

# Estimating CRTM-simulated Measurement Uncertainties and their Impact on Detecting and Analyzing NOAA Operational MW Sounder Calibration Anomalies

National Environmental Satellite,  
Data, and Information Service

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# Outline

- ❖ Using Community Radiative Transfer Model (CRTM) simulated microwave (MW) brightness temperatures (Tb) to monitor and evaluate space-based MW sensor data performance
- ❖ Dominant MW instrument calibration anomaly mechanisms
- ❖ Method to estimate CRTM-simulated Tb uncertainties and their relative size to calibration anomalies

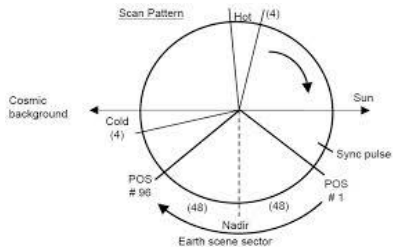
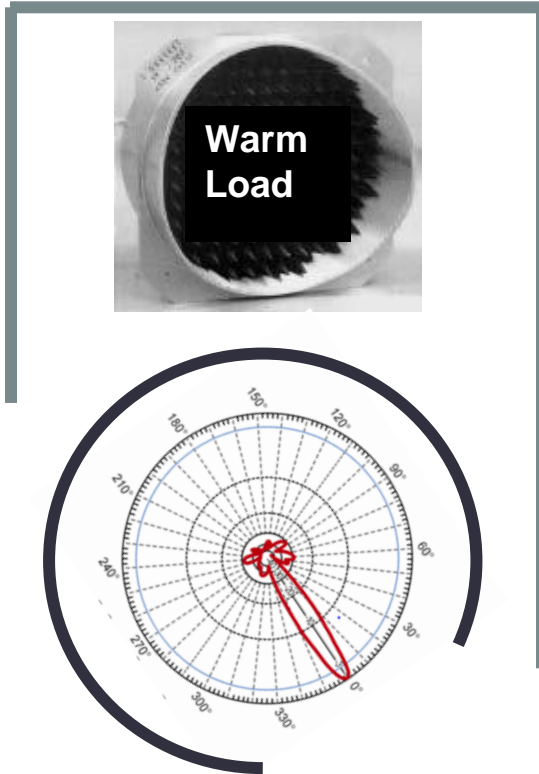
# Harnessing CRTM-simulated MW Tb

- ❖ CRTM-simulated background (B) MW sounder Tb values can be subtracted from collocated observed (O) instrument Ta values to form single-sensor O-B Ta bias estimates
- ❖ Double differences of O-B Ta bias between MW instrument pairs can estimate inter-sensor Ta biases
- ❖ These parameters are used to monitor NOAA operational MW sounder data quality and analyze instrument calibration anomalies\*

\* Iacovazzi, R.; L. Lin; N. Sun; Q Liu, 2020. <https://doi.org/10.3390/rs12050828>  
Iacovazzi *et al.* *Terres., Atmos. and Ocn. Sci.*, 2022. <https://doi.org/10.1007/s44195-022-00008-0>

