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**Forward Modeling for  
Microwave and Infrared Remote Sensing:  
Spectroscopic Issues and Line-by-Line Modeling**

**Tony Clough**

**and a host of colleagues**

*Joint Center, Camp Springs, MD*

*15 Sep 2010*

# LBL Heritage and Presentation Outline

<b>FASCODE</b>	<b>AFGL</b>	<b>Fast Atmospheric Signature CODE</b>	<i>1977</i>
<b>LBLRTM</b>	<b>AER</b>	<b>Line By Line Radiative Transfer Model</b>	<i>1983</i>
<b>LBL_CRA</b>	<b>CRA</b>		<i>2010</i>

## Outline

- **Emphasis on Physics**
- **Background and Intellectual Underpinnings**
- **Line Shape**
- **Line Coupling**
- **Validation Issues**
- **Validation Cases**
  - AERI
  - IASI
- **To Do List**
- **Summary**

## Related Models

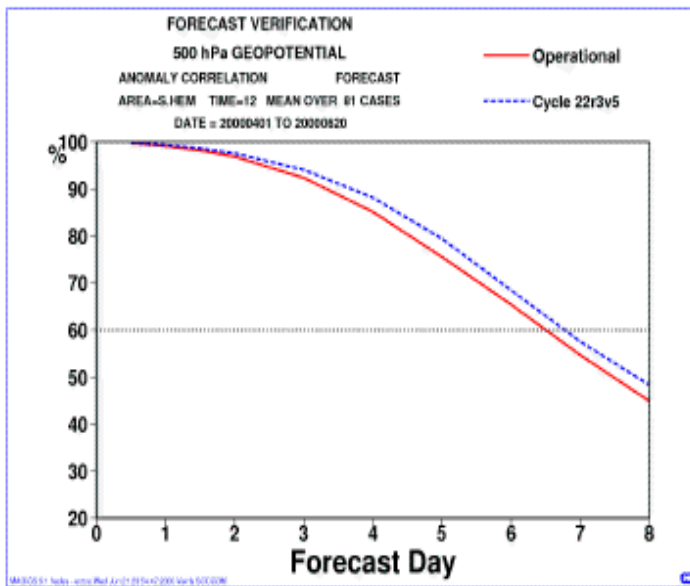
<b>LBLxxx</b>		Clough et. al.
<b>CHARTS</b>	Multiple scattering Adding Doubling Method	Moncet and Clough
• <b>MonoRTM</b>	MonochromRTM for limited # of frequencies e.g. microwave	Boukabara, Cady-Pereira and Clough
<b>DISORT</b>	Multiple Scattering Discrete Ordinate Method	Stamnes and Wiscombe
• <b>RRTM*</b>	Rapid RTM General Circulation Models	Mlawer and Clough
• <b>OSS</b>	Optimal Spectral Sampling	Moncet
• <b>MT_CKD</b>	Continuum	Mlawer, Payne and Clough

\* adjoint easily developed due to coding attributes (next slide)

**Physics consistent with LBLxxx in these models !**

# Example of Code Utilization

Acceptance of RRTM by the GCM community is a direct consequence of the acknowledged accuracy of LBLRTM



## Main features of the McRad radiation package

The main features of the McRad radiation package are summarised in the table

	RRTM <sub>LW</sub>	RRTM <sub>sw</sub>
<b>Solution of Radiation Transfer Equation</b>	Two-stream method	Two-stream method
<b>Number of spectral intervals</b>	16 (140 g-points)	14 (112 g-points)
<b>Absorbers</b>	H <sub>2</sub> O, CO <sub>2</sub> , O <sub>3</sub> , CH <sub>4</sub> , N <sub>2</sub> O, CFC <sub>11</sub> , CFC <sub>12</sub> , aerosols	H <sub>2</sub> O, CO <sub>2</sub> , O <sub>3</sub> , CH <sub>4</sub> , N <sub>2</sub> O, CFC <sub>11</sub> , CFC <sub>12</sub> , aerosols
<b>Spectroscopic database</b>	HITRAN, 1996	HITRAN, 1996
<b>Absorption coefficients</b>	From LBLRTM line-by-line model	From LBLRTM line-by-line model
<b>Cloud handling</b>	True cloud fraction	True cloud fraction
<b>Cloud optical properties method</b>	16-band spectral emissivity	14-band $\tau$ , $g$ , $\omega$
<b>Data: ice clouds</b>	Ebert & Curry, 1992 Fu et al., 1998*	Ebert & Curry, 1992 Fu, 1996*
<b>Data: water clouds</b>	Smith & Shi, 1992 Lindner & Li, 2000*	Fouquart, 1987 Slingo, 1989*
<b>Cloud overlap assumption set up in cloud generator</b>	Maximum-random or generalised*	Maximum-random or generalised*
<b>References</b>	Mlawer et al., 1997 Morcrette et al., 2001	Mlawer & Clough, 1997

# LBL Model Attributes

- **Computational Accuracy**

Voigt Line Shape	Planck Fn	Layer Merging	Optical Depth	Radiance
0.1%	0.05%	0.1%	0.1%	0.1%

- **Computational Gain**

Optimal Sampling	Voigt Line Shape	Line Coupling <sup>2nd</sup>	Planck Fn
10x	10x	10x	2x

*Computational gain can be utilized to do more complicated problems in the same amount of time*

- **Attributes**

- Linear Algebra wherever possible
- Piecewise continuous wherever possible
- Planck Fn 'linear in tau' across inhomogeneous layer
- Voigt Fn obtained as a linear combination of precalculated functions
- Units: cgs
- Line Coupling (second order)
- NonLTE
- Analytic Derivatives
- Logical structure of high order
- Modular and proven very flexible
- Coding: **Horrendous**

# Formalism for LBL Calculations

- Validity from Microwave through Solar UV
  - Detail Balance across entire extent of the line
    - Radiance = Planck\_Fn \* [ 1 - Transmittance ]
- 

**A Bit of History:**      **With a nod to heroes of the profession!**

**Problem:** Incoherent understanding of line shape associated with binary collisions  
(~1972) What is the validity of the impact line shape ?  
What is the line shape far from line center that satisfies the physical constraints?

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- Development of a Water Vapor Continuum Model** (Clough and Kneizys 1975)
- Phillip Anderson thesis (student of Van Vleck) (1950)
  - Huber and Van Vleck I (1966)
  - Huber and Van Vleck II (1972)
  - John Van Vleck (Rev Mod Phys; 1978)

## Formalism for LBL Calculations II

$$k(\nu) = \nu \left\{ \frac{1 - e^{-hc\nu/kT}}{1 + e^{-hc\nu/kT}} \right\} \quad \text{Im} \langle \phi(\nu) + \phi(-\nu) \rangle$$

$$k(\nu) = \nu \tanh(hc\nu/2kT) \quad \text{Im} \langle \phi(\nu) + \phi(-\nu) \rangle$$

radiation field

molecular system  $\leftrightarrow$  radiation interaction

(line shape)

<symmetrized spectral density function>

- Radiation balance is satisfied over the full extent of the spectral line irrespective of accuracy of  $\phi(\nu)$  !
- F-sum rule rigorously satisfied: integral over  $\nu$  ? value of the band strength
- Led to the development of the CKD continuum model

Impact Result:

$$\approx \nu \left\{ \frac{1 - e^{-hc\nu/kT}}{1 + e^{-hc\nu/kT}} \right\} \langle \mathcal{S}_i^g(T) \frac{1}{\pi} \left[ \frac{\alpha_i P}{(\nu_i + \nu)^2 + (\alpha_i P)^2} + \frac{\alpha_i P}{(\nu_i - \nu)^2 + (\alpha_i P)^2} \right] \rangle$$

Microwave:

$$\approx \frac{hc\nu^2}{2kT} \langle \mathcal{S}_i^g(T) \frac{1}{\pi} \left[ \frac{\alpha_i P}{(\nu_i + \nu)^2 + (\alpha_i P)^2} + \frac{\alpha_i P}{(\nu_i - \nu)^2 + (\alpha_i P)^2} \right] \rangle$$

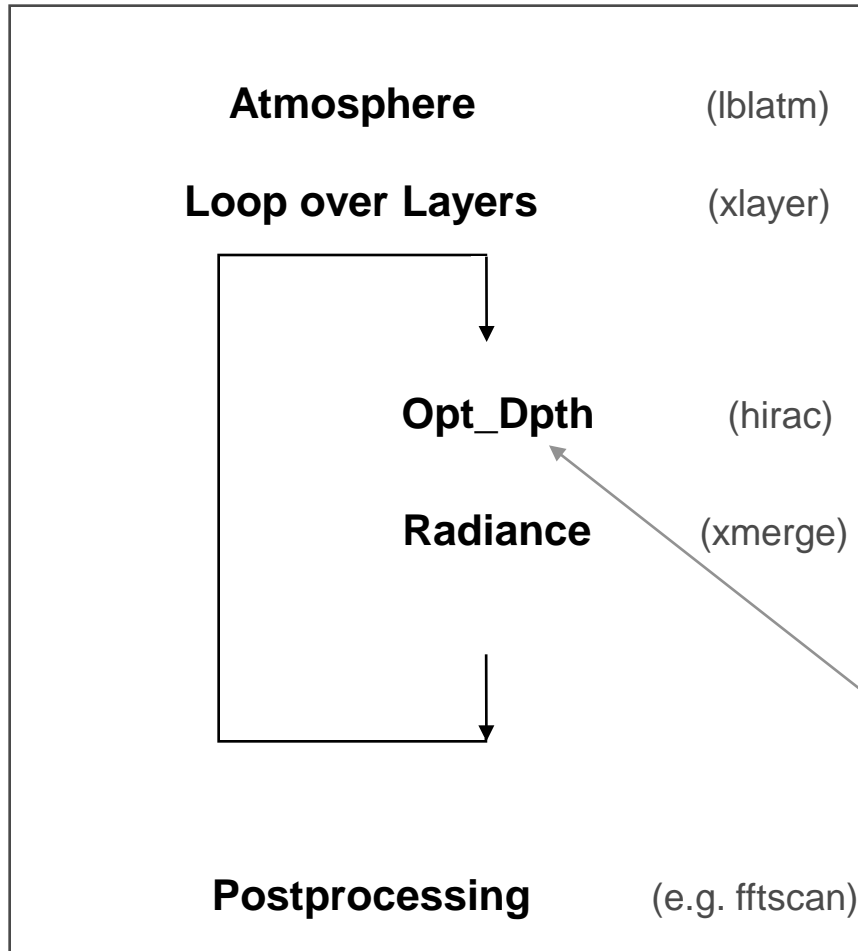
Van Vleck - Weisskopf  
Gross, etc. xxx

Infrared:

$$\approx \nu \langle \mathcal{S}_i^g(T) \frac{1}{\pi} \left[ \frac{\alpha_i P}{(\nu_i - \nu)^2 + (\alpha_i P)^2} \right] \rangle$$

Lorentz

# LBL Model



## Databases

Prestored Atmospheres

- Line parameters
- Partition Function
- Continuum
- NonLTE State Populations
- Cross Sections
- Aerosols and Clouds (absorbers)

**HiRAC**  $\Leftrightarrow \langle \phi(\nu) + \phi(-\nu) \rangle$

High Resolution Absorption Coefficient



## Formalism for LBL Calculations III

Impact Approximation »» Duration of Collision »»  $\chi(\nu_i - \nu)$  factor

$$k(\nu) \approx \nu \left\{ \frac{1 - e^{-hc\nu/kT}}{1 + e^{-hc\nu/kT}} \right\} < \mathcal{S}_i(T) \frac{1}{\pi} \left[ \frac{\alpha_i P}{(\nu_i + \nu)^2 + (\alpha_i P)^2} \chi(\nu_i + \nu) + \frac{\alpha_i P}{(\nu_i - \nu)^2 + (\alpha_i P)^2} \chi(\nu_i - \nu) \right] >$$

$\mathcal{S}_i(T)$

$\nu_i \Rightarrow \nu_i + \delta_i(P, T)$

$\alpha_i \Rightarrow \alpha_i \gamma_i^{T/T_0}$

$\chi(\nu_i - \nu)$

Strength	grade		grade
	A+		
Line Position	A++	Pressure Shift	C/D
Width	B	T Dependence	C
$\chi$ Fn	?		

