

# **UWPHYSRET an SSEC inversion package for high resolution infrared data based on LBLRTM.**

---

Paolo Antonelli, R. Knuteson, R. Garcia, S. Bedka, D. Tobin, J. Taylor,

W. Smith, and H. Revercomb

4<sup>th</sup> Advanced High Spectral Resolution Infrared Observations  
EUMETSAT - Darmstadt, Germany  
15-17 September, 2008

[paolo.antonelli@ssec.wisc.edu](mailto:paolo.antonelli@ssec.wisc.edu)



# Outline

---

- UWPHYSRET general considerations
- Applications to S-HIS data for JAIVEX
  - Examples of Retrieval Validation
  - Impact of PCA noise filter
- Conclusion
- Future development

# UWPHYSRET

---

- Attempt to build a *reference* physical retrieval package;
- Based on Clive Rodger's methodology (Bayesian approach);
- Simultaneous retrieval of Temperature, Water Vapor, Ozone, Surface Temperature, Surface Emissivity;
- Uses LBLRTM 11.3;
- Analytical Jacobians can be updated at every iteration;
- Slow, flexible, accurate;
- Implemented in matlab

# Solution

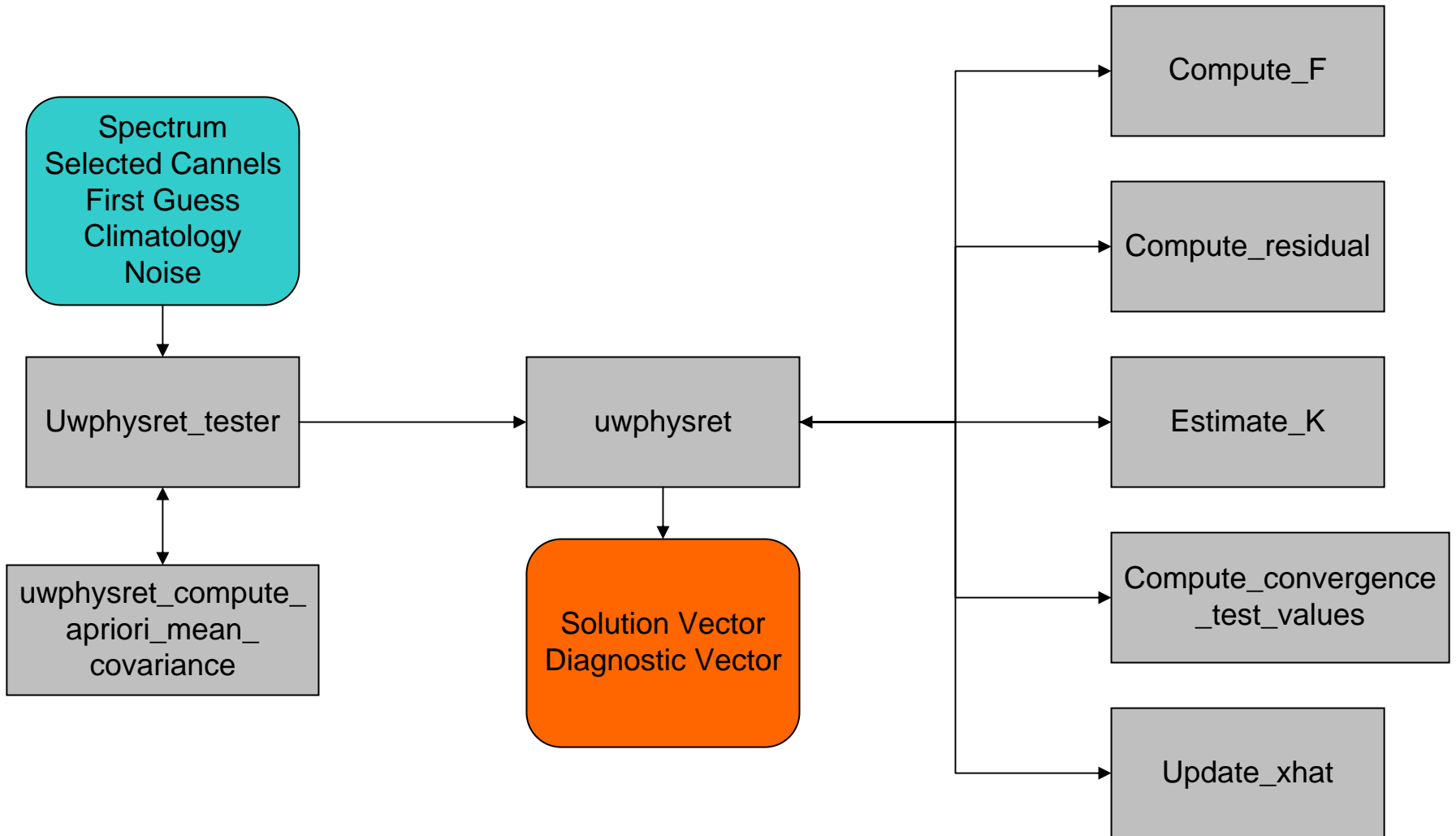
---

- Iterative solution (Gauss-Newton):

$$x_{n+1} = x_a + (K_n^T \bullet S_e^{-1} \bullet K_n + S_a^{-1})^{-1} \bullet K_n^T \bullet S_e^{-1} \bullet ([Y - F(x_n)] + K_n \bullet (x_n - x_a))$$

- $x$  is the state vector ( $a$  stands for a-priori,  $n$  is the iteration number);
- $K$  is the Jacobian Matrix;
- $S_a$  is the covariance matrix of the a-priori knowledge;
- $S_e$  is the covariance matrix of the Instrument noise;
- $Y$  is the observation vector (radiances);
- $F(x)$  is the calculated observation vector (radiances);

# UWPHYSRET



# Uwphysret\_tester: INPUT

---

## Input Data

- Observed Spectrum from matlab file
- Climatological Data Set: T,WV, Ozone, SKT (predefined)
  - First Guess (optional)
  - Climatology Covariance Matrix
- Surface Emissivity Data Set (predefined)
- Instrument Noise
  - Noise Covariance Matrix

## Configuration Parameters

- Apodizaion (variable)
- Number of Levels
  - Top Of the Atmosphere (variable)
  - Surface Elevation (variable)
- Variables to be retrieved (variable)
- Jacobian Update Frequency (variable)
- Convergence parameters (variable)
- External First Guess (variable)

# UWPHYSRET: FW Model

---

- **Compute\_F** and **Estimate\_K** based on LBLRTM 11.3:
  - Highly accurate;
  - Slower than fast models;
  - Very flexible;
  - Highly configurable;
  - Easily Adaptable to different Instruments;
  - Provides Jacobians for 26 molecular species;
- Future implementations of UWPHYSRET will allow for easy substitution of FW through better definition of computational modules;

# Uwphysret\_tester: OUTPUT

---

## solution

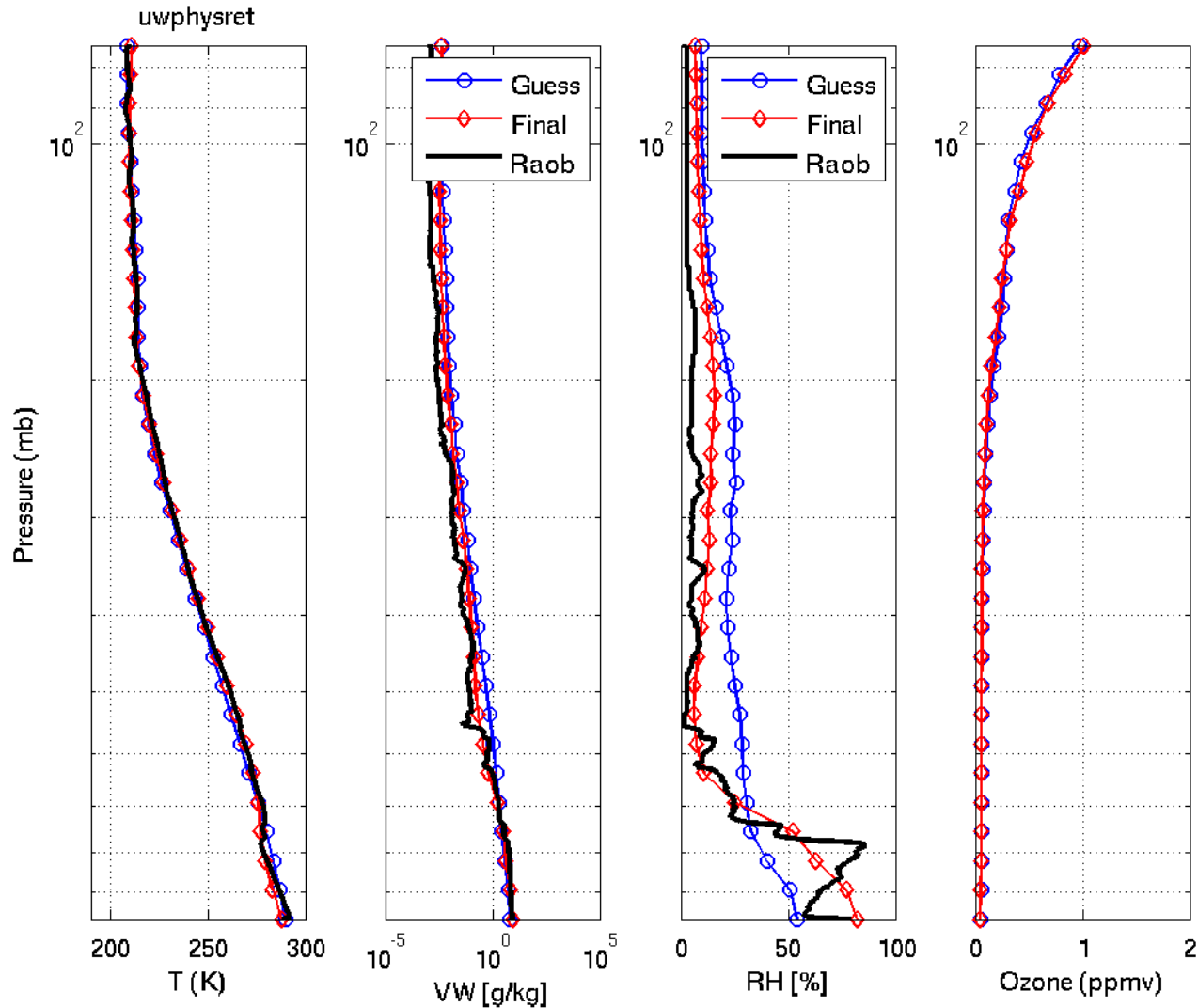
- $\hat{x}$ ,  $x_{\text{dim}}$ ,  $p$ ,  $x_0$ ,  $x_a$ ;
- $F$ ,  $wn_F$ ;
- $y_{\text{obs\_minus\_yhat}}$ ,  $wny_{\text{obs\_minus\_yhat}}$ ;
- $\chi^2_{\text{optimal}}$ ,  $x_{\text{hat\_update}}$ ,  
 $\text{norm\_measurement\_space\_only}$ ,  
 $\text{norm\_solution\_space\_only}$ ;
- $\text{numIterations}$ ;  $\text{maxIterations}$ ;
- $\text{Error\_smoothing}$ ,  $\text{error\_measurements}$ ,  
 $\text{error\_total}$ ;  $\text{averaging\_kernel}$ ;
- $S_a$ ;

