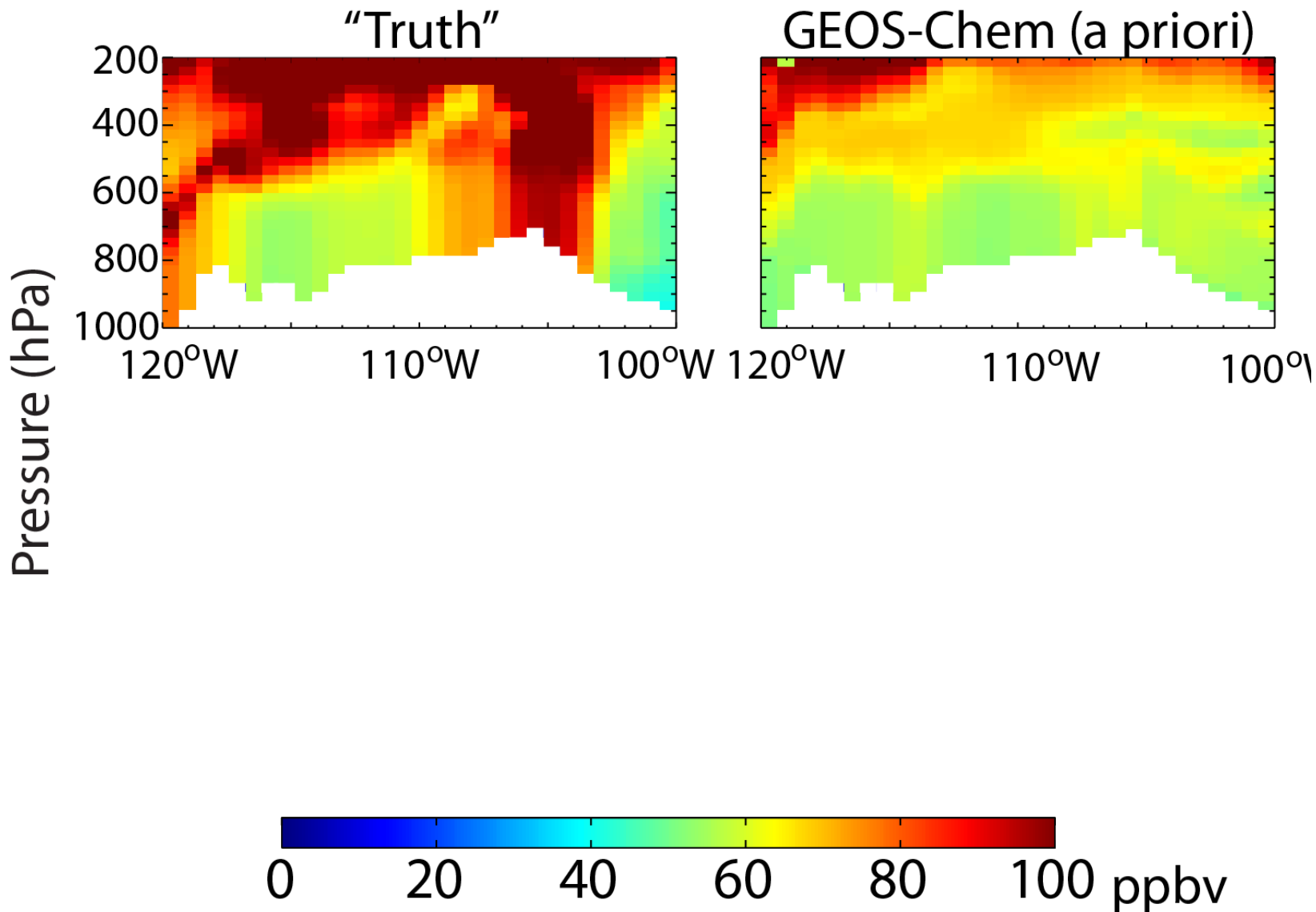


Geo UV+Vis+TIR RMSE: 3.7 ppbv

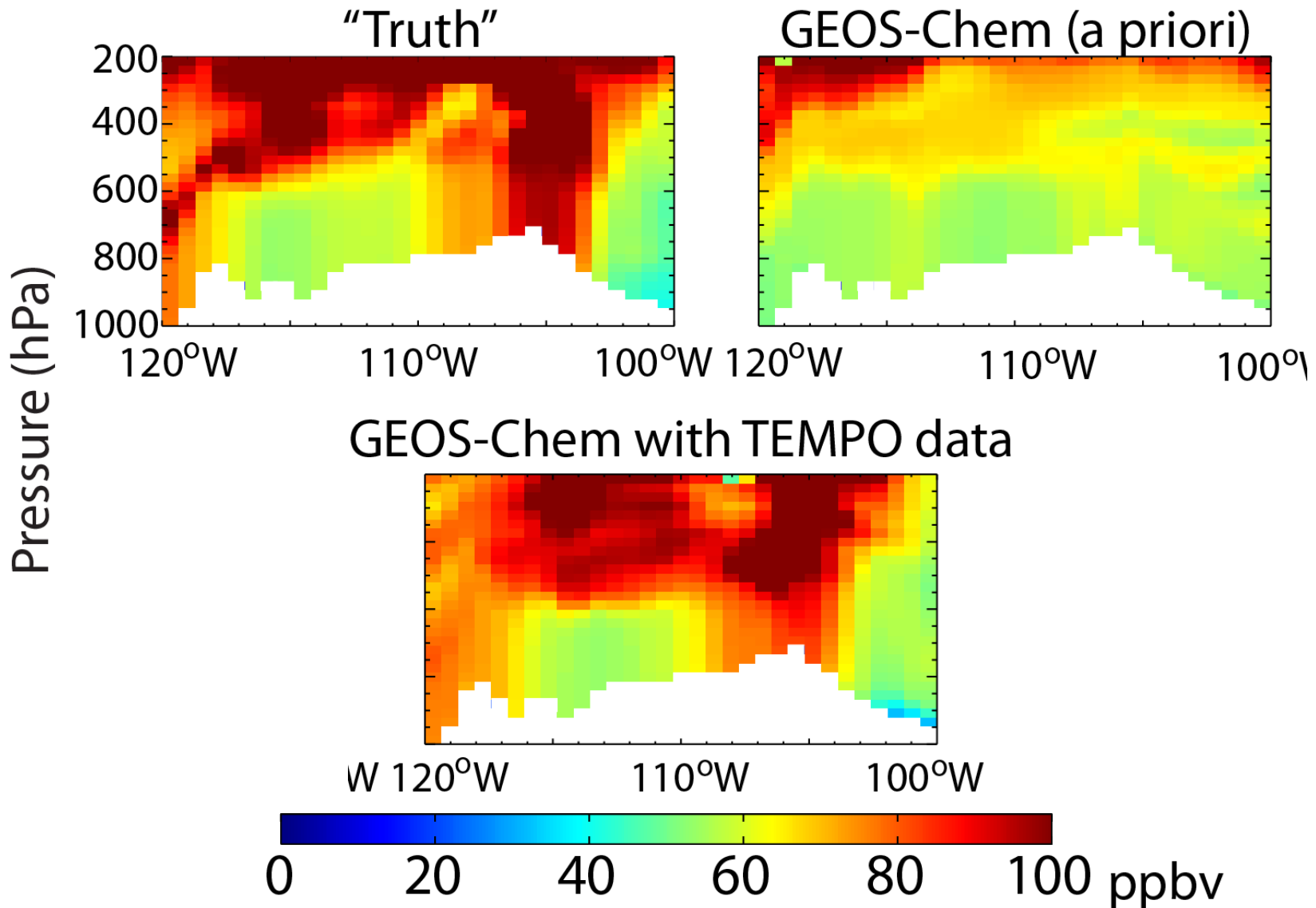


**Need to combine observations in multiple spectral regions at high temporal resolution to constrain ozone air quality**

# Seeing a Stratospheric Intrusion



# Seeing a Stratospheric Intrusion

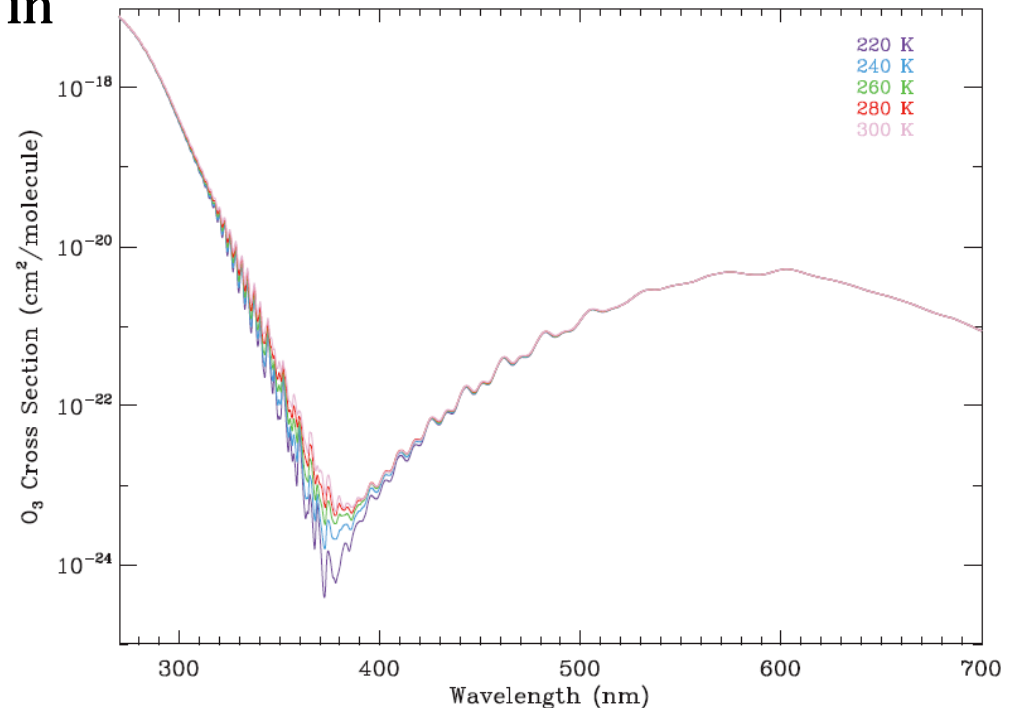


Assimilation of TEMPO observations into the GEOS-Chem model recaptures structure of stratospheric intrusion

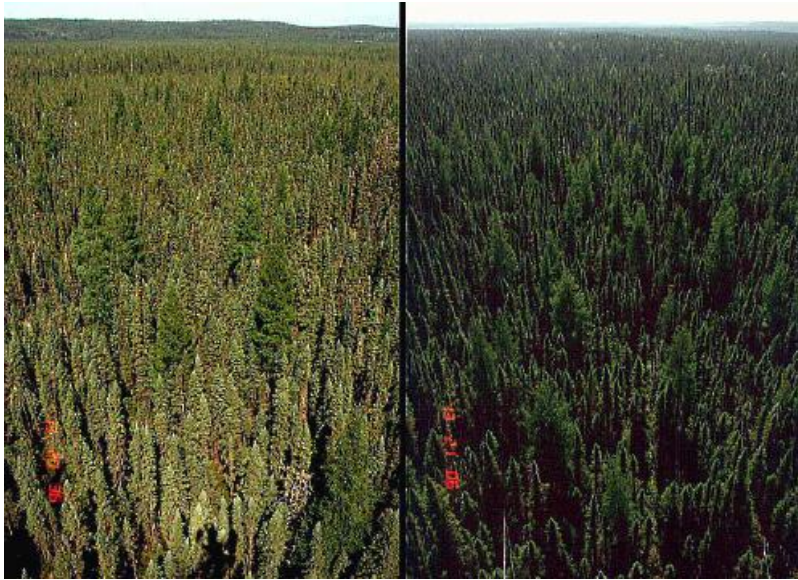


# Ozone absorption in the Visible

- Ozone has weak spectral features in the Chappuis band (~500 – 700 nm)
- Since the atmosphere is optically thin in the visible, can get information near the surface