# Line Coupling

The task is to evaluate the collision operator in Liouville (line) space:  $[\nu - \nu_0 - i \mathbf{P} \cdot \mathbf{W}]^{-1}$

$$k(\nu) = \nu \tanh(\beta \nu / 2) \operatorname{Im}[\phi(\nu) + \phi(-\nu)]$$

$$\phi(\nu) = \frac{1}{\Pi} \sum_{jk} \mu_j \langle j | \frac{1}{(\nu - \nu_0) - iPW} | k \rangle \mu_k \rho_k$$

$\mu_k$   
 $\rho_k$

diagonalize:  $(\nu_0 + iPW)$

transition rate operator

$$X^{-1} (\nu_0 + iPW) X = \lambda' + i\lambda''$$

$$\nu - \nu_0 - iPW = X (\nu - \lambda' - i\lambda'') X^{-1}$$

$$(\nu - \nu_0 - iPW)^{-1} = X^{-1} (\nu - \lambda' - i\lambda'')^{-1} X$$

$$\mathfrak{S} = \rho_l \mu_l^2$$

$$\phi(\nu) = \frac{1}{\Pi} \sum_{jkl} \mu_j X_{jl} (\nu - \lambda'_l - i\lambda''_l)^{-1} X_{lk}^{-1} \mu_k \rho_k$$

$$= \frac{1}{\Pi} \sum_l \frac{(\nu - \lambda'_l) + i\lambda''_l}{(\nu - \lambda'_l)^2 + (\lambda''_l)^2} \sum_{jk} X_{lh}^{-1} \mu_k \rho_k \mu_j$$

$$S' = S_l \left( 1 + g_l \left( \frac{P}{P_0} \right)^2 \right)$$

$$S'' = S_l y_l \left( \frac{P}{P_0} \right)$$

$$\lambda'' = \alpha_l \left( \frac{P}{P_0} \right)$$

$$\lambda' = \nu_l + \delta_l \left( \frac{P}{P_0} \right)$$

$$\operatorname{Im}\{\phi(\nu)\} = \frac{1}{\Pi} \sum_l \frac{\lambda'_l \mathfrak{S} + \mathfrak{S}'(\nu - \lambda'_l)}{(\nu - \lambda'_l)^2 + (\lambda''_l)^2}$$

$S', S'', \lambda', \lambda''$



# Thoughts on Forward Model Validation and Spectroscopy

- The atmospheric conditions for which spectroscopic parameters are required are difficult to obtain in the laboratory- for water vapor, essentially impossible (long paths-cold temperatures)
- Spectroscopy error, though small, is the dominant error in most retrievals
- Spectroscopists have been making significant progress
- The OCO experiment has been a great motivator
- A strong commitment to study line shapes was articulated at the HITRAN meeting June 2010
- Nevertheless, improved spectroscopy is needed now!

## ***In situ* measurements are simply not adequate**

- Spatial and temporal sampling issues
- Accuracy of the measurements themselves is not adequate
- *In situ* measurements are useful: e.g. vertical structure

## **My perspective is that the atmosphere will have to function as our laboratory**

- Focus on a small number of cases (10) spanning a range of atmospheric conditions
- Initial cases: night time over ocean quiet atmosphere  
Progressing to day time cases, land cases always with as quiet an atmosphere as possible
- Spectral residuals to follow are based on *ad hoc* changes in line parameters  
Progressing to retrieval of line parameters from atmospheric spectra (tuning?)

# What is Truth?

- **Spectral Residuals are Key!**

- **Consistency *within a band system***

- $\nu_2$  band to investigate consistency for H<sub>2</sub>O

- **Consistency *between bands***

- $\nu_2$  and  $\nu_3$  bands to investigate consistency for CO<sub>2</sub>

- **Consistency *between species***

- TES: temperature from O<sub>3</sub> and H<sub>2</sub>O consistent with CO<sub>2</sub>; N<sub>2</sub>O

- **Consistency *between instruments***

- IASI

- AIRS

- ACE

- TES

- MIPAS

- SHIS

- NAST-I

- AERI



# Collaborators for IASI Case

- **Collaborators:**

- M. Shephard, V. Payne, K. Cady-Pereira and J. Delamere      AER, Inc.
- W. Smith and S. Kireev      Hampton U.

- **Extension of**

**Performance of the line-by-line radiative transfer model (LBLRTM) for temperature and species retrievals: IASI case studies from JAIVEx:** M. W. Shephard, S. A. Clough, V. H. Payne, W. L. Smith, S. Kireev, and K. E. Cady-Pereira, Atmos. Chem. Phys., 9, 7397-7417, 2009

- **IASI Cases from JAIVEx**

- **2007\_04\_19**

**Case Study**

- » **Over SGP site (surface emissivity retrieved)**
- » **Atmosphere**
  - **Clear and Homogeneous (h2o)**
  - **'Well Characterized'**

- **2007\_04\_20**

**'Control'**

- » **Over Gulf of Mexico ”**
- » **Atmosphere**
  - **Broken Clouds and Highly Inhomogeneous (h2o)**
  - **Not So Well Characterized**



# Introduction

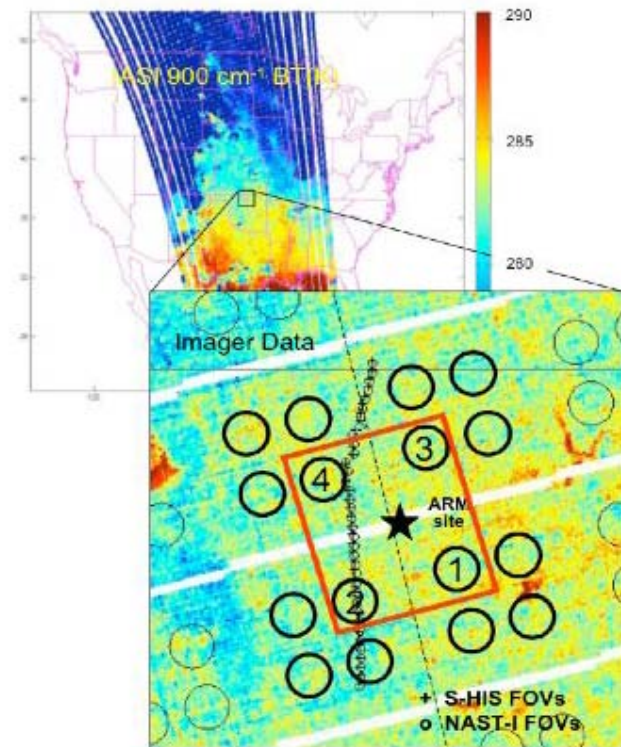
## IASI

- Scan Rate 8 secs
  - Scan Type Step and dwell
  - Pixel IFOV 0.8225°
  - **IFOV size at Nadir** **12 km**
  - Sampling at Nadir 18 km
  - Earth View Pixels / Scan 2 rows of 60 pixels each
  - Swath  $\pm 48.98^\circ$
  - Swath  $\pm 1066$  km
  - Spectral Range 645 to 2760 cm<sup>-1</sup>
  - **Resolution (hw/hh)** **0.25 cm<sup>-1</sup>**
  - Lifetime 5 years
  - Power 210 W
  - Size 1.2 m x 1.1 m x 1.3 m
  - Mass 236 kg
  - Data rate 1.5 Mbps
  - **Radiometric Calibration** **< 0.1 K**
- 
- The IASI programme is led by
  - Centre National d'Études Spatiales (CNES) in association with EUMETSAT.
  - Alcatel Alenia Space is the instrument Prime Contractor.

## Joint Airborne IASI Validation Experiment

*JAIVEx 19 Apr 2007*

*CART-site (03:35 UTC)*

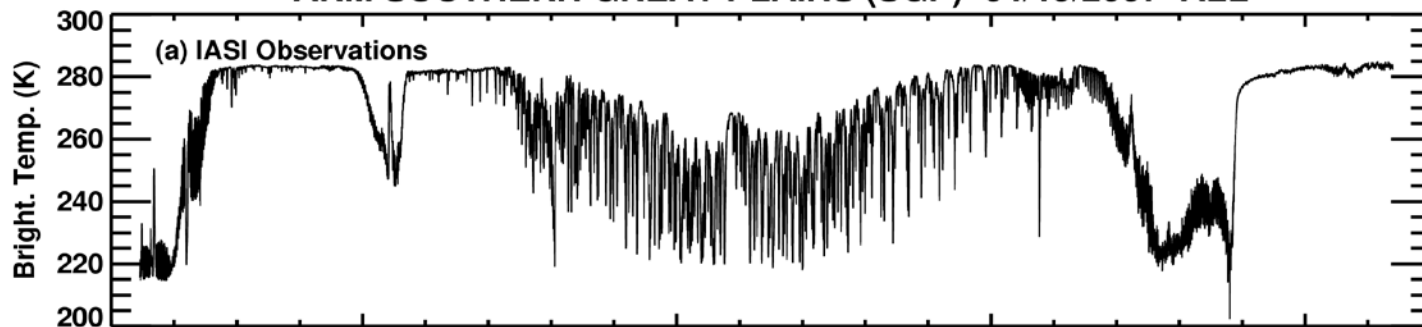




# IASI/LBLRTM Validation

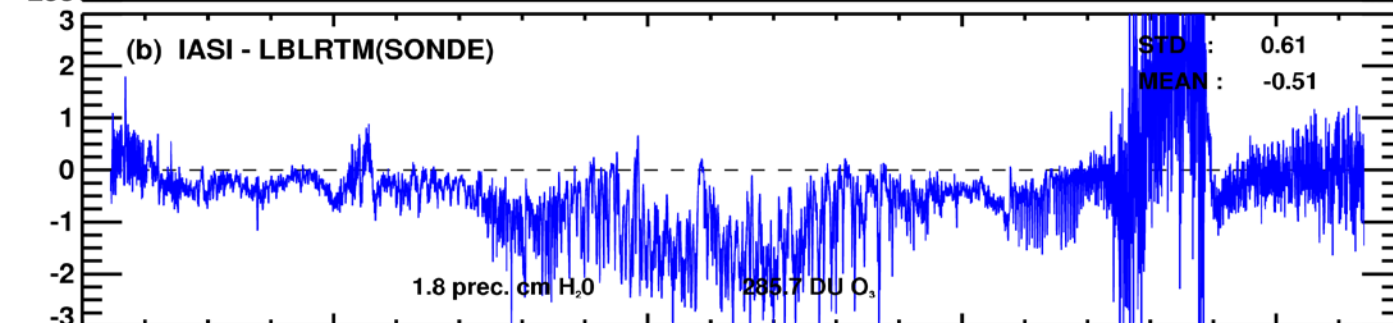
ARM SOUTHERN GREAT PLAINS (SGP) 04/19/2007 ALL

