A satellite with large solar panels is shown in orbit above Earth's cloud-covered surface.

# The impact of *a priori* assumptions on CO retrievals from IASI and MOPITT

A circular inset image showing industrial smokestacks emitting thick black smoke against a bright orange sunset sky.

David Edwards, Avelino Arellano,  
Dallas Masters, Merritt Deeter & Debbie Mao  
*ACRESP, NCAR, Boulder, Colorado USA*

Cathy Clerbaux & Maya George  
Service d'Aéronomie /CNRS, IPSL, Paris, France

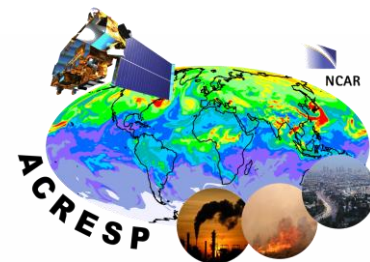
Pierre Coheur & Daniel Hurtmans  
Université Libre de Bruxelles, Belgium

# This Talk

- Tropospheric carbon monoxide
- Comparison of IASI and MOPITT
- The impact of *a priori* assumptions
- Implications for data assimilation

**Also see Maya George's Poster, *Carbon monoxide distributions from the IASI/Metop mission: Evaluation with other space-borne sensors***

# Why Measure Carbon Monoxide?



- CO is created by chemical oxidation and incomplete combustion processes including industry, transport, and biomass burning
- The main sink of CO is oxidation by OH, so high CO levels can potentially affect the oxidizing capacity of the atmosphere
- Reaction of CO with OH in the presence of  $\text{NO}_x$  leads to the formation of tropospheric  $\text{O}_3$
- CO lifetime is between a week and two months depending on location
- This is long enough to be transported without becoming evenly mixed so making it a useful tracer

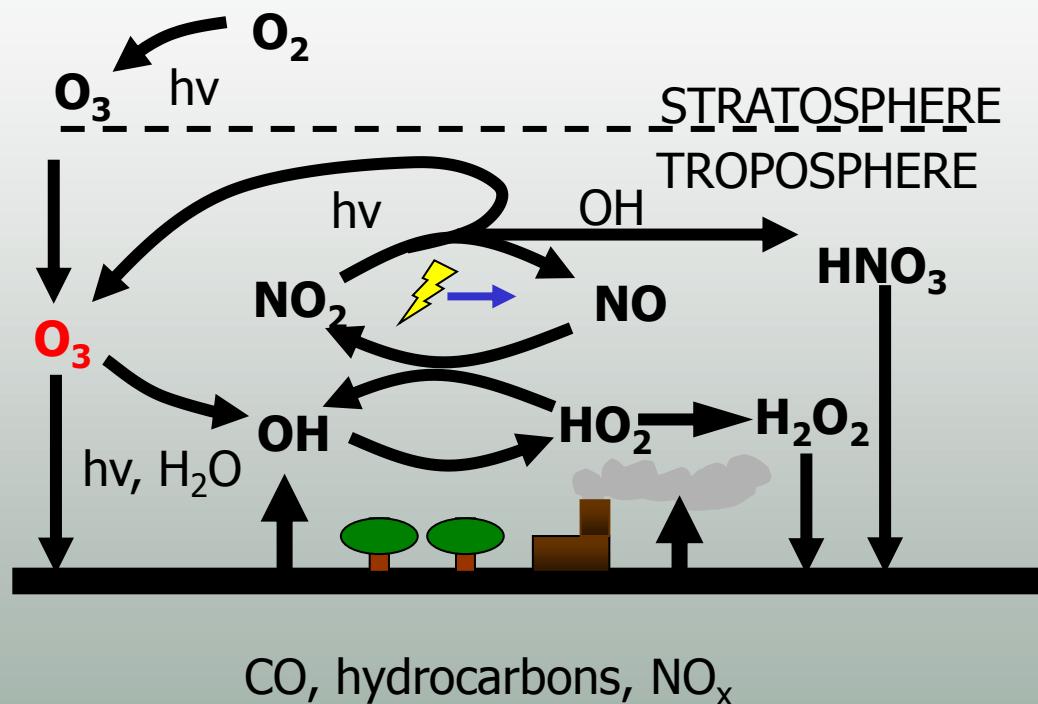
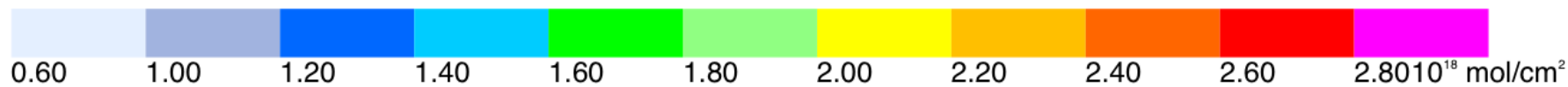
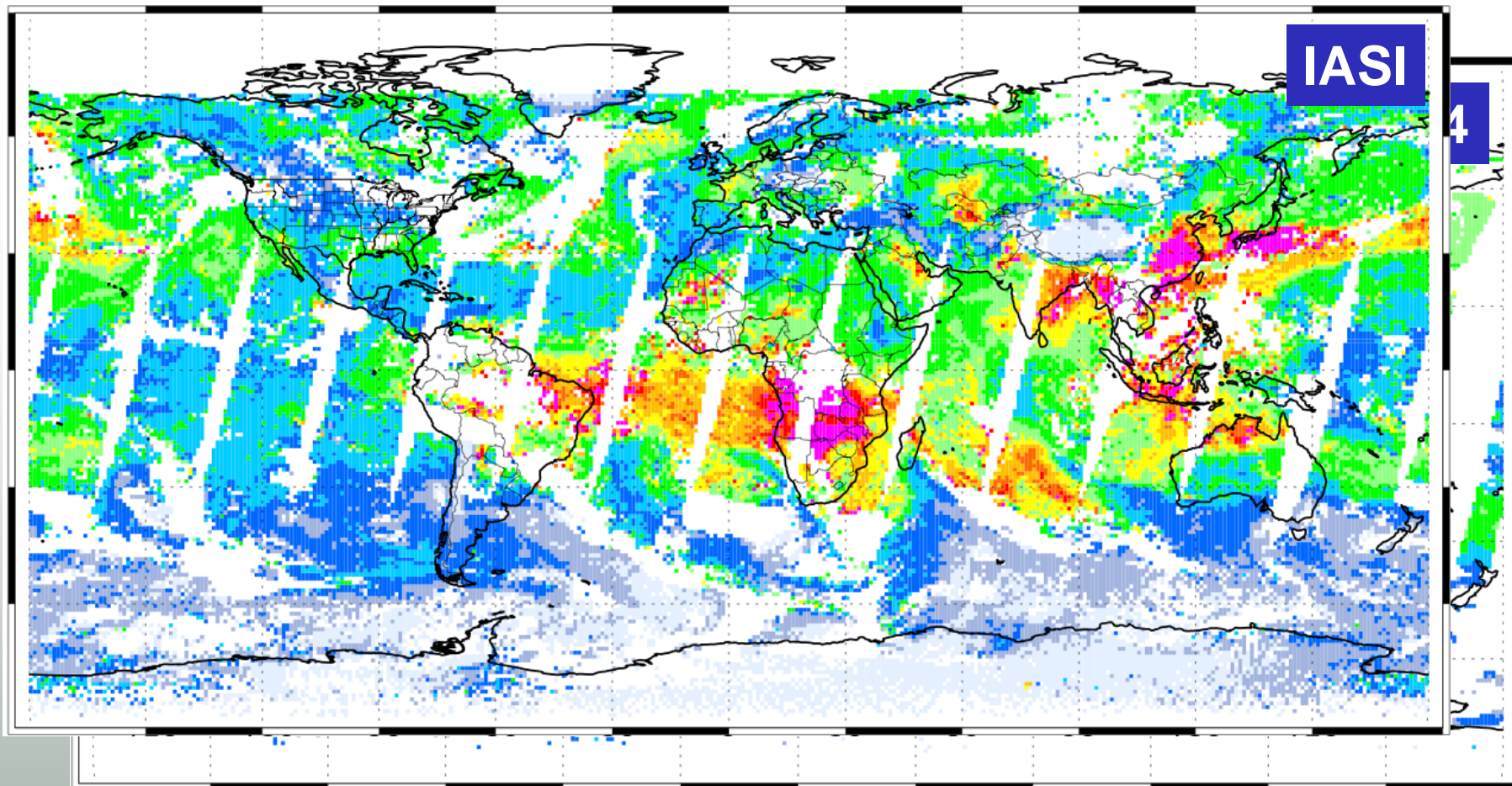
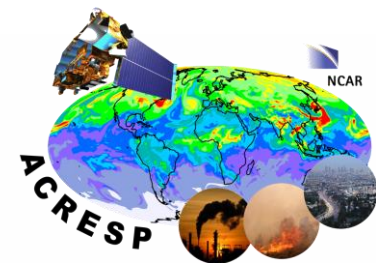