- But retrieval is more sensitive to errors in radiative transfer model
  - Example → **surface reflectance**



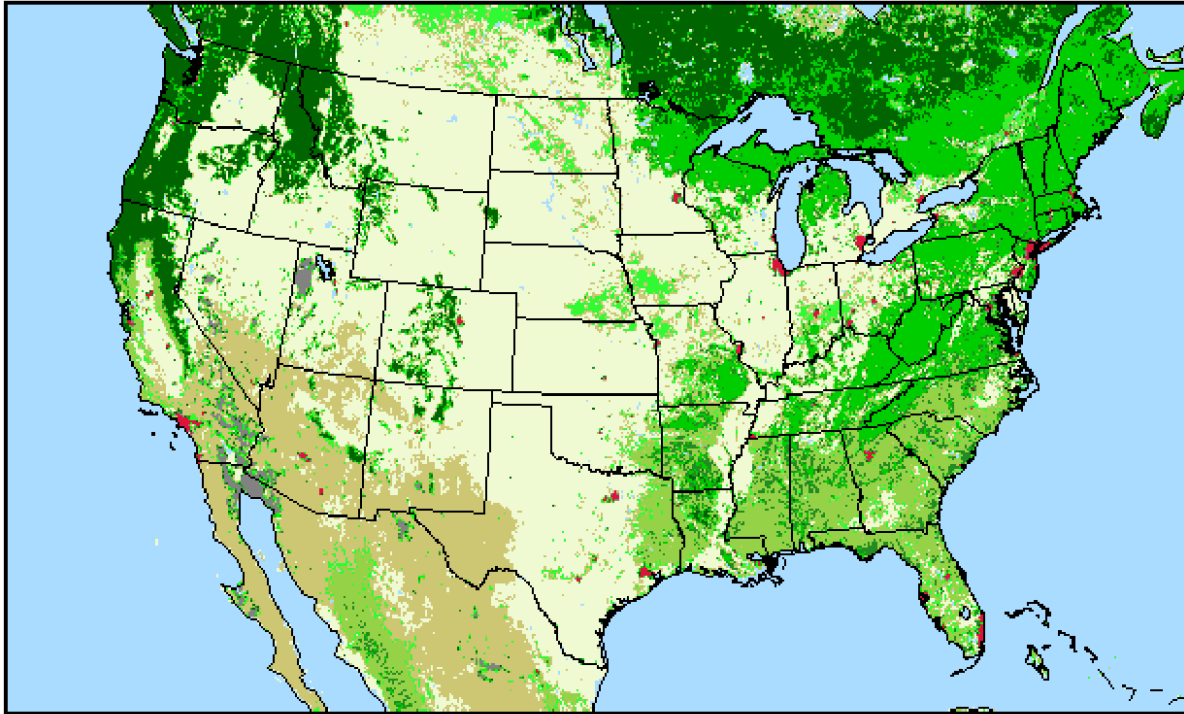
# Surface Reflectance in the Visible



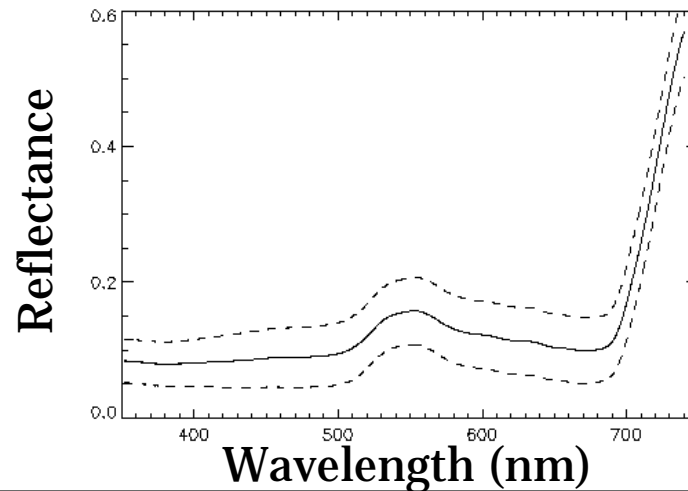
Pictures by Don Deering

- Spectral variation
- Dependence on land cover
- Changes with viewing geometry

# Variation by Land Cover



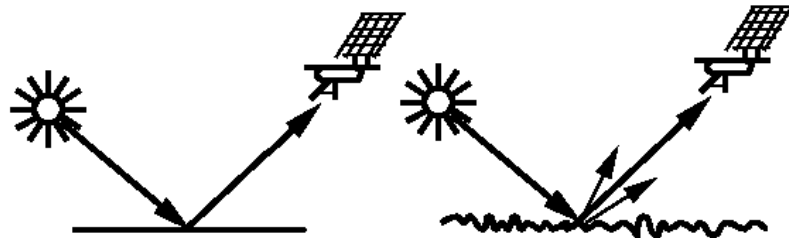
Water  
Grasses/Cereal Crops  
Shrubs  
Broad-leaf crops  
Savannah  
Evergreen Broadleaf Forest  
Deciduous Broadleaf Forest  
Evergreen Needleleaf Forest  
Deciduous Needleleaf Forest  
Barren Ground  
Urban