IASI

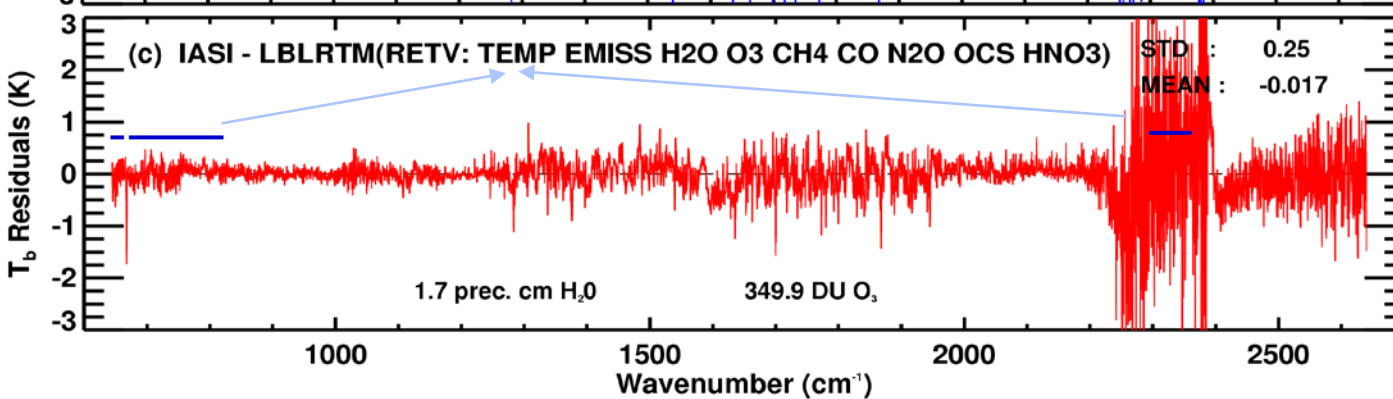


Tsfc:  
284.323 K

SONDE



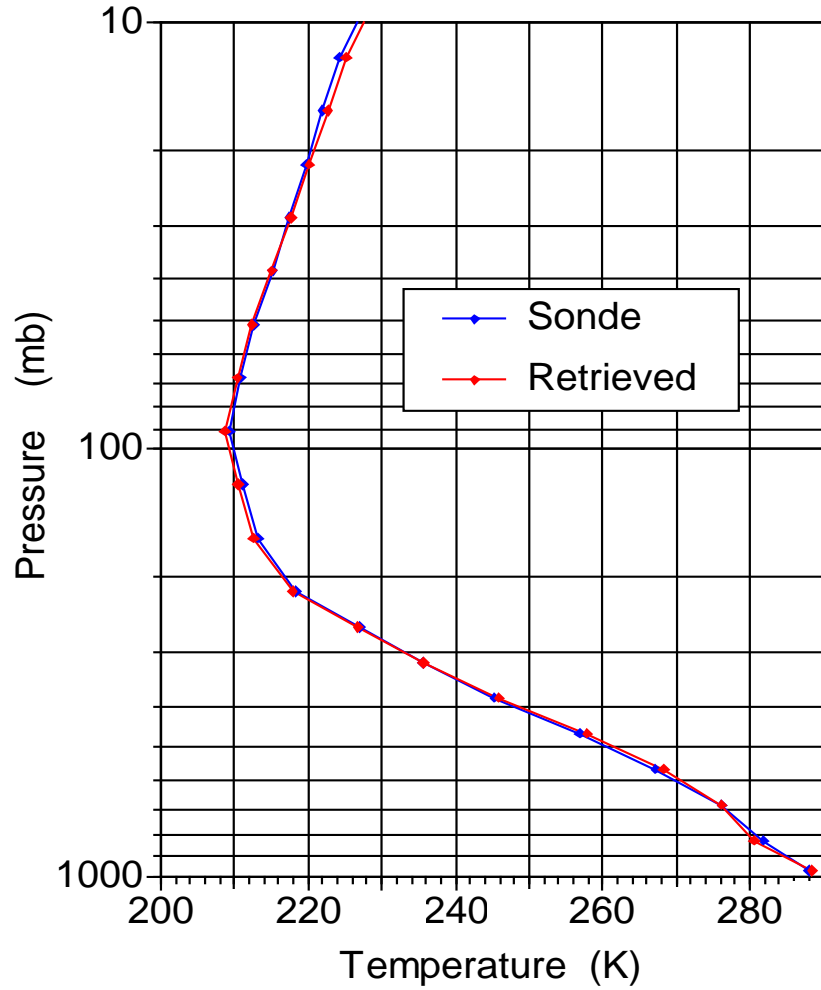
RETV



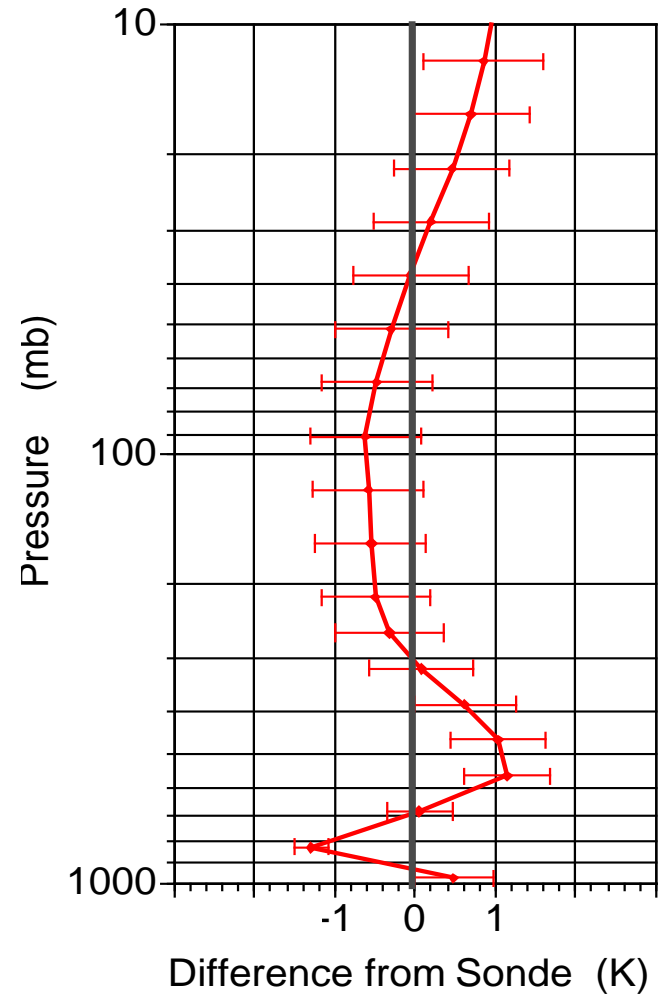
**Strategy: to analyze the spectroscopy in the context of these red residuals**

# Temperature

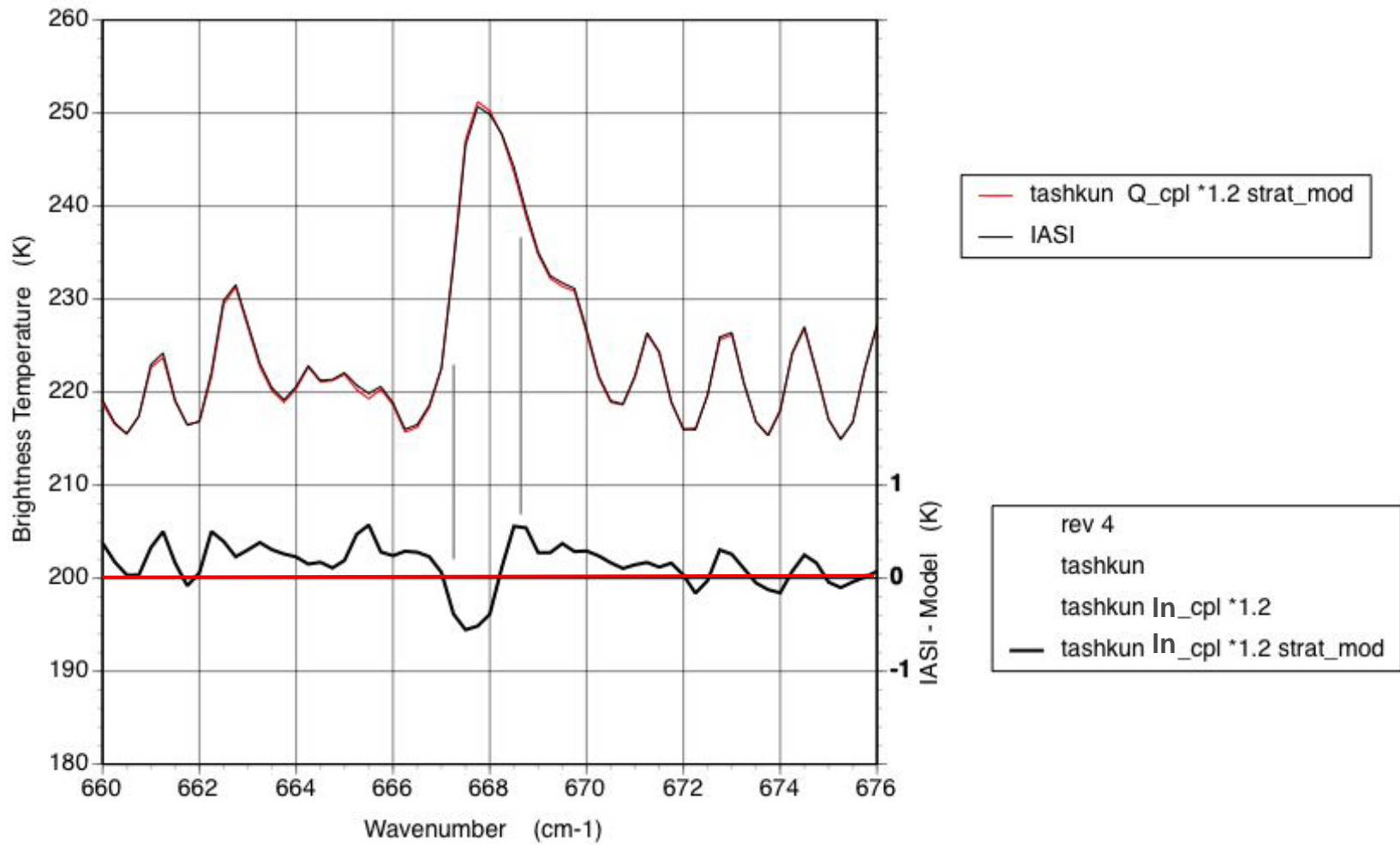
Profile



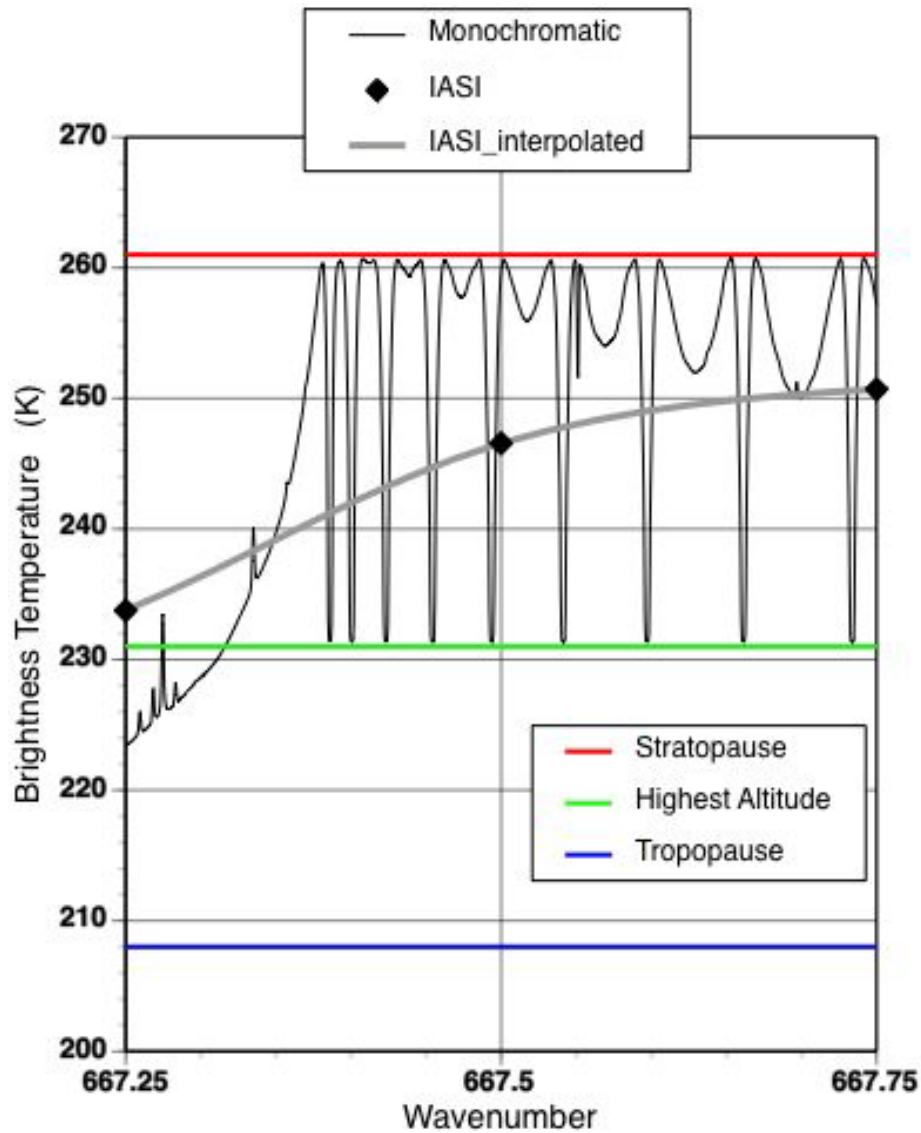
Difference between Retrieval and Sonde



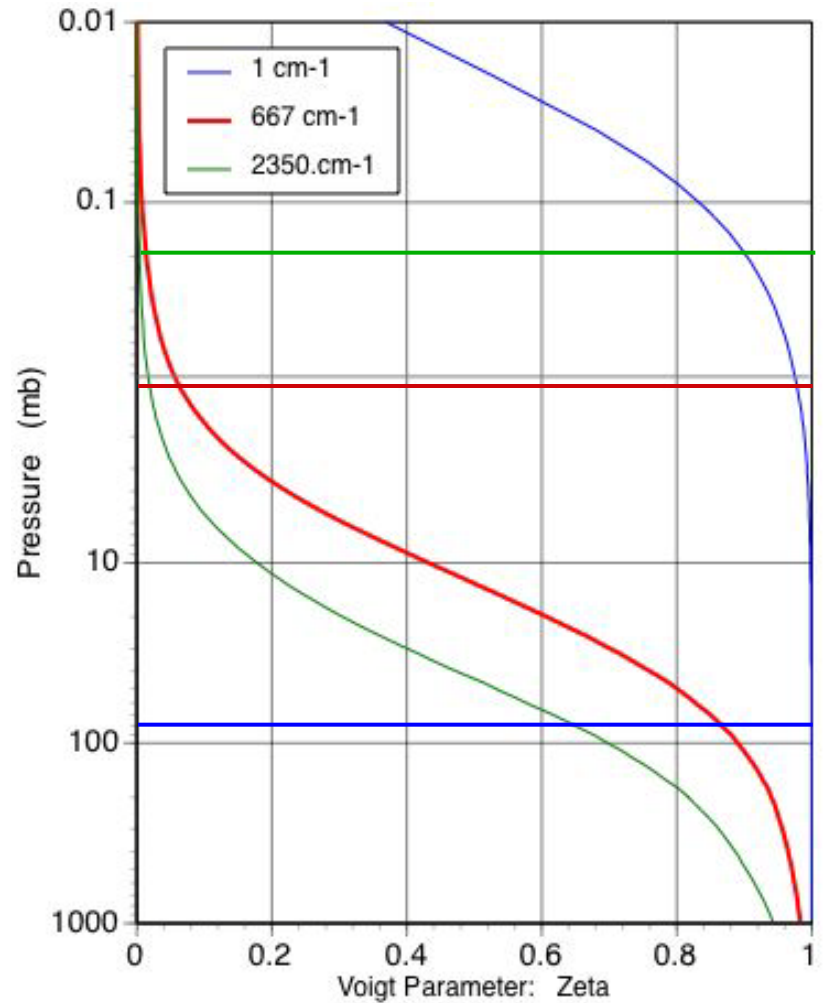
# IASI 19 Apr 2007 CO<sub>2</sub> Q-Branch Sensitivity to Upper Stratosphere