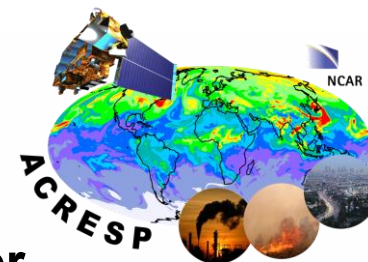
Fig: Daniel Jacob, University of Harvard



# CO total column 15 Sept. 2009



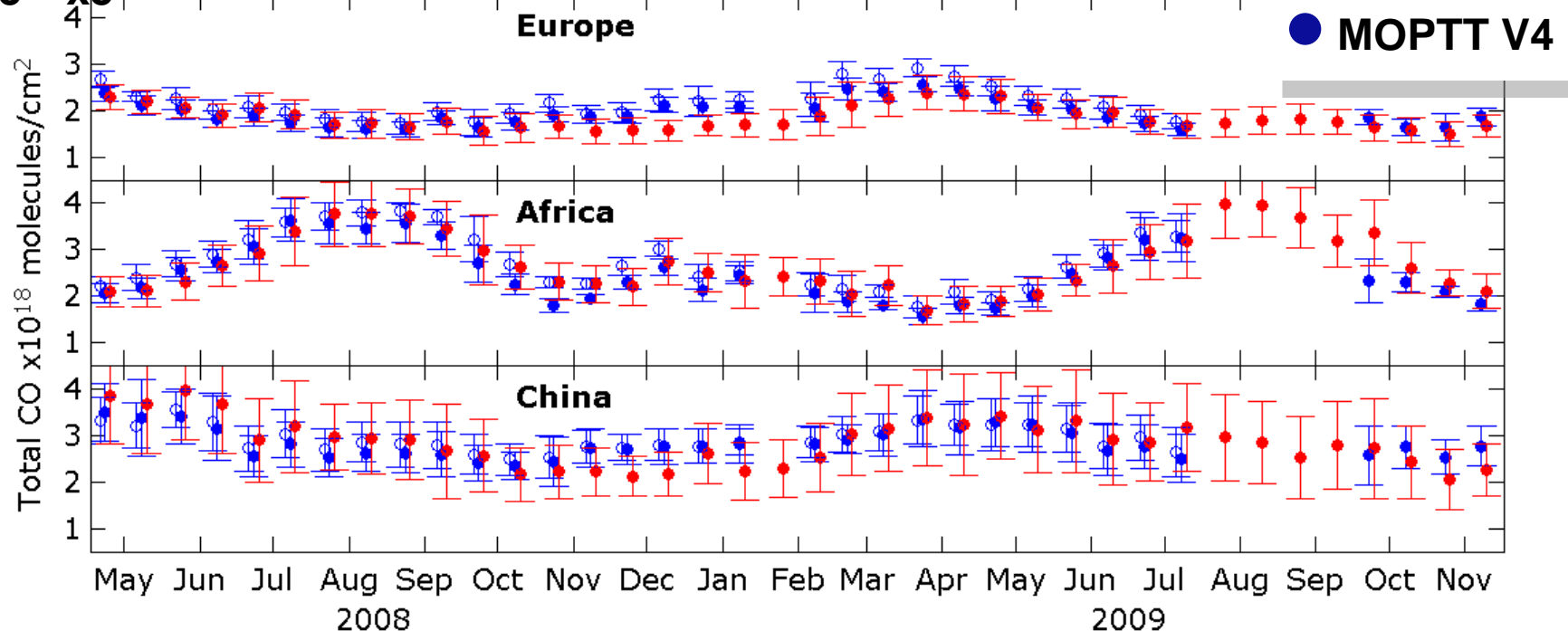
# IASI & MOPITT Trends in CO Column



- Good general agreement!
- In clean regions, MOPITT V3 columns are usually higher than V4 and IASI because of a higher assumed *a priori* profile
- The much better sampling of IASI captures more plume variability
- *A priori* assumptions account for some of the other differences