Grasses/Cereals  
(51 samples)

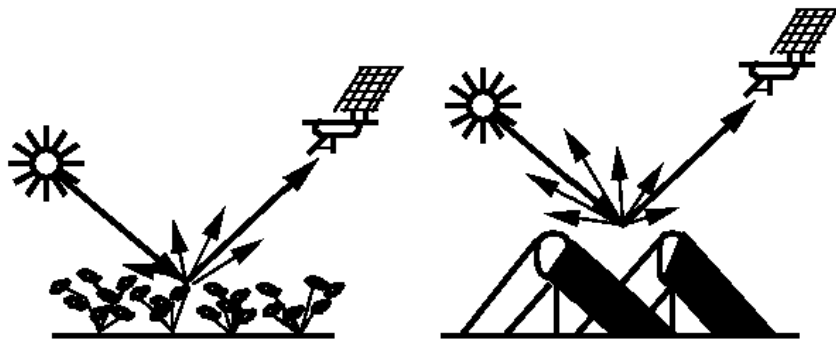
# Effect of Viewing Geometry

## Bidirectional Reflectance Distribution Functions: Causes



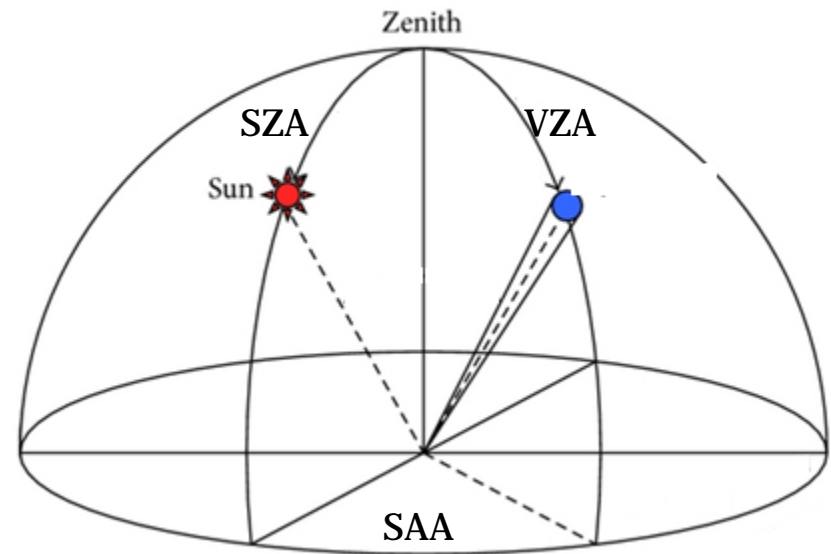
Mirror BRDF:  
specular reflectance

Rough water surface BRDF:  
sunglint reflectance



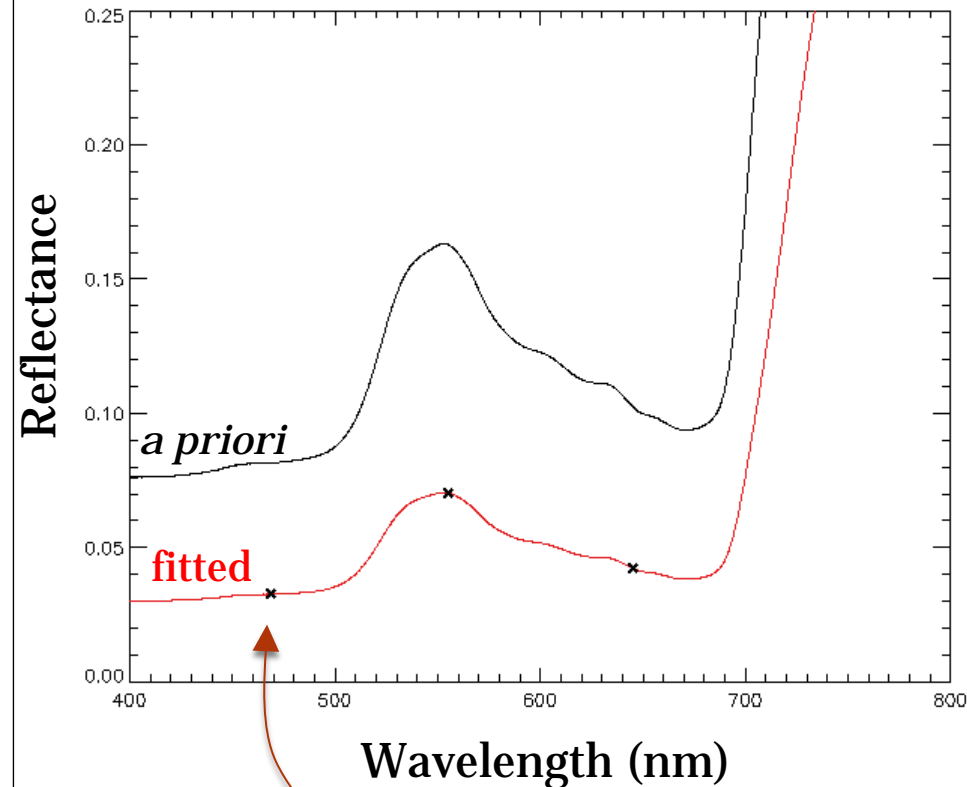
Volume scattering BRDF:  
leaf/vegetation reflectance