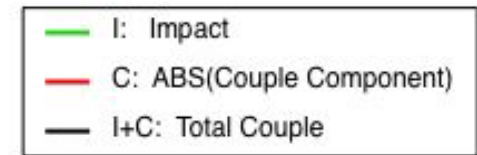
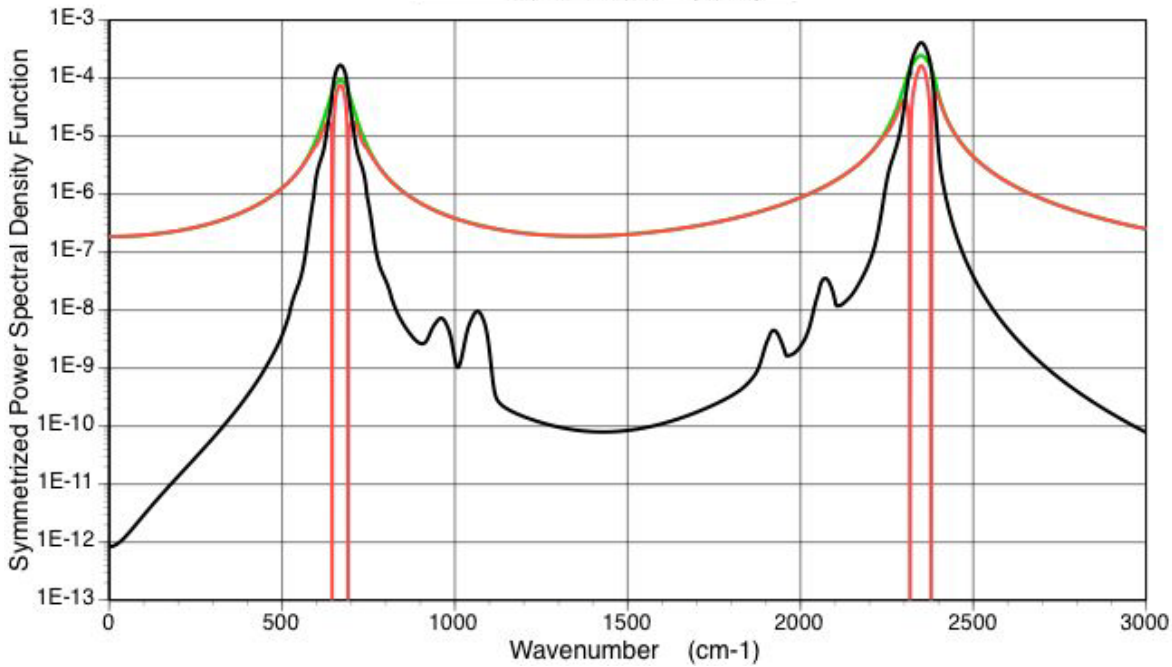
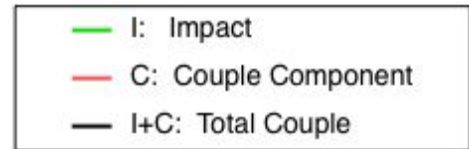
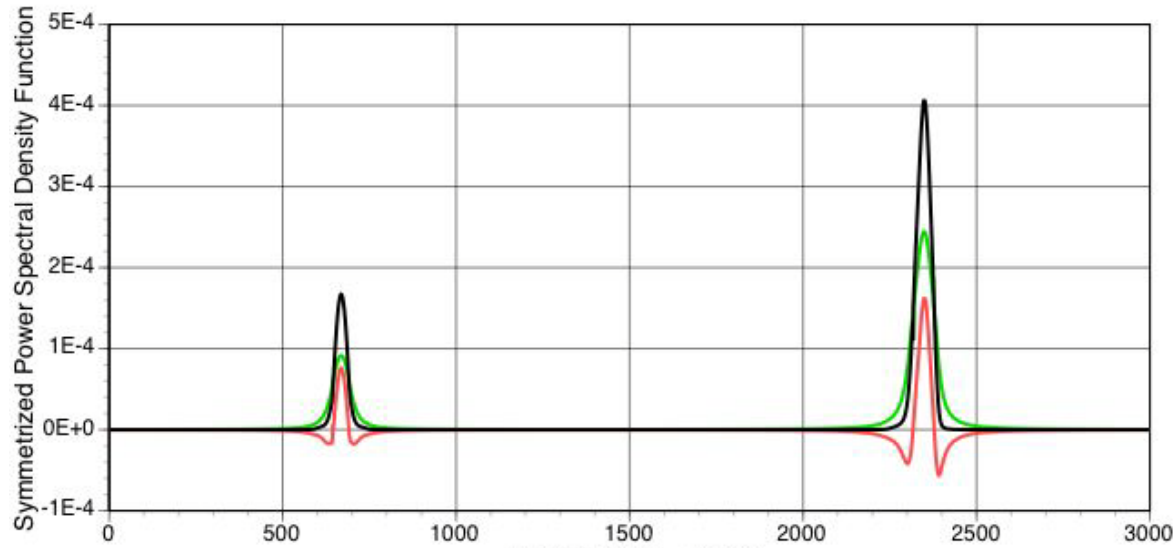
# Voigt Parameter and Q Branch Monochromatic Spectrum



$$\zeta = \frac{\alpha_c}{\alpha_c + \alpha_D}$$



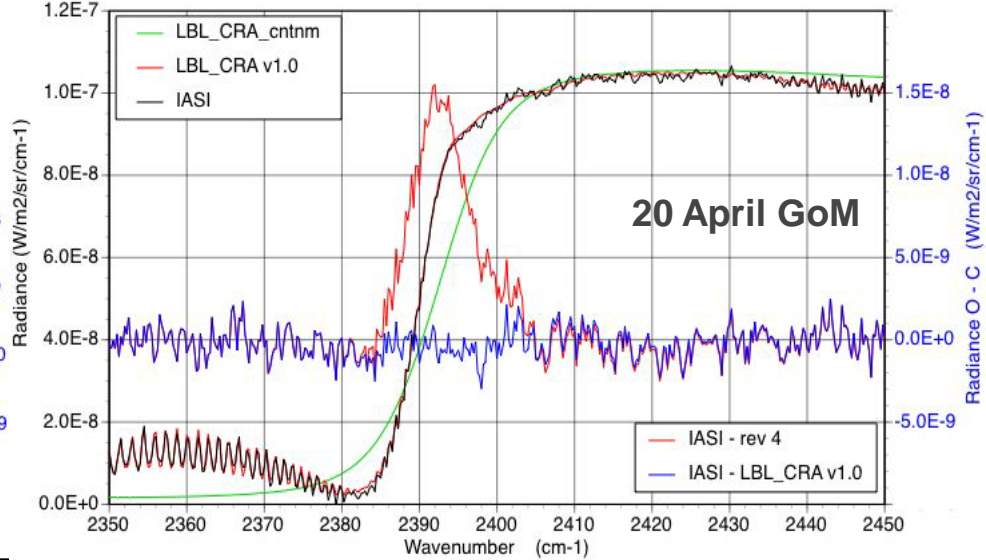
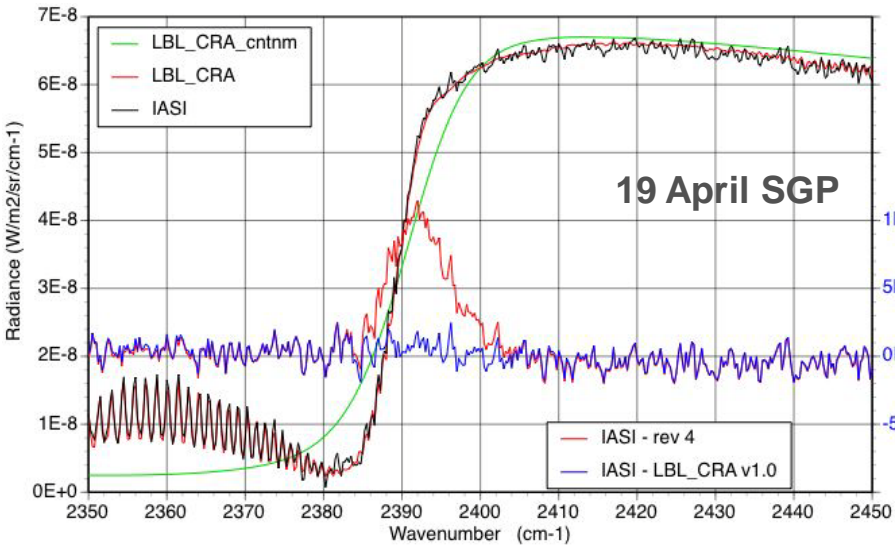
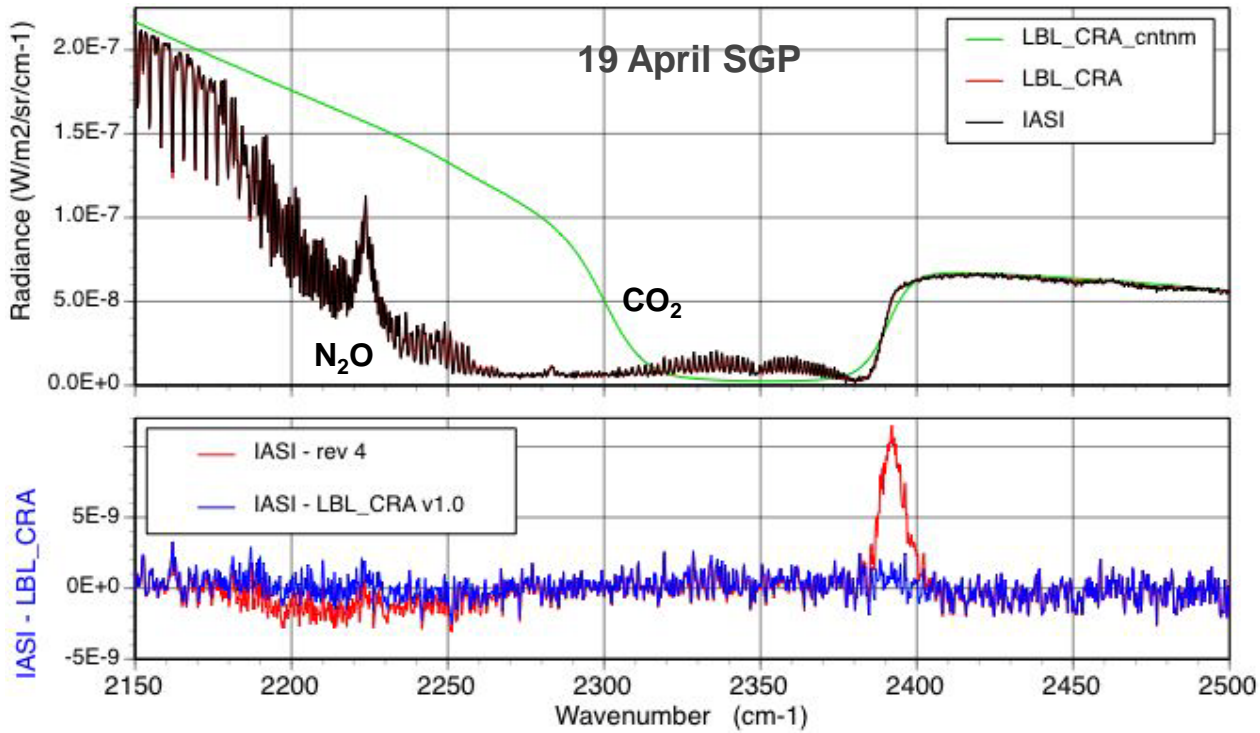
# Effect of Line Coupling on CO<sub>2</sub> Continuum



