



# Motivation for an experiment: can we utilize the CrIS short-wave infrared channels in data assimilation?

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STAR Seminar: Wednesday March 6, 2019

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# Topics for today

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- I am discussing the motivation behind an experiment to assimilate the short-wave infrared radiances (SWIR  $\cong$  2000-2800  $\text{cm}^{-1}$ ) from the Cross-Track Infrared Sounder (CrIS)
  - **Topic #1: History of the SWIR instruments**
  - **Topic #2: The Pro's and Con's of using the SWIR**
- The experiment is designed to answer the following questions:
  - Can the SWIR add additional information?
    - **Topic #3: Radiance vs. Brightness Temperature DA**
    - **Topic #4: Spectral Purity**
    - **Topic #5: non-LTE**
  - Can the SWIR replace the LWIR for the next generation of sounding instruments?
    - **Topic #6: What is the future for IR sounding instruments?**

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# **TOPIC #1: A LITTLE HISTORY OF HYPERSPECTRAL SOUNDING INSTRUMENTS**

# 1980's began the launch of microwave and infrared sounders for weather forecasting

- 1977 Lewis Kaplan published idea that SWIR (2000-2800  $\text{cm}^{-1}$ ) has unique sounding properties.
  - See Kaplan, Chahine, Susskind Searl 1977 Applied Optics v.16 p.322-324.
- 1989 Dave Wark writes the NOAA specifications for a hyperspectral infrared sounder

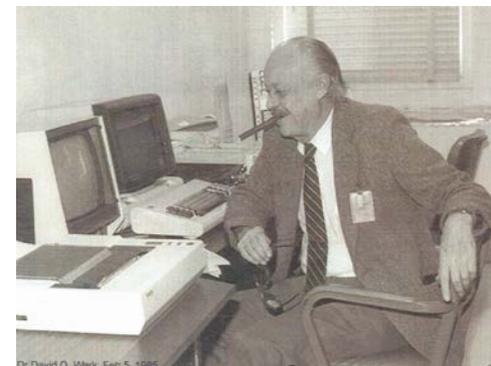
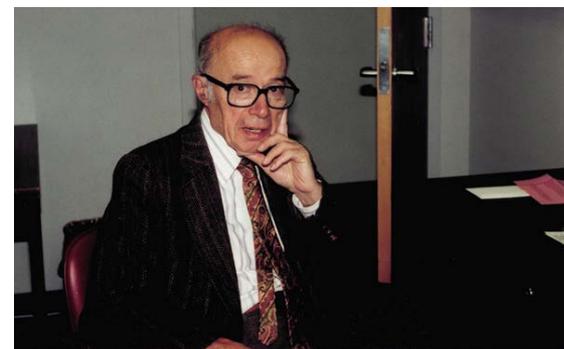


Table 2. Numbers of channels required by NOAA in the sixteen spectral intervals of the AIRS instrument. (DS) indicates double sampling.

Band	Spectral range		No. of channels	
	( $\text{cm}^{-1}$ )	( $\mu\text{m}$ )	Available	Required
<b>Long-Wave Spectrometer</b>				
1.	595.4-886.6	14.56-16.79 (DS)	342	132
2.	686.2-777.4	12.86-14.57 (DS)	299	298
3.	776.8-868.6	11.51-12.87 (DS)	268	94
4.	867.8-959.4	10.42-11.52	120	23
5.	958.5-1050.1	9.52-10.43	109	37
6.	1050.1-1141.2	8.76-9.52	99	24
7.	1139.9-1231.2	8.12-8.77	92	29
8.	1231.2-1322.4	7.56-8.12	85	32
<b>Short-Wave Spectrometer</b>				
1.	1322.4-1522.3	6.55-7.56	172	172
2.	1524.0-1729.6	5.78-6.56	151	150
3.	1726.6-1930.0	5.18-5.79	133	132
4.	1930.0-2131.6	4.69-5.18	119	78
5.	2131.6-2335.8	4.28-4.69	109	43
6.	2330.4-2537.4	3.94-4.29 (DS)	204	63
7.	2537.4-2739.0	3.65-3.94	91	52
8.	2739.0-2940.4	3.40-3.65	85	42
Visible			Not specified	

Makes use of Kaplan's idea of using SWIR  $\text{CO}_2$  band

# 1990's: The AIRS Science Team is formed and implements the NOAA requirements

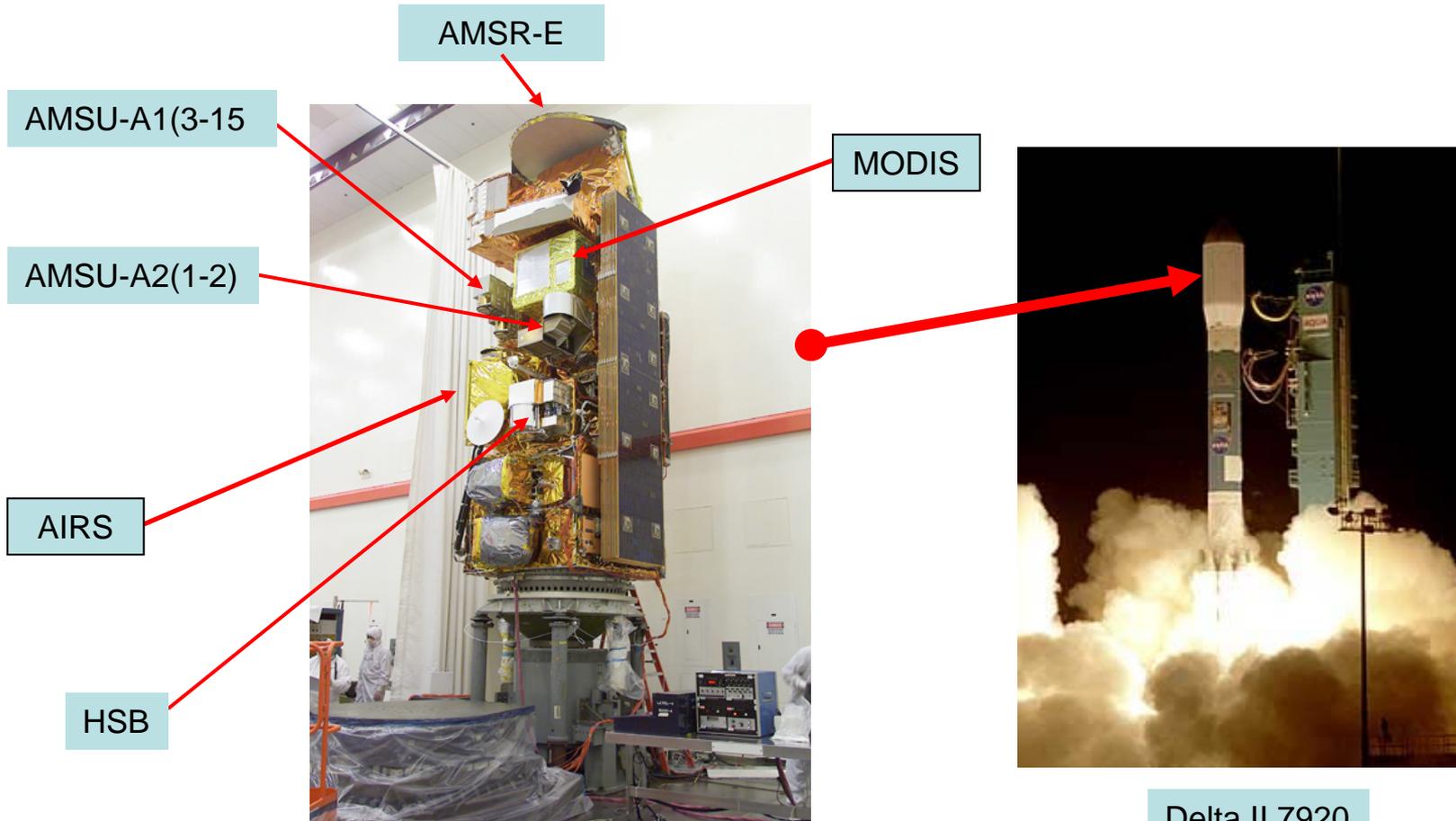
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- Advanced the design of microwave + infrared advanced sounding instruments.
- Developed advanced forward models for the microwave and infrared.
  - *Major investment in low noise, high spectral resolution SWIR*
- Developed an algorithm approach that merged numerous concepts, *including the use of the SWIR for sounding.*



David Wark, Bill Smith   Phil Rosenkranz   Larrabee Strow   Catherine Gautier   Larry McMillin   Alain Chedin  
Hank Revercomb   Roberto Calheiros   Joel Susskind   Moustafa Chahine   Mitch Goldberg   George Aumann