Gap-driven BRDF (Forest):  
shadow-driven reflectance



# Computed surface reflectance

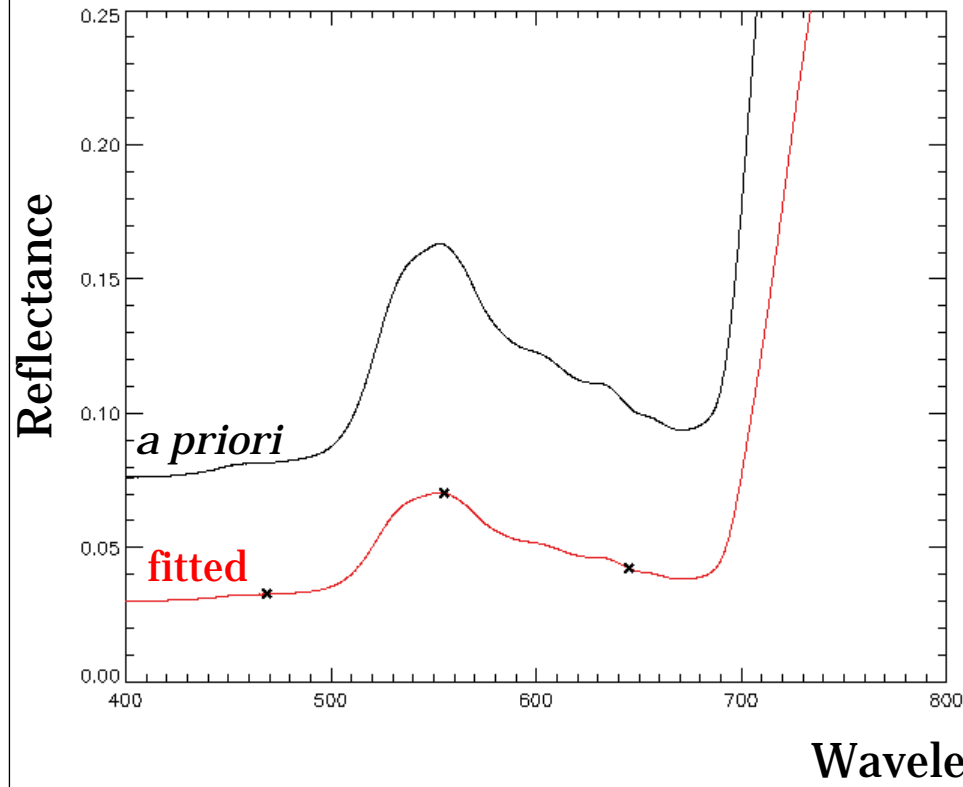
Vegetated Scene, SE US



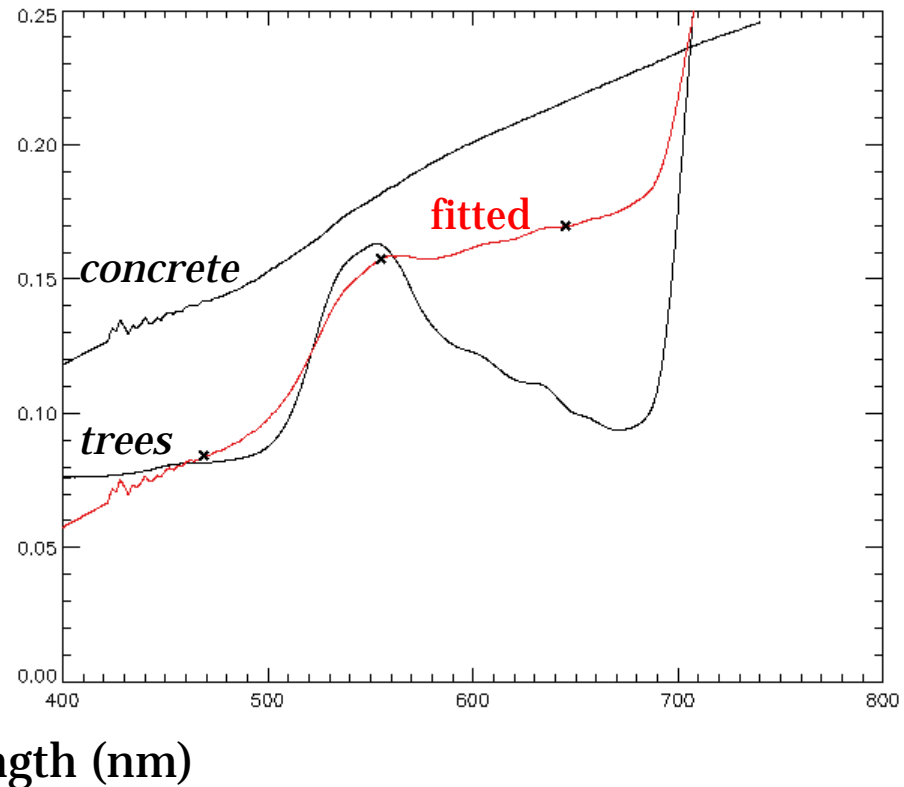
X's are measured MODIS reflectances adjusted for viewing geometry