15-day average @

5° x 5°

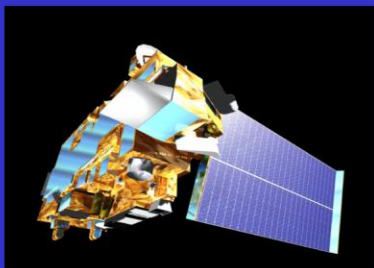


## What we want:

For required atmospheric state  $\mathbf{X}$

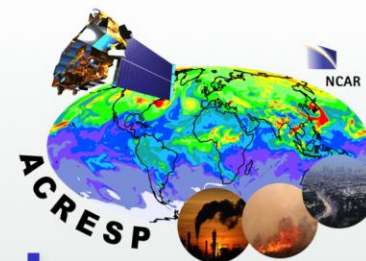
New Observations

$$\mathbf{y}, \mathbf{S}_\varepsilon$$



Auxiliary observations will probably also be needed

## The Retrieval



A cost function is minimized to obtain an “optimal estimate” of  $\mathbf{X}$  given the new observation & our prior knowledge of the atmosphere

## What we think we already know :

The Physics of the Measurement:  
Forward Model

$$\mathbf{y} = \mathbf{F}(\mathbf{x}) + \varepsilon$$

Measurement  
sensitivity

$$\mathbf{K} = \frac{\partial \mathbf{F}}{\partial \mathbf{x}}$$

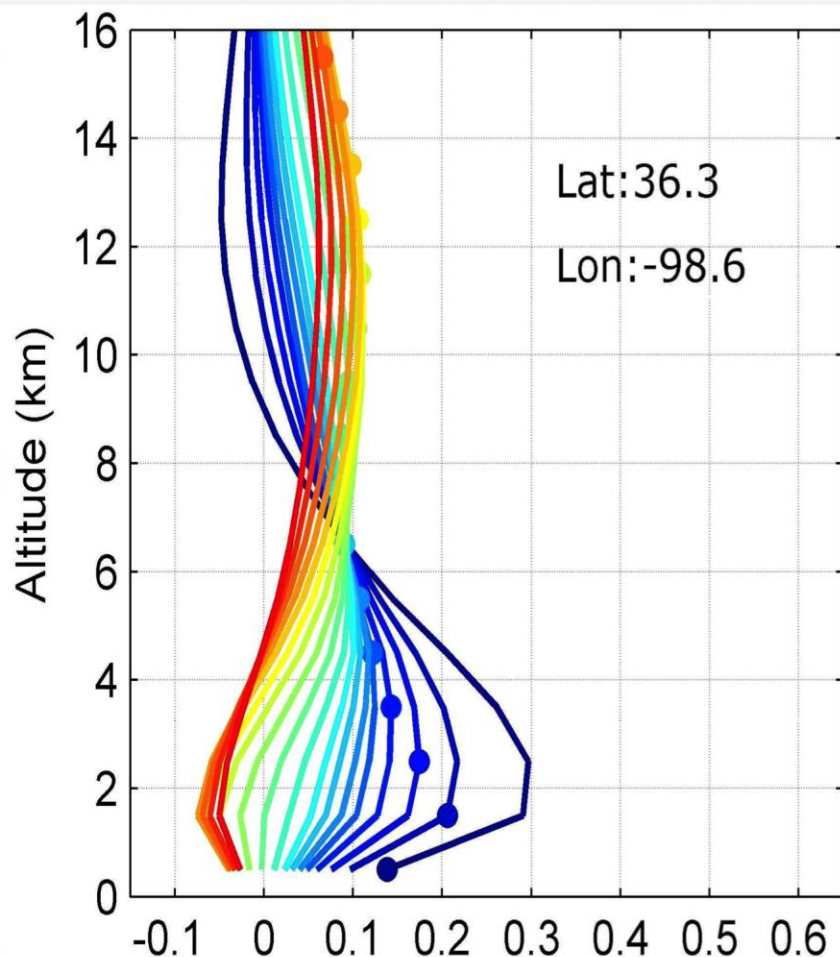
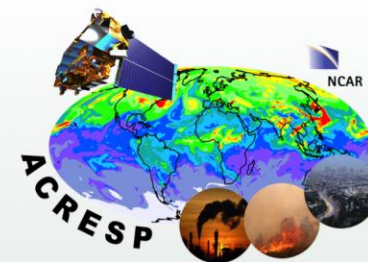
*a priori* constraint data

$$\mathbf{x}_a, \mathbf{S}_a$$

$$\hat{\mathbf{x}}, \hat{\mathbf{S}}, \mathbf{A} = \frac{\partial \hat{\mathbf{x}}}{\partial \mathbf{x}}$$



# The Averaging Kernel



After the retrieval process we need to know how much information came from the observation relative to the *a priori*

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

represents the retrieved profile sensitivity to the true profile

$$\hat{\mathbf{x}} - \mathbf{x}_a = \underbrace{\mathbf{A}(\mathbf{x} - \mathbf{x}_a)}_{\text{smooth err.}} + \underbrace{\boldsymbol{\varepsilon} \dots}_{\text{ret. err.}}$$

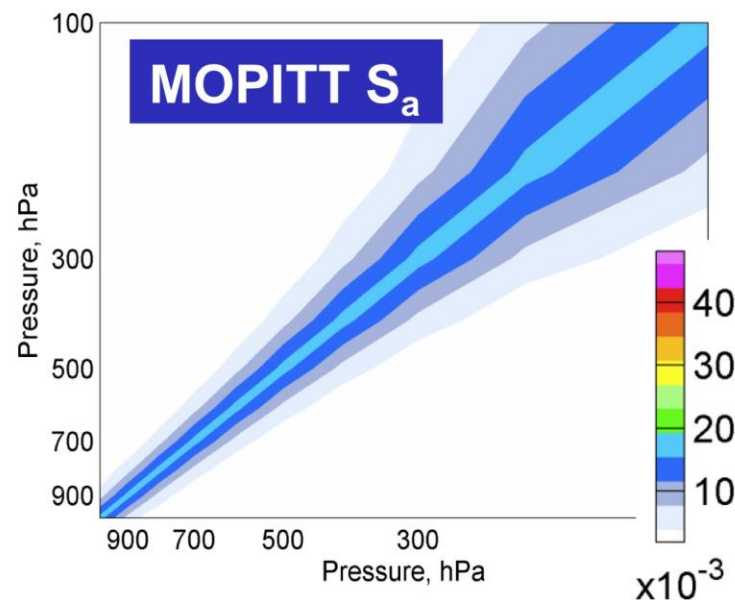
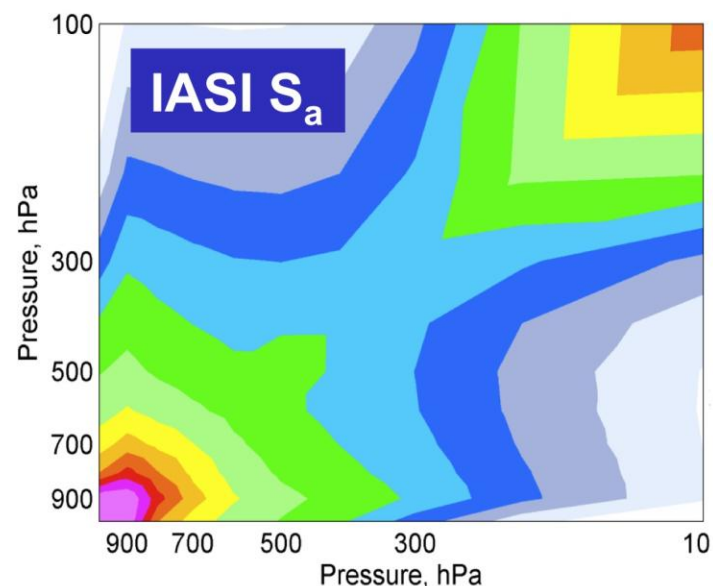
IASI averaging kernels for 19 retrieval layers, DFS = 1.99  
George et al., ACP, 2009