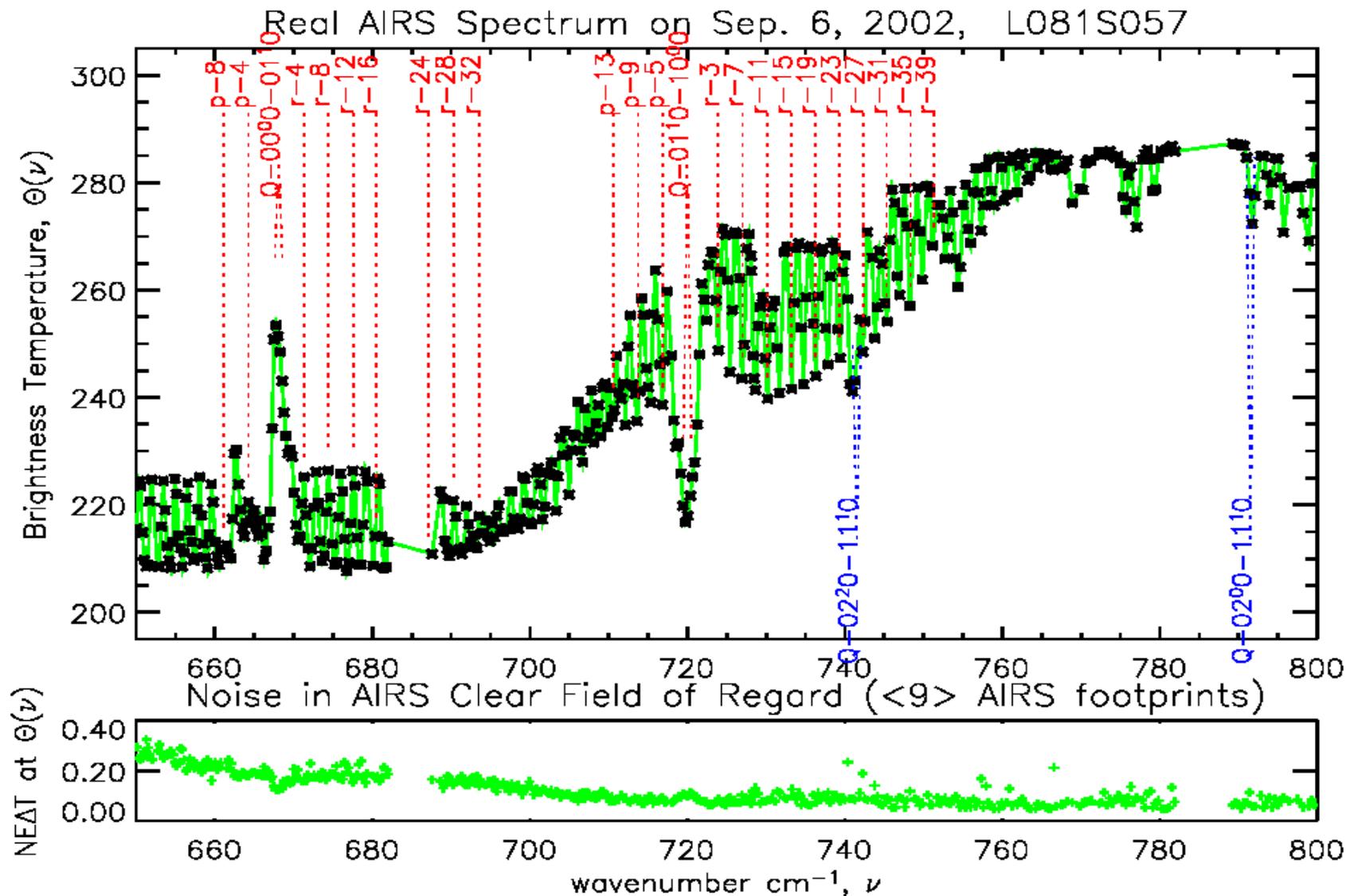
# The first (and only) AIRS instrument was launched on the NASA EOS Aqua Platform May 4, 2002



Aqua Acquires 325 Gb of data per day

**AIRS Version.5, fully exploiting the SWIR and the basis for NUCAPS, has been operational at NASA since 2007**

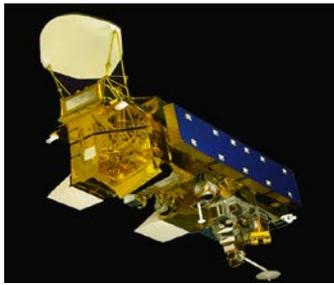
# Example of 15 $\mu\text{m}$ band radiance measurement from AIRS 1<sup>st</sup> operational day, Sep. 6, 2002



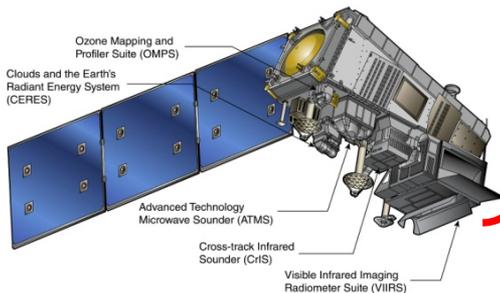
# The NOAA-Unique Combined Atmospheric Processing System (NUCAPS) was envisioned in late 1990's.

## *NUCAPS leverages the lessons learned by NASA AIRS Team*

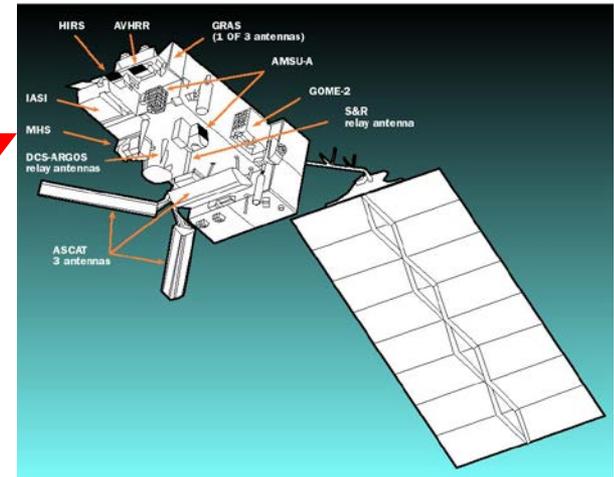
NASA/Aqua  
1:30 pm orbit  
(May 4, 2002)



Suomi-NPP & JPSS  
1:30 pm orbit  
(Oct. 28, 2011, Nov. 18, 2017, 2021)



9:30 and 1:30 orbits provide information at critical times in the diurnal cycle



**EUMETSAT/METOP-A,B, C**  
9:30 am orbit  
(Oct. 19, 2006, Sep. 17, 2012, Nov. 7, 2018)

Office of Satellite Applications and Research

**Research Project Plan (RPP)**

**Radiance Products and Atmospheric Soundings from Advanced Infrared and Microwave Sensors for Weather and Climate Applications.**

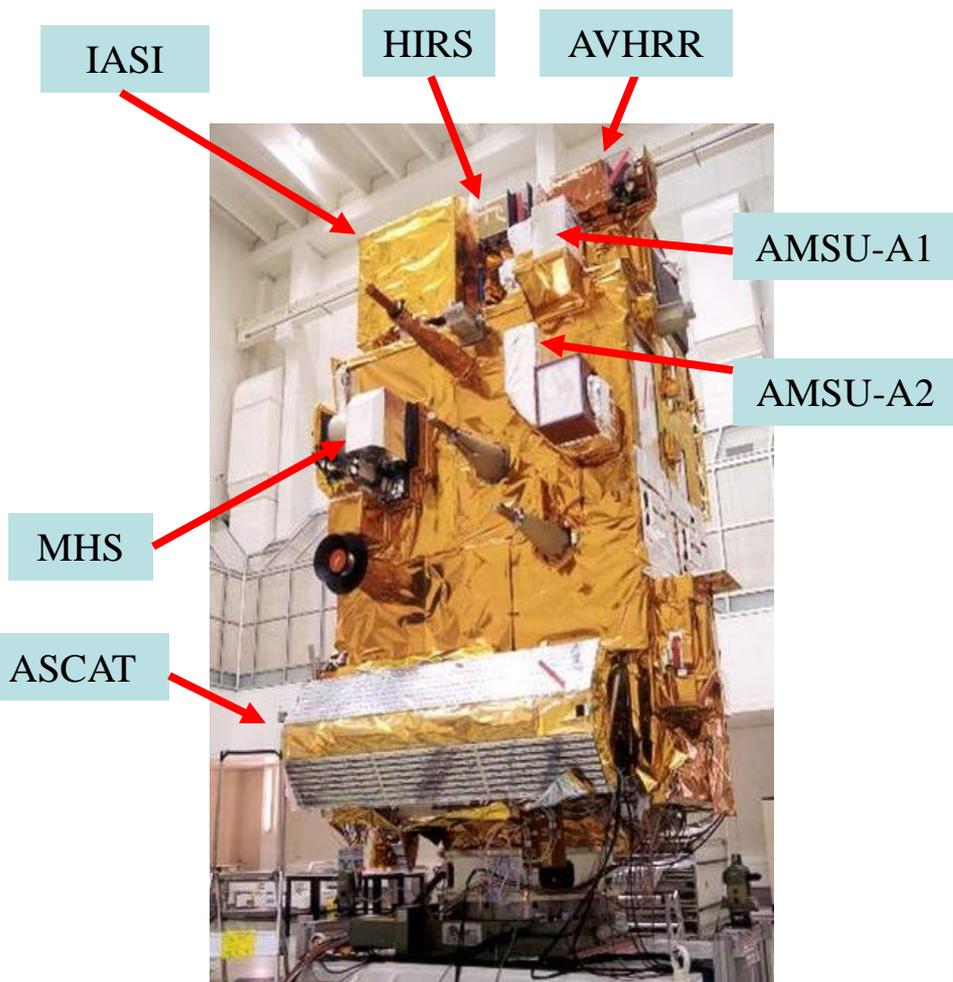
May 19, 2004



Prepared by:  
Christopher D. Barnett

Discussions at 1999 ITOVS and OSA meetings led to the 2004 NOAA Research Plan to implement NUCAPS