# Computed surface reflectance

## Vegetated Scene, SE US

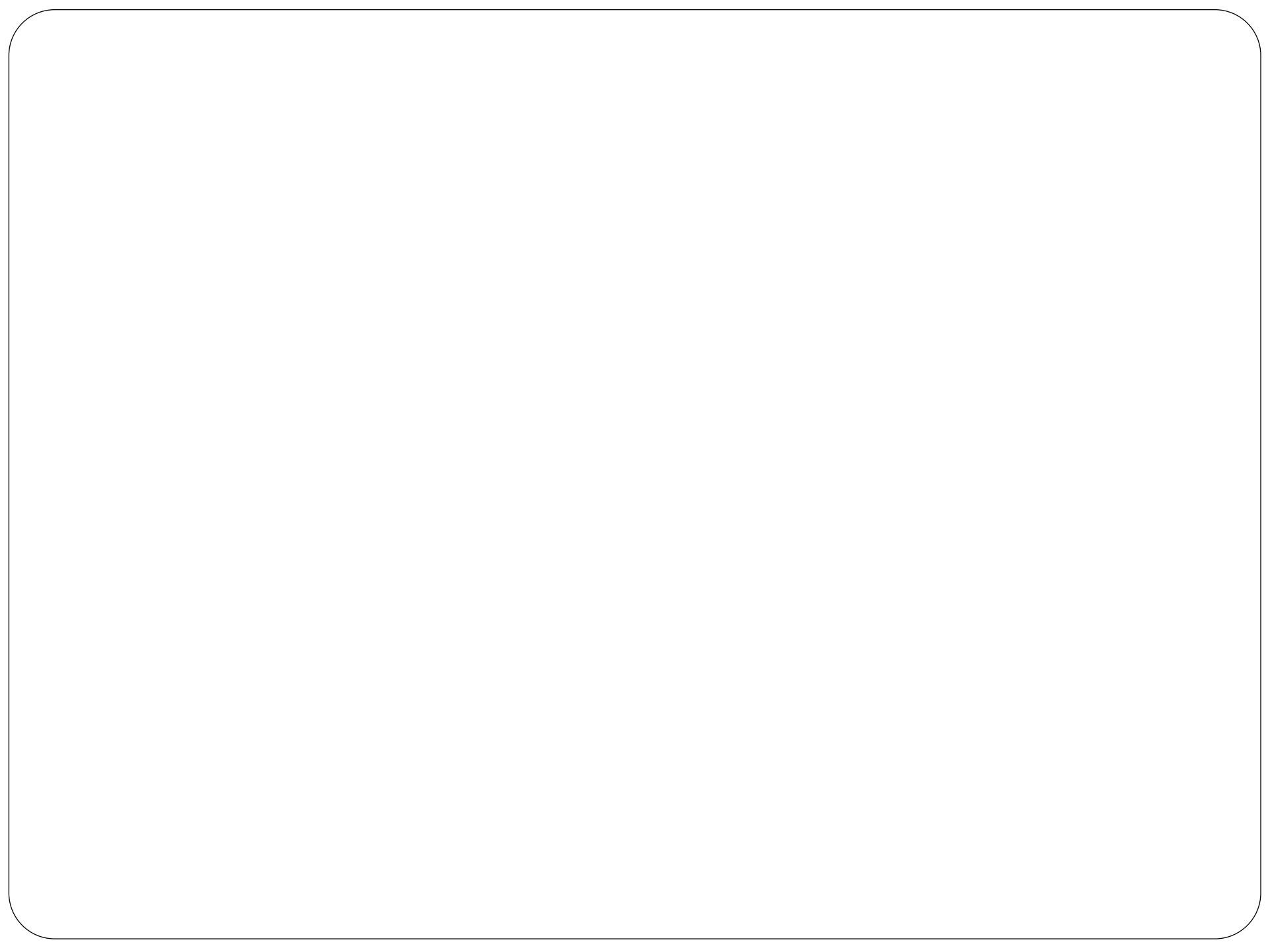


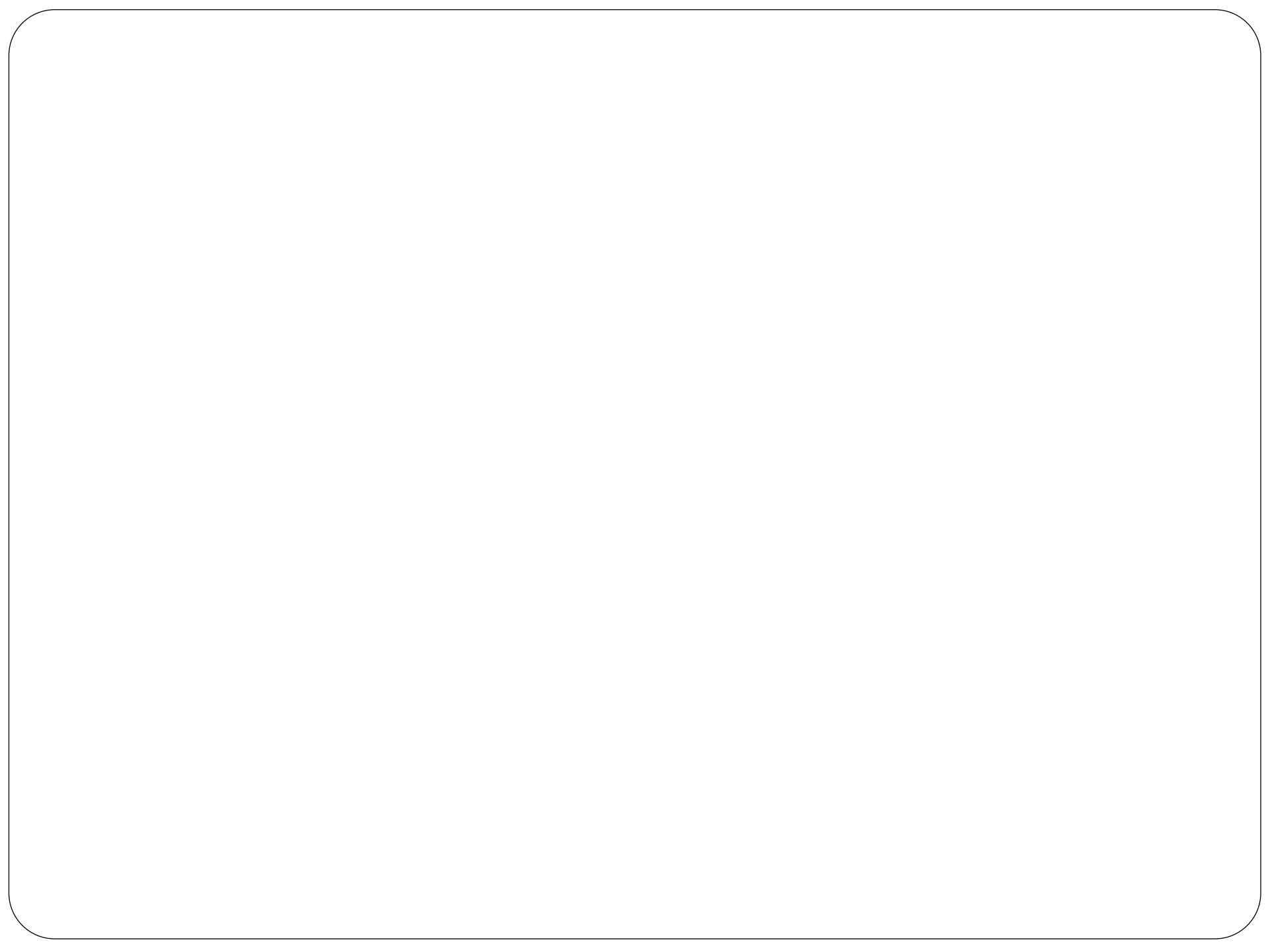
## Boston, MA: Combination of concrete and trees



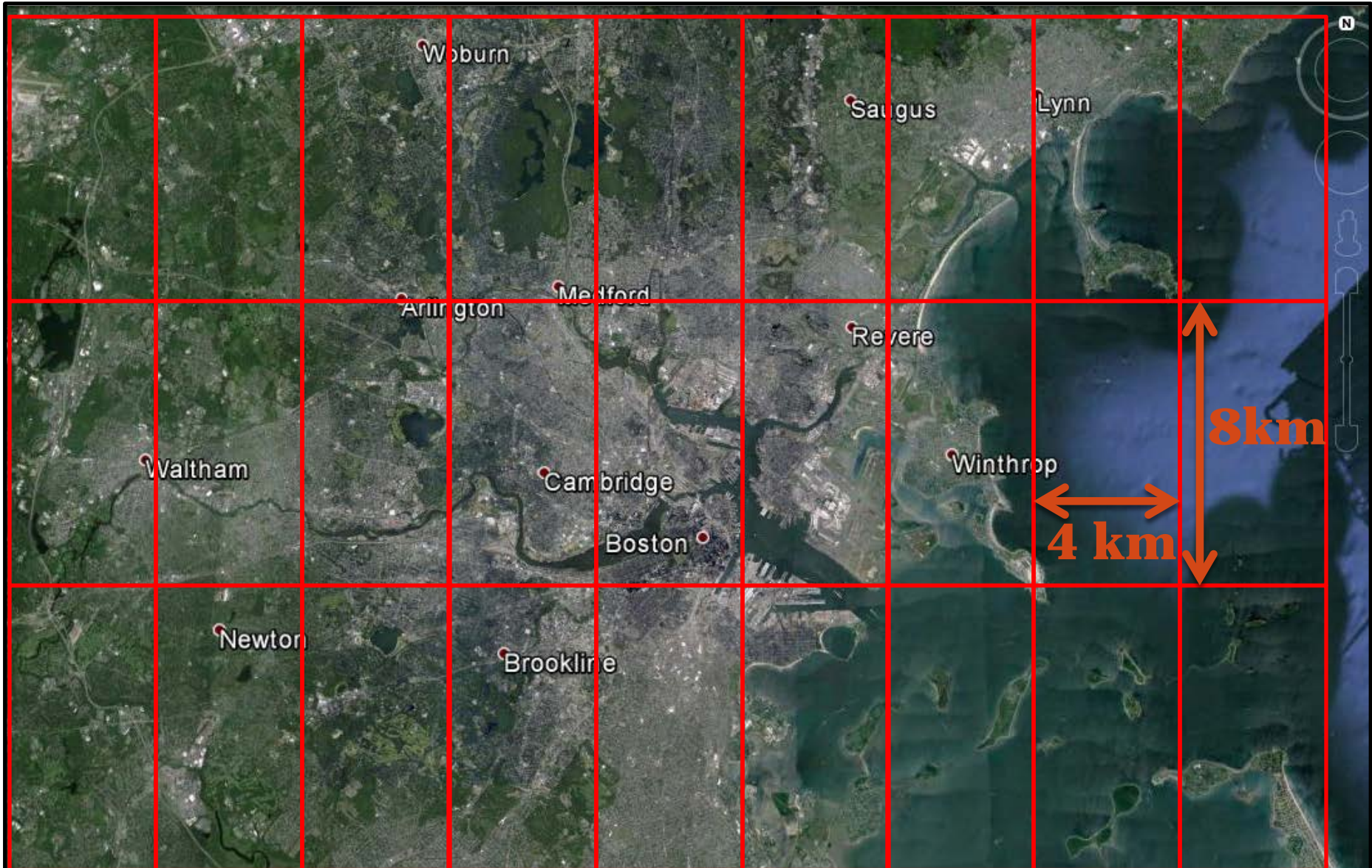
X's are measured MODIS reflectances adjusted for viewing geometry