$\nu_3$  Bands of  
 $N_2O$  and  $CO_2$   
 2150 - 2500  $cm^{-1}$

1

LBL\_CRA:  $N_2O$   
 increased by 1.04



# CO<sub>2</sub> Line Coupling

## • Line Parameters:

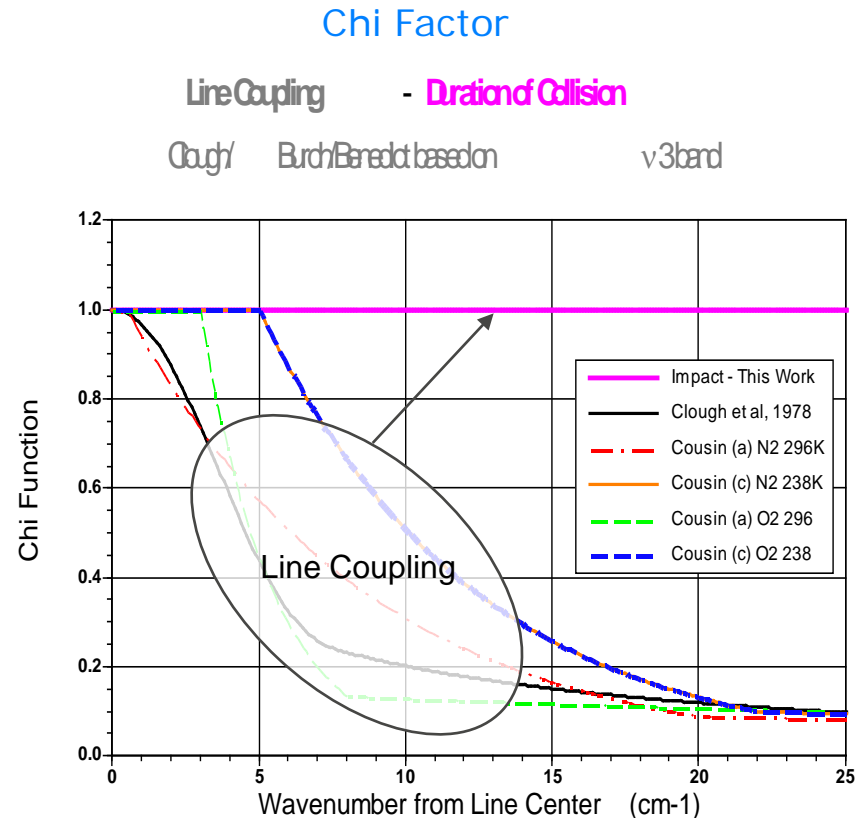
- P, Q, & R line coupling for bands of importance
- [Niro, F., K. Jucks, J.-M. Hartmann](#), Spectra calculations in central and wing regions of CO<sub>2</sub> IR bands. IV :  
Software and database for the computation of atmospheric spectra: J Quant Spectrosc Radiat Transfer., 95, 469-481.
- Niro et al. code modified to generate first order line coupling coefficients,  $y_j$ .
- Works in regular line by line mode with LBLRTM
- Temperatures: 4

## • Line Shape:

- Impact Approximation
- Duration of collision effects under study

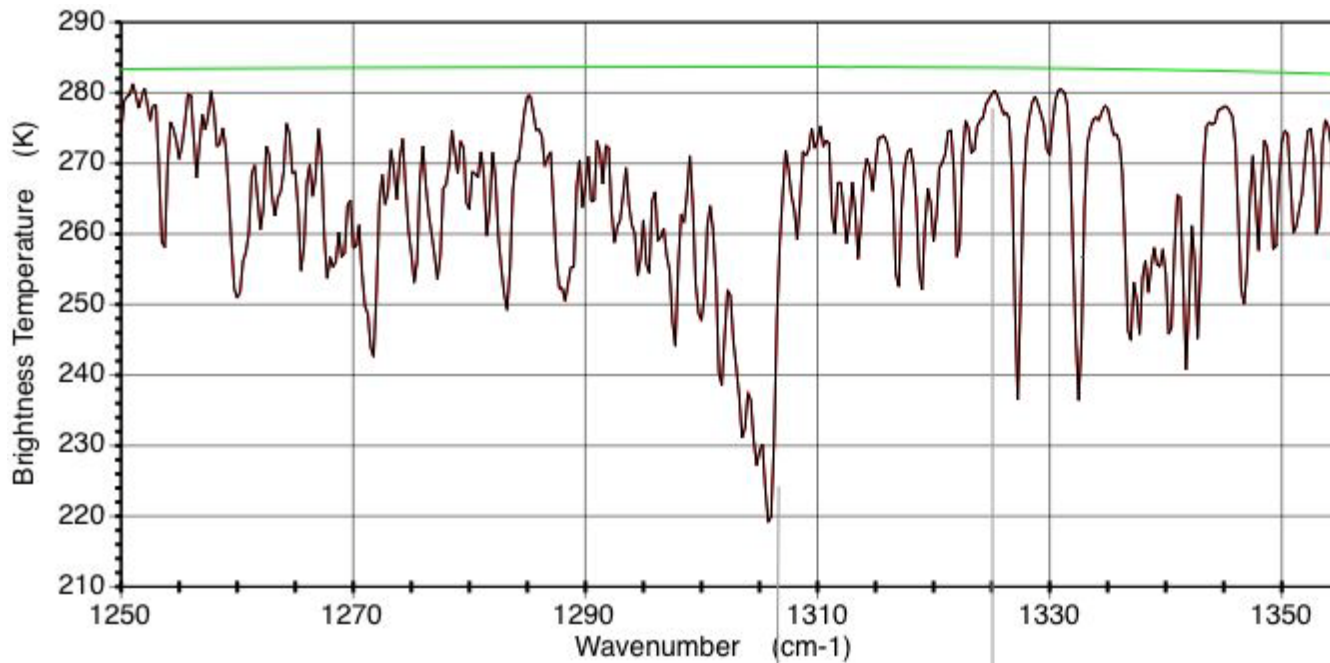
## • Continuum:

- Band head: 2385 cm<sup>-1</sup>

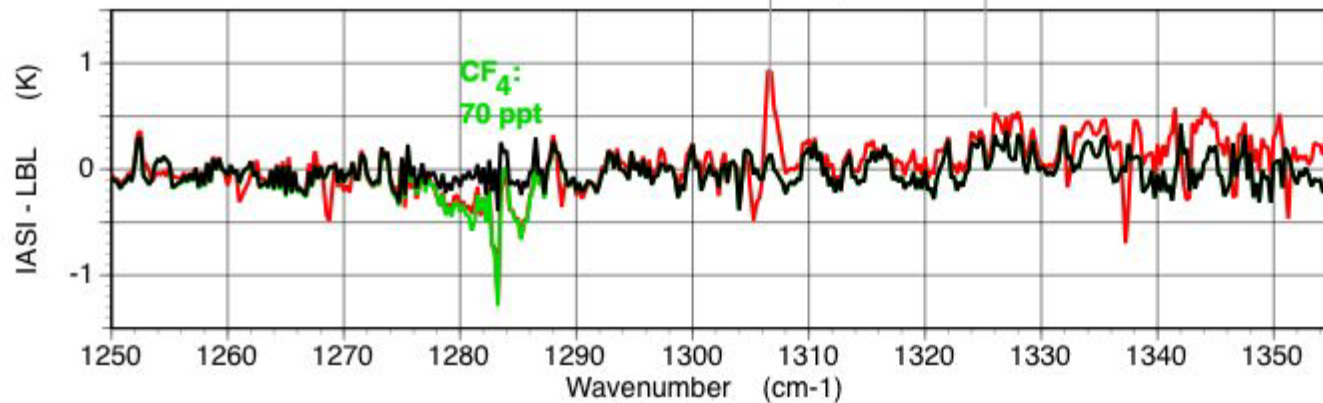


# Line Coupling in Methane

Tran et al., JQSRT, 2006



Ave: 0.035 K  
Std: 0.250 K  
Ave: -0.019 K  
Std: 0.145 K





# Water Vapor: 'The Most Important Greenhouse Gas'

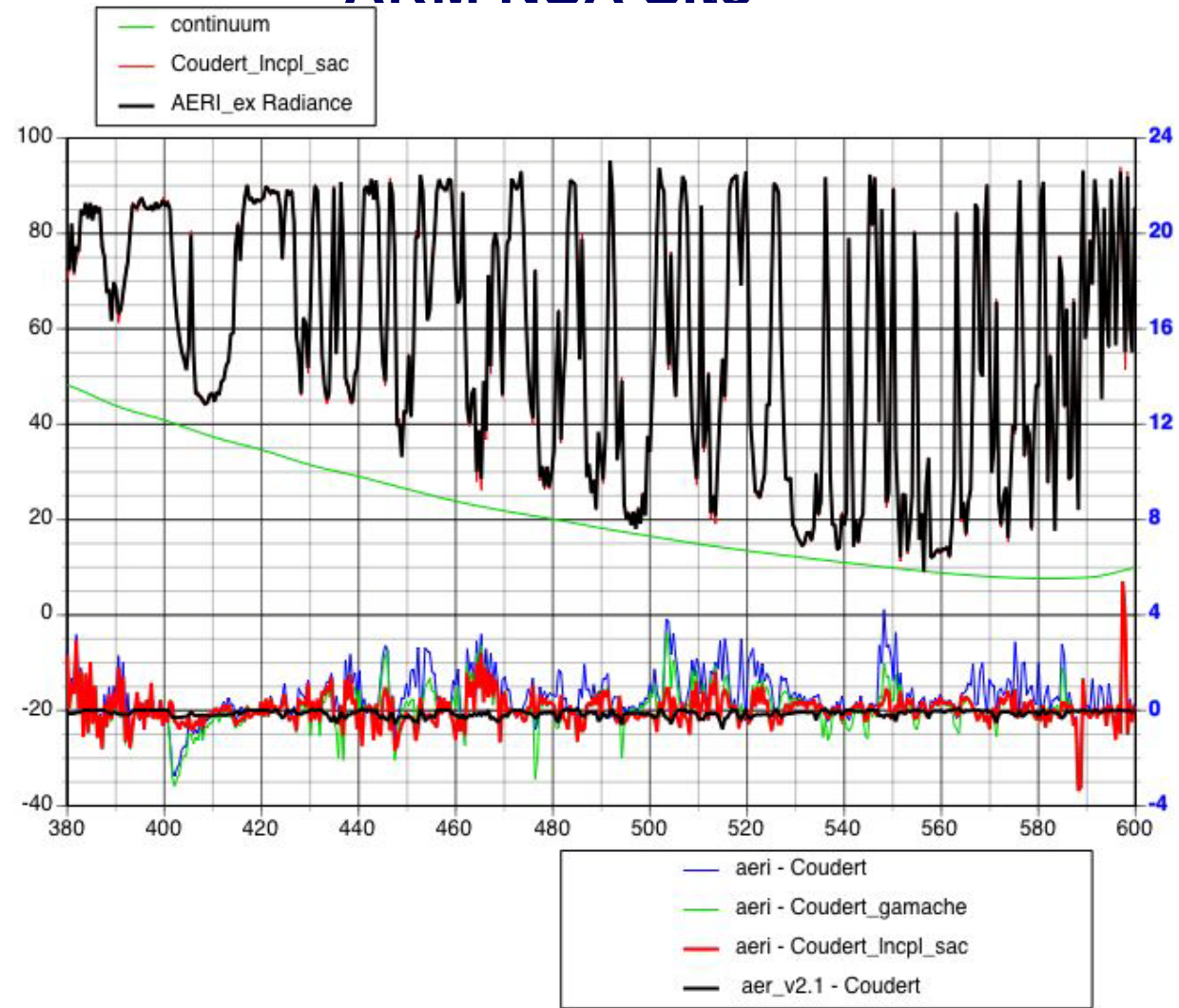
## Critical for NWP and Climate

- **Line Strengths**
  - Laurent Coudert
    - » Strong Lines: Intensities increased by ~ 5 %
- **Line Widths and Shifts / Temperature Dependence**
  - Bob Gamache &
  - [this paper](#)
- **Line Coupling**
  - Linda Brown (accidental two line resonances)
  - [Revised relaxation rates](#)
  - First Order
- **Continuum**
  - **Inextricably linked to the width**
  - mt\_ckd\_2.4 >> 2.5 (water only)
  - [Scaled in selected regions of the water band by ~5%](#)