# Common Sources of NOAA Operational MW Sounder Calibration Anomalies

Cold Space

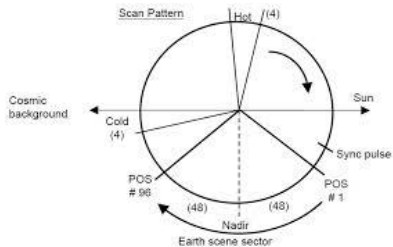
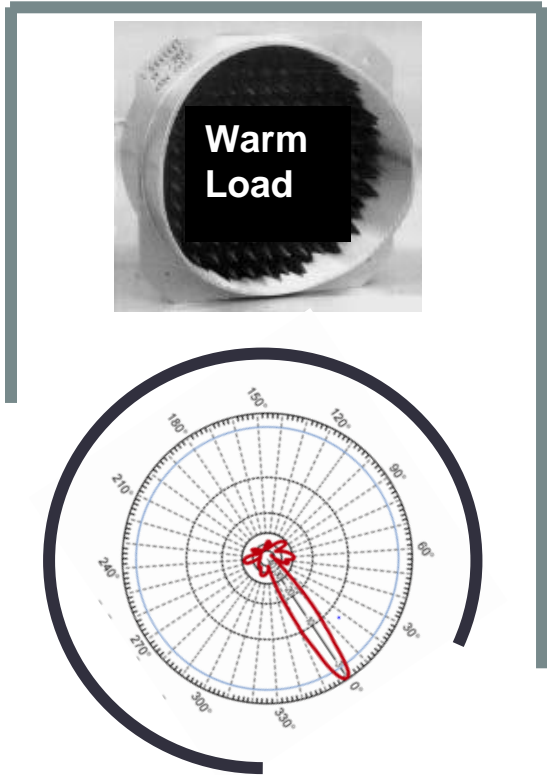


- ❖ **NOAA Operational MW Sounder 3-point Calibration System Includes measurements of**
  - Warm load with NIST-Traceable Platinum Resistance Thermometers ( $\sim 275\text{ K} - 285\text{ K}$ )
  - Cold Space ( $\sim 2.73\text{ K}$ )
  - Earth Scene
- ❖ **MW Antenna Reflectors Characteristics Related to Calibration Anomalies**
  - Response in the sidelobes (SLs) beyond the main lobe
  - Non-zero emissivity at the reflector temperature

2.67 second rotation

# Common Sources of NOAA Operational MW Sounder Calibration Anomalies

Cold Space



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  - Warm load with NIST-Traceable Platinum Resistance Thermometers (~275 K – 285 K)
  - Cold Space (~2.73 K)
  - Earth Scene
- ❖ MW Antenna Reflectors Characteristics Related to Calibration Anomalies
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  - Non-zero emissivity at the reflector temperature

- ❖ Earth View:
  - Antenna emission and earth radiance absorption
  - Earth radiance in antenna SL

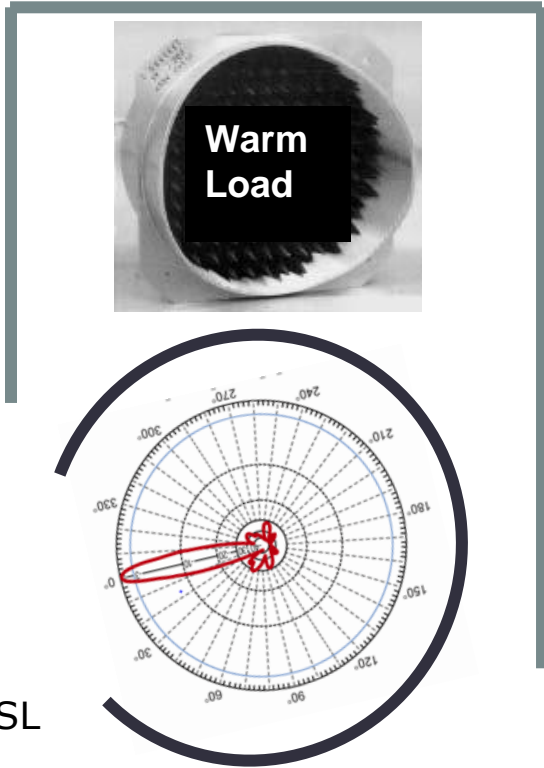
2.67 second rotation



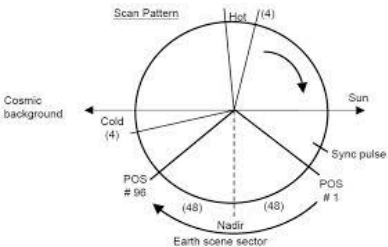
# Common Sources of NOAA Operational MW Sounder Calibration Anomalies

**Cold Space**

- ❖ **Cold Space View:**
  - Antenna emission
  - Earth and satellite radiance in antenna SL



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  - Earth radiance in antenna SL