# First IASI instrument was launched on the EUMETSAT MetOp-A Satellite on Oct. 19, 2006



Soyuz 2/Fregat launcher,  
Baikonur, Kazakhstan

**NUCAPS, using IASI SWIR, has  
been operational since Dec. 2008**

# First CrIS/ATMS was launched on the NPP Satellite on Oct. 28, 2011

VIIRS

CrIS

ATMS

OMPS  
Nadir, limb

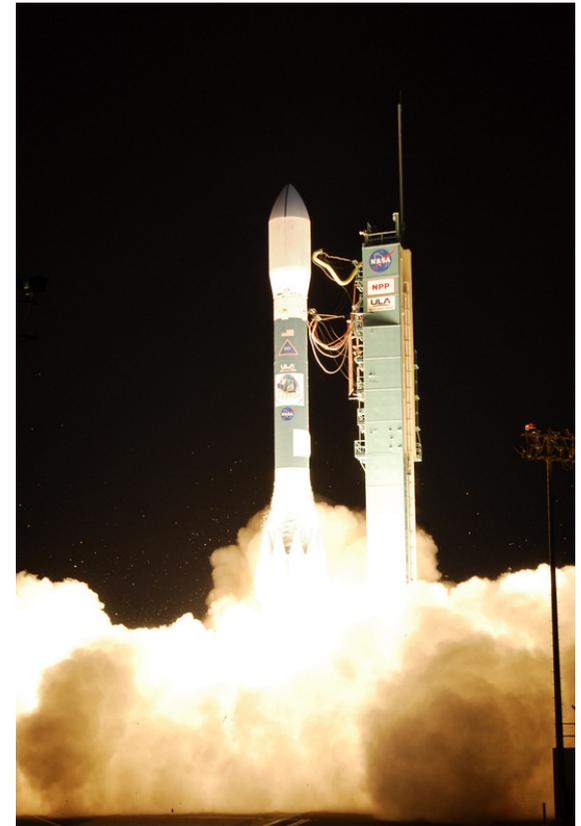
S-band C+T  
Antenna

X-band DB  
Antenna

CERES

X-band 300  
Mb/s Antenna

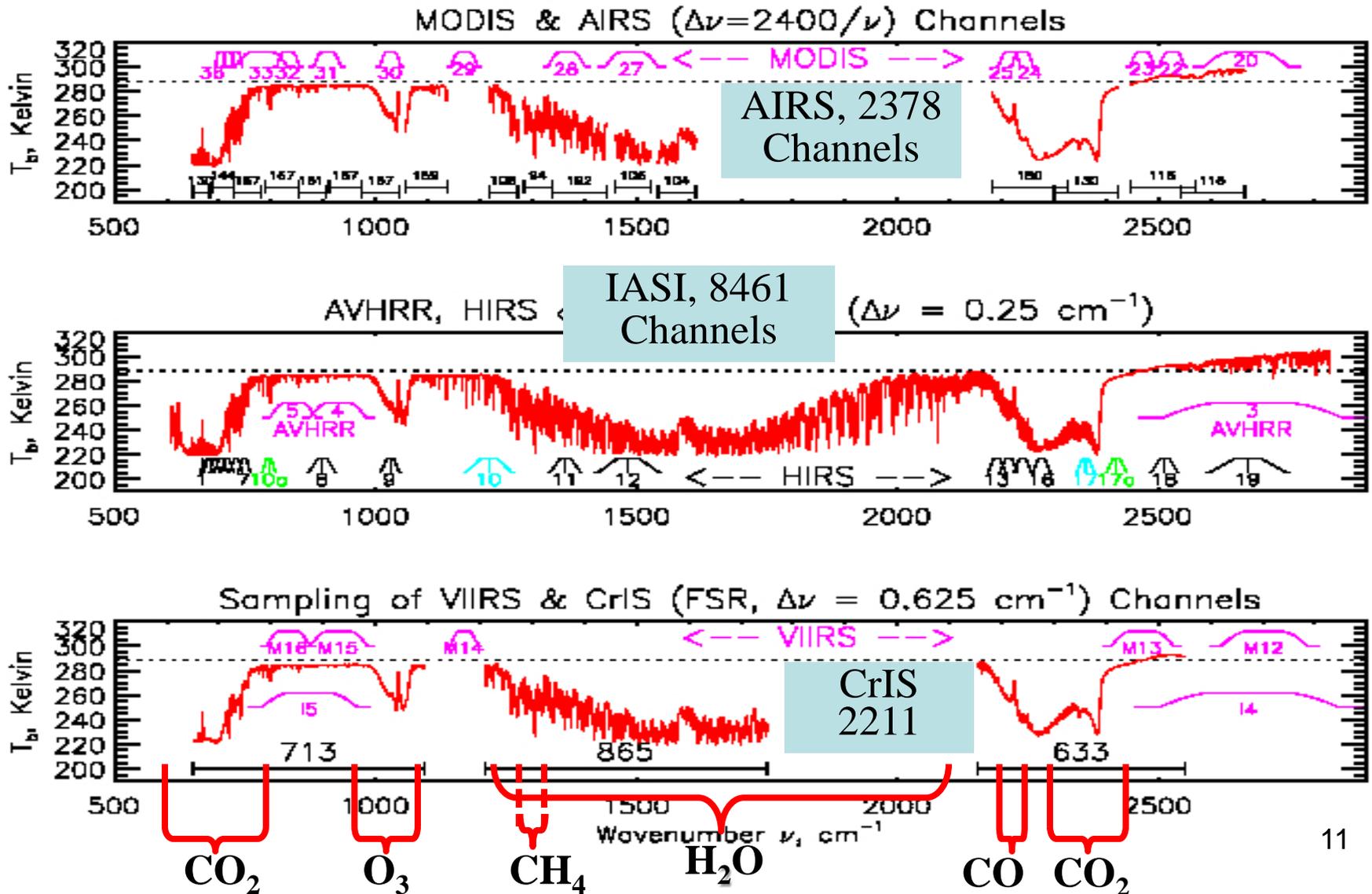
OMPS  
(electronics)



Delta-II-7920

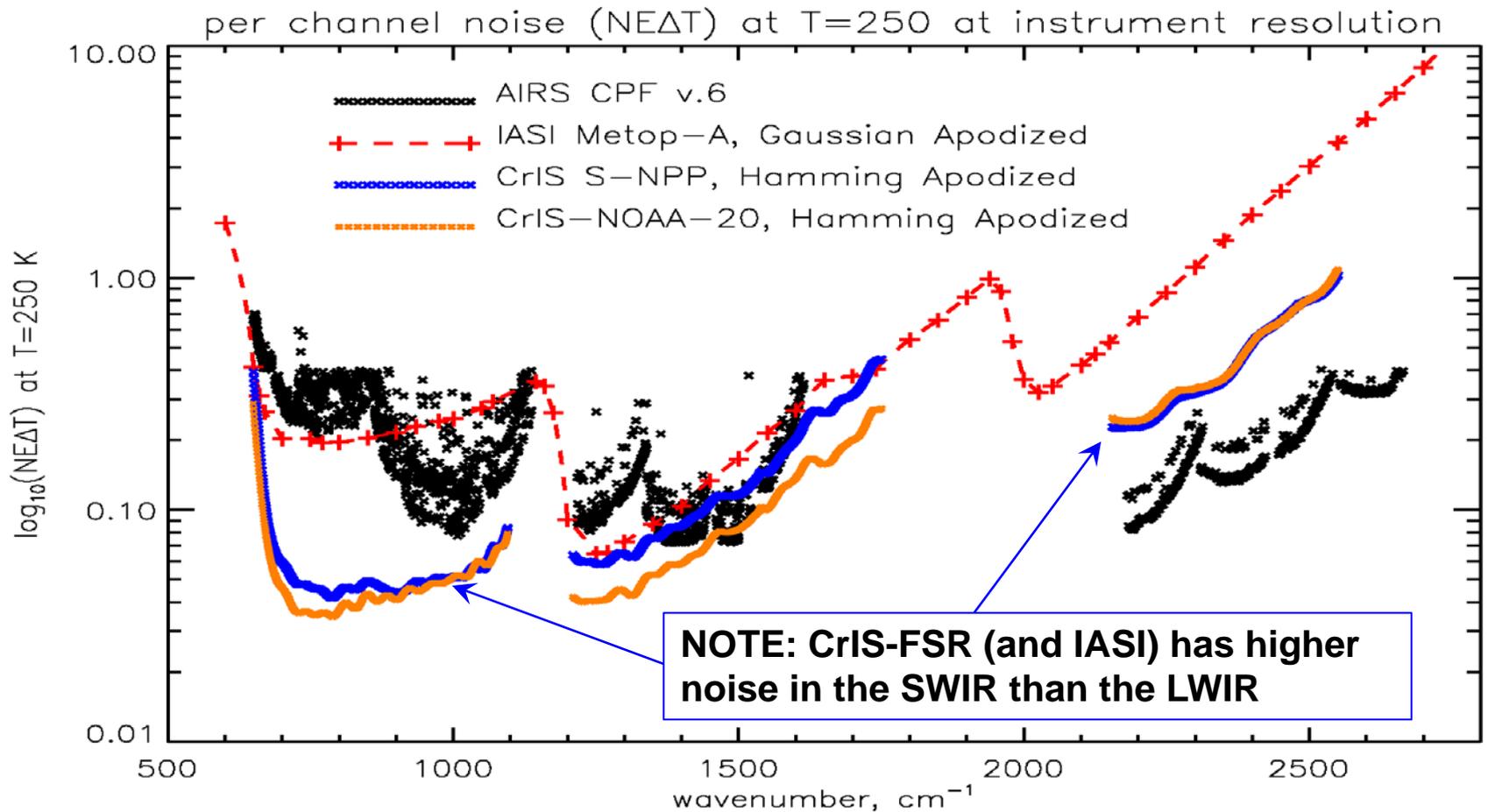
Vandenberg AFB

# Spectral Coverage of Thermal Sounders & Imagers (Aqua, Metop-A,B,C, Suomi-NPP, NOAA-20+)



# What is important for sounding is signal to noise

Per channel noise is shown as noise equivalent delta temperature (NE $\Delta$ T) at a cold scene temperature (T=250 K)