## diagnostic

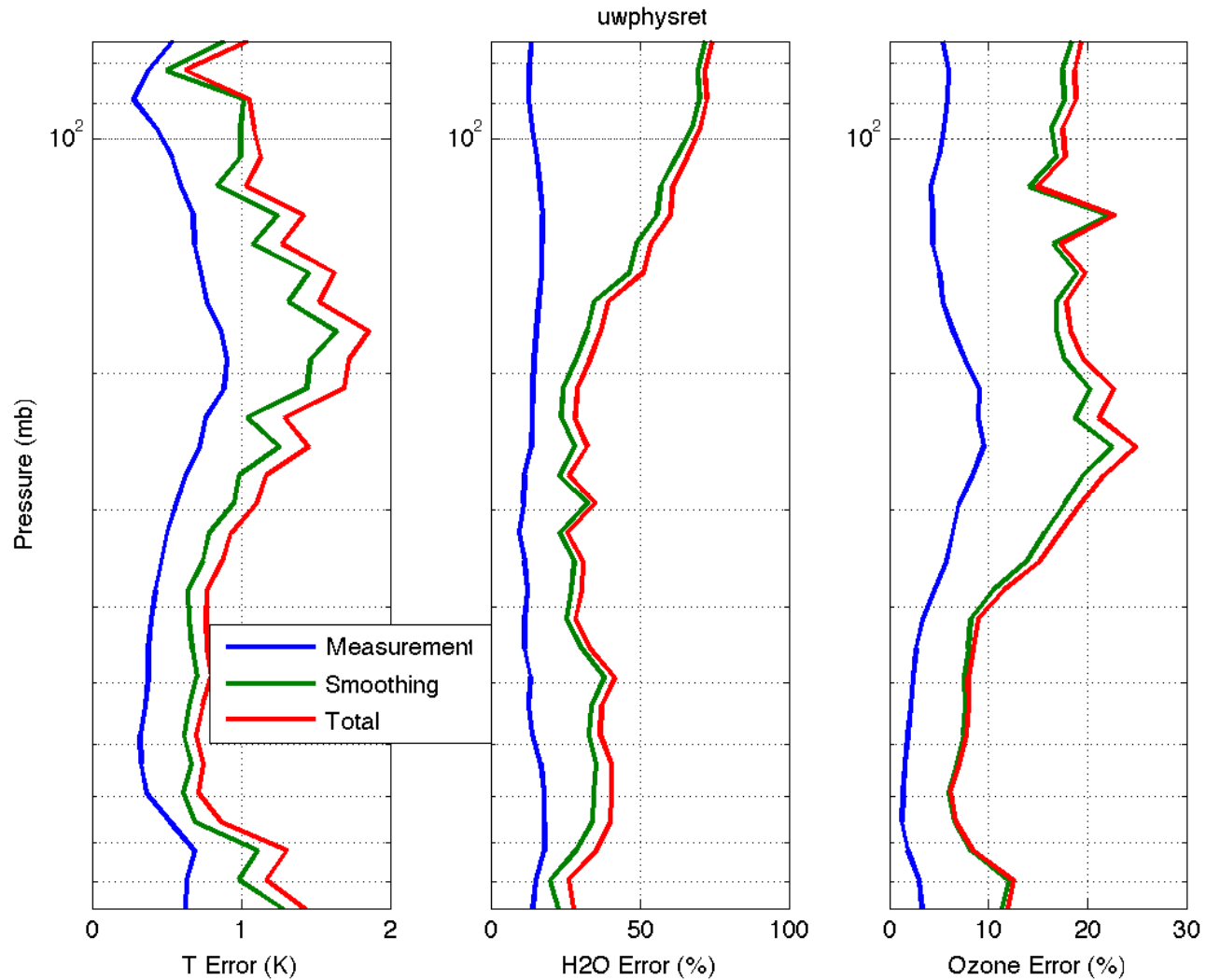
- $\hat{x}$ ,  $x_{\text{dim}}$ ,  $p$ ,  $x_0$ ,  $x_a$
- $R$ ,  $wn_R$ ;
- $F$ ,  $wn_F$ ,  $K$ ;
- $y_{\text{obs\_minus\_yhat}}$ ,  $wny_{\text{obs\_minus\_yhat}}$ ;
- $\chi^2_{\text{optimal}}$ ,  $x_{\text{hat\_update}}$ ;  
 $\text{norm\_measurement\_space\_only}$ ,  
 $\text{norm\_solution\_space\_only}$  ,
- $S_{\text{elwn}}$ ,  $\text{control}$ ;
- $S_a$ ,  $S_a^{-1}$ ,  $\text{diag}(S_e)$ ,  $S_{\text{hat}}$ ,  
 $\text{contribution\_function}$ ;
- $\text{numIterations}$ ,  $\text{maxIterations}$



# Solution: Retrieved Vertical Profiles

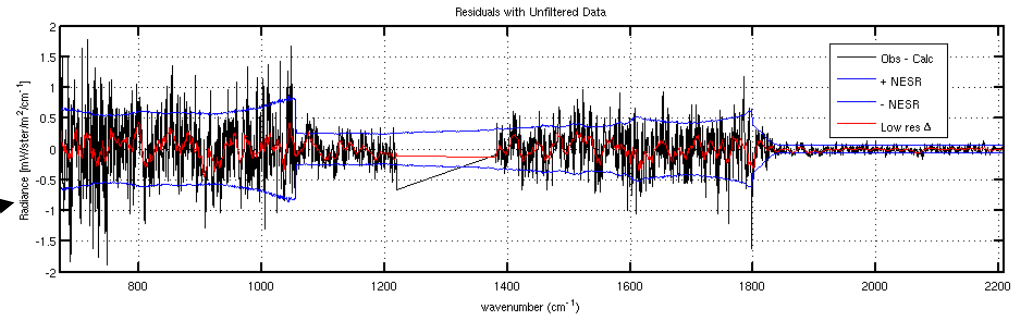


# Solution: Retrieval Errors

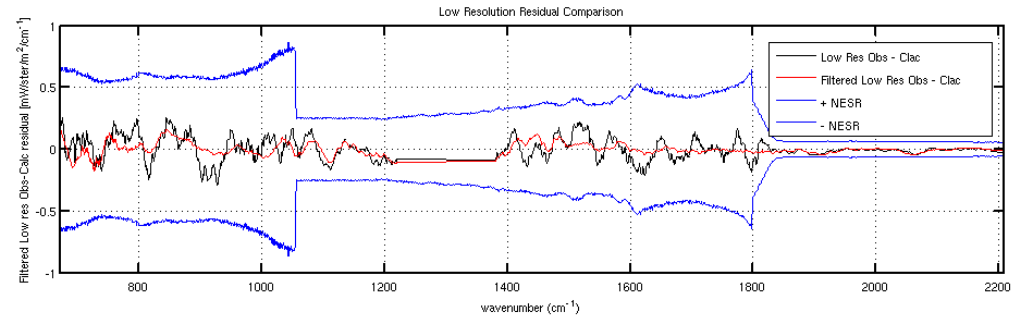
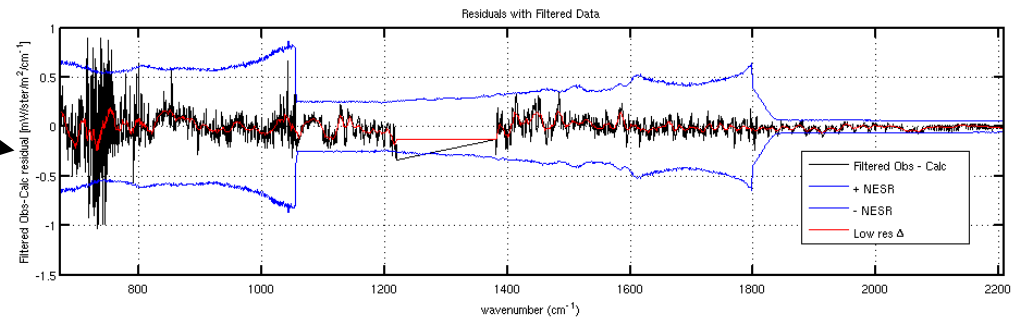


# Diagnostic: Residuals in radiance Units

Unfiltered Obs - Calc

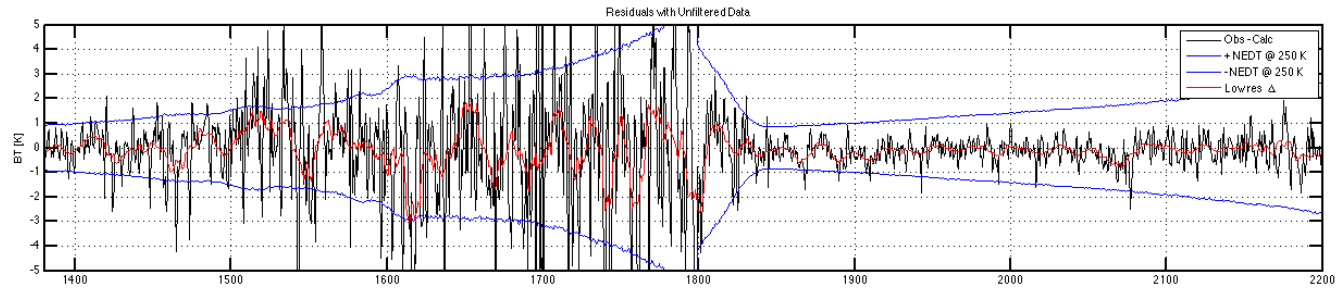


Filtered Obs - Calc

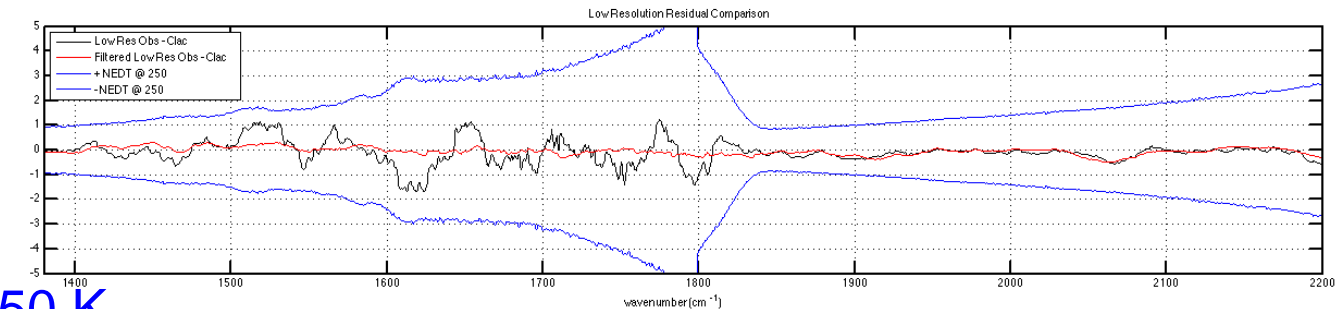
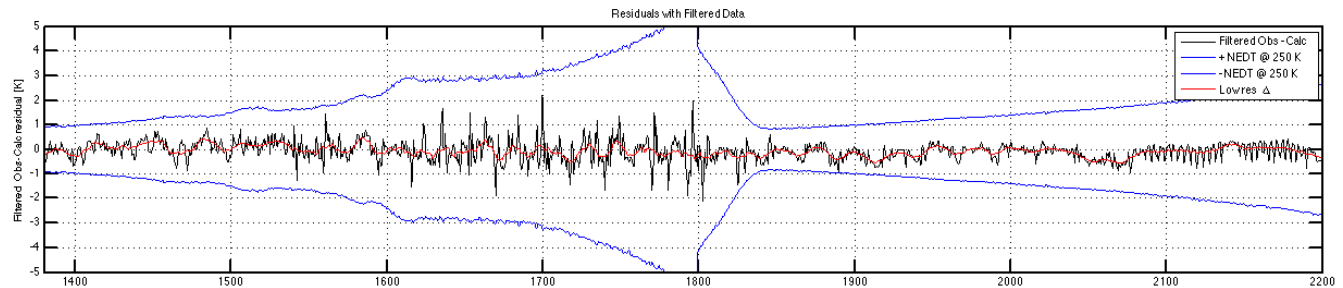


# Diagnostic: Residuals in BT

Unfiltered  
Obs - Calc

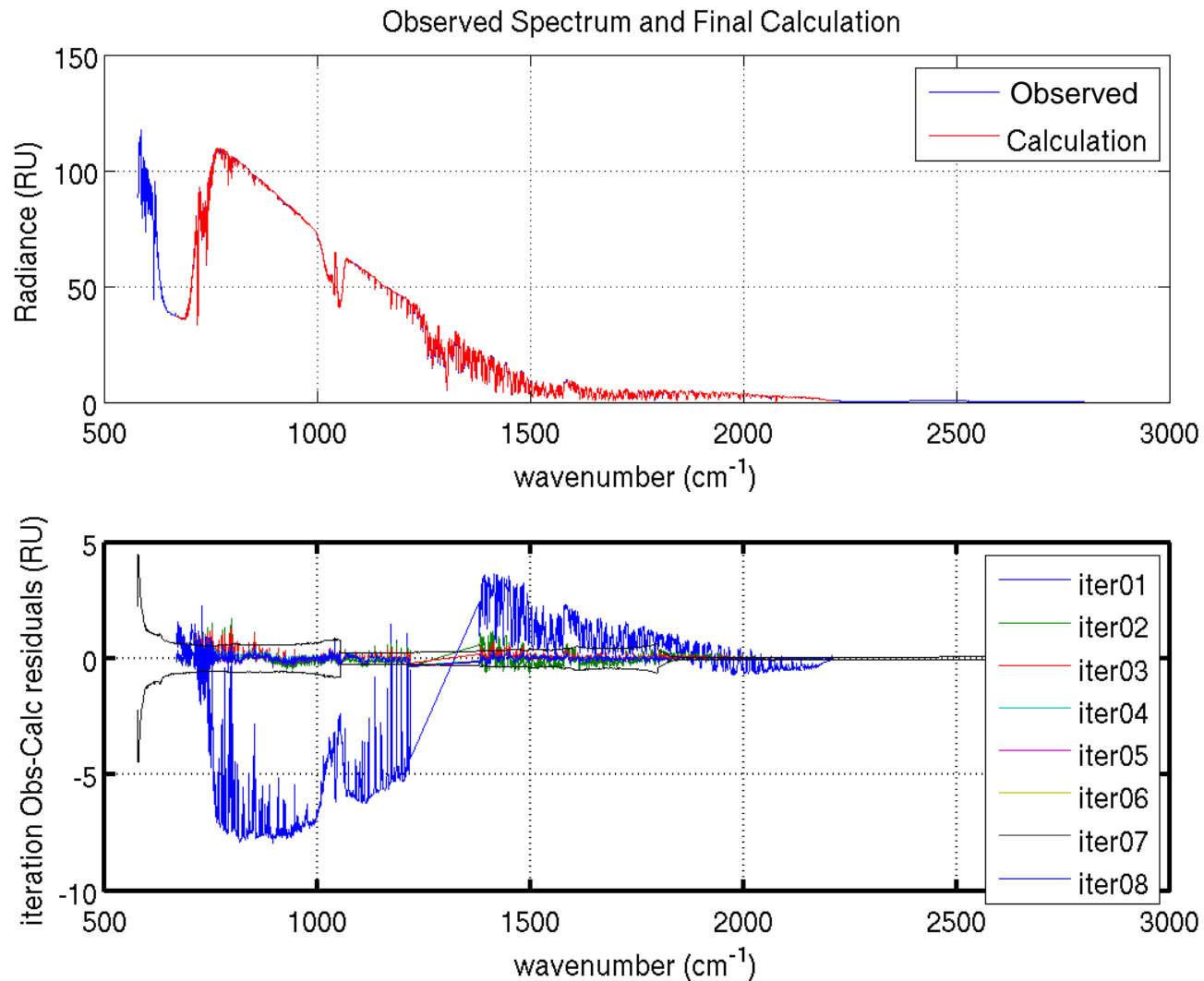


Filtered  
Obs - Calc



NEDT @ 250 K

# Diagnostic: Retrieval Conversion Iteration by Iteration



# UWPHYSRET: Installation Requirements

---

- Availability of LBLRTM (10.4 and newer)
- MATLAB
- Tested on Linux and MAC OS X (Intel and Power PC)
- Software is freely distributed
  - to obtain it, please, contact R. Knuteson ([bobk@ssec.wisc.edu](mailto:bobk@ssec.wisc.edu))