$\text{trace}(\mathbf{A}) =$  degrees of freedom of signal (DFS)

# A closer look at the *a priori* assumptions....

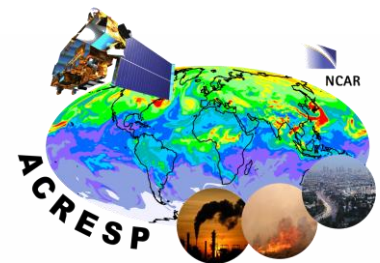
- IASI uses fixed *a priori*  $x_a$  &  $S_a$ : Based on MOZAIC aircraft, ACE-FTS satellite and LMDx-INCA model data
- Profile surface value  $\sim 100$  ppbv and  $S_a$  assumes relatively large fractional variability of 62% near the surface decreasing with altitude and a relatively long correlation length
- MOPITT uses variable *a priori*  $x_a$  and fixed  $S_a$ : Based on monthly  $1^\circ \times 1^\circ$  MOZART model data and NOAA aircraft validation for MOPITT
- $S_a$  assumes constant 30% fractional variability with altitude and a short correlation length  
 ➔ A looks more like K

$$\mathbf{A} = \frac{\partial \hat{\mathbf{x}}}{\partial \mathbf{x}} = \mathbf{I} - \hat{\mathbf{S}}\mathbf{S}_a^{-1} = (\mathbf{K}^T \mathbf{S}_\varepsilon^{-1} \mathbf{K} + \mathbf{S}_a^{-1})^{-1} \mathbf{K}^T \mathbf{S}_\varepsilon^{-1} \mathbf{K}$$



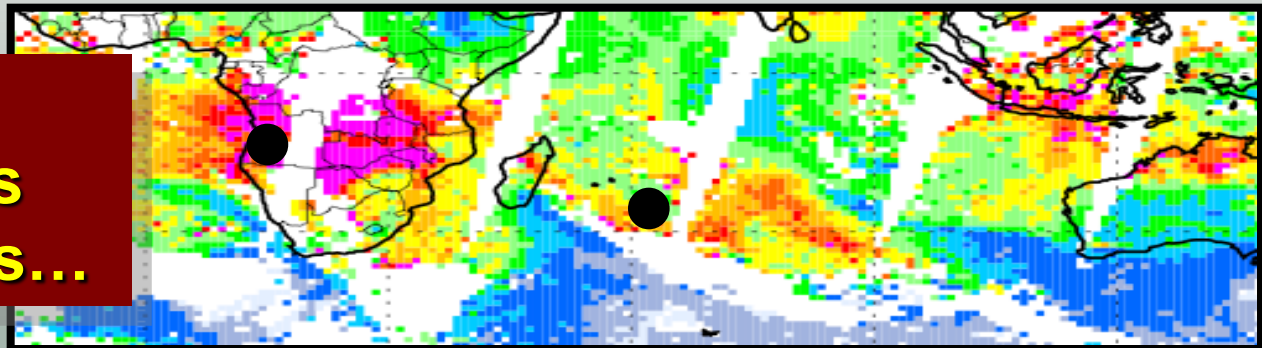


# Explaining Profile Differences

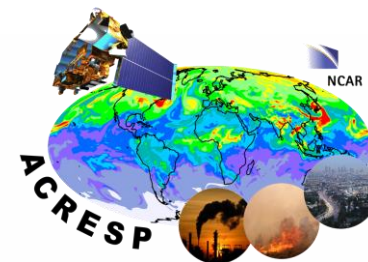


- A validation exercise comparing retrievals from two instruments must first quantify the expected difference due to:
  - 1) Retrieval assumptions: **methodology, *a priori***
  - 2) Measurement and instrument characteristics: **weighting functions, measurement errors, auxiliary observation**
- Any remaining ‘problem’ differences are due to inaccurate characterization of the above
- An ideal comparison would use the same retrieval algorithm
- Here we use a common OE methodology and *a priori* to pin down 1) and look for consistency between retrievals based on what we know about 2)

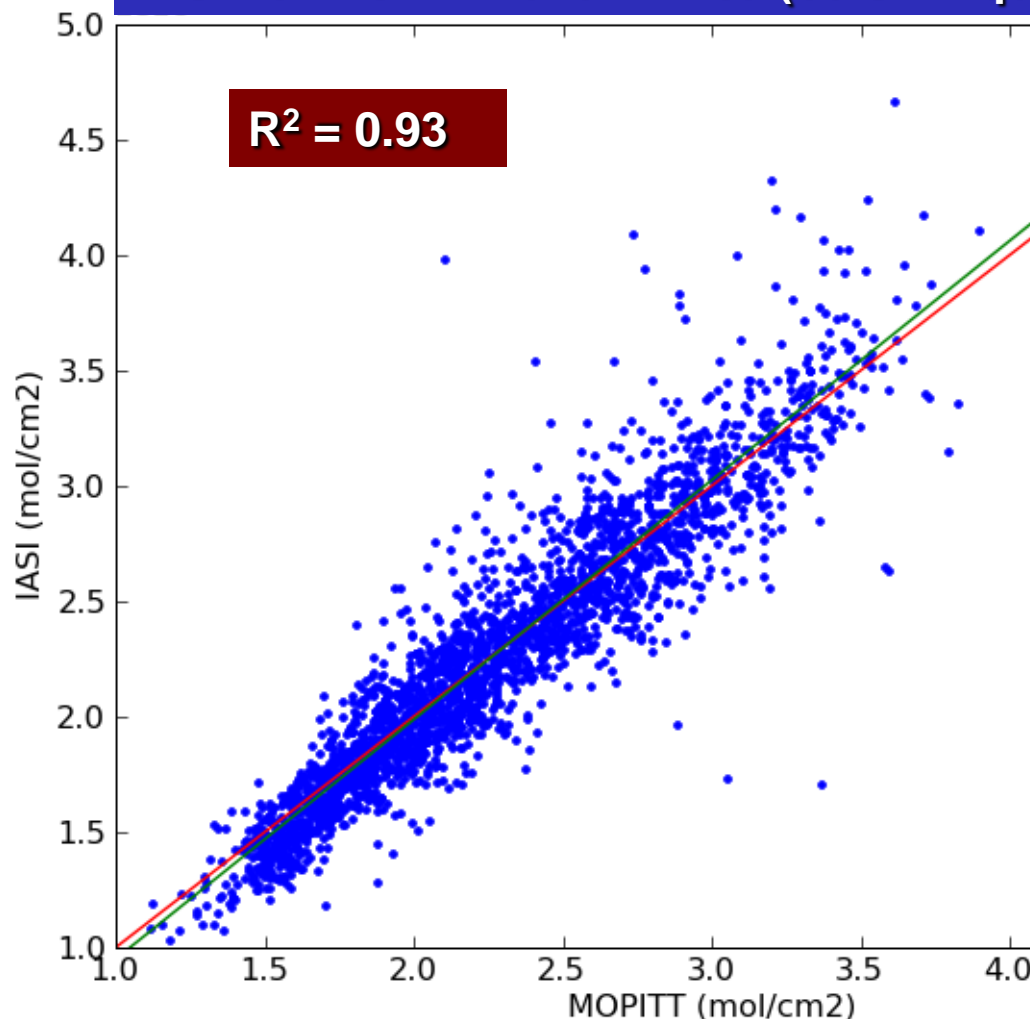
**Compare  
coincidences  
at 2 locations...**