# So where are we today?

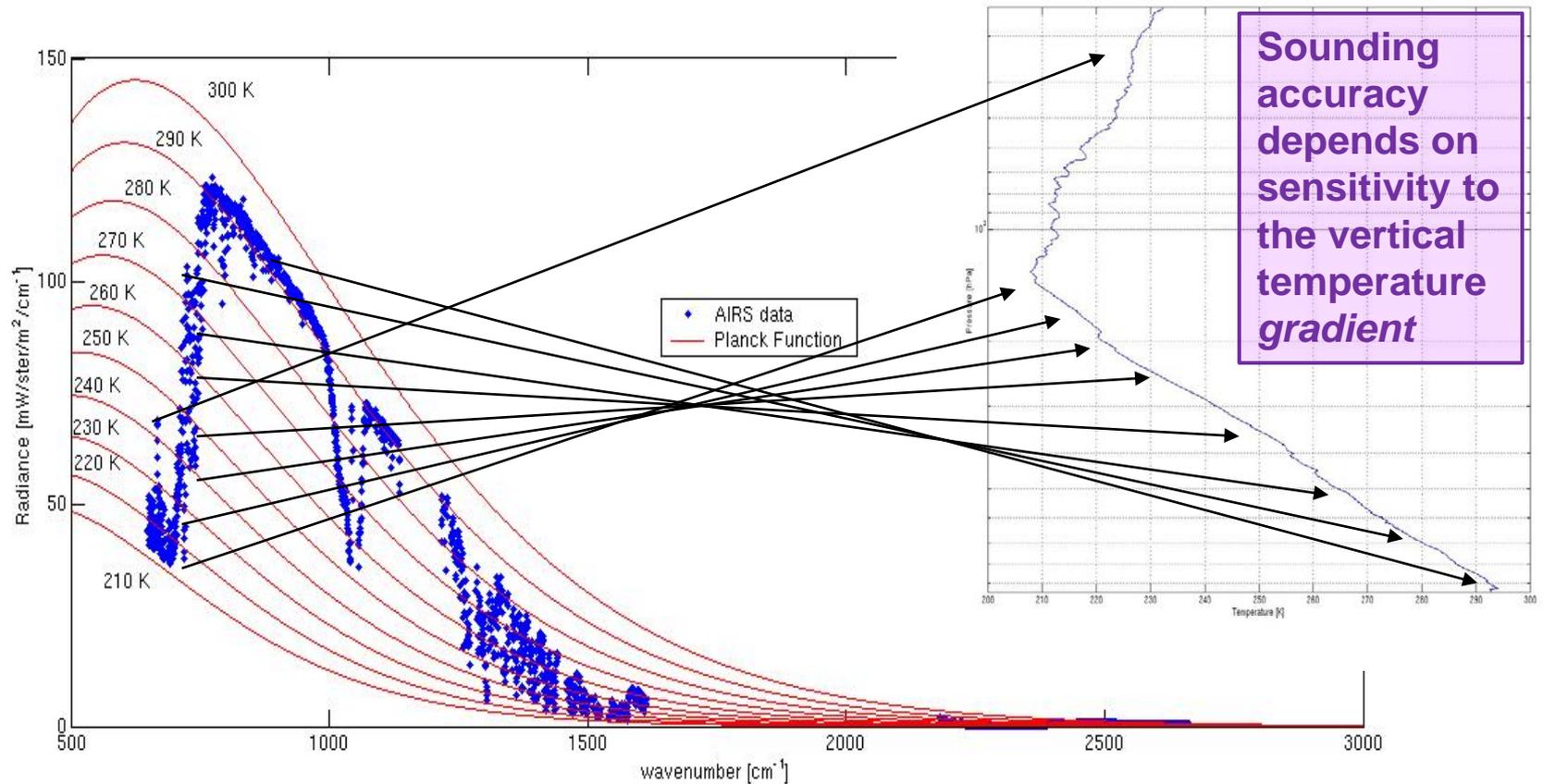
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- It has been 42 years since Kaplan, Chahine and Susskind noted the advantage of the SWIR in sounding.
- It has been 30 years since Dave Wark wrote the hyperspectral sounding requirements.
- It has been 16 years since the AIRS ST demonstrated the benefits of the SWIR.
- It has been 14 years NOAA laid out a plan to exploit 30+ years of hyper-spectral assets with the lessons learned from the AIRS ST

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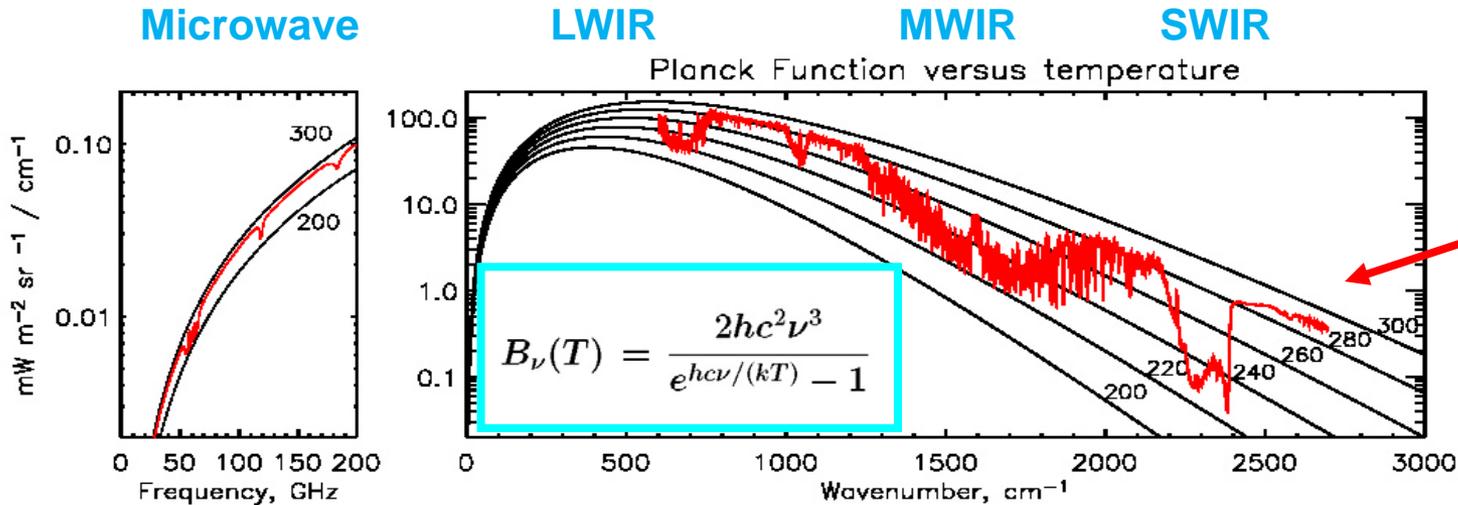
# **TOPIC #2: SO LET'S TALK ABOUT THE PRO'S AND CON'S OF USING THE SWIR**

# The Advantage of High Spectral Resolution is improved Vertical Resolution (selectivity)

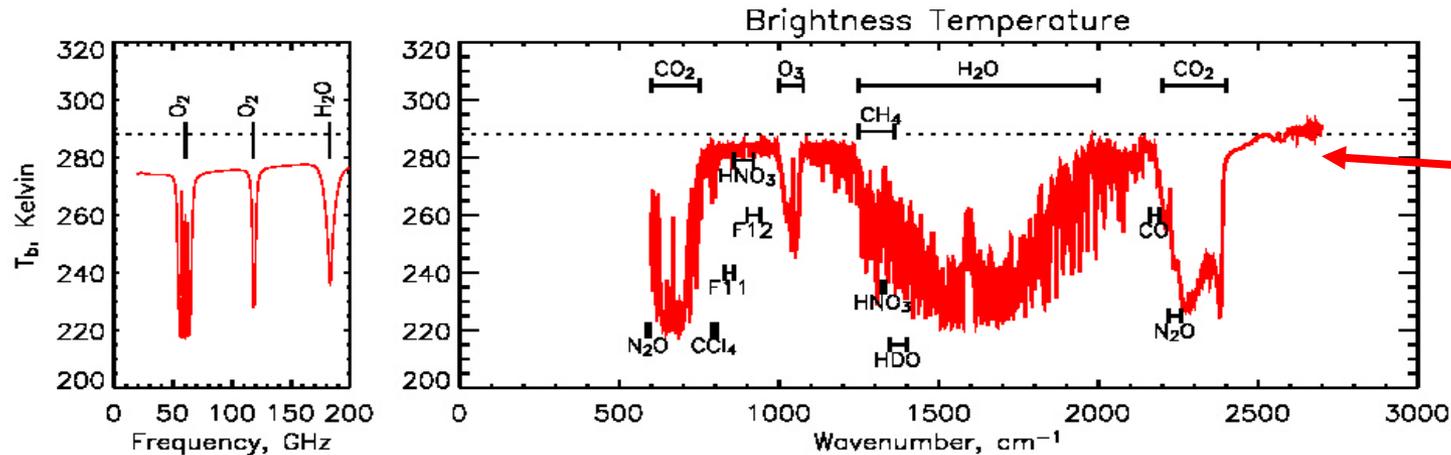


Sampling over rotational bands

# These instruments really measure radiance that is, energy/time/area/steradian/frequency-interval



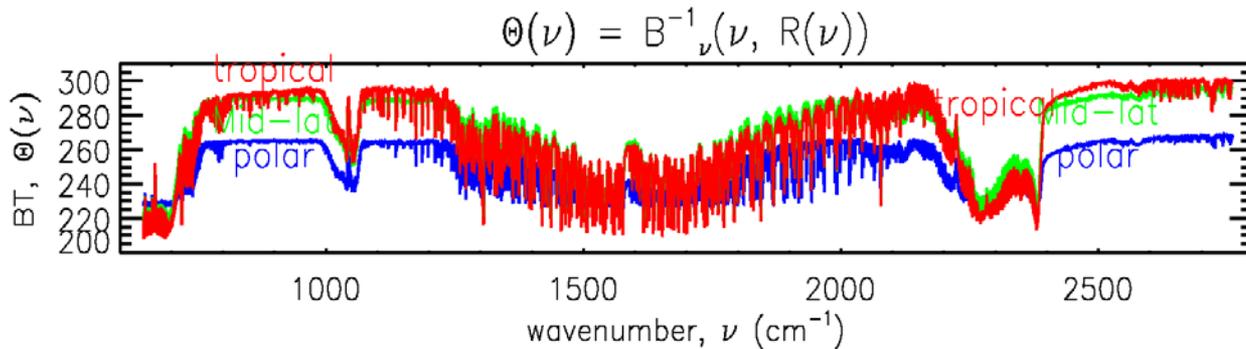
This is what we really measure.



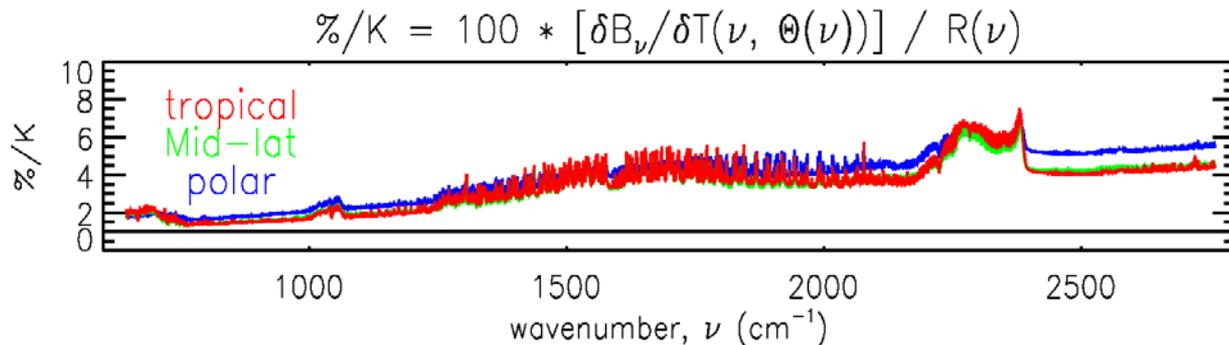
This is how we usually show it.