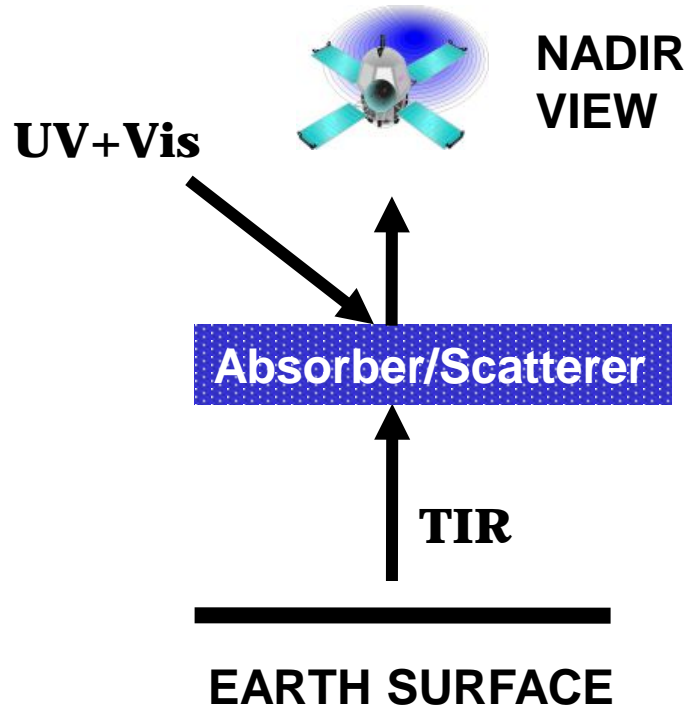




# The View from GEO



# Current Satellite Observations

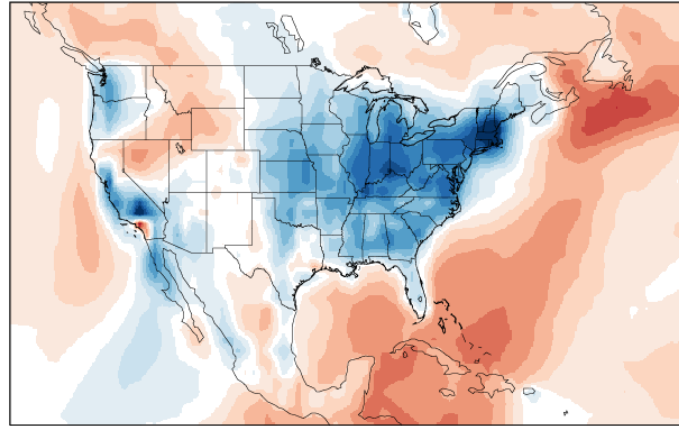


- High density of observations, but limited to once per day
- Satellite observe absorption features in UV, Vis, IR
  - e.g.  $O_3$ ,  $NO_2$ ,  $CO$ ,  $HCHO$ ,  $CH_4$
- Nadir viewing geometry gives good horizontal resolution but poor vertical resolution

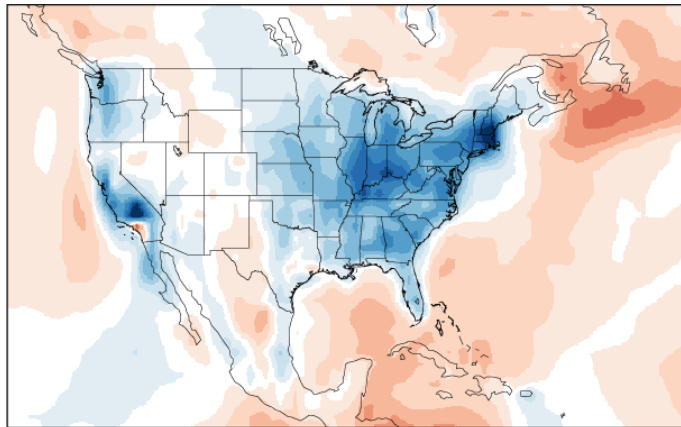
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Error in Surface MDA8 Ozone averaged for July 2001

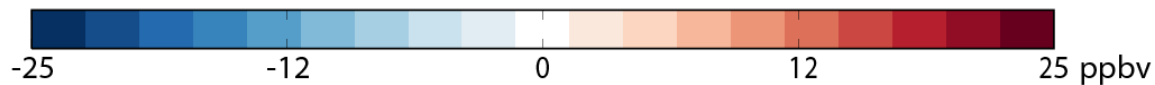
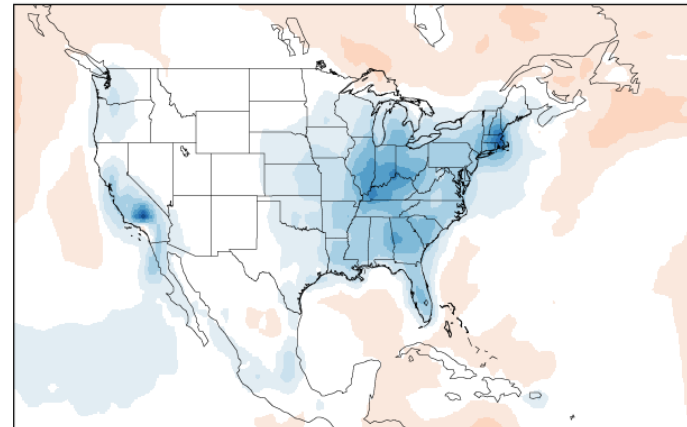
*a priori* RMSE: 8.0 ppbv



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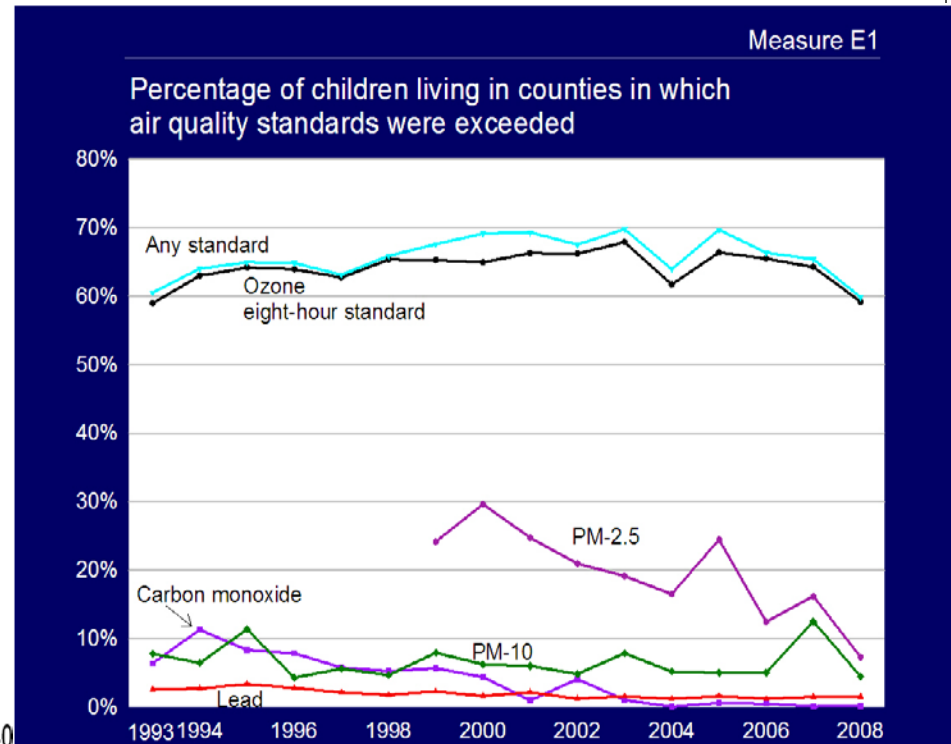
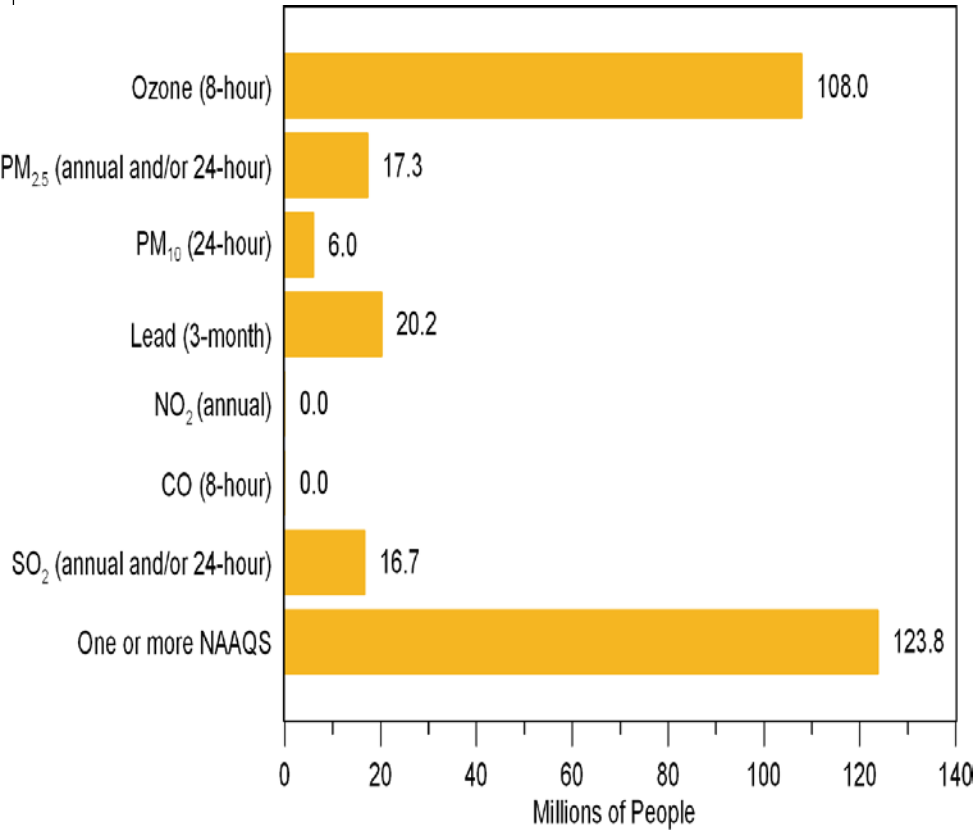