# Comparison of Column Data, Oct. 2009

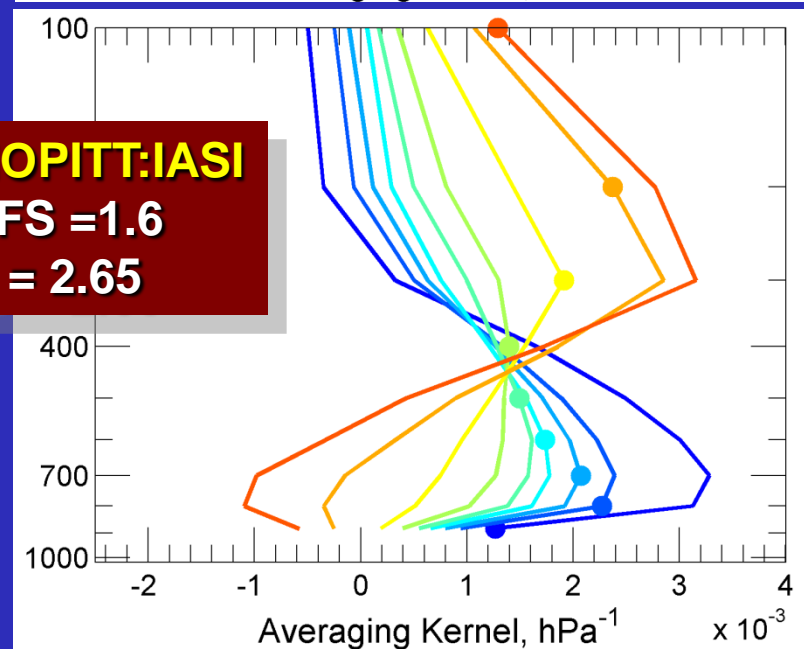
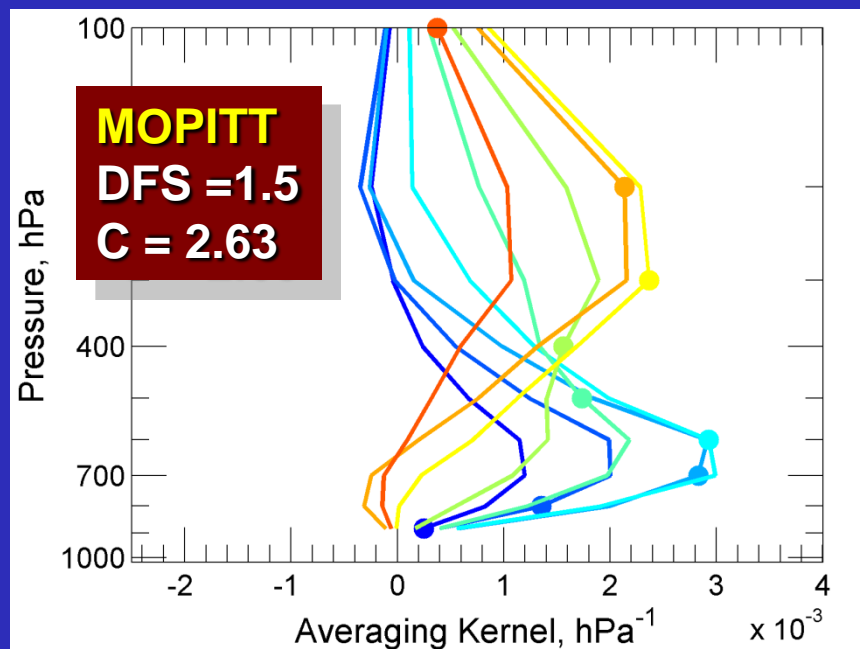
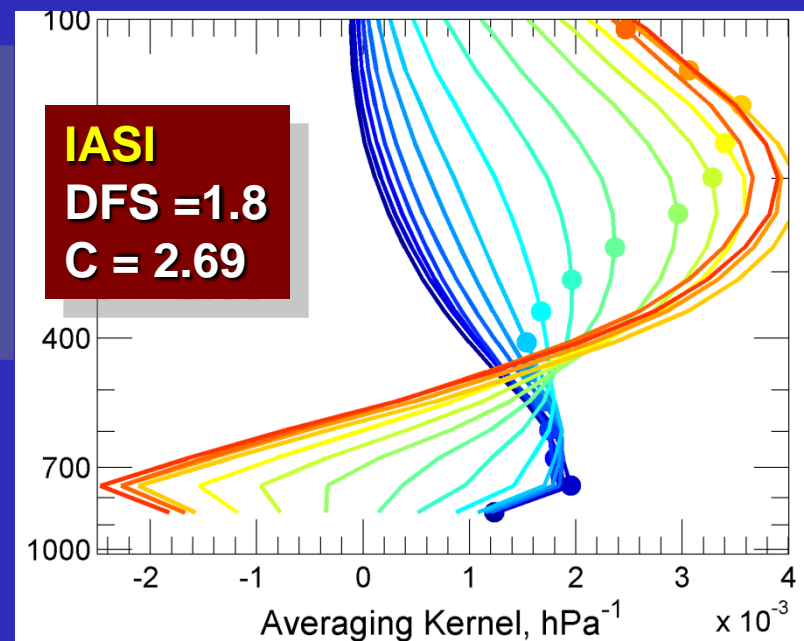
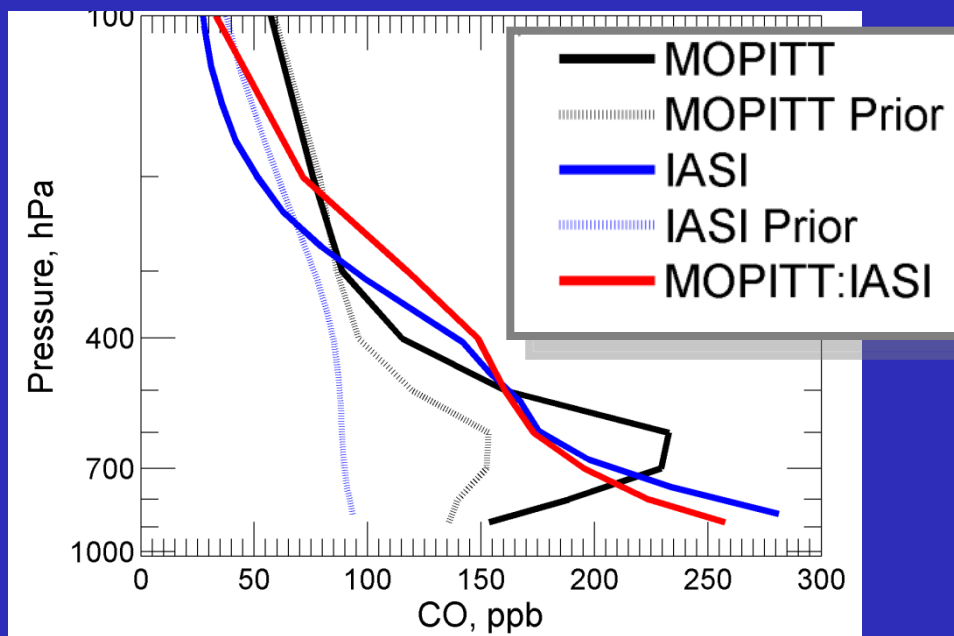