To Convert to Brightness Temperature ≡ Find Temperature where the Planck Function is equal to measured radiance at a given frequency.

# The SWIR is ~3x more sensitive due to the non-linearity of Planck function

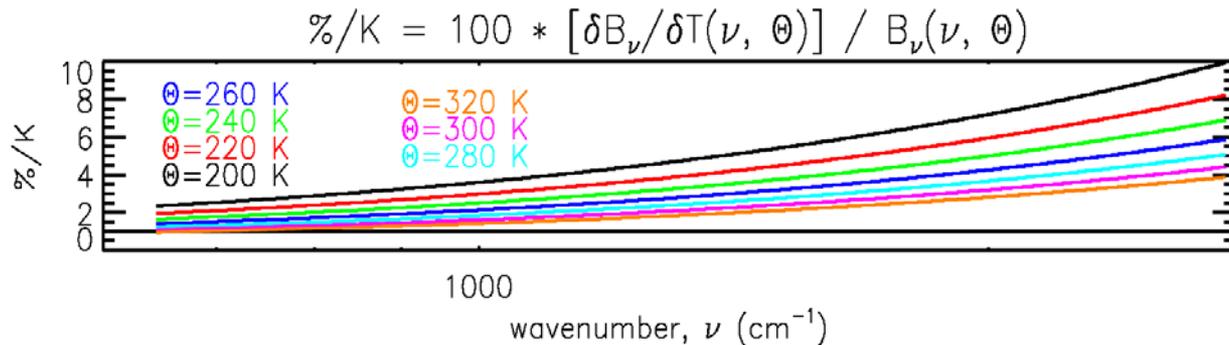


**Example Brightness Temperature for Polar, Mid-Lat, and Tropical cases**



**% change in radiance for a 1 K change in T**

**SWIR changes 4-6%/K  
LWIR changes 1-2 %/K**

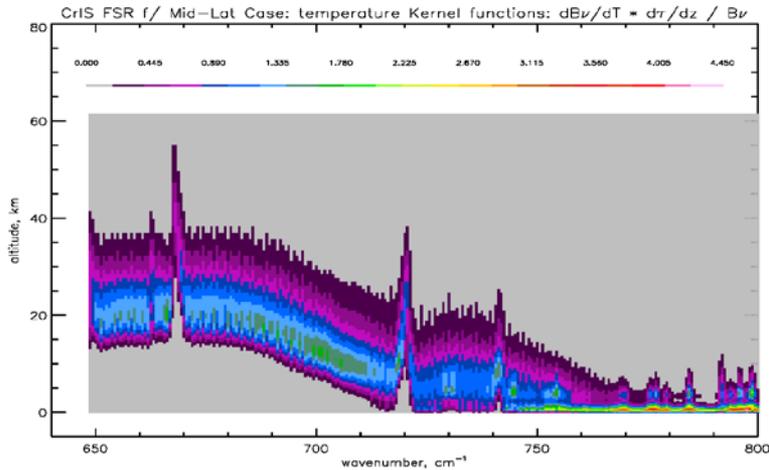


**This is due to the derivative of the Planck function**

**Cold scenes are significantly more sensitive.**

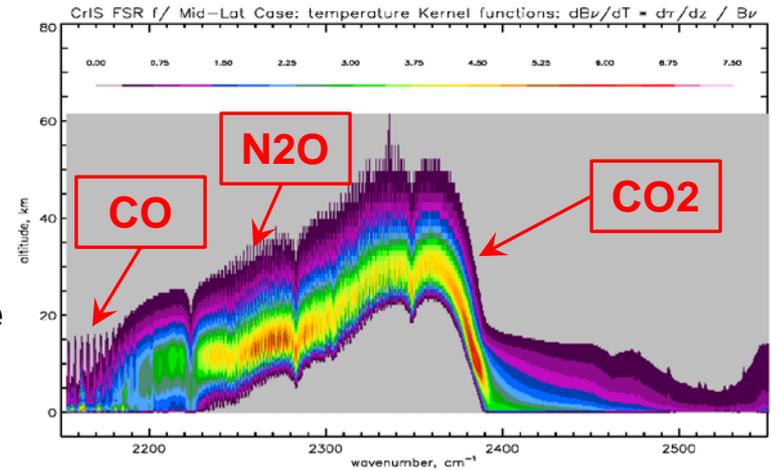
# The CrIS FSR LWIR & SWIR Temperature (top) and Moisture Channel Kernel Functions

## LWIR (15 $\mu\text{m}$ , 650-800 $\text{cm}^{-1}$ )

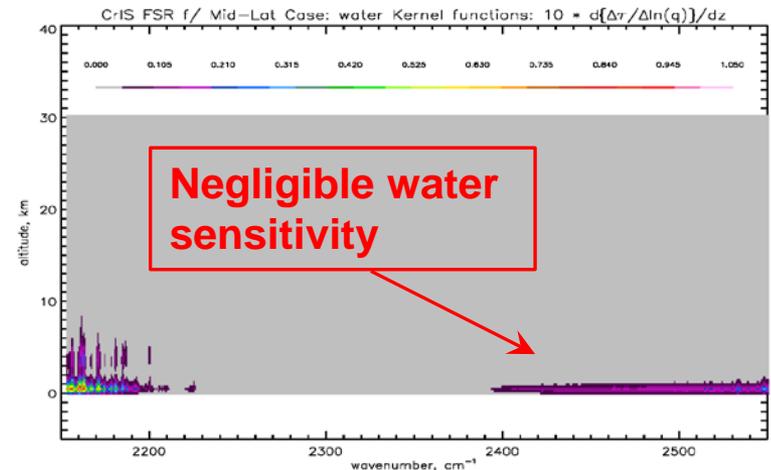
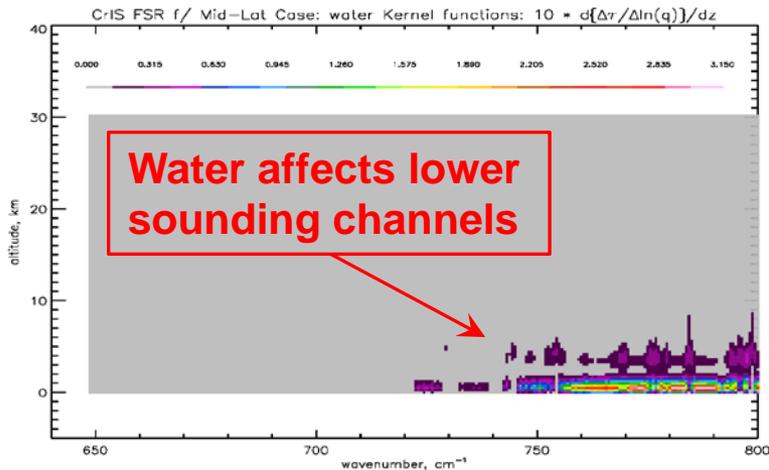


Sensitivity  
to  
Temperature

## SWIR (4 $\mu\text{m}$ , 2200-2700 $\text{cm}^{-1}$ )



Sensitivity  
to  
Water



# Pro's and con's of SWIR vs. LWIR

	LWIR	SWIR
Interfering gases in CO2 bands	<b>H2O, O3, HNO3</b>	<b>None</b>
Exploit the use of N2O sounding	No	<b>YES</b>
Vertical sounding range	<b>1 hPa to surface</b>	20 hPa to surface
Influence of solar radiation	<b>negligible</b>	Must handle non-LTE and surface reflection
Planck function linearity	<b>1<sup>st</sup> order linearity</b>	Highly nonlinear
Instrument Noise sensitivity to scene temperature	<b>Can Assimilate BT's (not really true!!)</b>	Noise is stronger function of scene T
FWHM of T(p) Kernel Fnc't's	<b>4 km</b>	<b>2 km</b>
Future instruments: Detector technology and optics.	<b>Higher Power Requires Cold T's</b>	<b>More COTS options</b>

**NOTE: All of the items in SWIR column been resolved by the AIRS science team & implemented in NUCAPS-IASI and NUCAPS-CrIS systems.**

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# **TOPIC #3: RADIANCE VERSUS BRIGHTNESS TEMPERATURE DATA ASSIMILATION**

# One of the biggest outcomes of this experiment might be communication

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- Data assimilation and retrievals are the same math, but there are many differences, for example:
  - *Retrievals do not “inflate” the observation error.*
  - *Retrievals can explicitly add “geophysical errors.”*
  - *Retrievals never convert observations to brightness temperature because observed radiances can go negative!*
- Instrument noise can be difficult to characterize exactly, but it is usually more linear in radiance space.
  - Retrievals handle spectral correlations, noise as a function of scene temperature, and other effects.
- **Having retrieval, instrument, and DA folks in the same room, looking at details of how things are done, matters!**

# Simplified view of how things are done

Variable	Retrievals	Data Assimilation
Observations	Radiance, $R_{\text{obs}}(n)$	Brightness Temp., $\Theta_{\text{obs}}(n)$
Forward Model	SARTA $R_{\text{calc}}(n, X)$ $X=\text{state}$	CRTM $R_{\text{calc}}(n, X)$ $X=\text{state}$
Conversion	$G(n, X) \equiv \delta B_{\nu} / \delta T(n, \Theta_{\text{calc}}(n))$	$\Theta_x \equiv B_{\nu}^{-1}(n, R_x)$
Signal, S	$[ R_{\text{obs}}(n) - R_{\text{calc}}(n, X) ] / G(n, X)$ $\cong \Theta_{\text{obs}}(n) - \Theta_{\text{calc}}(n)$	$\Theta_{\text{obs}}(n) - \Theta_{\text{calc}}(n)$
Noise, N	$NE\Delta N(n) / G(n, X)$ $\cong NE\Delta T(n, X)$	$NE\Delta T(n)$
S/N	$[ \Theta_{\text{obs}}(n) - \Theta_{\text{calc}}(n) ] /$ $NE\Delta T(n, X)$	$[ \Theta_{\text{obs}}(n) - \Theta_{\text{calc}}(n) ] /$ $NE\Delta T(n)$

- When minimizing the cost function, we are effectively minimizing the square of S/N
- Saying it is *radiance assimilation* is misleading, **it really is brightness temperature assimilation.**