# UWPHYSRET: Issues

---

- Technical:
  - Slow if  $K$  is updated every iteration;
  - Slower for satellite data than for aircraft data;
  - Number of levels is the same for all the atmospheric variables retrieved;
- Theoretical:
  - Based on Bayesian approach, it assumes Gaussian distribution;
- General:
  - Proprietary software dependent;

# UWPHYSRET: current applications

---

- Using JAIVEx data:
  - Estimation of PCA noise filtering impact on retrieved profiles;
  - Investigation of the role of Noise Covariance Matrix on retrieval accuracy;
  - Investigation of the role of Climatology Covariance Matrix on retrieval accuracy;
- Surface Emissivity Retrieval;
- Estimation of Total Precipitable Water from retrieved profiles;
- Estimation of Stability Indices from retrieved profiles;

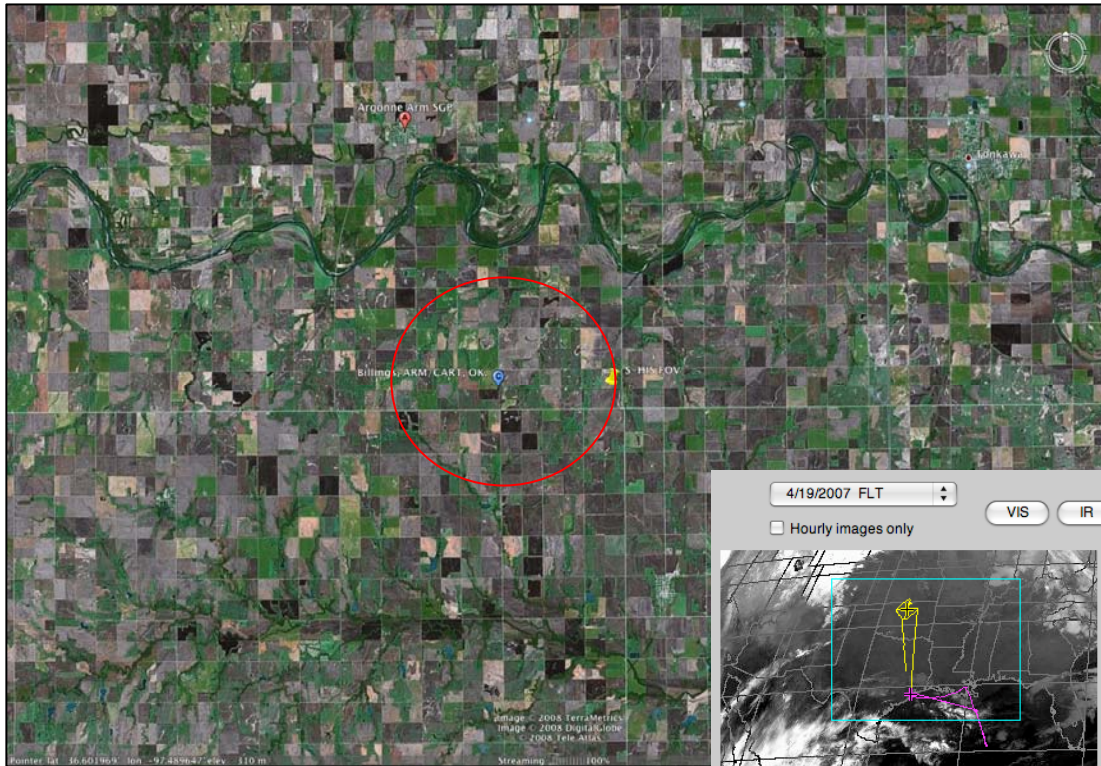


# Results on JAIVEx data

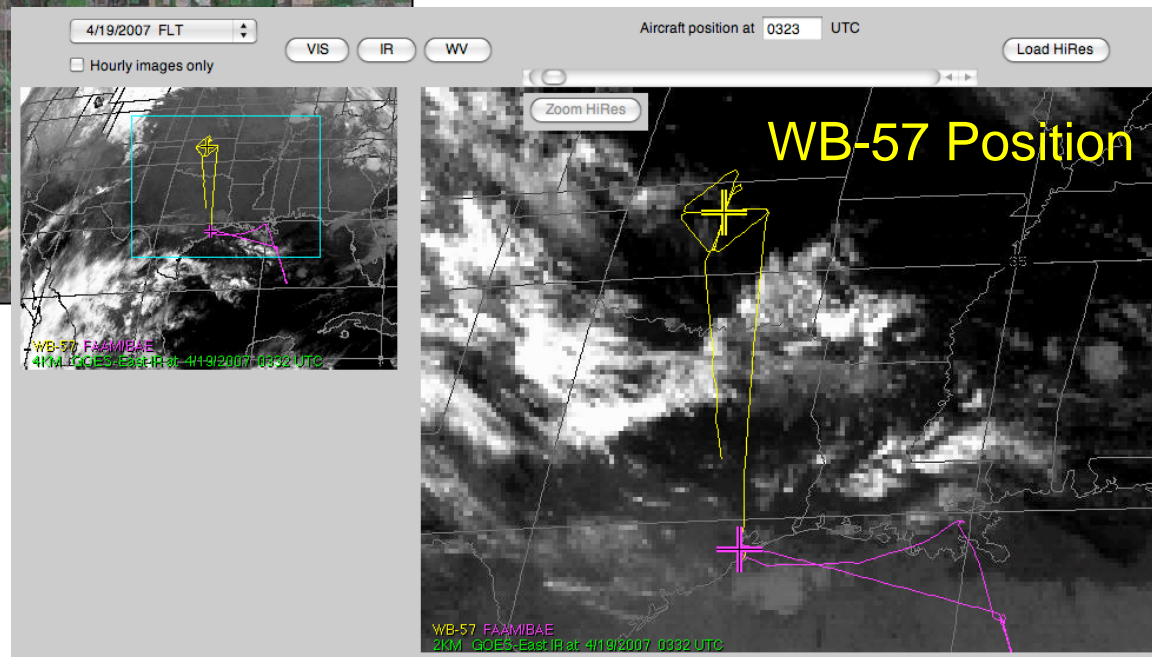
---

- **JAIVEx stands for Joint Airborne IASI Validation Experiment**
- is an international cal/val campaign in support of the [NPOESS](#) and [MetOp](#) series of operational satellites.
- Focus is on the validation of radiance observations and meteorological products from the Infrared Atmospheric Sounding Interferometer, [IASI](#).
- IASI measures radiation emission from the surface and atmosphere in the 645 - 2760 cm<sup>-1</sup> (i.e., 3.6-15.5 μm) spectral band with high spectral resolution (i.e., 8461 spectral channels with a spacing of 0.25 cm<sup>-1</sup>).
- The aircraft being employed are the NASA [WB-57](#) and the [FAAM BAe 146](#).

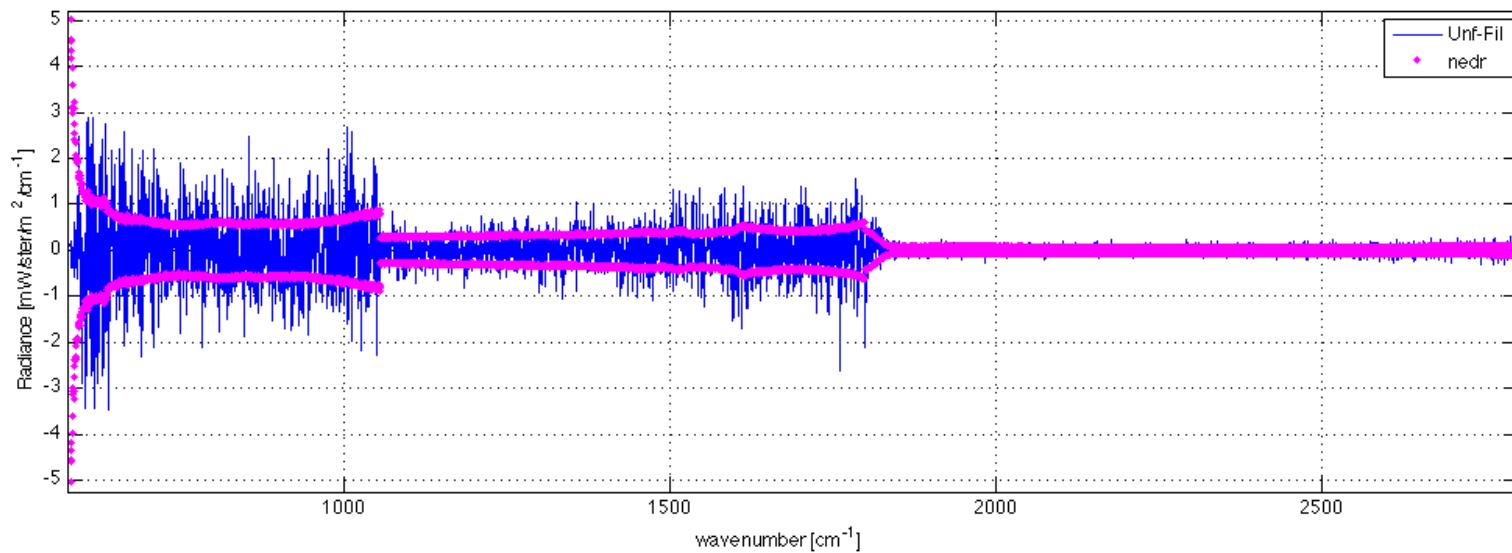
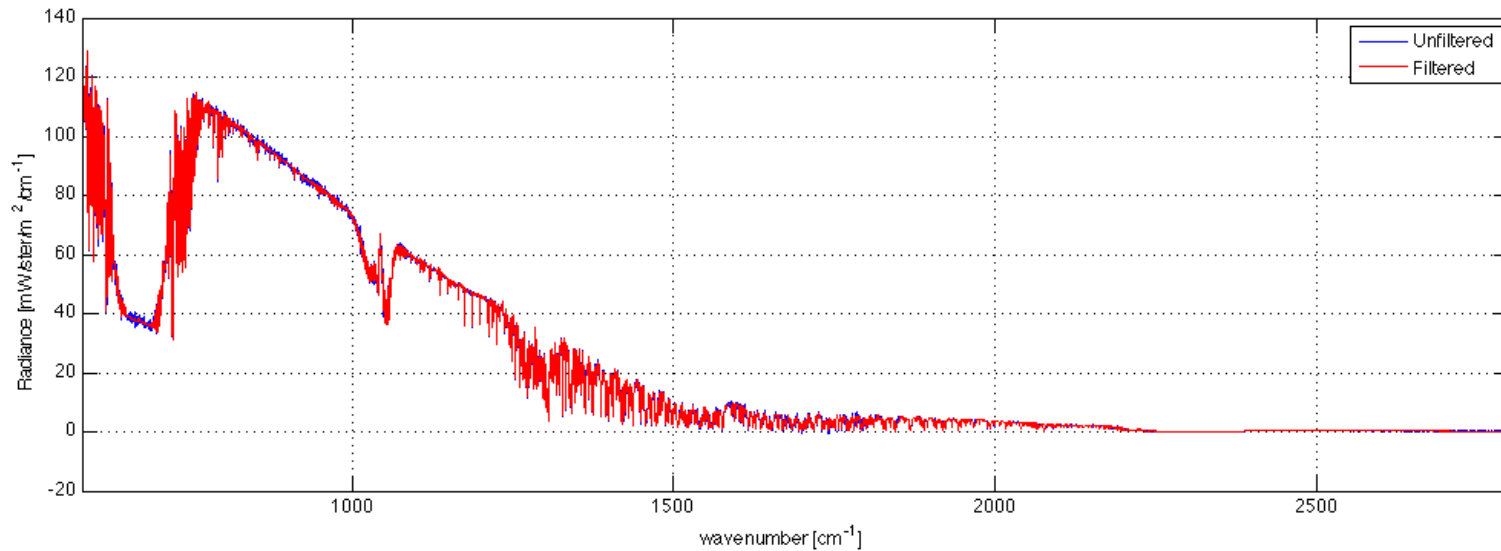
# SGP ARM Cart Site: 19 Apr 2007 15:32 UTC