Geo UV+Vis+TIR RMSE: 3.7 ppbv



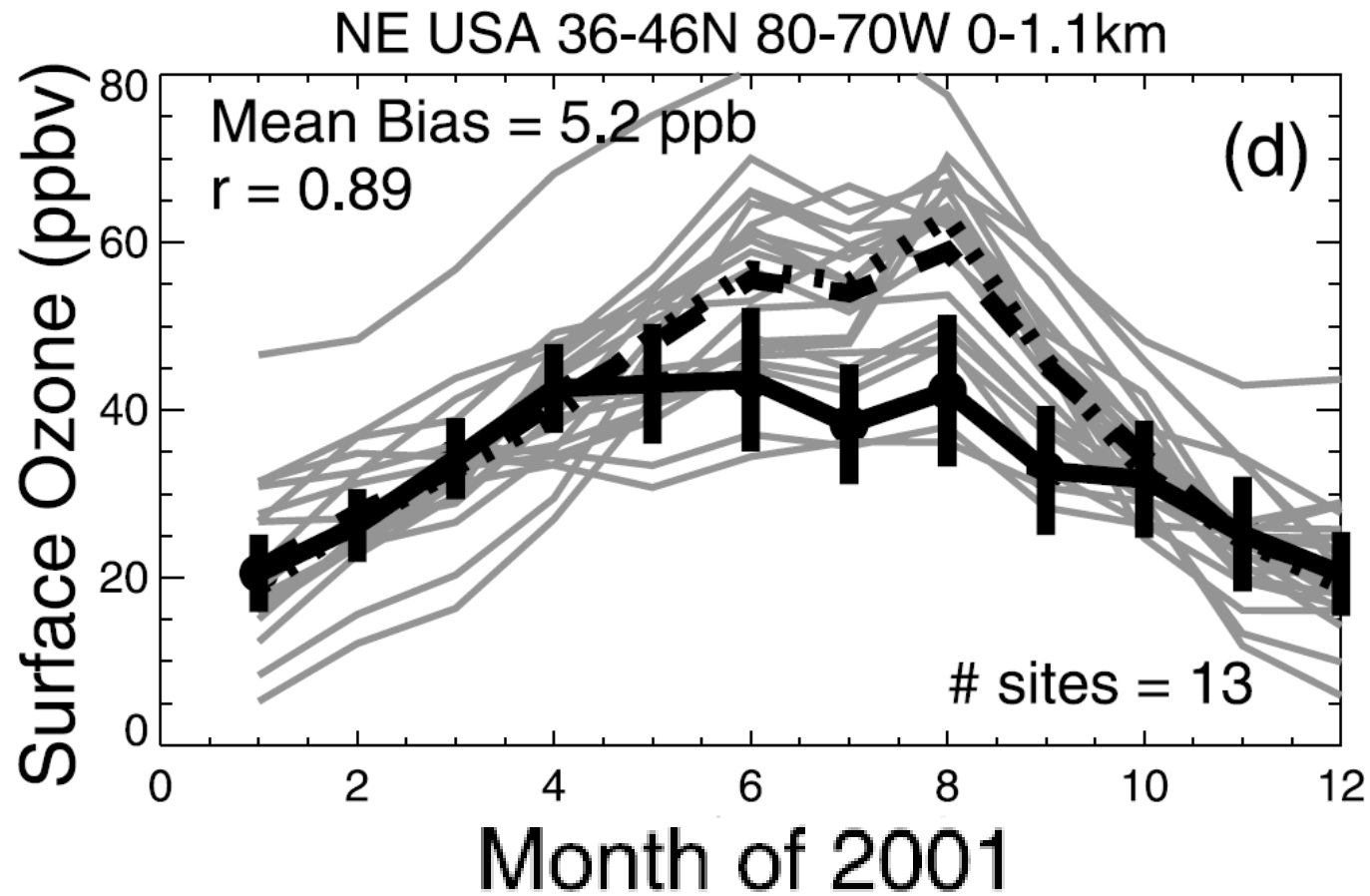
**Need to combine observations in multiple spectral regions at high temporal resolution to constrain ozone air quality**

# If its polluted, there's ozone





# Difficulty of Modeling Ozone



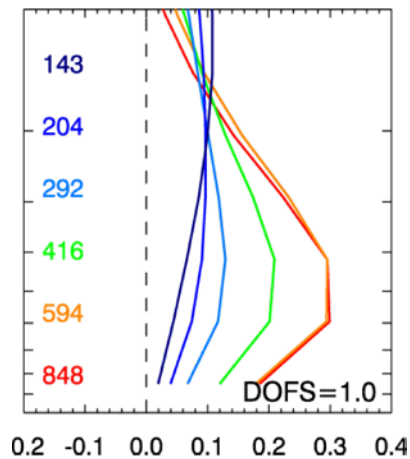
[Fiore et al. 2009]

# Multispectral Satellite Observations of Ozone

Averaging Kernel matrix  $\mathbf{A}$  quantifies the vertical information provided by a satellite retrieval

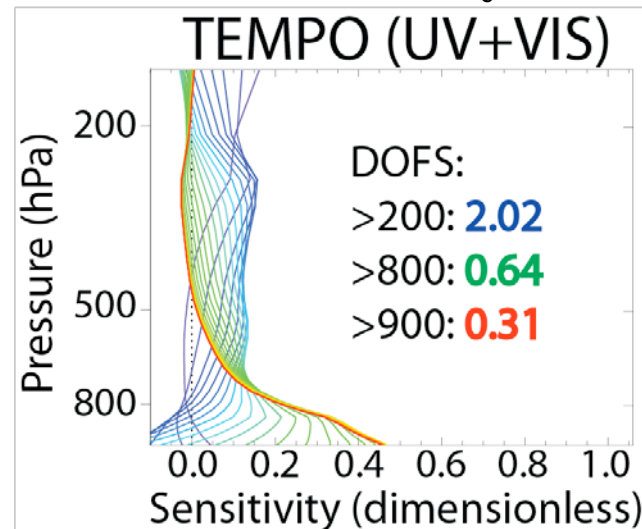
$$\mathbf{x}' = \mathbf{x}_a + \mathbf{A}(\mathbf{x} - \mathbf{x}_a) + \varepsilon \quad \mathbf{A} = \frac{\partial \mathbf{x}'}{\partial \mathbf{x}}$$

Current ozone sensitivity, OMI (UV)