# But nothing in life is free.

- The instrument  $NE\Delta T$  increases non-linearly for cold scene temperatures

Scene BT	LW $NE\Delta N$	LW $NE\Delta T$	MW $NE\Delta N$	MW $NE\Delta T$	SW $NE\Delta N$	SW $NE\Delta T$
200 K	0.05	0.09	0.03	0.65	0.0046	9.7
250 K	0.05	0.04	0.03	0.12	0.0046	0.5
300 K	0.05	0.03	0.03	0.04	0.0046	0.07

- Note that for a constant  $NE\Delta N$

- LWIR  $NE\Delta T$  varies by 3x
- MWIR  $NE\Delta T$  varies by 16x
- SWIR  $NE\Delta T$  varies by 100x

Note: This issue has recently been raised by Larrabee Strow & CrIS SDR Team

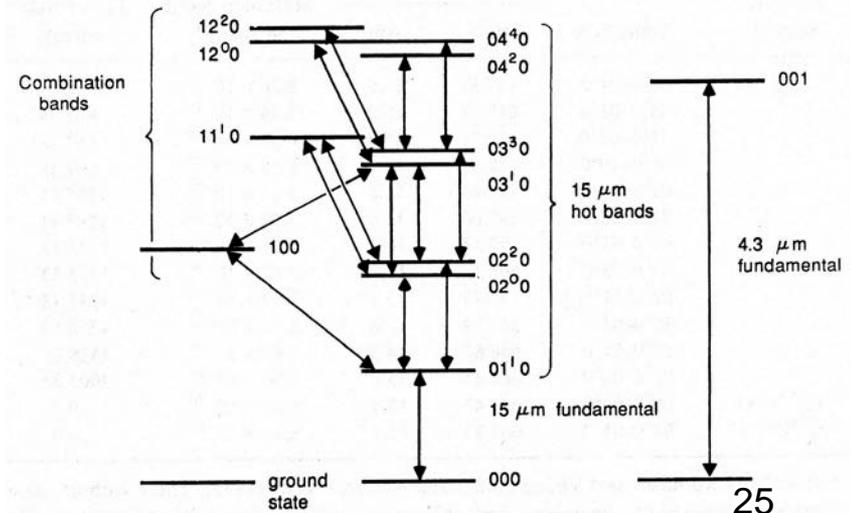
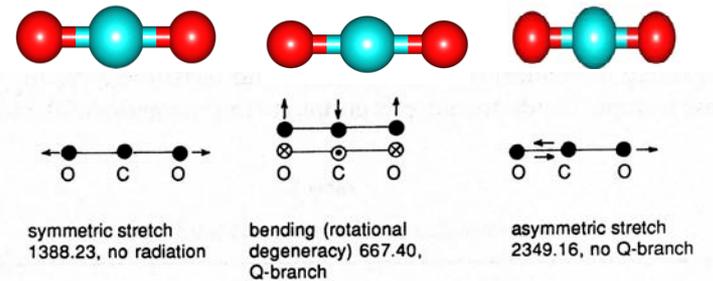
- *In the SWIR it is critical to use radiance, not brightness temperature, as the operator*

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# **TOPIC #4: SPECTRAL PURITY**

# Molecular Vibrational Modes (Example: CO<sub>2</sub>)

- CO<sub>2</sub> has 4 modes of vibration. Each is quantized.
  - $\nu_1$  is symmetric stretch (not active in infrared due to lack of dipole moment) but does interact via Fermi resonance with  $\nu_2$
  - $\nu_2$  is a bending that is doubly degenerate
  - $\nu_3$  is an asymmetric stretch
- Energy of vibrational mode is given by
  - $E_{vib} = \sum hc \cdot \nu_k \cdot (i_k + \frac{1}{2})$  for  $i_k = 0, 1, 2, \dots$



Isotope	transition	band	S	d
<sup>12</sup> C <sup>16</sup> O <sup>16</sup> O	00 <sup>0</sup> → 01 <sup>1</sup> 0	667.38	194	1.56
	01 <sup>1</sup> 0 → 02 <sup>2</sup> 0	667.75	15	0.78
	01 <sup>1</sup> 0 → 10 <sup>0</sup> 0	720.81	5	1.56
	01 <sup>1</sup> 0 → 00 <sup>0</sup> 0	618.03	4	1.56
	02 <sup>2</sup> 0 → 03 <sup>3</sup> 0	688.11	0.85	0.78
	10 <sup>0</sup> 0 → 11 <sup>1</sup> 0	647.06	0.7	1.56
<sup>13</sup> C <sup>16</sup> O <sup>16</sup> O	00 <sup>0</sup> → 01 <sup>1</sup> 0	648.48	2.01	1.56
<sup>12</sup> C <sup>18</sup> O <sup>16</sup> O	00 <sup>0</sup> → 01 <sup>1</sup> 0	662.37	0.77	1.56

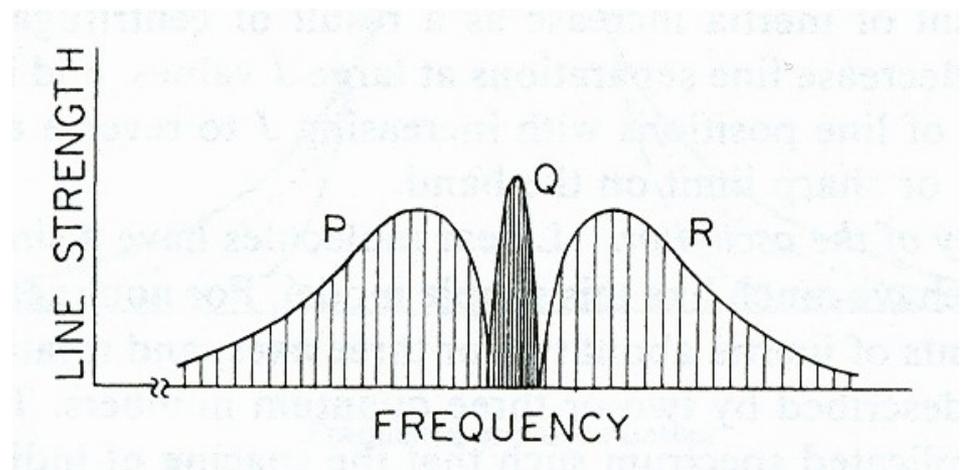
# Rotational Modes

- The energy of rotation is quantized and given by
  - $E_{rot} = hc \cdot B \cdot j \cdot (j+1)$ ,  $j = 0, 1, 2, 3, \dots$
- But as the molecule rotates it also has centrifugal forces
  - $E_{rot} = hc \cdot (B \cdot j \cdot (j+1) - D \cdot j^2 \cdot (j+1)^2)$

**P-branch lines form when  $\Delta j = +1$**

**Q-branch lines form when  $\Delta j = 0$**

**R-branch lines form when  $\Delta j = -1$**



# All the Physics is Contained in a quantity called the Absorption Coefficient

- The absorption coefficient is a complicated and highly non-linear function of molecule  $i$  and line  $j$
- Line Strengths,  $S_{ij}$ , result from many molecular vibrational-rotational transitions of different molecular species and isotopes of those species (blue).

$$\kappa_i(\nu, p, T, \theta) \simeq \sum_{j=1}^J \frac{N_i \cdot S_{ij}}{\pi} \frac{\gamma_{ij}}{(\nu - \nu_{ij})^2 + (\gamma_{ij})^2} \cdot \sec(\theta)$$

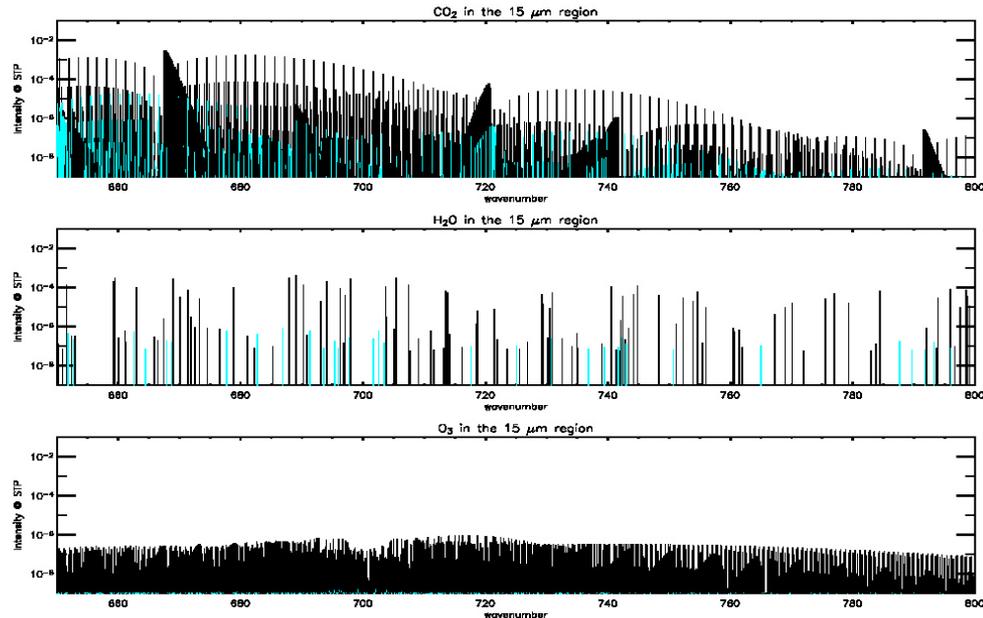
Where width of line,  $\gamma_{ij}$ , is a function of the molecule structure (natural broadening), temperature (doppler broadening) and pressure (collisional broadening)

$$\gamma_{ij} \simeq \gamma_{ij}^0 \cdot \frac{p}{P_0} \cdot \sqrt{\frac{T}{T_0}}$$

Line strength (at T=300K) of CO2, H2O, and O3 in the 15 μm band.