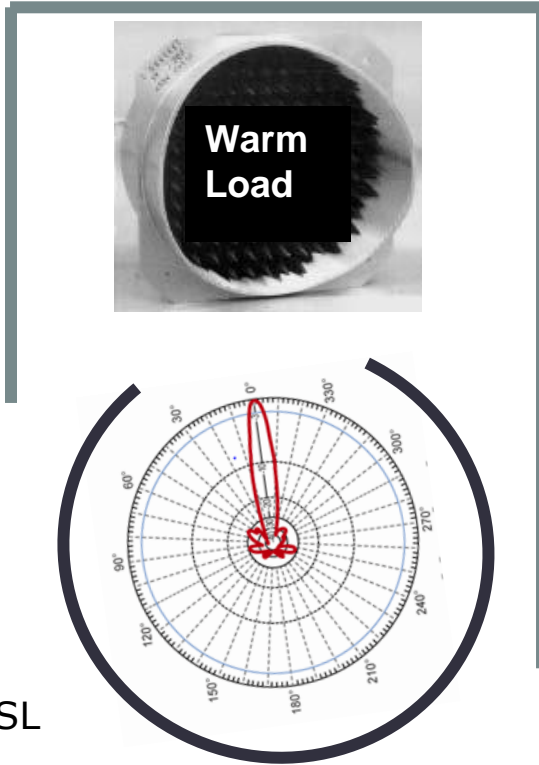
2.67 second rotation



# Common Sources of NOAA Operational MW Sounder Calibration Anomalies

## ❖ Warm Load View:

- Antenna emission and Warm Load radiance absorption



## Cold Space View:

- Antenna emission
- Earth and satellite radiance in antenna SL

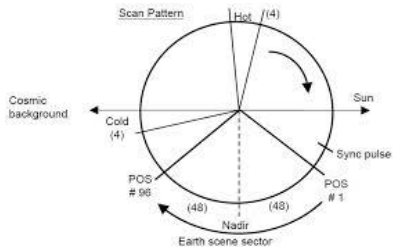


## ❖ NOAA Operational MW Sounder 3-point Calibration System Includes measurements of

- Warm load with NIST-Traceable Platinum Resistance Thermometers (~275 K – 285 K)
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- Earth Scene

## ❖ MW Antenna Reflectors Characteristics Related to Calibration Anomalies

- Response in the sidelobes (SLs) beyond the main lobe
- Non-zero emissivity at the reflector temperature



2.67 second rotation

## ❖ Earth View:

- Antenna emission and earth radiance absorption
- Earth radiance in antenna SL



# Calibration Radiance Contribution Normalized Magnitudes

Radiance Contribution Mechanism	Instr Type	Single Sensor NSF*		Inter-sensor NSF
				ATMS-to-AMSU-A
Earth radiance in earth scene antenna SL	ATMS	(1)	$\sim 10^{-2}$	$\sim 10^{-4}$
	AMSU-A		$\sim 10^{-2}$	
Earth radiance in cold space view antenna SL	ATMS		$\sim 10^{-3}$	$\sim 10^{-4}$
	AMSU-A		$\sim 10^{-3}$	
Reflected earth radiance from the satellite in cold space view antenna SL	ATMS		$\sim 10^{-3}$	$\sim 10^{-4}$
	AMSU-A		$\sim 10^{-3}$	
Antenna emission in the cold space view	ATMS		$\sim 10^{-4}$	(2) $\sim 10^{-3}$
	AMSU-A		$\sim 10^{-3}$	
Warm load radiance absorption by the antenna	ATMS		$\sim 10^{-4}$	$\sim 10^{-3}$
	AMSU-A		$\sim 10^{-3}$	
Antenna emission in the warm load view	ATMS		$\sim 10^{-4}$	$\sim 10^{-3}$
	AMSU-A		$\sim 10^{-3}$	
Earth radiance absorption by the antenna	ATMS		$\sim 10^{-4}$	$\sim 10^{-3}$
	AMSU-A		$\sim 10^{-3}$	
Antenna emission in the earth view	ATMS		$\sim 10^{-4}$	$\sim 10^{-3}$
	AMSU-A		$\sim 10^{-3}$	
CRTM Tb Uncertainty	ATMS	(3)	??	??
	AMSU-A		??	X ??