# AERI Downwelling Radiances I

## ARM NSA Site

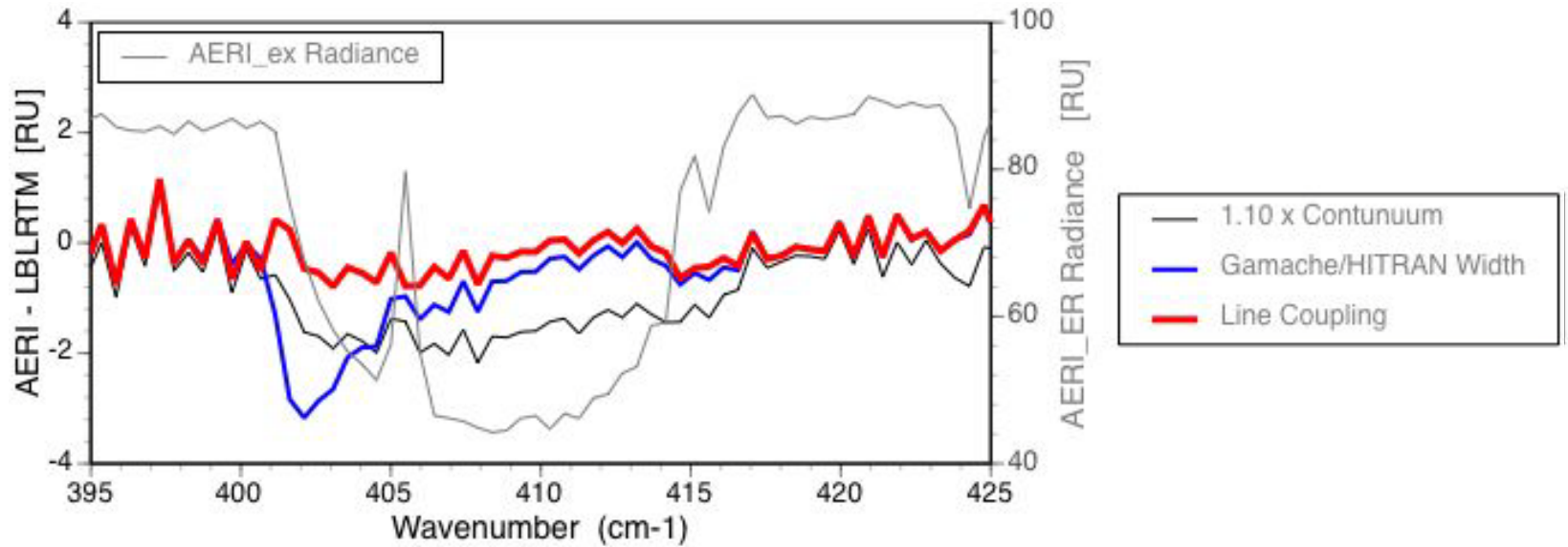
PWV: 1.866 mm



# AERI Downwelling Radiances II

## ARM NSA Site

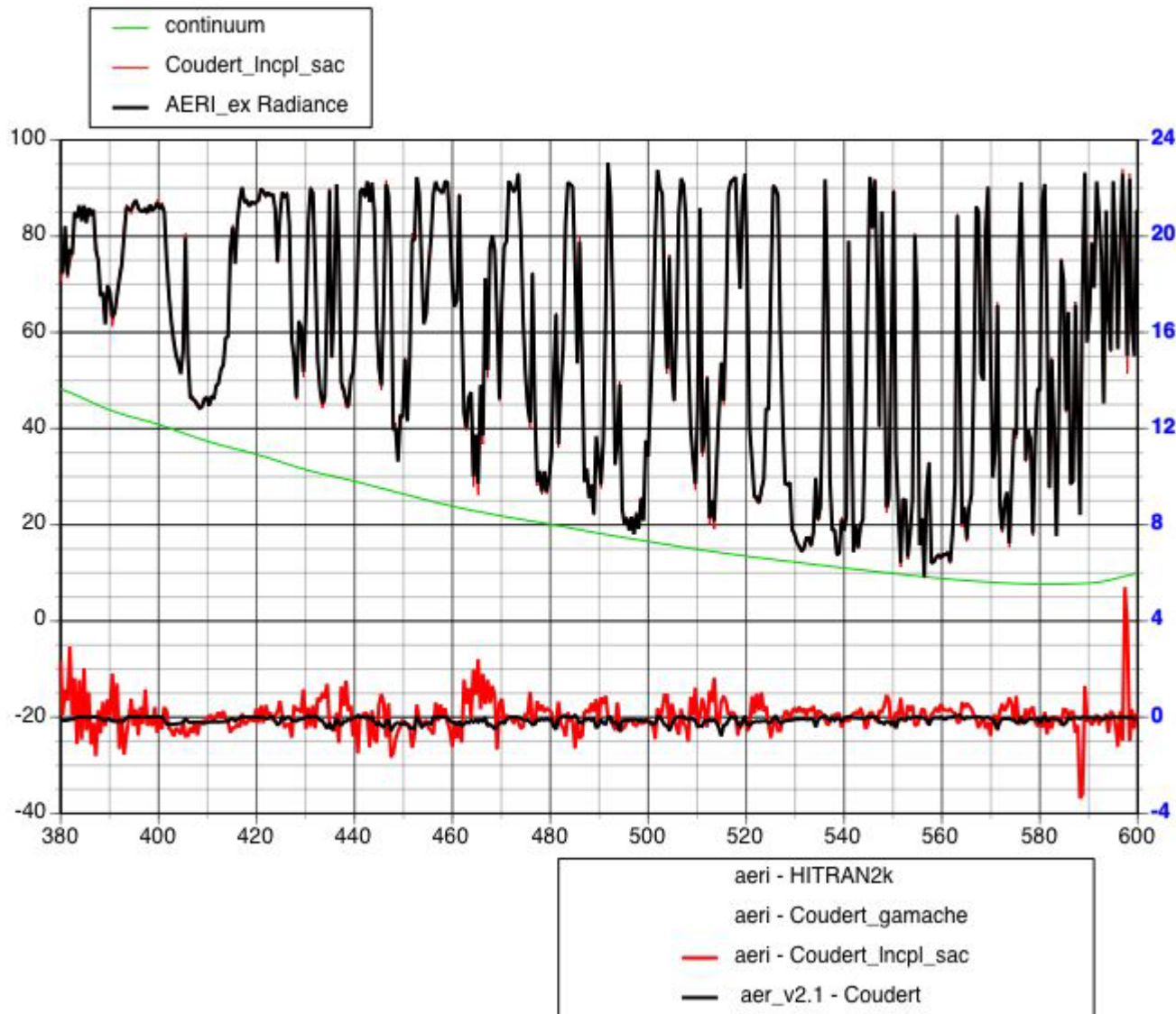
### Line Coupling



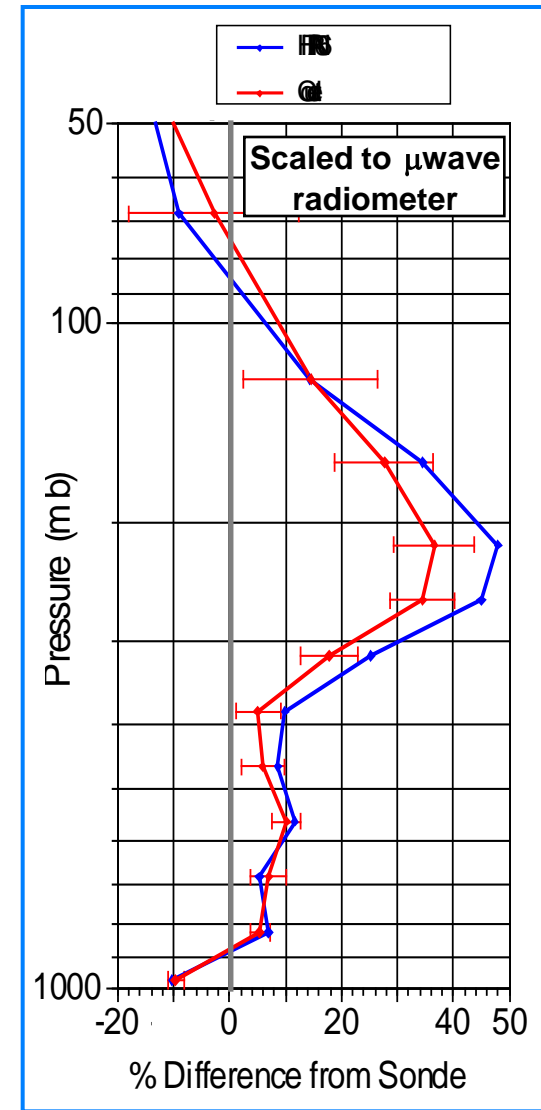
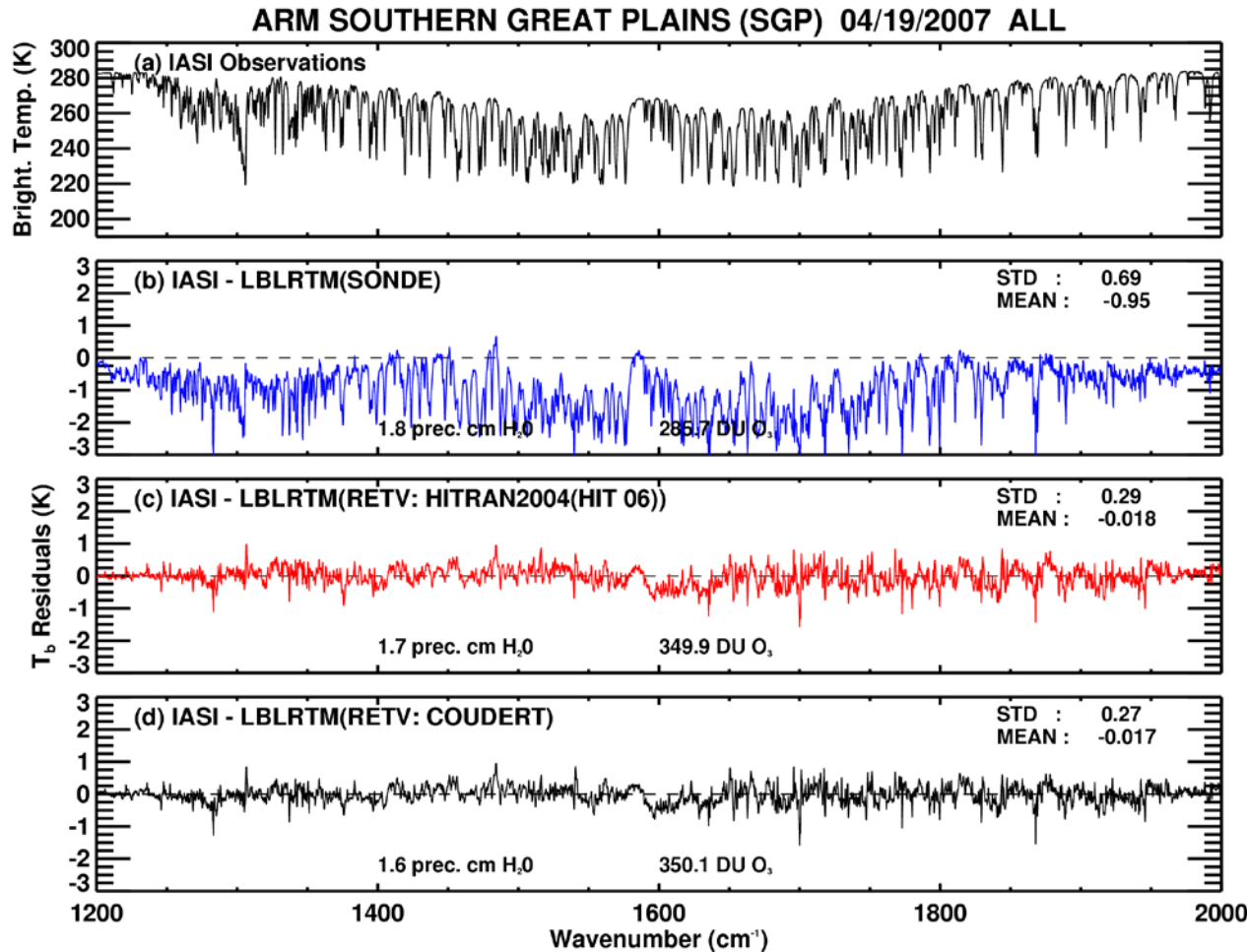
# AERI Downwelling Radiances III