Line strength, S, is also a function of temperature

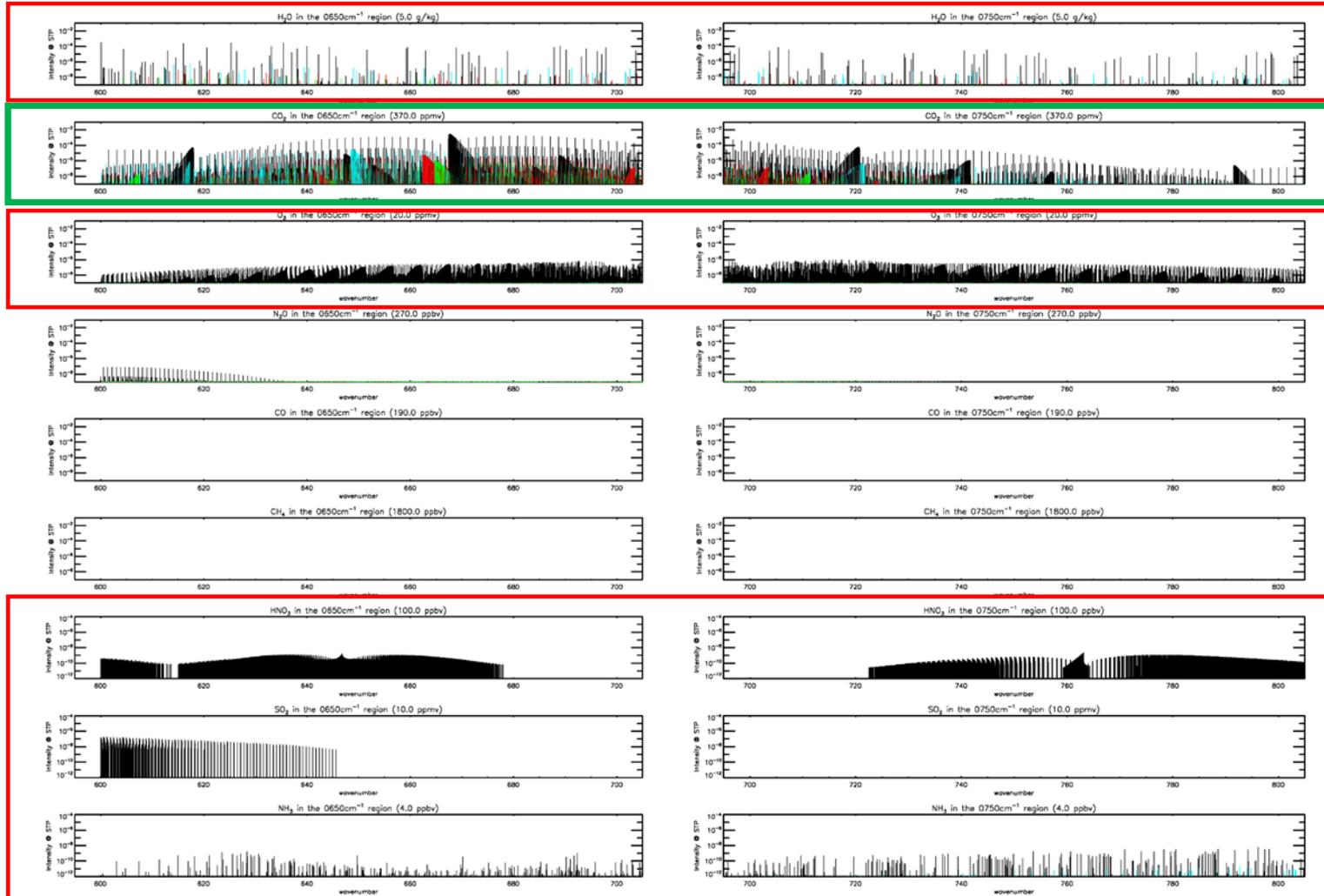
$$S(T) = S(T_0) \cdot \frac{(1 - \exp(-1.439\nu/T))^3}{(1 - \exp(-1.439\nu/T_0))^3}$$



# Example of vibration rotational line strengths in 15 $\mu\text{m}$ band region

600 to 700  $\text{cm}^{-1}$

700 to 800  $\text{cm}^{-1}$



H2O

CO2

O3

N2O

CO

CH4

HNO3

SO2

NH3

# Example of vibration rotational line strengths in 4 $\mu\text{m}$ band region

2100 to 2200  $\text{cm}^{-1}$

2200 to 2300  $\text{cm}^{-1}$

2300 to 2400  $\text{cm}^{-1}$

H<sub>2</sub>O

CO<sub>2</sub>

O<sub>3</sub>

N<sub>2</sub>O

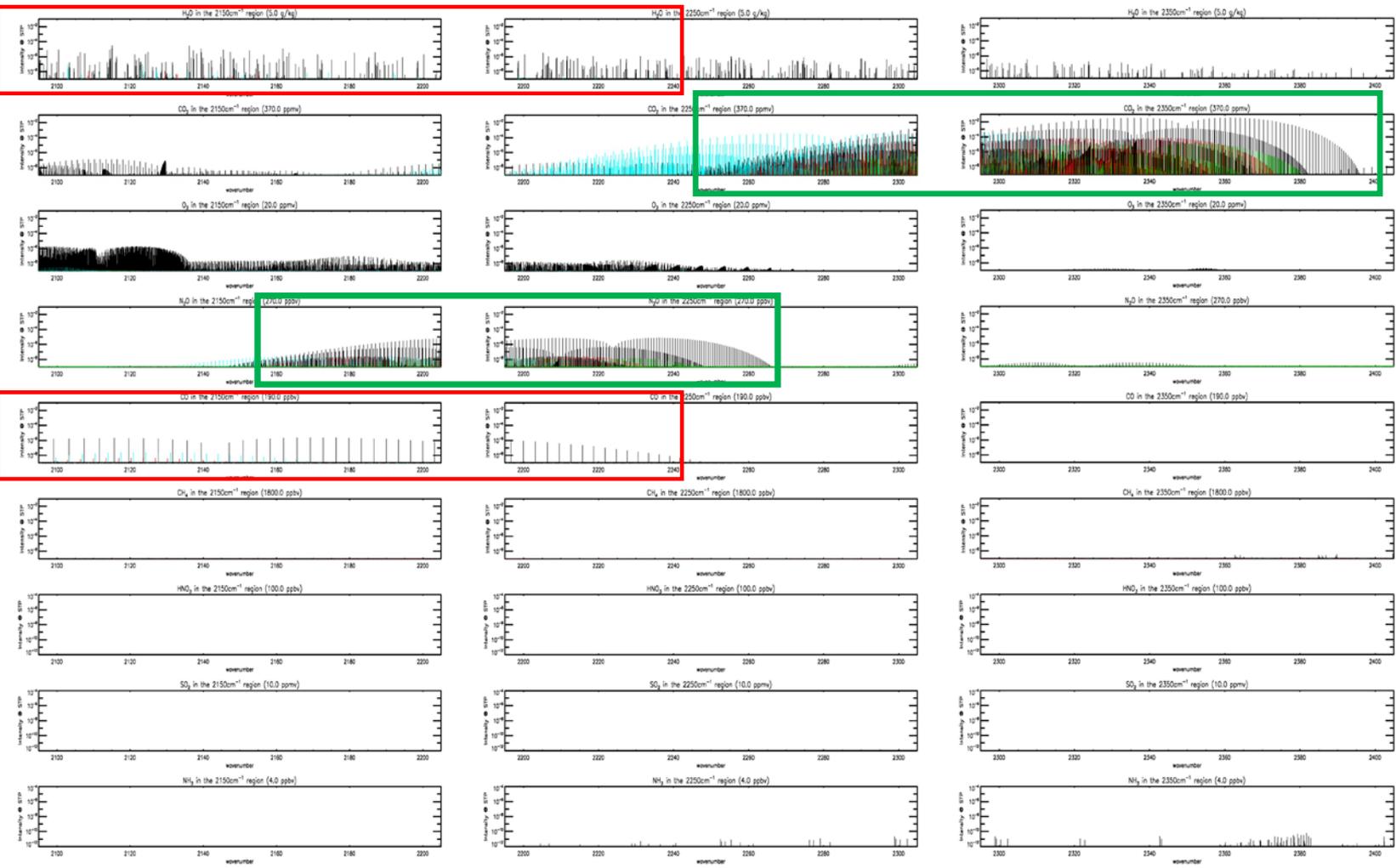
CO

CH<sub>4</sub>

HNO<sub>3</sub>

SO<sub>2</sub>

NH<sub>3</sub><sub>29</sub>



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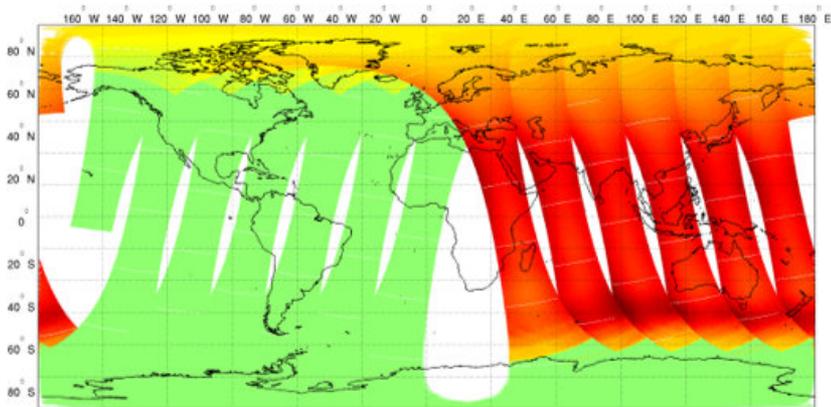
# TOPIC #5: NON-LTE

# How big is the non-LTE effect?

CRTM simulation of a channel pair difference

SWIR 2336.25  $\text{cm}^{-1}$  minus LWIR 667.50

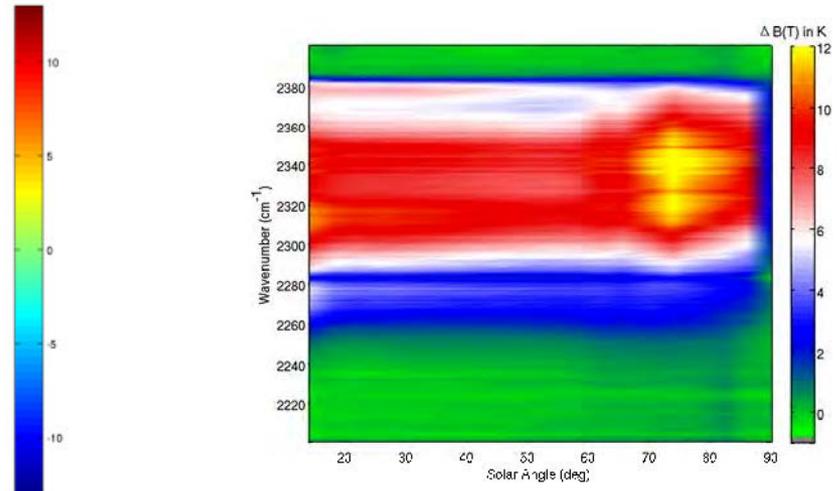
Non-LTE effect is  $\sim 5$  to  $\sim 10$  K in daytime