IASI vs. MOPITT over Africa (30 S – Equ, 10-40 E)



- Comparison of co-located IASI and MOPITT (V4) CO total columns is generally good
- Comparison is not much improved by processing MOPITT column data using IASI prior constraints
- Implies that *a priori* assumptions have only a small effect on total column retrievals
- **But what about the underlying profile shapes?**

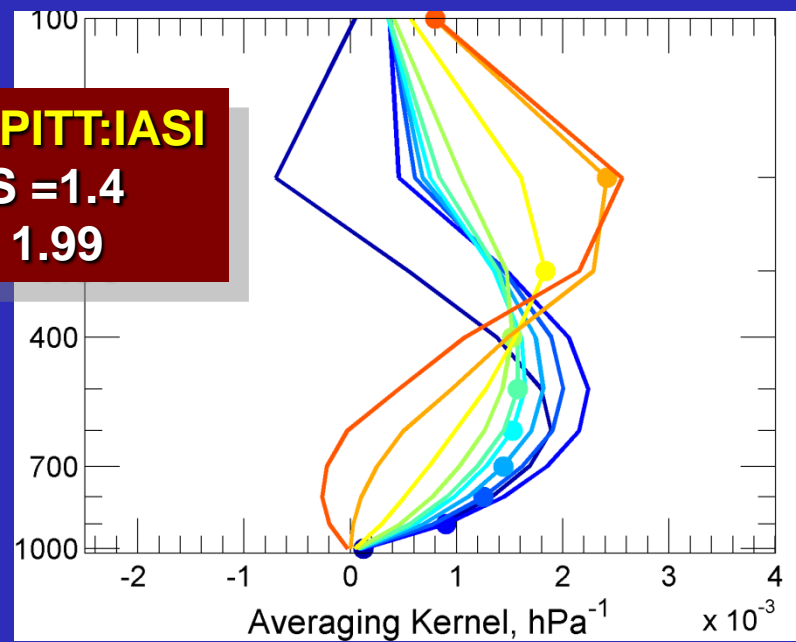
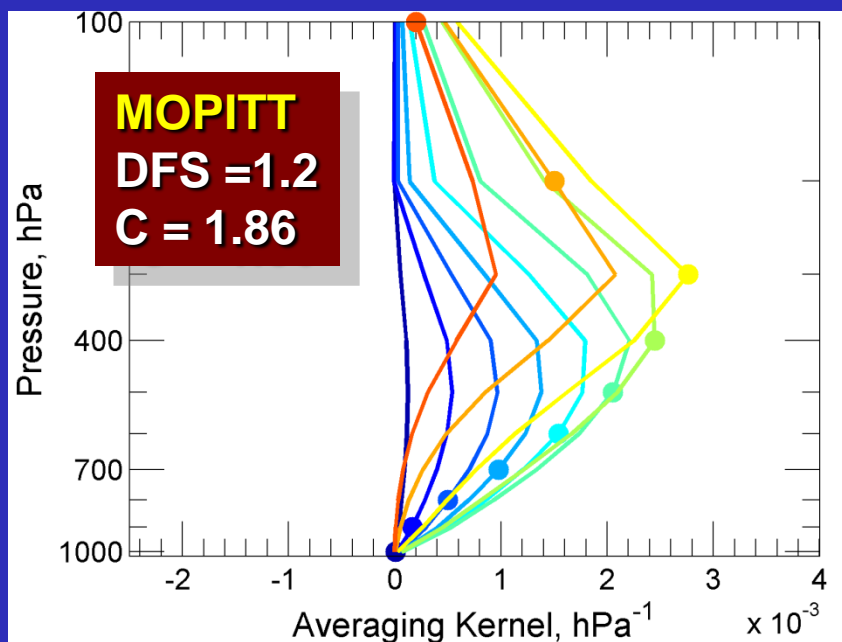
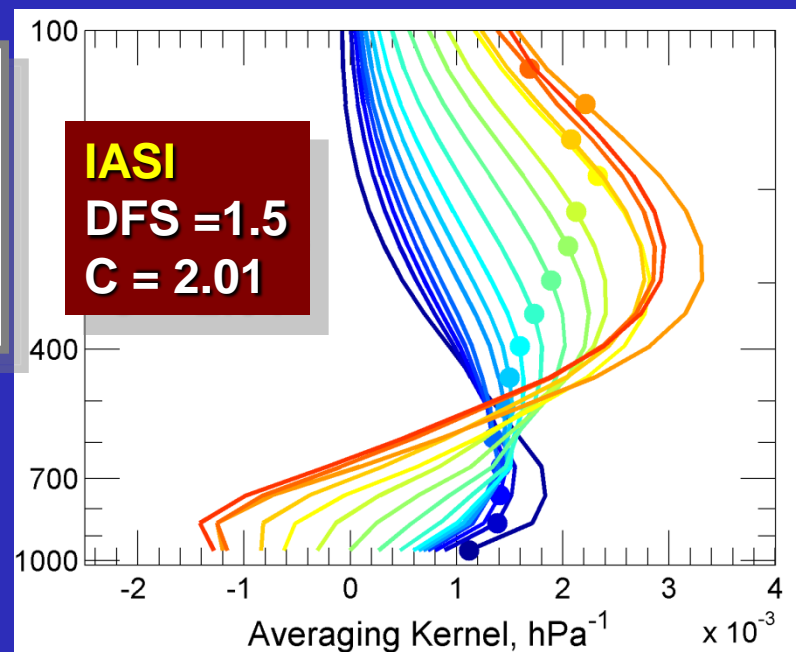
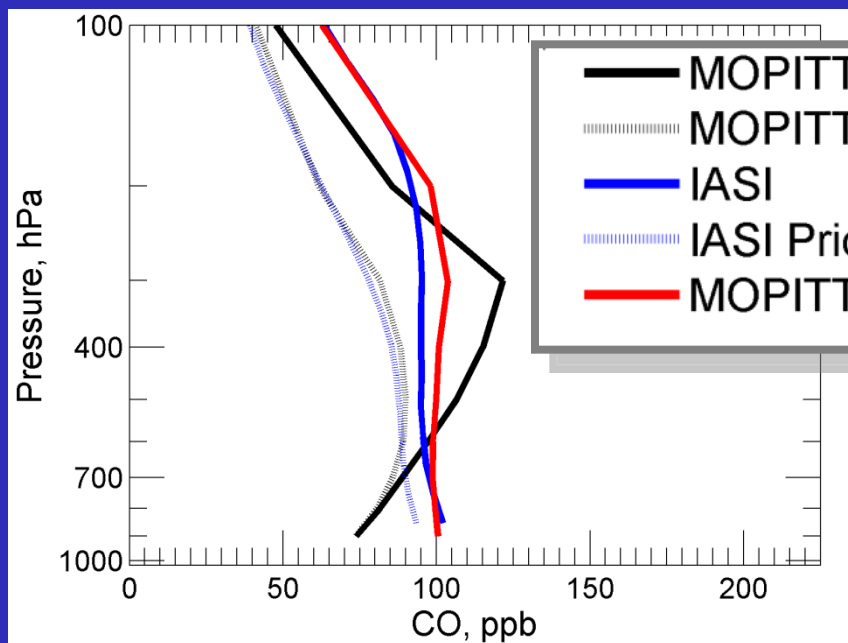
# Over Angola: 14E,14S, Oct. 15, 2009