## ARM NSA Site

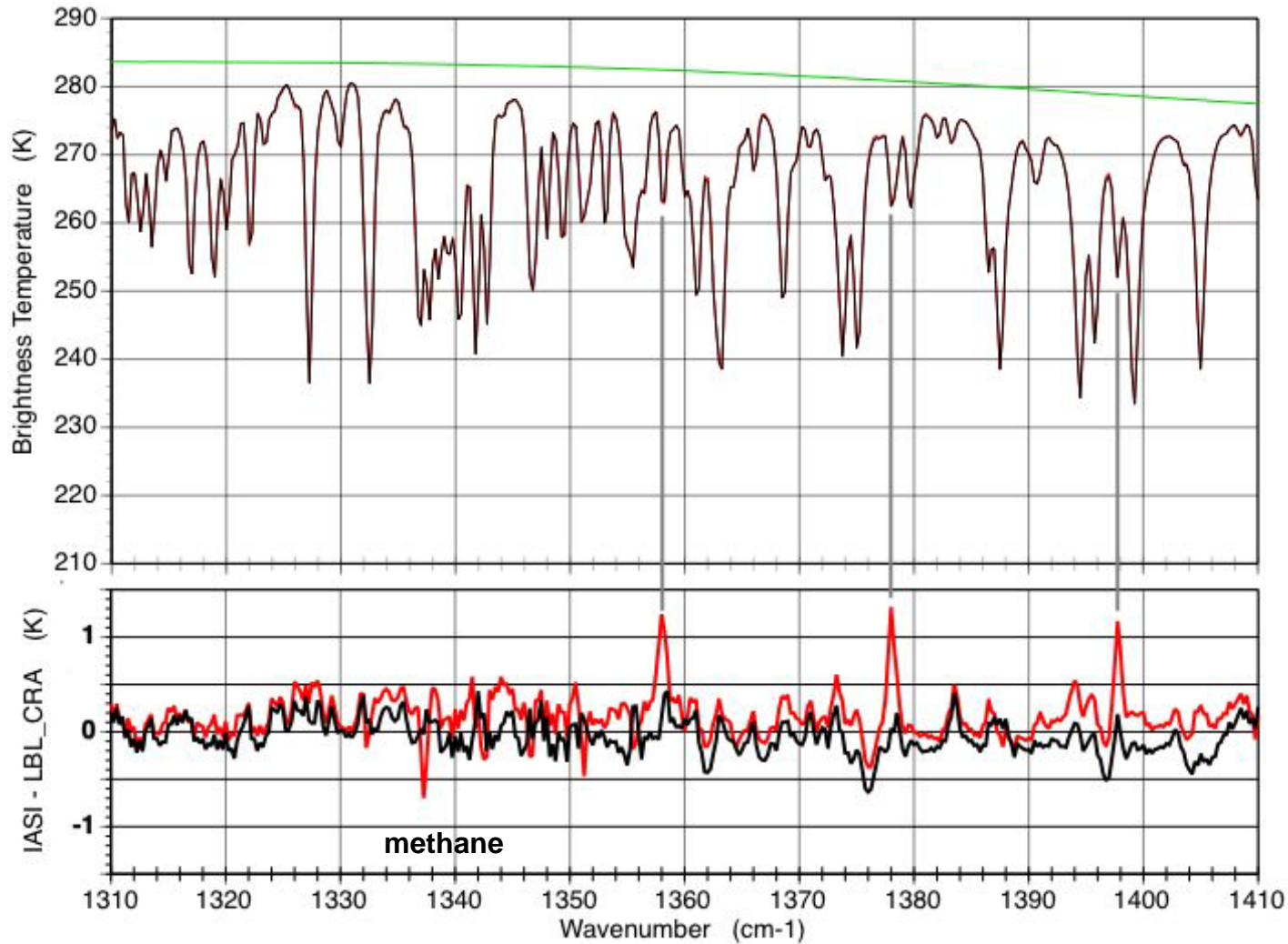
PWV: 1.866 mm



# Water Vapor $\nu_2$ Region : Impact of Coudert Intensities



# Water Vapor P-Branch: 1310 -1410 cm<sup>-1</sup>



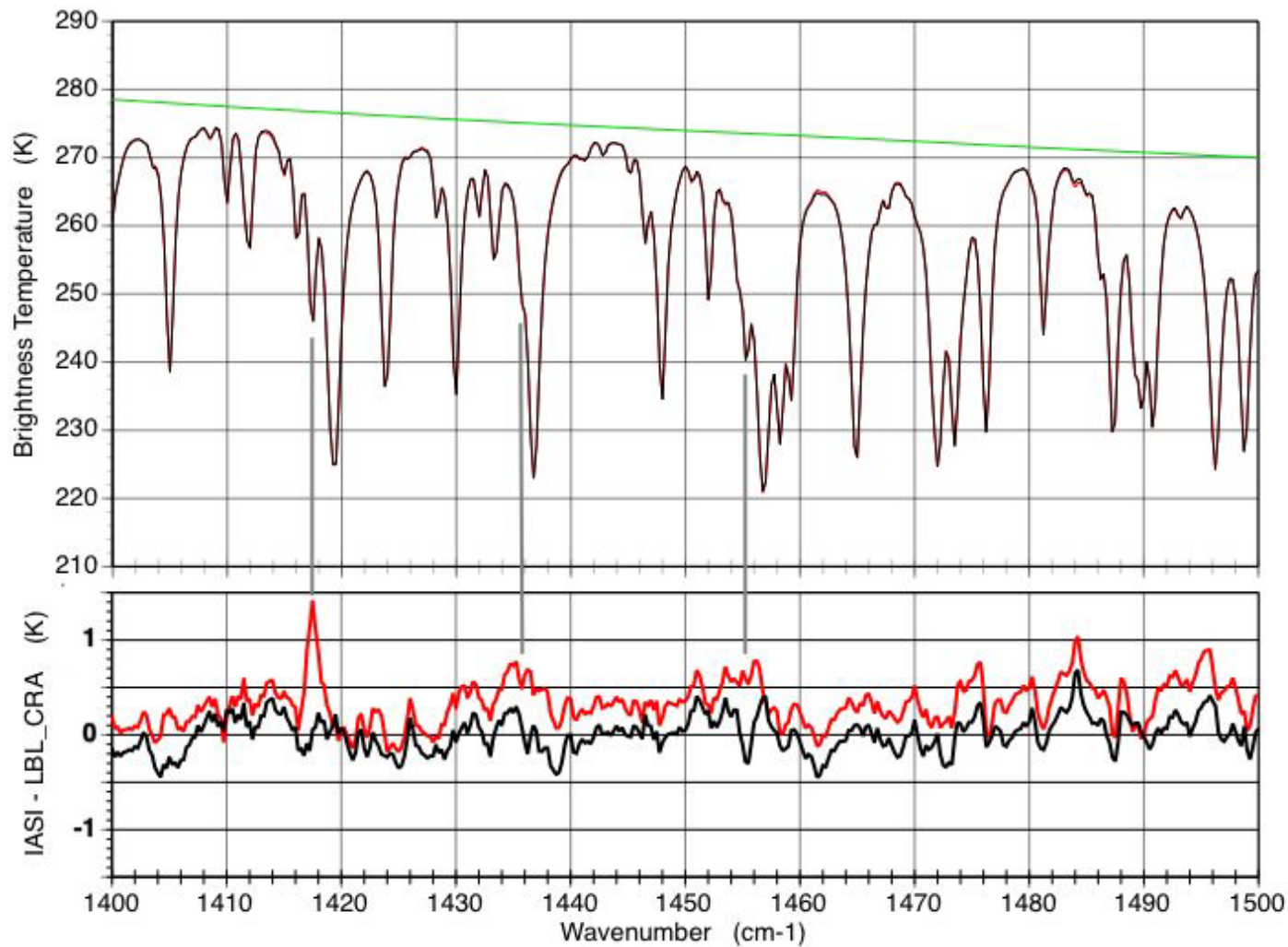
— LBL\_CRA\_cntnm  
— LBL\_CRA\_v1.0  
— IASI

**Widths modified**

Ave: 0.173 K  
Std: 0.225 K  
Ave: 0.044 K  
Std: 0.183 K

— IASI - rev4  
— IASI - LBL\_CRA\_v1.0

# Water Vapor P-Branch: 1400 -1500 cm<sup>-1</sup>



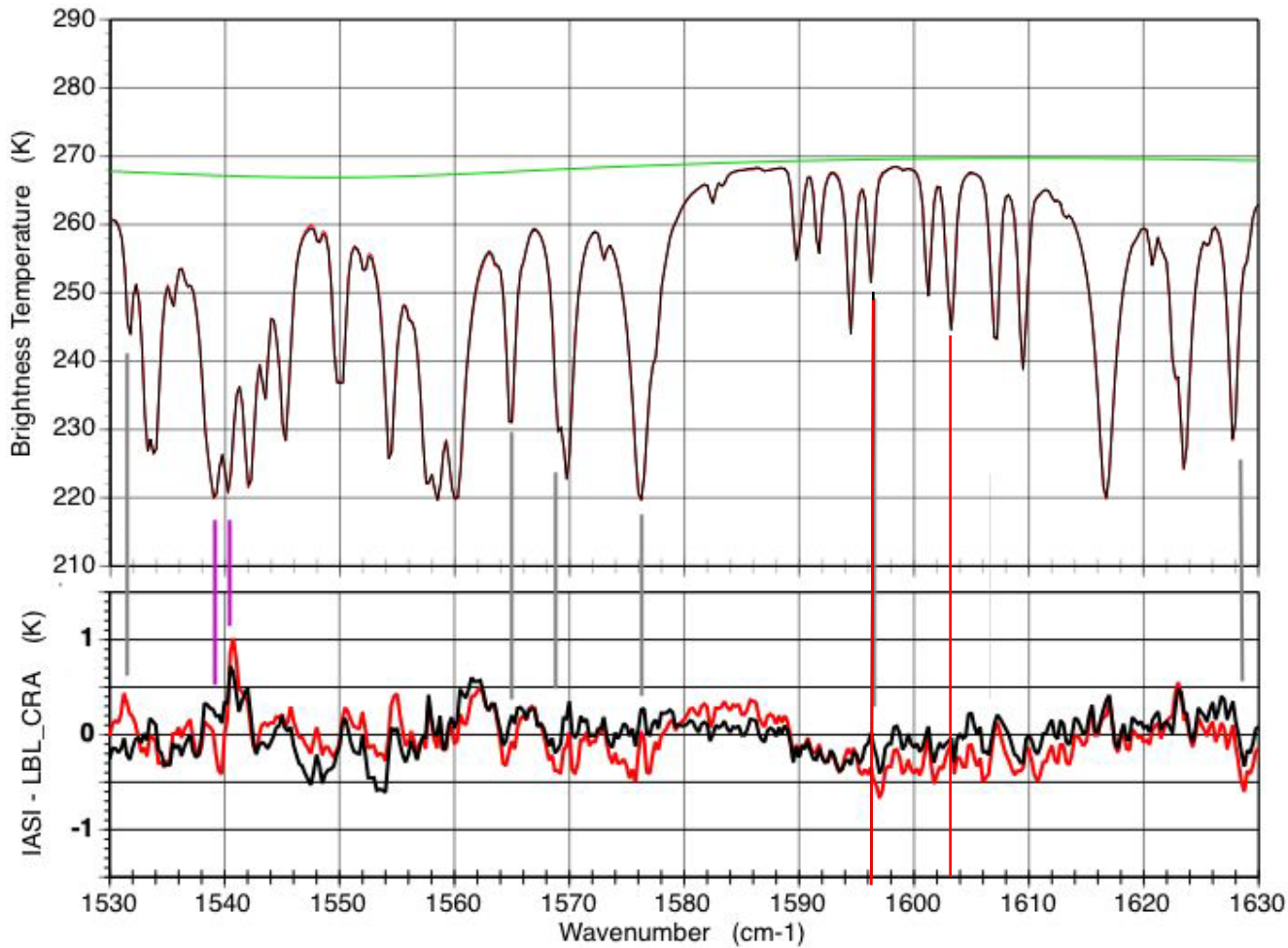
— LBL\_CRA\_cntnm  
— LBL\_CRA\_v1.0  
— IASI