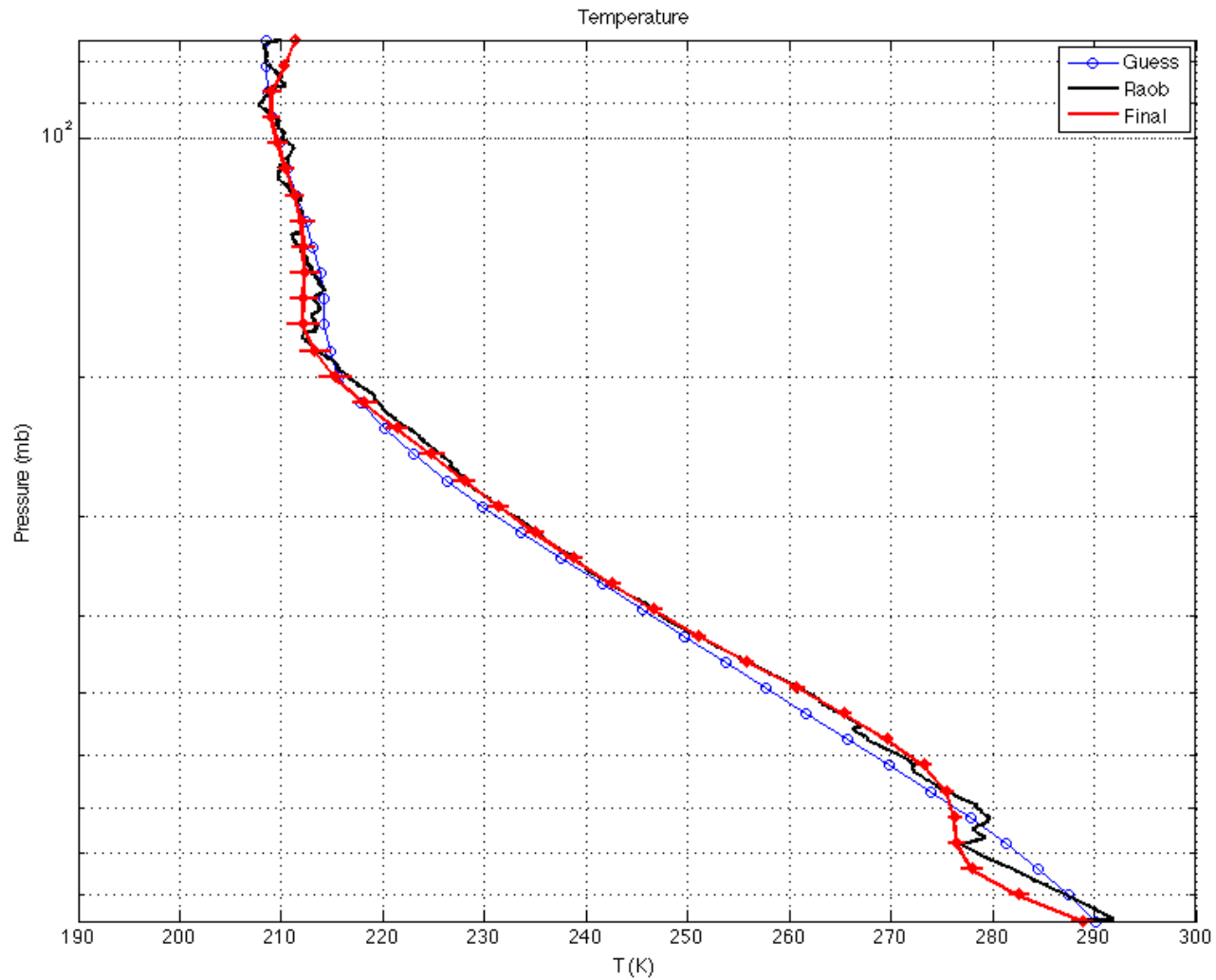
S-HIS FOV



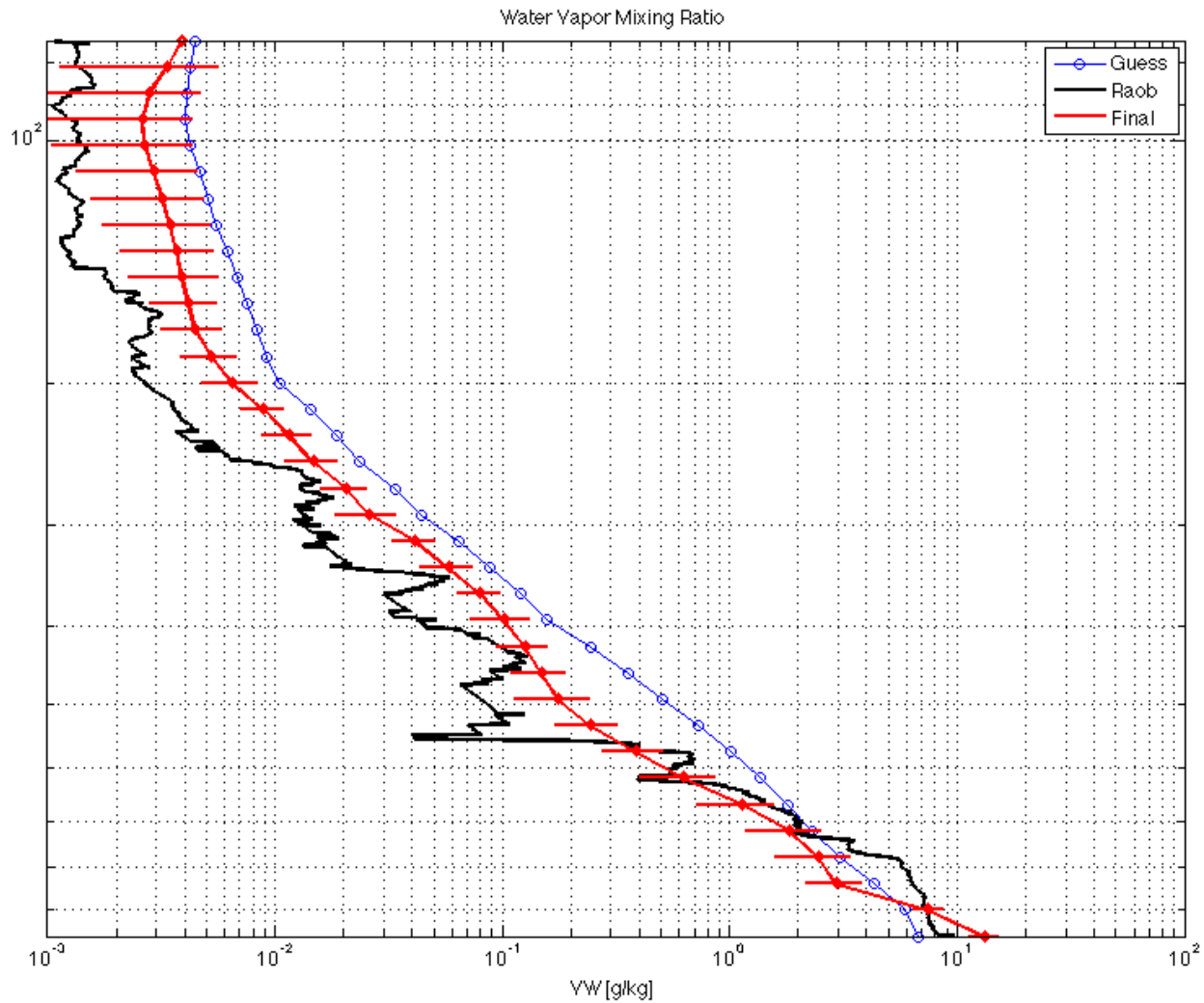
# Filtered Minus Unfiltered



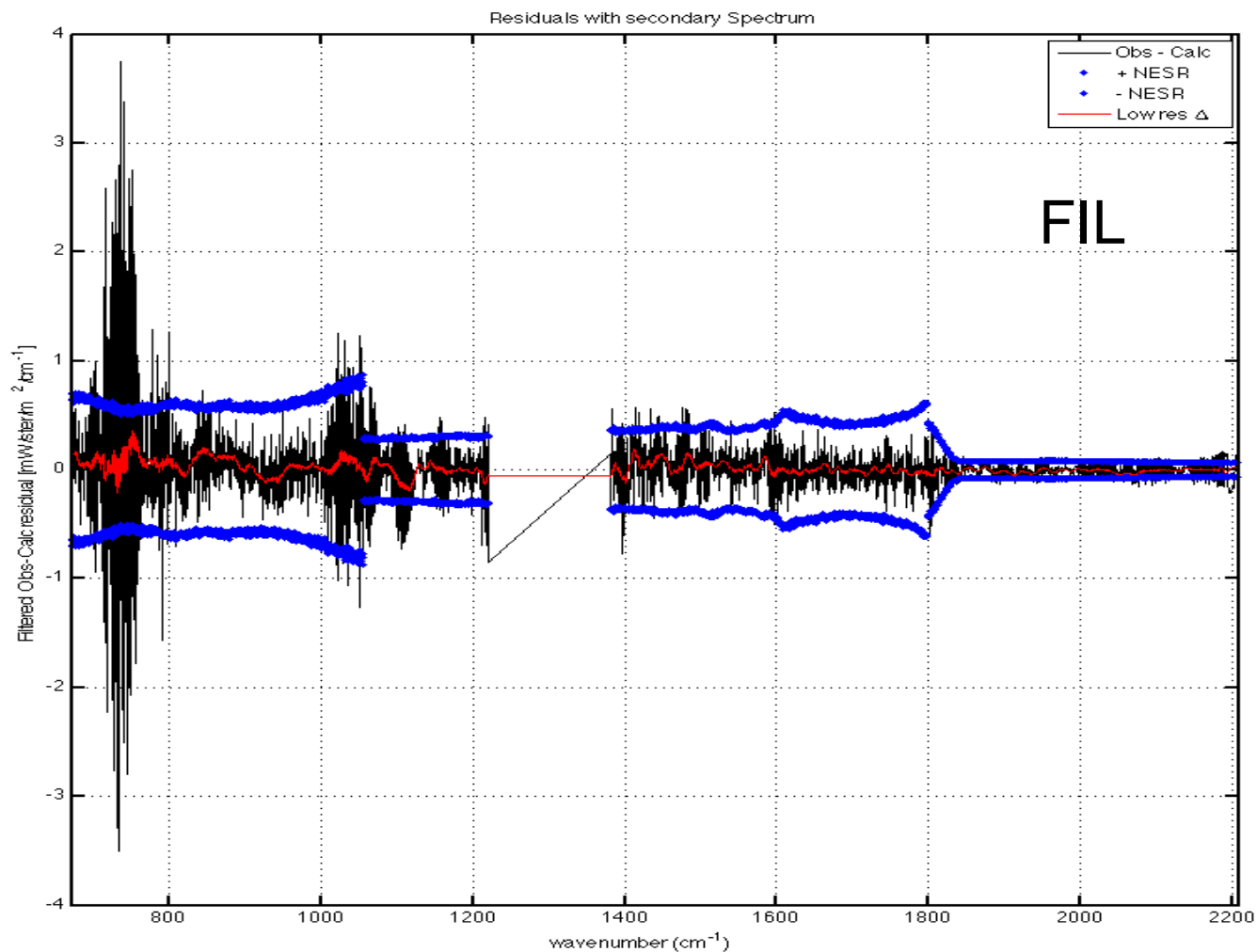
# Retrieved Temperature Profile



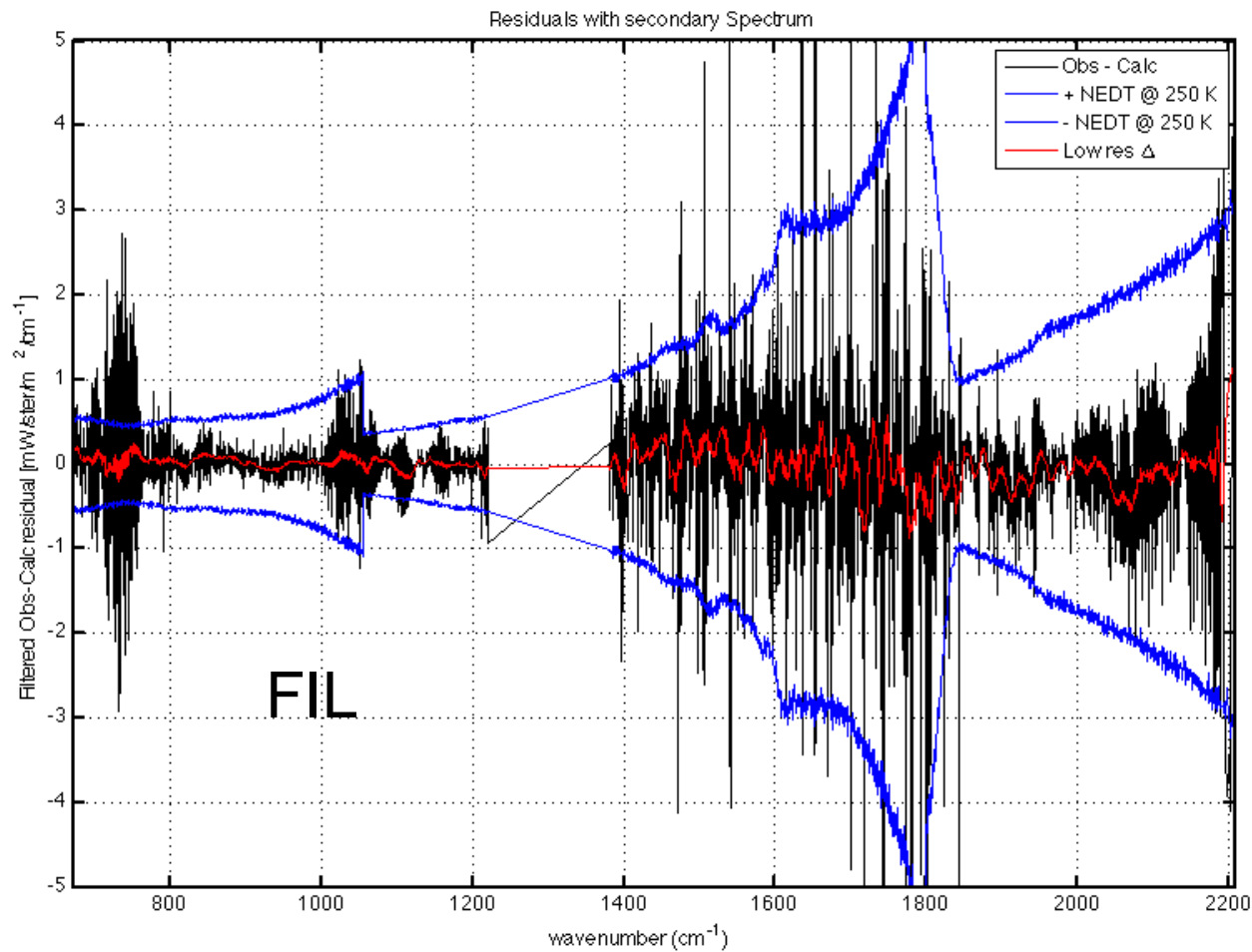