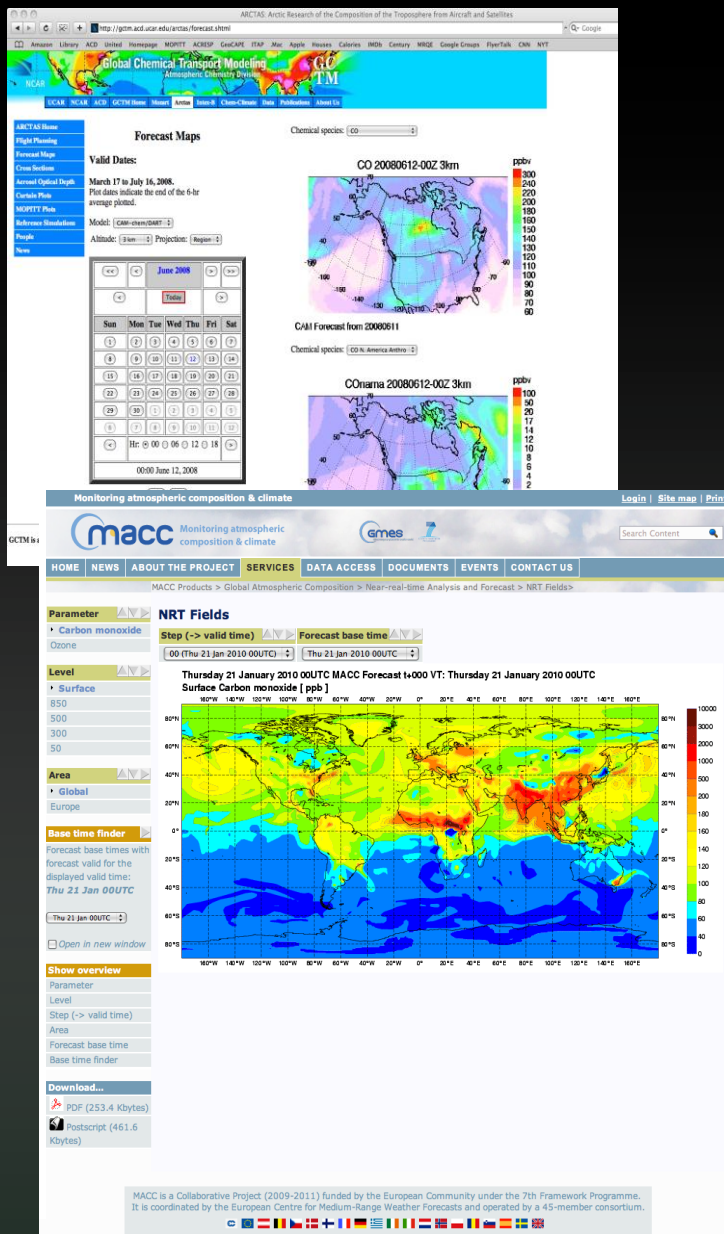


Units of C are ( $\times 10^{18}$ ) molecules/ $\text{cm}^2$

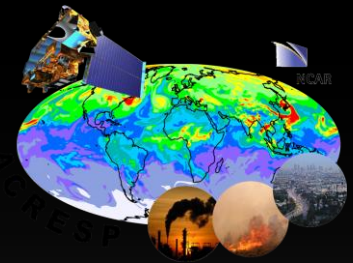


# Over Indian Ocean: 60E, 40S, Oct. 15, 2009





# Data Assimilation

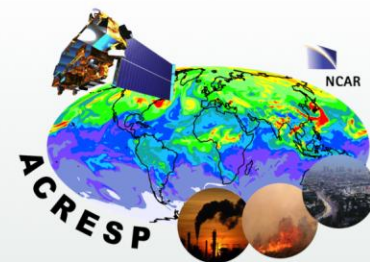


There's significant activity exploring the assimilation of satellite trace gas data in chemical transport models:

- Chemical weather forecasts
- Flight support for chemistry field campaigns
- Improving emissions estimates
- Improving model physics
- Examining correlations between different pollutant fields including those that are not measured
- Performing OSSEs to quantify the impact of future satellite measurements