\*Normalized Scaling Factor (NSF) is the magnitude of a radiance contribution relative to the radiance of a 300 K object.

1. Inter-sensor NSF can be smaller than the single-sensor NSF by one or more orders of magnitude.
2. Larger ATMS-to-AMSU-A NSF residuals are due to neglected non-zero antenna emissivity impacts.
3. Simulated Tb uncertainties have not been quantified.



# Estimating CRTM-simulated Tb Uncertainty (1 of 2)

1. Consider regions of interest (ROIs) from 60°S to 60°N that utilize the simplest CRTM physics
  - a) Rain-free
  - b) Ocean-only for MW window channels and surface-influenced sounding channels, and global for sounding channels free of surface influence
  - c) Near-nadir only
2. CRTM-simulated Tb uncertainties are assumed to have a relatively strong linear relationship with at-sensor radiance, except at the coldest temperatures
3. This study focuses on
  - a) Single-sensor NOAA operational ATMS Chs 2-3 and 5-15/AMSU-A Chs 4-14 (monitored at NOAA/NESDIS/STAR using BOTH Global Navigation Satellite System (GNSS) Radio Occultation (RO) and ECMWF Ensemble (ENS) NWP soundings)
  - b) Inter-sensor ATMS-to-AMSU-A statistics formed from single-sensor instrument pairs.

# Estimating CRTM-simulated Tb Uncertainty (2 of 2)

1 Day of GNSS RO Sounding Time and Lat/Lon  
• COSMIC-1, KOMPSAT-5, and COSMIC-2

ECMWF 51-member  
ENS NWP Gridded, 6-  
hourly Sounding Time  
and Lat/Lon

Collocate Data

MW Sounder Observed Ta Data Time  
and Lat/Lon  
• ATMS Chs 2-3, 5-15: S-NPP and NOAA-20  
• AMSU-A Chs 2-14: NOAA-18 and -19,  
Metop-A to -C

ECMWF T and WV  
Soundings @ Collocations

Simulate  
Tb with  
CRTM

Simulate  
Tb with  
CRTM

GNSS-RO T and WV Soundings @  
Collocations  
• COSMIC-1, KOMPSAT-5, and COSMIC-2

ECMWF ENS and GNSS RO Sounding and CRTM-simulated Tb Data Analysis

ECMWF ENS and GNSS RO  
Sounding Comparison

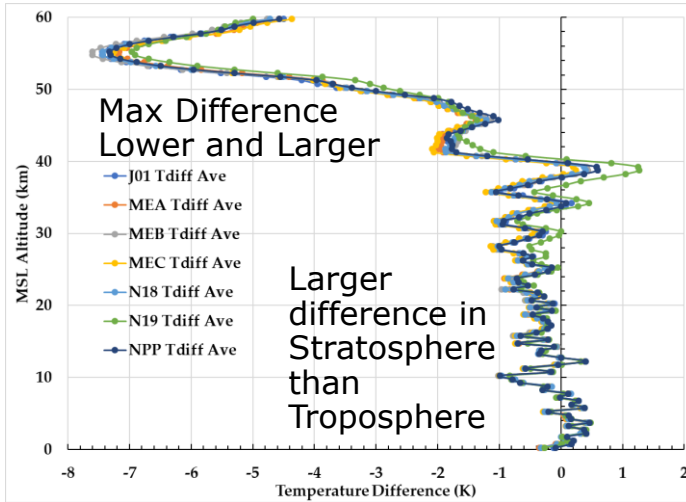
Single-sensor  $Tb_{ECMWF} - Tb_{RO}$   
for each MW sounder

Inter-sensor Tb bias created from MW sounder  
pair  $Tb_{ECMWF} - Tb_{RO}$  double differences



# Global-average, ECMWF and RO Sounding Differences

Temp difference profile at matchups between ECMWF, GNSS RO, and MW sounder data.