# Retrieved Water Vapor Profile



# Radiance Residuals (compared to Unfiltered and Filtered Spectra)

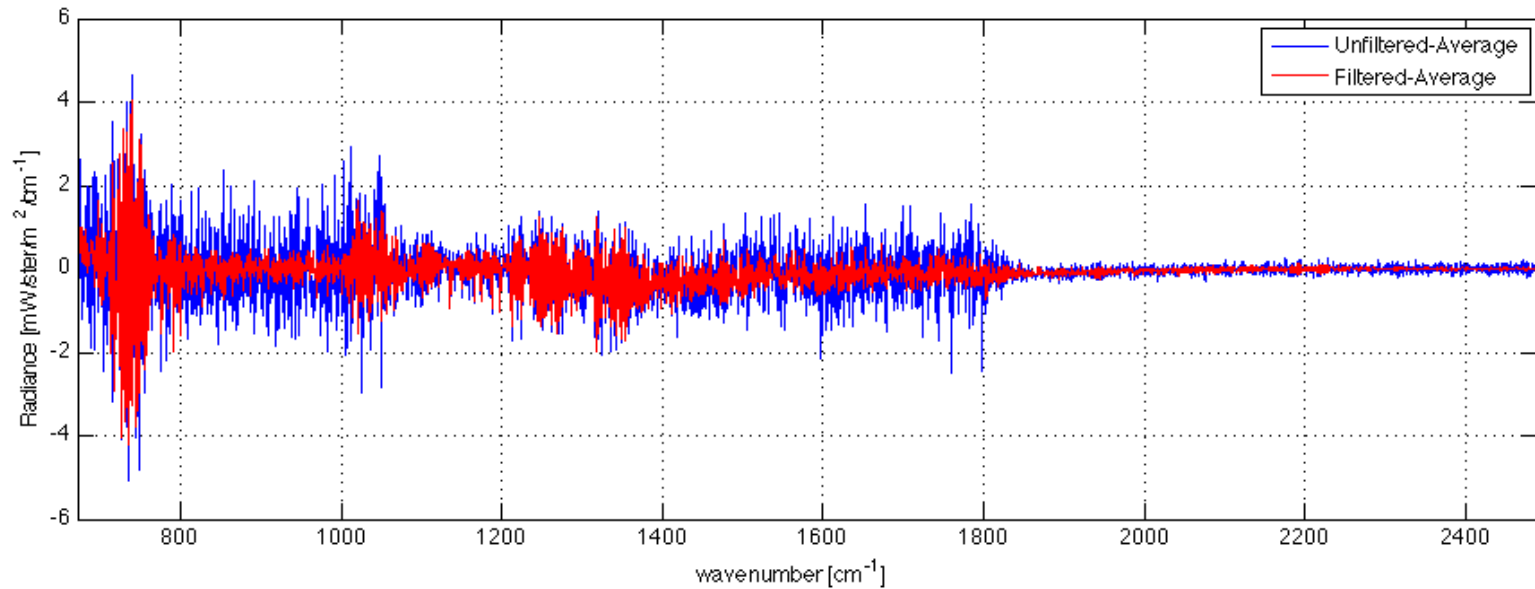


# BT Residuals (compared to Unfiltered and Filtered Spectra)



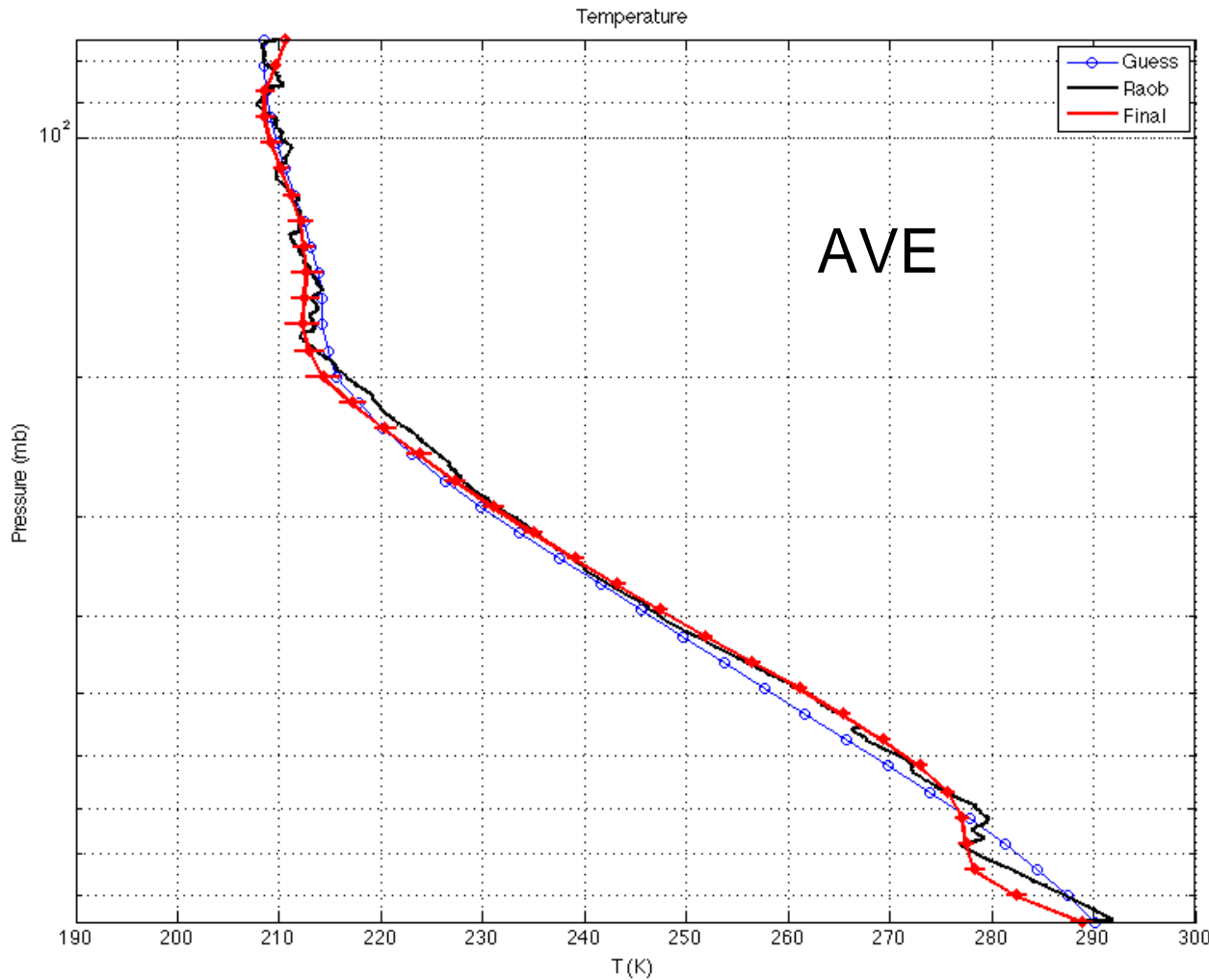
# Unfiltered, Filtered, Averaged spectra