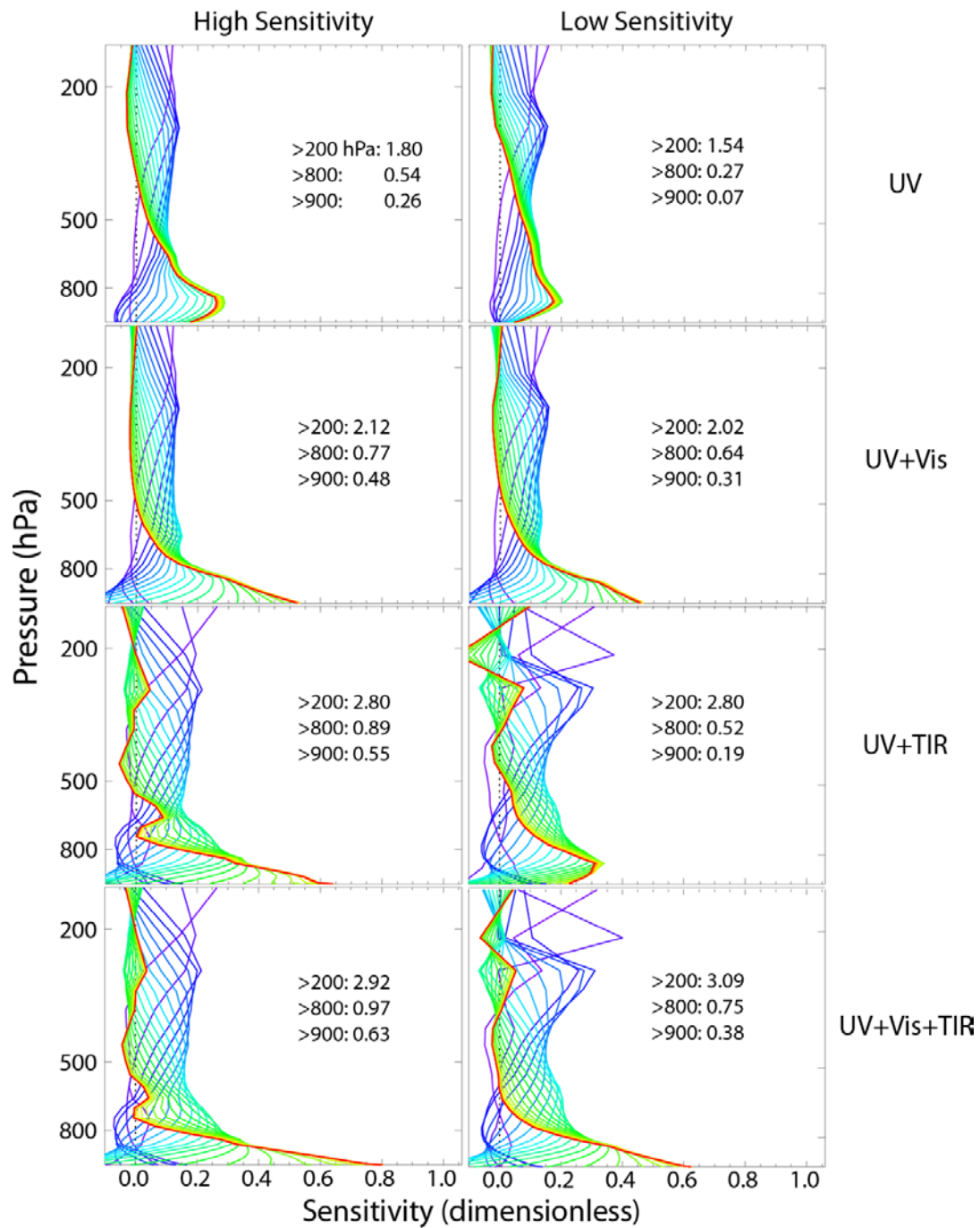


[Zhang et al. 2010]

Ozone sensitivity, future

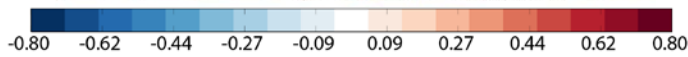
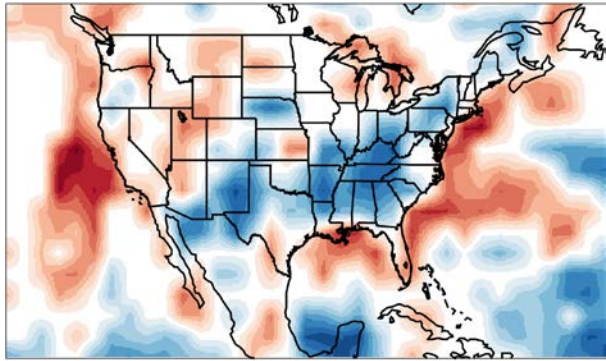


[Natraj et al, 2011]

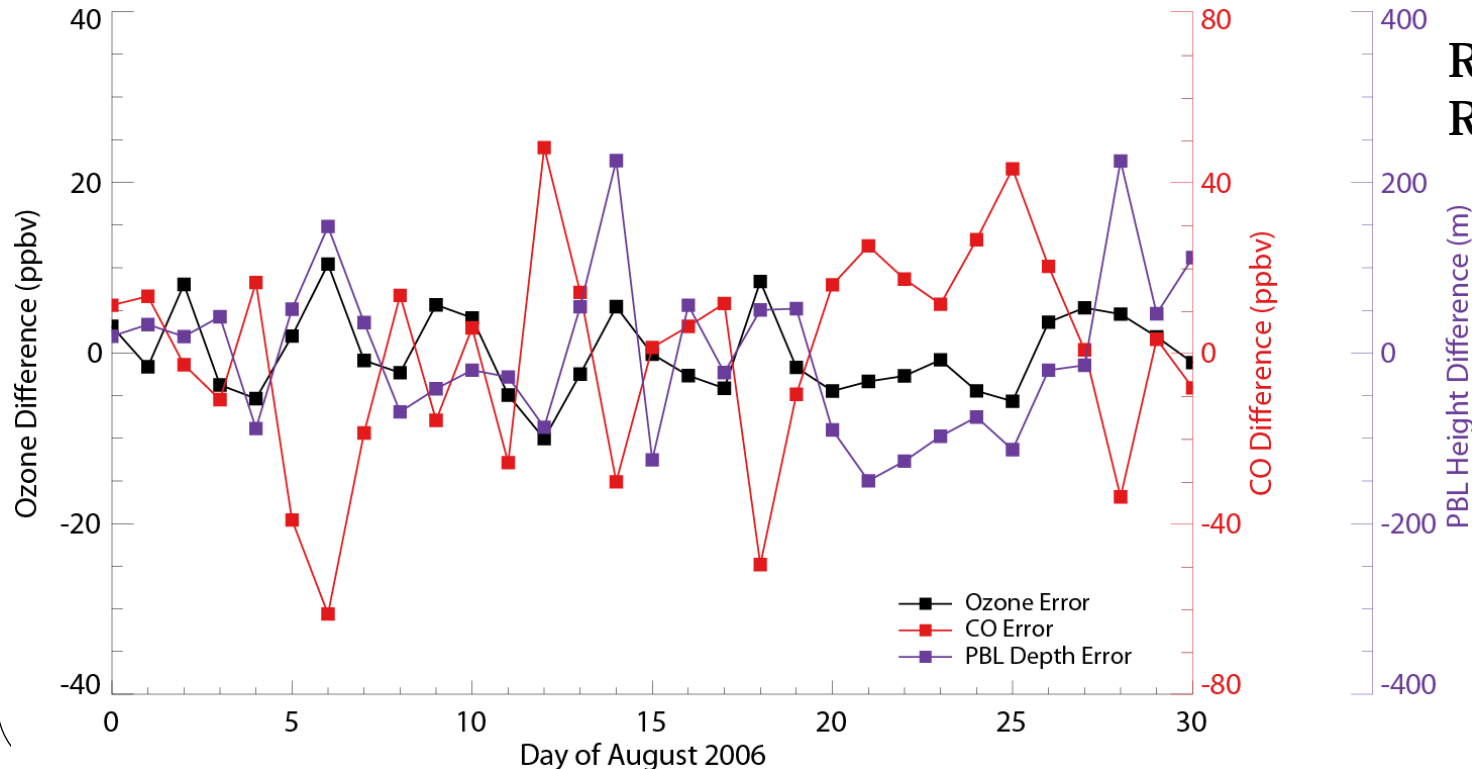


# Error Correlations Investigated

ozone-CO error correlations (model/model)



Negative error correlations over land  
driven by differences in vertical mixing



$$R_1 (\text{Ozone:CO}) = -.68$$
$$R_2 (\text{PBLH:CO}) = -.65$$