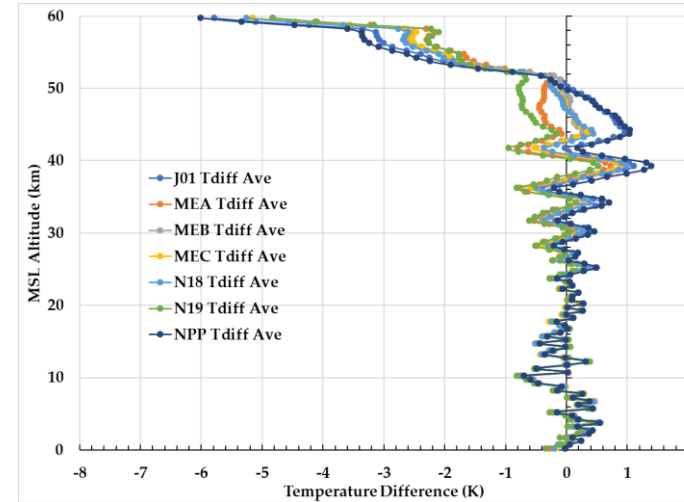


Jan 1,  
2020

ATMS Ch 15/  
AMSU-A Ch 14

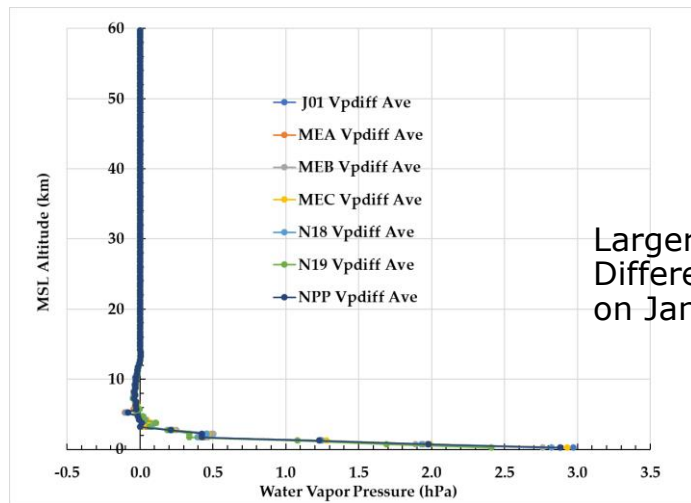
ATMS Ch 10/  
AMSU-A Ch 9

ATMS/AMSU-A Ch 2



Jul 1,  
2020

Water vapor difference profile at matchups between ECMWF, GNSS-RO and MW sounder data.