---



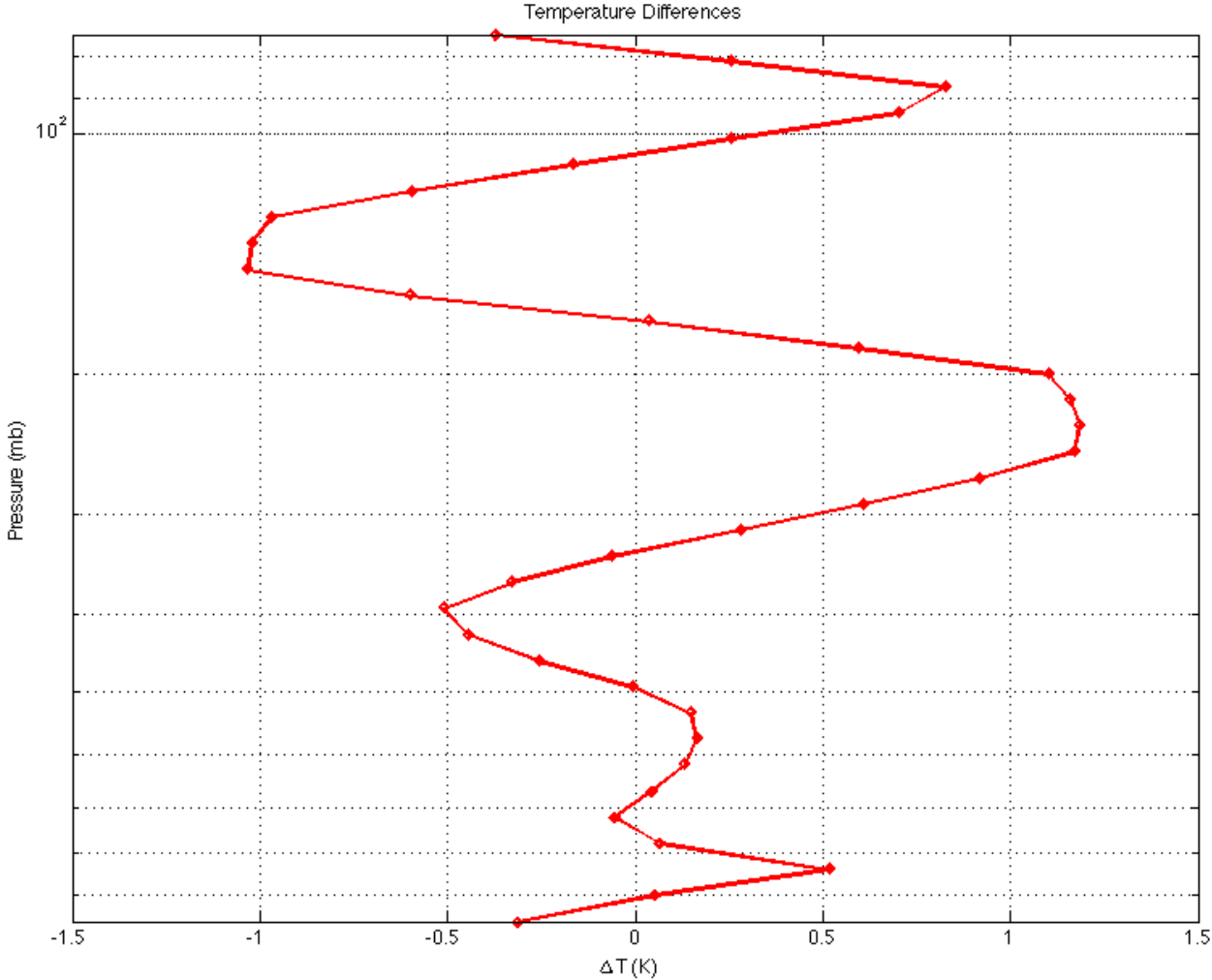


# Temperature Retrieval Comparison

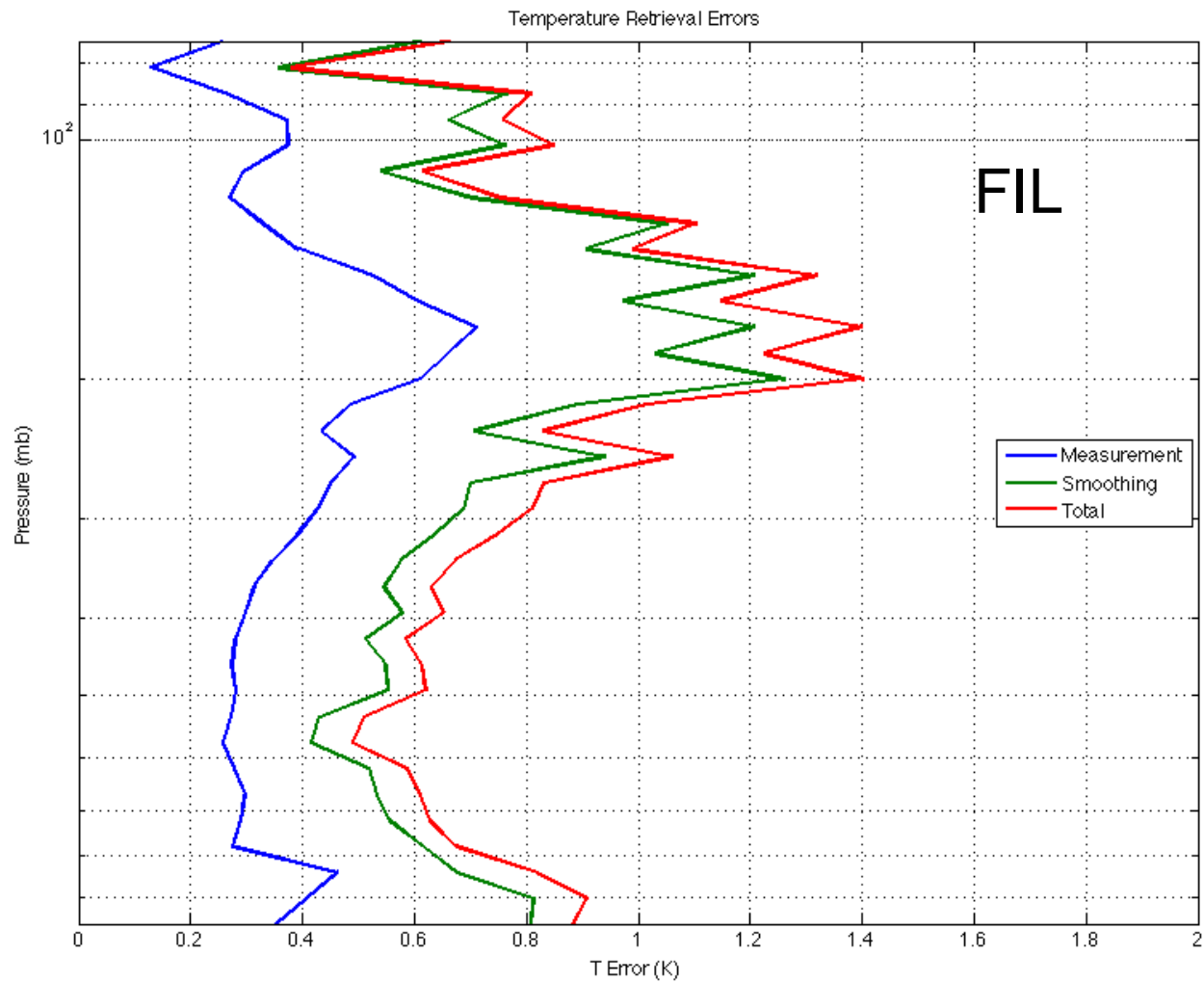


# Temperature Retrieval difference: Unfiltered-Filtered

---

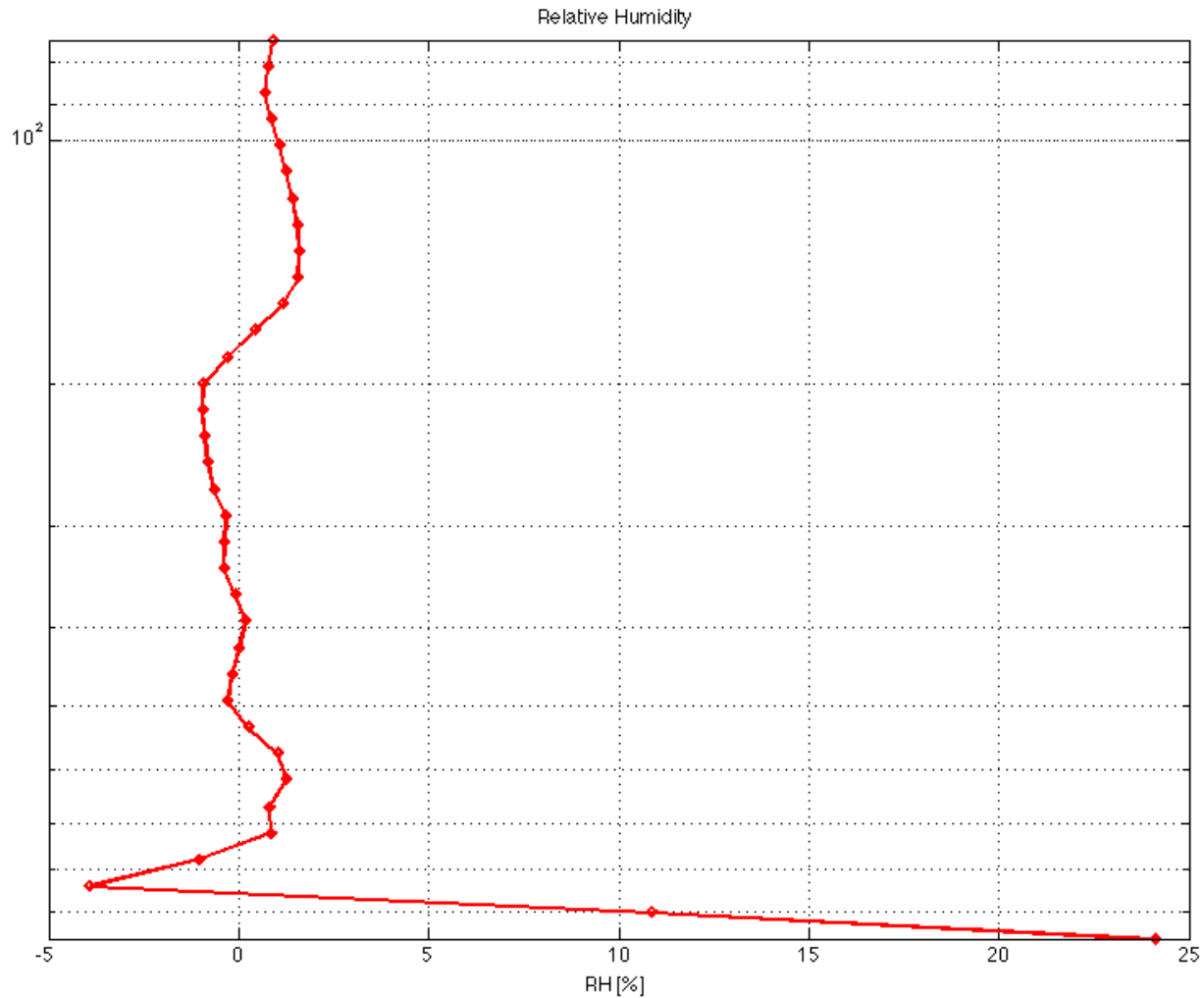


# Uncertainties on Temperature

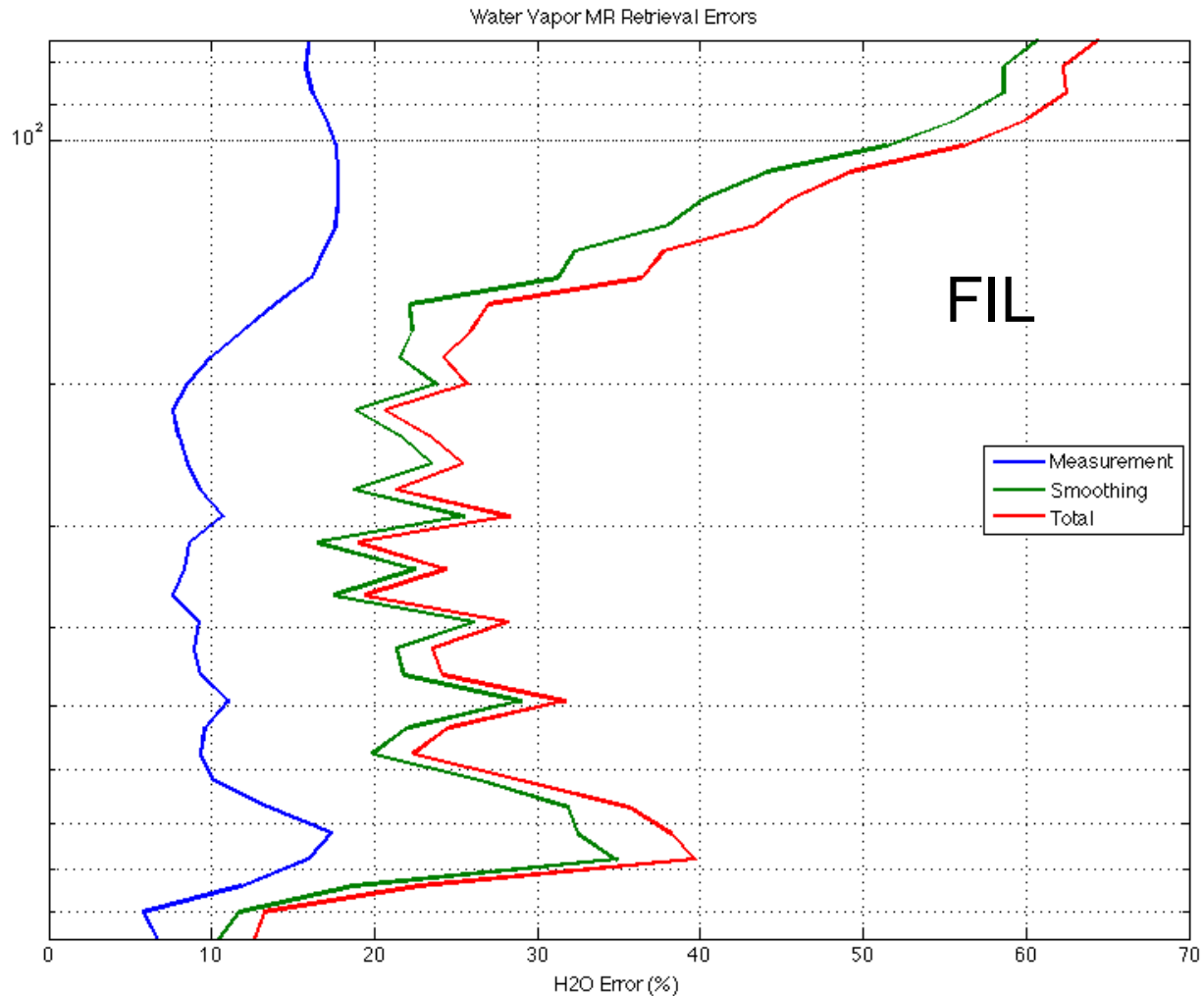


# Relative Humidity Retrieval difference: Unfiltered - Filtered:

---

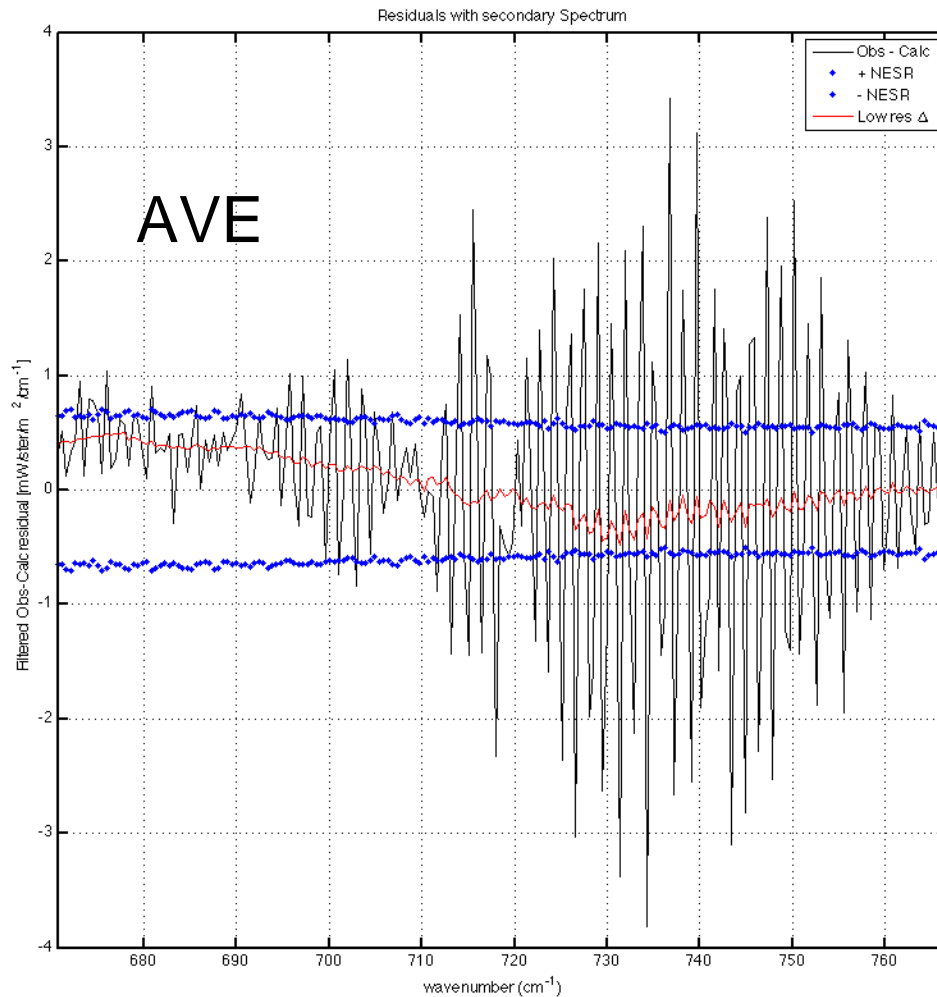