**Widths and Continuum  
modified**

Ave: 0.372 K  
Std: 0.242 K  
Ave: 0.008 K  
Std: 0.190 K

— IASI - rev4  
— IASI - LBL\_CRA\_v1.0

# Water Vapor Band Center: 1530 -1630 cm-1



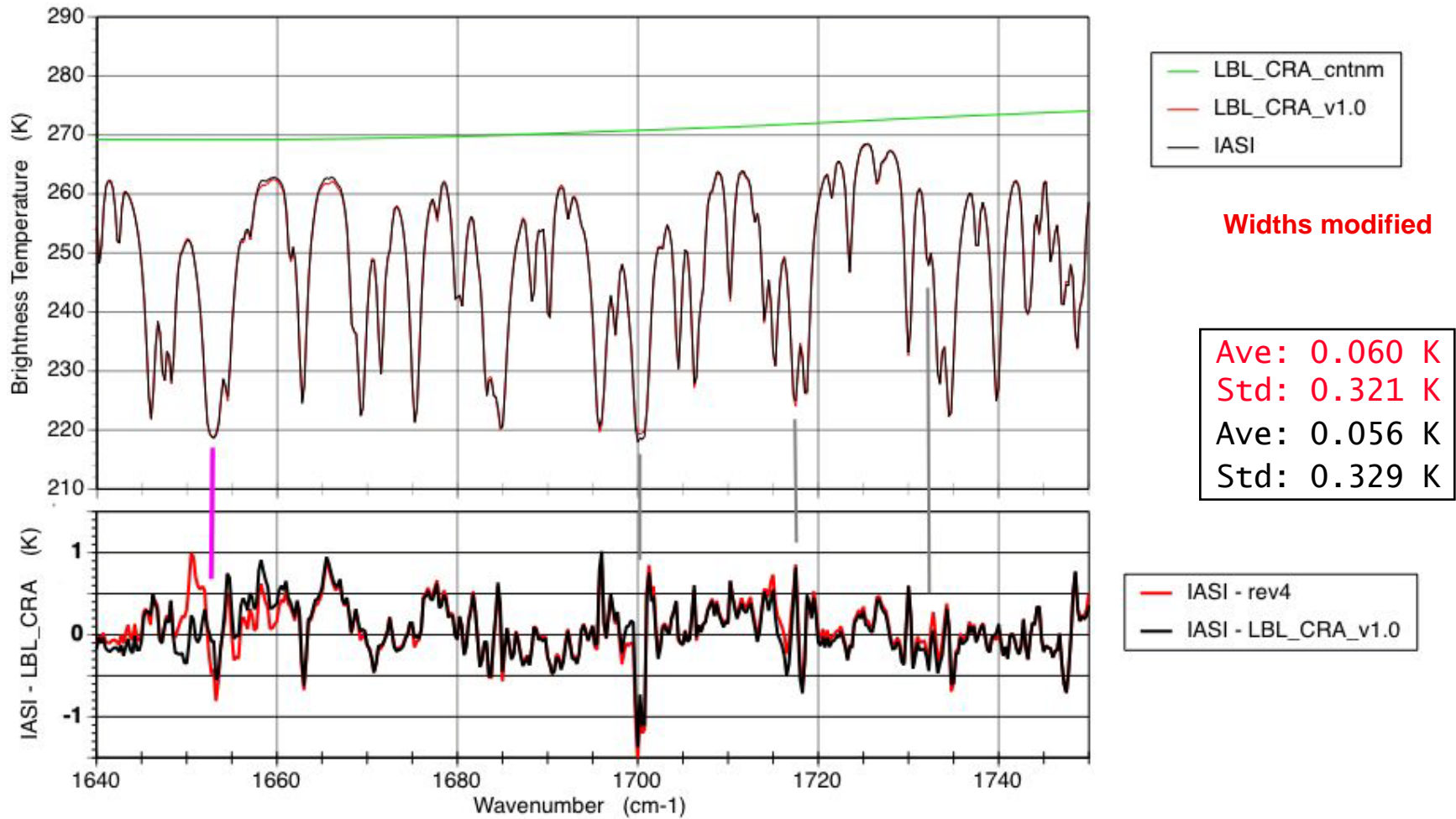
**Widths and Continuum modified**

Ave: -0.047 K  
Std: 0.267 K  
Ave: 0.007 K  
Std: 0.219 K

**Line Coupling  
1540 cm-1**

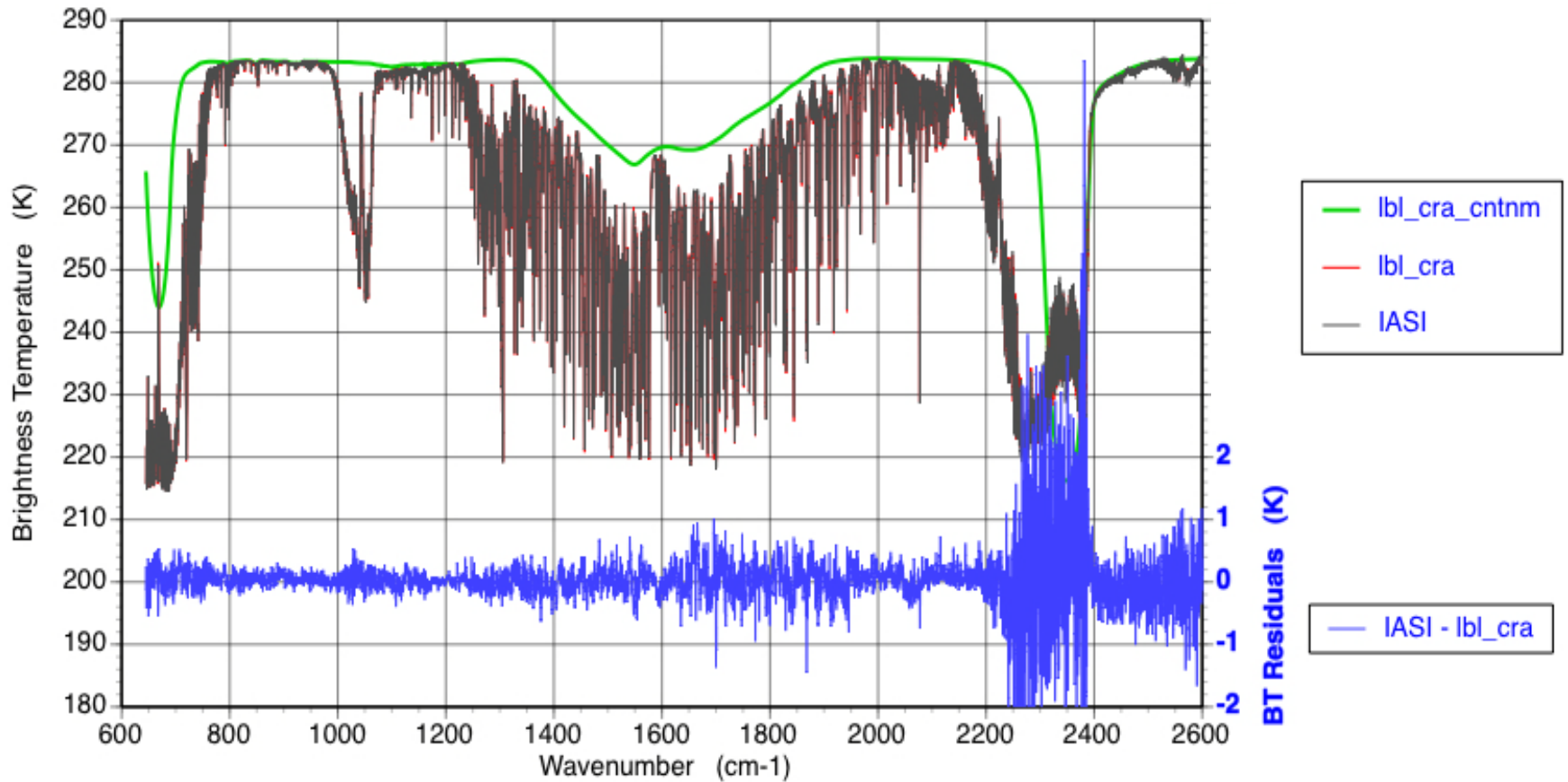


# Water Vapor R-Branch: 1640 -1750 cm-1



# Overall Comparison of LBL\_CRA with IASI

19 Apr 2007 SGP case



# Summary - 1

- **Temperature**

- **Carbon Dioxide**

- » **Line Parameters:** Tashkun et al. JQSRT, 2009
    - » **Line Coupling:**
      - Niro et al., JQSRT, 2005 J.M.Hartmann
      - **Q-Branch 667 cm<sup>-1</sup>:** Niro \* 1.2
    - » **Band Head 2385 cm<sup>-1</sup>** Robust for 19 April and 20 April (low water cases)
      - **Line Coupling > Continuum**
    - » **Good agreement between CO<sub>2</sub>  $\nu_2$  and CO<sub>2</sub>  $\nu_3$**

- **Nitrous Oxide**

- » **Agreement between CO<sub>2</sub>  $\nu_2$  and N<sub>2</sub>O  $\nu_3$  / CO<sub>2</sub>  $\nu_3$**
    - » **N<sub>2</sub>O profile scaling required:** 19 April case: 1.04  
20 April case: 1.02
    - » **N<sub>2</sub>O shows more variability than expected**

- **Methane**

- » **Residuals significantly reduced with line coupling:** Tran \* 1.5
      - Tran et al., JQSRT, 2006 J.M.Hartmann

# Summary - 2

- **Water Vapor**

- » **Sondes provide an excellent first guess / structure** (nothing more)
- » **Coudert strengths**
  - **Residuals unchanged**; retrieved water in upper trop reduced 10%
- » **Widths are the current major issue**
  - **Gamache widths: 350 - 1600 cm<sup>-1</sup>**
  - **Widths of a series of weak high J low Ka P-Branch lines reduced by ~50%**
- » **Widths and continuum are inextricably linked**
- » **Three coupled lines observed so far** (accidental line resonances)
- » **P-Branch has much lower residuals than R-Branch. Why ???**
  - **Gamache Widths ???**
- » **19 April 2007 case is superb for FM improvement**
- » **Due to the resolution of IASI there is a limit to the spectroscopic improvements that can be achieved**

# Summary - 3

- **Next Steps**

- **Resolve R-Branch Issues for water vapor**
- **More Cases**
  - **Night time with high water**
  - **Day time cases for impact of NLTE on 720 cm<sup>-1</sup> Q-Branch**
- **Line Shape issues are the dominant problem**
- **Spectroscopy needs greater support to take full advantage of the data**
- **Thinking of the real world as our laboratory**
- **Implement line parameter retrieval scheme using spectral residuals**

**Performance of LBL\_xxx is generally gratifying  
(said in not quite all modesty?)**

**10 years ago I wouldn't have envisioned that we would be modeling at this level**

# Line Coupling: Accidental Line Resonances

**400 cm-1**

**Tony Clough**

11	398.976493	5.556D-20	2.283E+01.0360.3283	1411.61150.29-.000910	1	1 9 7 2	8 6 3	5552433	5
11	400.221796	1.070D-20	4.643E+00.0791.3009	1216.23130.710.004940	1	110 4 6	9 3 7	5552433-	1
1	<b>1.456529E-01</b>		<b>1.365260E-01</b>	1.300000E-01			<b>1.248789E-01</b>		-1
11	400.481057	1.071D-20	1.636E+01.0510.3009	1474.98080.30-.000770	1	110 6 4	9 5 5	5552433-	1
1	<b>-2.671053E-01</b>		<b>-1.725650E-01</b>	-1.303796E-01			<b>-1.064366E-01</b>		-1
11	1337.897589	9.576D-23	5.903E+00.0261.1905	1806.67180.05-.000970	2	112 012	13 113	3556443	0
<b>Y:</b>	<b>200K</b>		<b>250K</b>	<b>296K</b>			<b>340K</b>		

**1540 cm-1 Linda Brown**

11	1539.060760	2.255D-19	1.153E+01.1053.4643	79.49640.79-.004100	2	1 1 0 1	2 1 2	3555433-	1
1	1.098843E-02		1.048538E-02	1.012000E-02			9.829722E-03		-1
11	1540.299806	1.767D-19	7.175E+00.0971.5173	136.76170.79-.000020	2	1 2 1 2	3 0 3	3577443-	1
1	-1.604015E-02		-1.409560E-02	-1.292537E-02			-1.211058E-02		-1

**1630 cm-1 Linda Brown**

11	1539.060760	2.255D-19	1.153E+01.1053.4643	79.49640.79-.004100	2	1 1 0 1	2 1 2	3555433-	1
1	1.098843E-02		1.048538E-02	1.012000E-02			9.829722E-03		-1
11	1540.299806	1.767D-19	7.175E+00.0971.5173	136.76170.79-.000020	2	1 2 1 2	3 0 3	3577443-	1
1	-1.604015E-02		-1.409560E-02	-1.292537E-02			-1.211058E-02		-1