This figure stolen from  
Zhenglong Li (CIMSS)

Bias in AIRS SWIR region for  
daytime radiances versus  
solar zenith angle

Need to correct for non-LTE  
from 2255 to 2383  $\text{cm}^{-1}$



From DeSouza-Machado  
2007 GRL, Fig. 3

# We know how to correct for non-LTE.

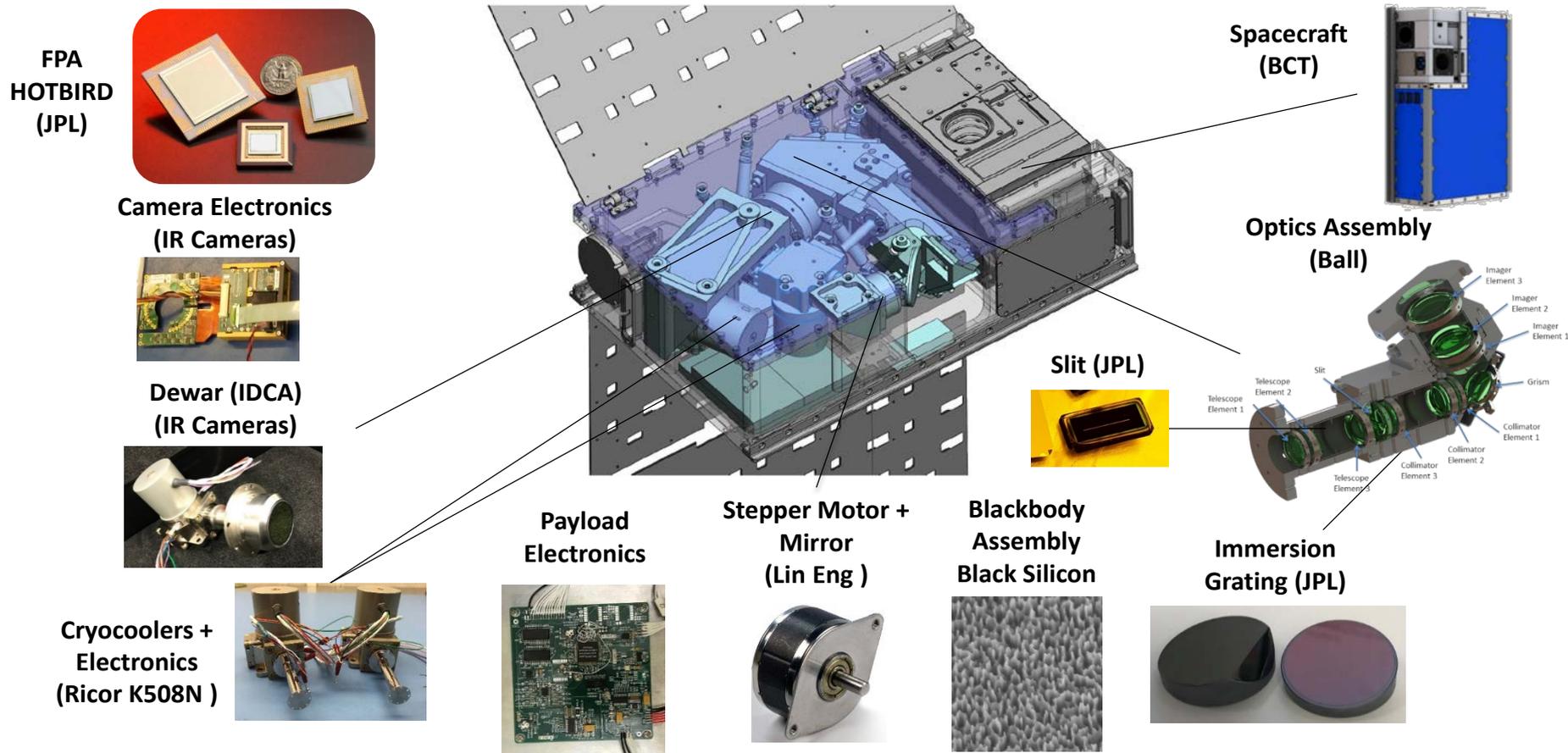
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- The use of the Planck function assumes a Boltzmann distribution in the population of energy states – called thermodynamic equilibrium or LTE
- Channels sensitive to high altitudes do not have enough molecular collisions to achieve equilibrium – called non-LTE
- AIRS Science Team dealt with this issue and employed an algorithm to correct for non-LTE effects (DeSouza-Machado 2007 GRL)
- NASA/AIRS ST and NOAA NUCAPS Teams have demonstrated that the SWIR + LWIR can be used for both day and night without introducing day-night artifacts.
- ***Non-LTE correction is in the CRTM (Chen 2013 JAOT)***

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# **TOPIC #6: WHAT IS THE FUTURE OF INFRARED HYPERSPECTRAL**

# Example of technologies enabled by using SWIR: A NASA/JPL CubeSat Instrument called CIRAS



Entire satellite can fit in 6U (60x10x10 cm) enclosure!

# Advantage of the SWIR might be most important for future instruments

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	Size (cm)	Mass (kg)	Power (W)
AIRS	116 x 159 x 95	177	200
IASI	120 x 110 x 130	236	210
CrIS	80 x 47 x 66	147	106
CIRAS	10 x 20 x 30	4	29

- Low power {and lower noise} detectors can drive the entire design of instruments *and satellites*.
- Low mass, power, and size will have significant implications for schedule and launch of these instruments.

# Summary of the experiment

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- NOAA/OPPA has funded a study to study the impact of the CrIS SWIR in DA
  - We will account for non-LTE, solar surface reflection, scene dependent noise, etc.
- My NOAA co-authors will perform an OSSE.
  - The CrIS instrument is being used as a proxy for future instrument concepts, such as CIRAS.
  - CrIS-FSR is also operationally relevant to NCEP.
  - We will develop QC, thinning, and bias correction schemes suitable for SWIR.
  - We will also evaluate radiance data assimilation versus brightness temperature data assimilation.

# QUESTIONS?

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# Documents available

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cell: (301)-789-6934

email: [chrisdbarnet@gmail.com](mailto:chrisdbarnet@gmail.com)

Google drive short link: <http://goo.gl/twuRtW>

NOTES from UMBC classes, theory of remote sounding (PHYS741) and numerical methods documentation (PHYS 640)

**rs\_notes.pdf (~17.5 MB, ~650 pages)**

**180702\_cuny\_barnet.pdf (10 MB, 140 slides)**

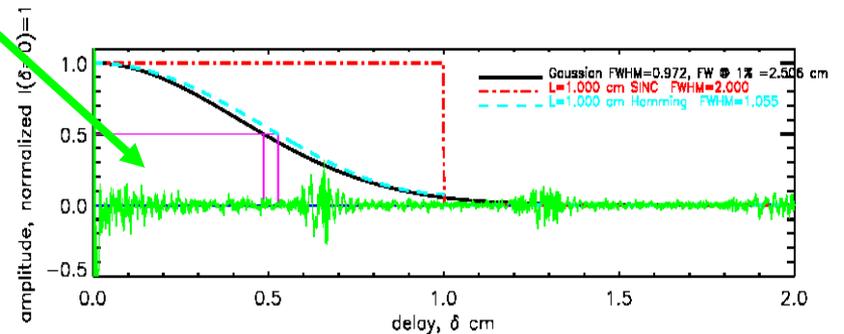
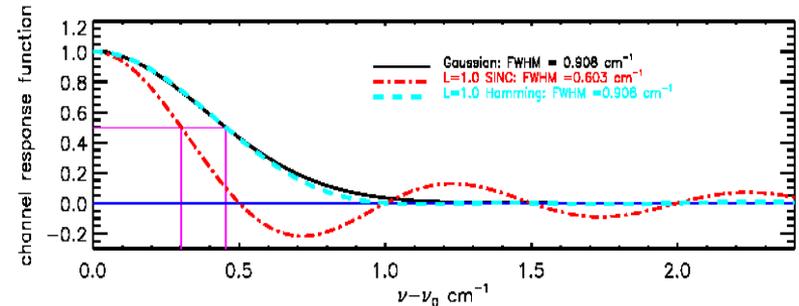
**phys640\_s04.pdf (~8.8 MB, 370 pages)**

These are *living* notes, or maybe a scrapbook – they are not textbooks.

Those documents refer to other documents that are also on the google drive.

# Apodization Alters the ILS and Spectrally Correlates the Noise.

- Interferometers measure interferograms (green curve) signal as a function of optical delay,  $\delta$
- Performing an inverse cosine transform will yield the spectrum.
- Un-apodized transforms (red) have a  $\text{SINC}(x)=\text{SIN}(x)/x$  instrument line shape (ILS).
- AIRS has a Gaussian ILS (black)
- Apodization can produce an ILS that is localized and has small ( $< 1\%$ ) side lobes. But the tradeoff is that the central lobe is wider and the signal is spectrally correlated between neighboring channels



	Gaussian	Hamming	Blackman
FWHM / FWHM(SINC)	1.682	<b>1.5043</b>	1.905
Random Noise reduction	1.735	<b>1.586</b>	1.812
Maximum Side-Lobe	0.45%	<b>0.73%</b>	0.12%
% of signal in central Lobe	95.1%	<b>87.5%</b>	99.8%

Channel Spacing	Gaussian	Hamming	Blackman
$\pm 1$	70.74%	<b>62.5%</b>	75.5%
$\pm 3$	25.0%	<b>13.3%</b>	31.6%
$\pm 4$	4.43%	-	6.57%
$\pm 5$	0.38%	-	0.53%
$\pm 6$	0.025%	-	-