# Uncertainties on Water Vapor



# Residual for T retrieval only

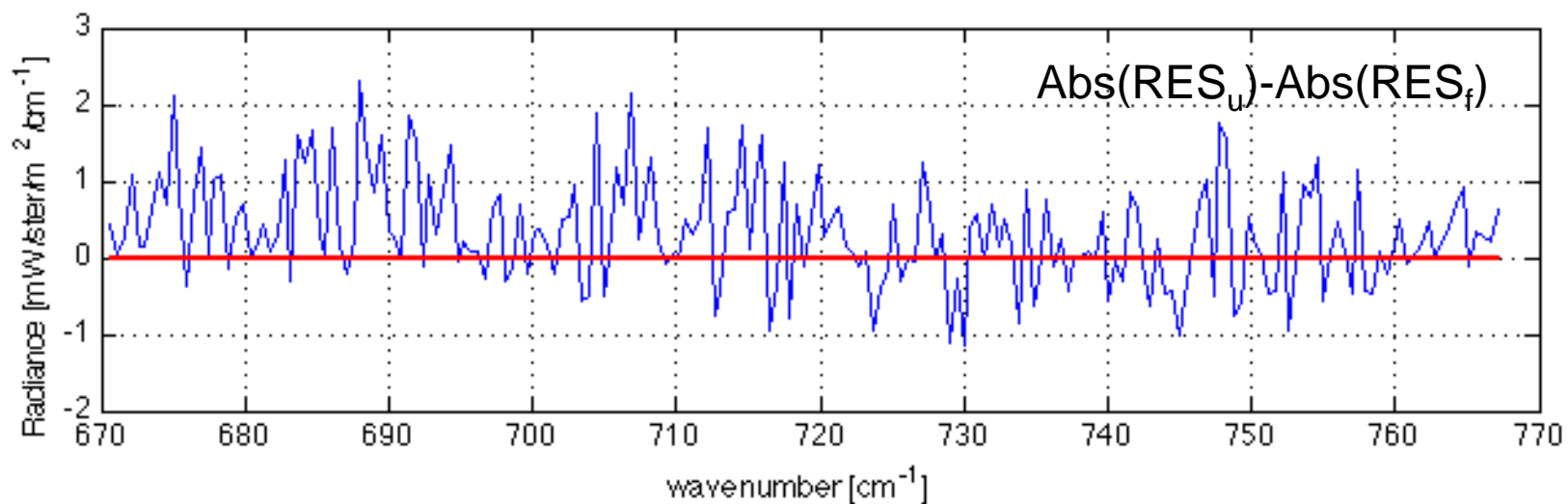
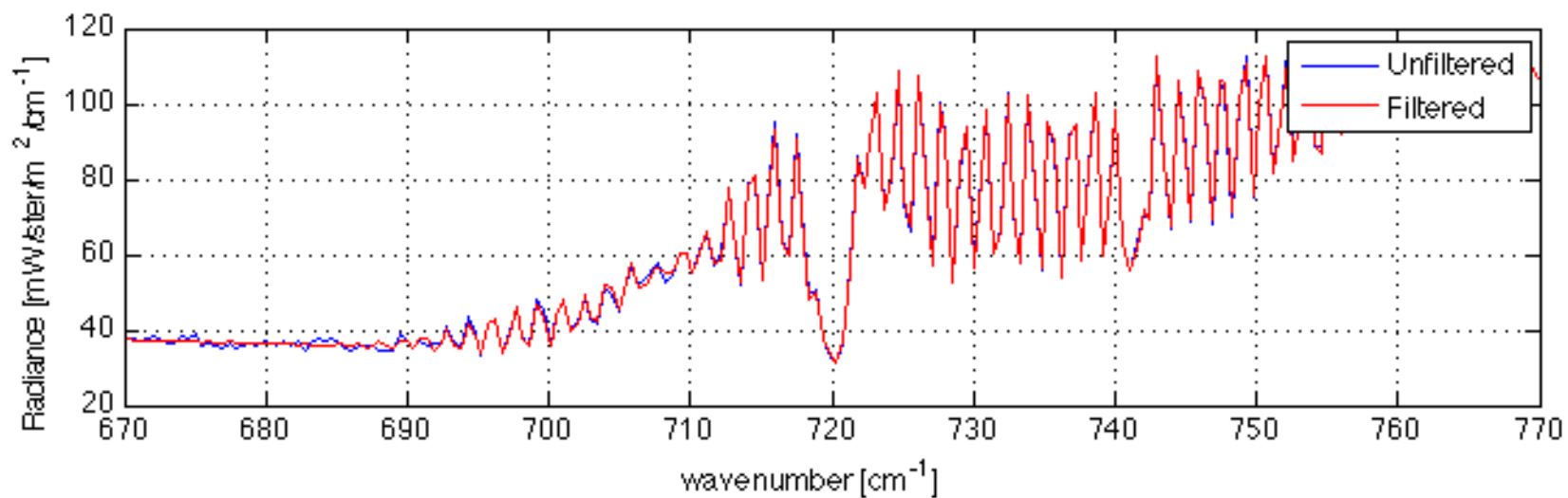
Raob used as First Guess  
Retrieval from CO<sub>2</sub> Band only



# Difference of Absolute value of Radiance

Residuals:

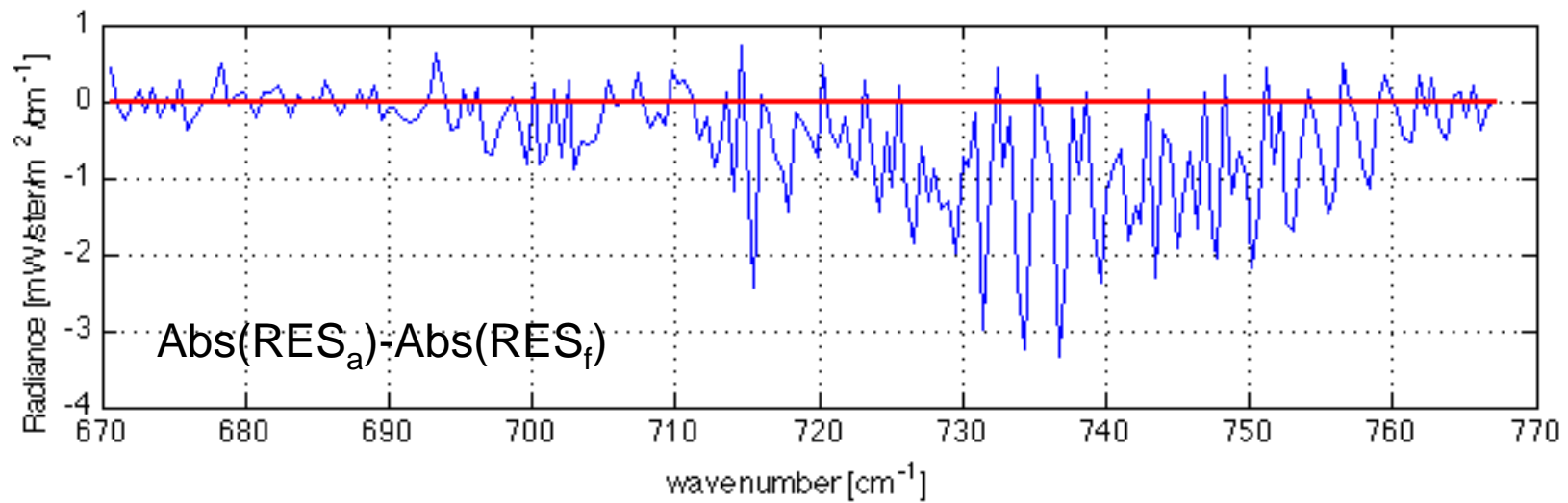
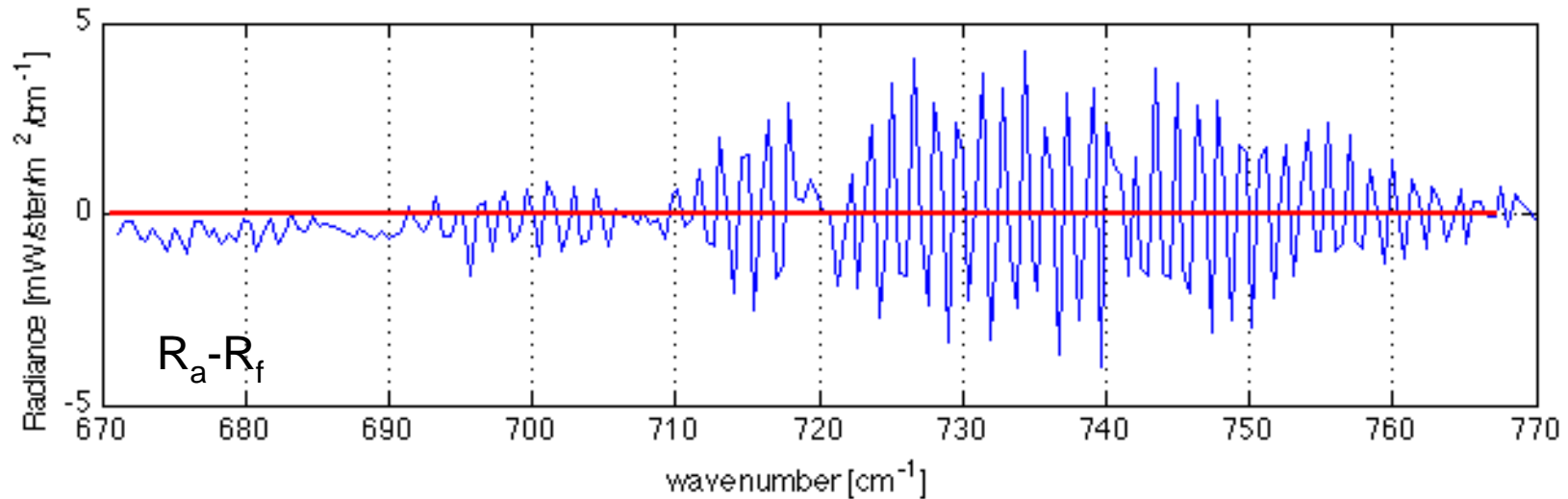
Unfiltered - Filtered



# Difference of Absolute value of Radiance

Residuals:

Averaged Spectrum



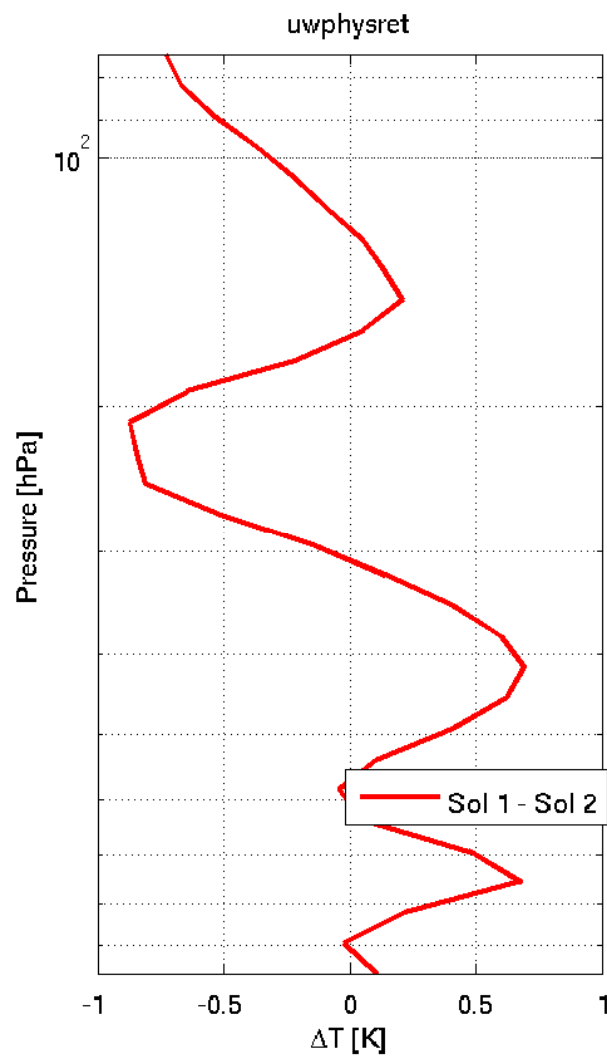
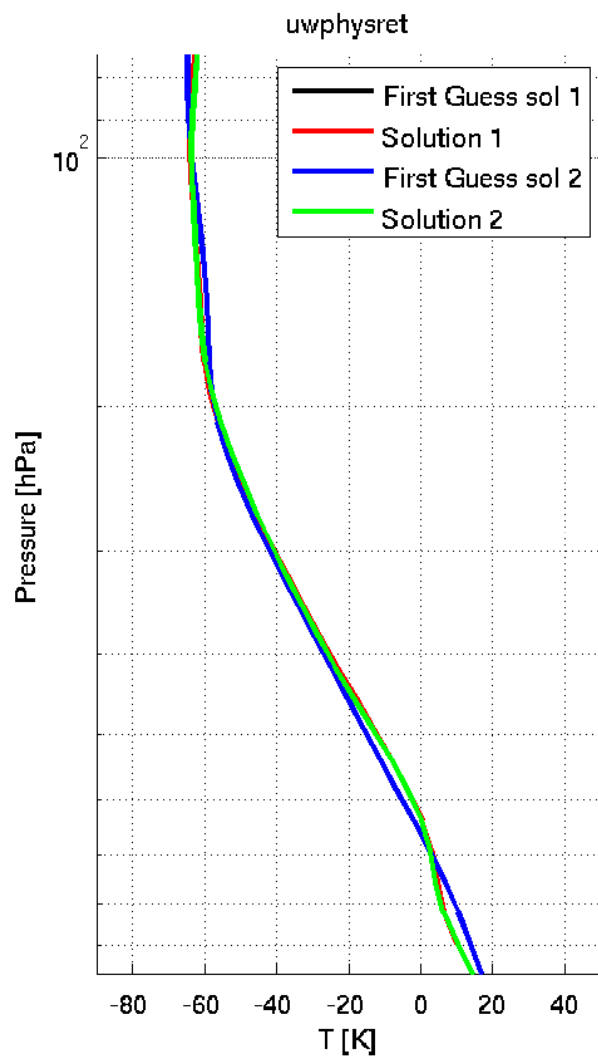


# Error Contributions not considered

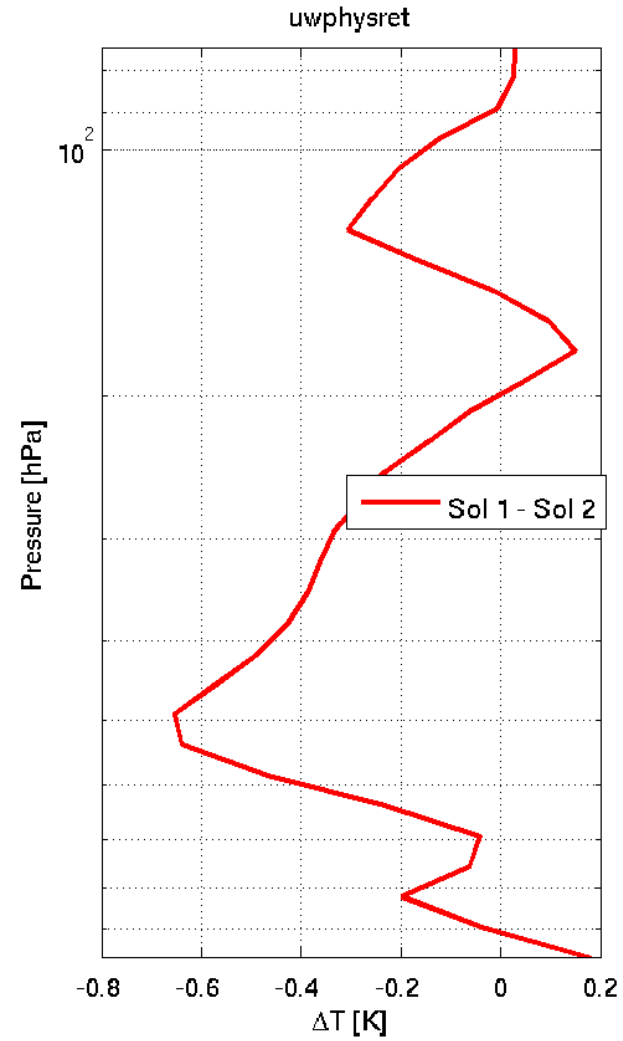
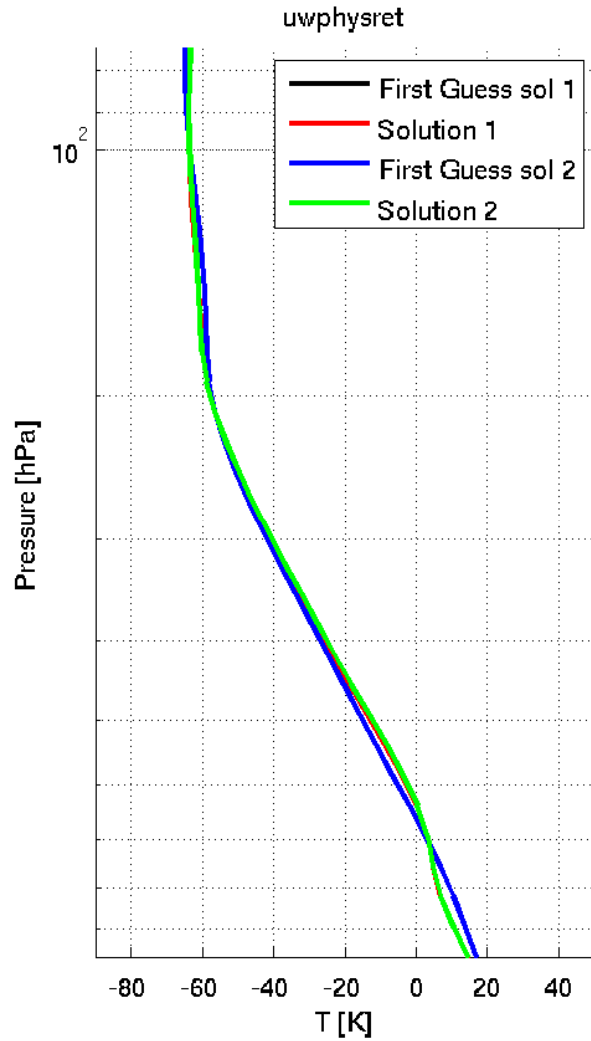
---

- Off-diagonal elements of Instrument Noise (correlated noise):
  - Apodization artifacts (for retrieval from apodized radiances);
  - Correlated Noise;
- Forward Model Error
  - Diagonal;
  - Off-Diagonal;
- PCA noise filter
  - Correlated noise;
  - Uncorrelated noise.

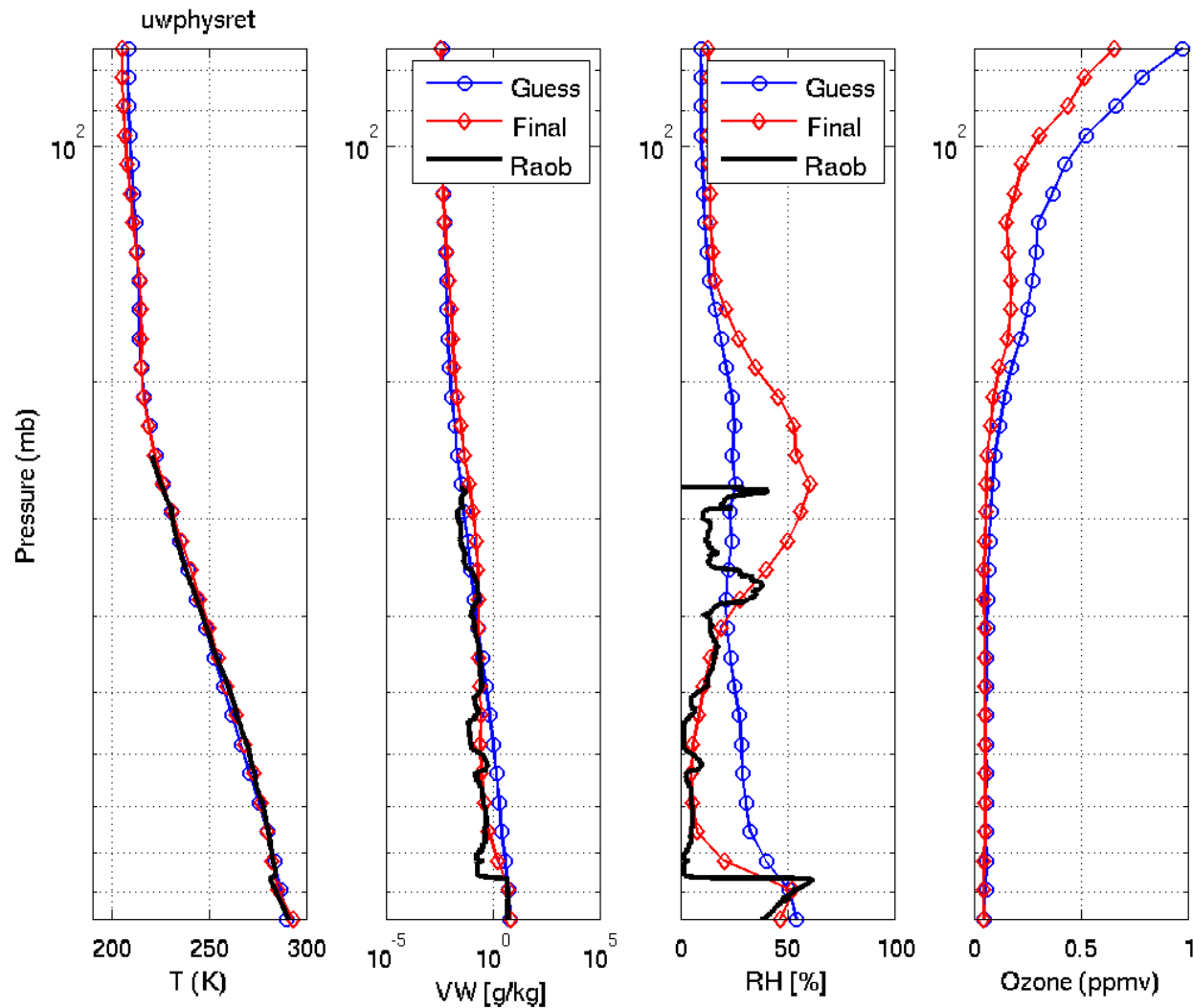
# Retrieval difference for Apodized and Non-Apodized Data: Temperature



# LBLRTM 10.4 - LBLRTM 11.3 (Temperature)



# Next case ... 16 Apr 2007: Retrieved Vertical Profiles



# Conclusions

---

- UWPHYSRET was built as *reference* retrieval system and relies on lbrtm accuracy to allow research on hyperspectral data inversion
- PCA noise filtering effects obtained without redefinition of the noise Covariance matrix produces changes in the range of:
  - [0.5 - 1] K in temperature;
  - [10 - 30] % in lower atmospheric RH;
- These changes are comparable in magnitude to those induced by apodization or lbrtm updates;
- Under the approximations used in this study, PCA noise filtered data allows for:
  - better representation of the retrieval residual and for estimation of potential FWM biases
  - retrieval convergence when using more accurate representation of the noise covariance
- Redefinition of stable non singular full covariance matrix (including artifacts introduced by apodization, PCA noise filtering, correlations due to the sensor, and forward model error) is key to achievement of high accuracy;

# Future Work

---

- Application of the current system to IASI data;
- Re-definition of a stable, comprehensive, noise covariance matrix:
  - Better characterization of *what we do not know*;
- Improvement representation of a-priori information:
  - Better characterization of *what we do know*;

# Topics for Discussion

---

- Forward Model Error (Full Covariance);
- Climatology on CO<sub>2</sub>, O<sub>3</sub>, and other species;
- Use of other sources of information in the *a-priori knowledge*;