**For these applications, the impact of retrieval *a priori* assumptions on the DA system must be quantified**

# Retrieved Profile Assimilation Options

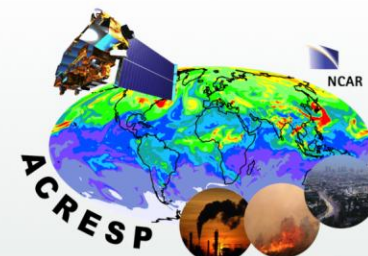


- Assimilation of  $\hat{\mathbf{x}}$  with covariance  $\hat{\mathbf{S}}$  is inappropriate because of the contribution from  $\mathbf{x}_a$
- Assimilation of  $\hat{\mathbf{x}} - \mathbf{x}_a = \mathbf{A}(\mathbf{x} - \mathbf{x}_a) + \varepsilon$  with  $\mathbf{A}$  as the observation operator eliminates the bias due to  $\mathbf{x}_a$  (but still leaves a dependence on  $\mathbf{S}_a$ )
- Retrieved profile values and their  $\mathbf{A}$  are correlated because of limited vertical information: Precludes independent sequential DA of each retrieval level
- With  $\text{DFS} < 2$ , there usually exists a null-space in  $\mathbf{A}$  and redundant information that may lead to numerical errors
- Application of SVD to  $\mathbf{A}$  (Joiner & daSilva, 1998) has the advantages of:

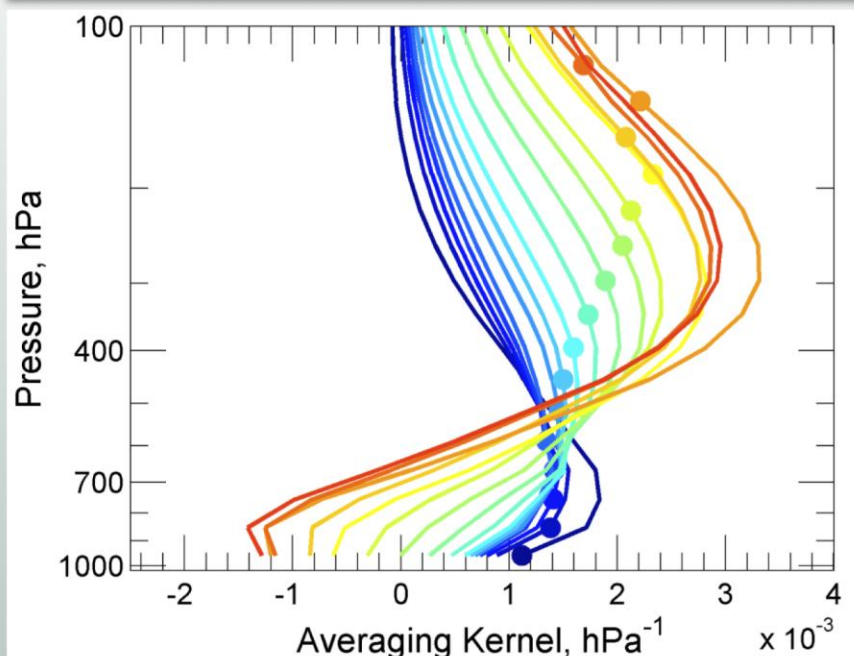
- Reducing the number of 'measurements' to  $\approx \text{DFS}$  which eliminates the correlated errors inherent in assimilation of profile points
- Improving efficiency for processing the large amount of IASI profile data



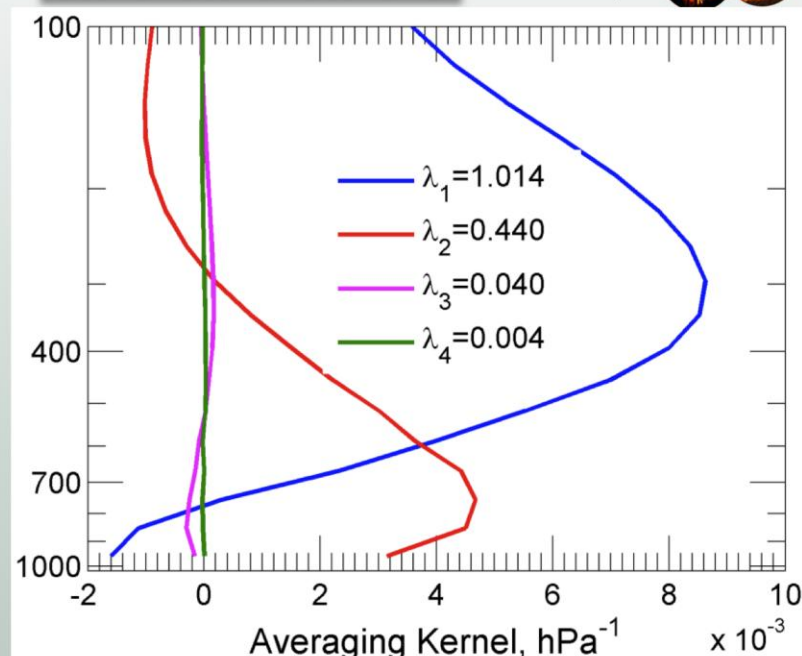
# Example IASI Rotated Averaging Kernel



**IASI AK over Indian Ocean: DFS =1.5**



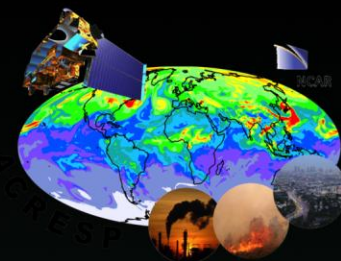
**Rotated AK**



**SVD of retrievals prior to data assimilation:**

- Transform the retrieval equation for  $\hat{\mathbf{x}}$  so that the error covariance is a unit matrix
- Rotate the scaled AK matrix using its associated singular vectors
- Truncate the resulting rotated AK matrix at eigenvalues  $\ll 1$
- The retrieved profile has been transformed into uncorrelated scalar observations while maintaining the information content

# Summary



- Agreement of IASI and MOPITT CO retrievals is good and consistent
- Impact of *a priori* assumptions on retrieved total column is small
- Impact on retrieved profile shape is significant
- Performing an SVD of retrievals prior to assimilation has advantages for efficiency

## Next Steps

- Instead of assimilating retrievals, use the intermediate linearized radiances:

$$\mathbf{y} - \mathbf{F}(\mathbf{x}_0) = \mathbf{K}(\mathbf{x} - \mathbf{x}_0) + \boldsymbol{\varepsilon}, \quad \mathbf{S}_{\boldsymbol{\varepsilon}}$$

- Eliminates explicit impact of retrieval *a priori*
- User does not have to understand the full forward model or instrument
- Application of SVD is again an option to concentrate on significant measurement information
- Based on this approach we may provide new products for DA application



**Thank You!**