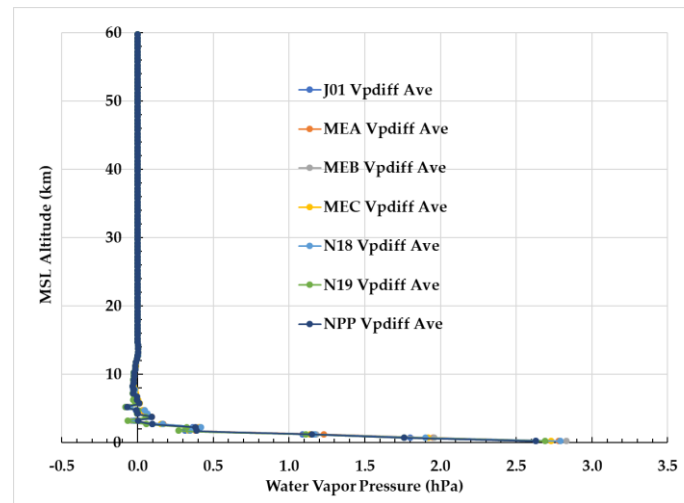


Jan 1,  
2020

ATMS Ch 15/  
AMSU-A Ch 14

ATMS Ch 10/  
AMSU-A Ch 9

ATMS/AMSU-A Ch 2



Jul 1,  
2020



# CRTM-simulated MW Sounder Tb Time Series (1 of 4)

## CRTM-simulated Tb Parameter Definitions

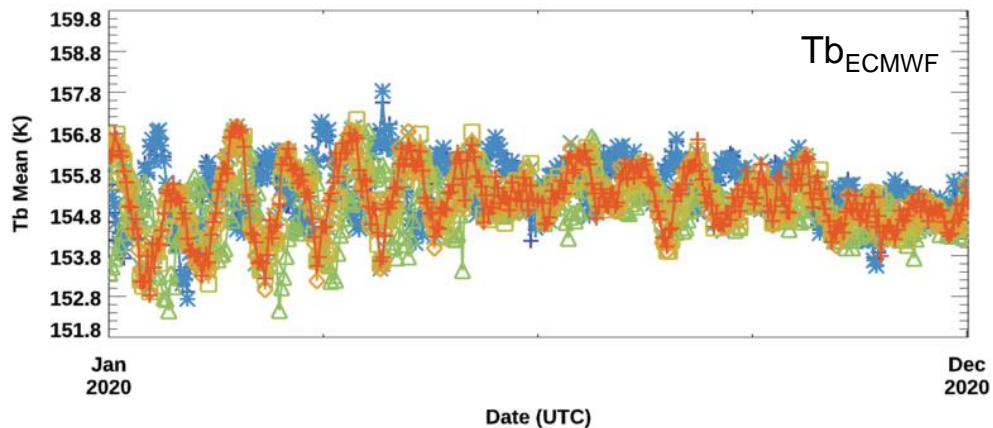
### ❖ Single-sensor

- Daily- and global-mean for S-NPP (NPP) and NOAA-20 (N20) ATMS and NOAA-18 (N18), NOAA-19 (N19), Metop A (MEA), Metop B (MEB), and Metop C (MEC) AMSU-A instruments
  - Tb using ECMWF sounding:  $Tb_{ECMWF}$
  - $Tb_{ECMWF} - Tb_{RO}: (\overline{\delta Tb^{SS}})_{gl}$

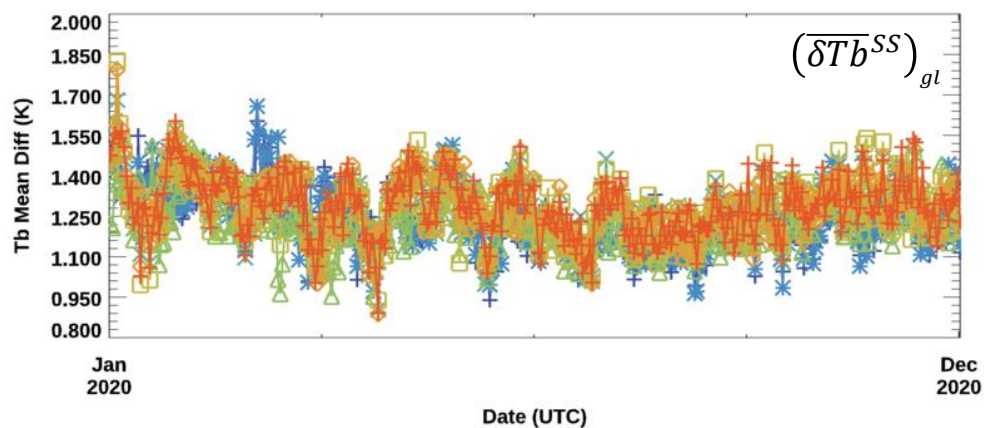
### ❖ Inter-sensor

- Daily- and Global-mean between each of the 10 ATMS-to-AMSU-A instrument pairs
  - $Tb_{ECMWF} - Tb_{RO}$  double difference:  $(\overline{\delta Tb^{IS}})_{gl}$

# CRTM-simulated MW Sounder Tb Time Series (2 of 4)



Timeseries mean  $\sim 155$  K and min-to-max range  $\sim 4$  K

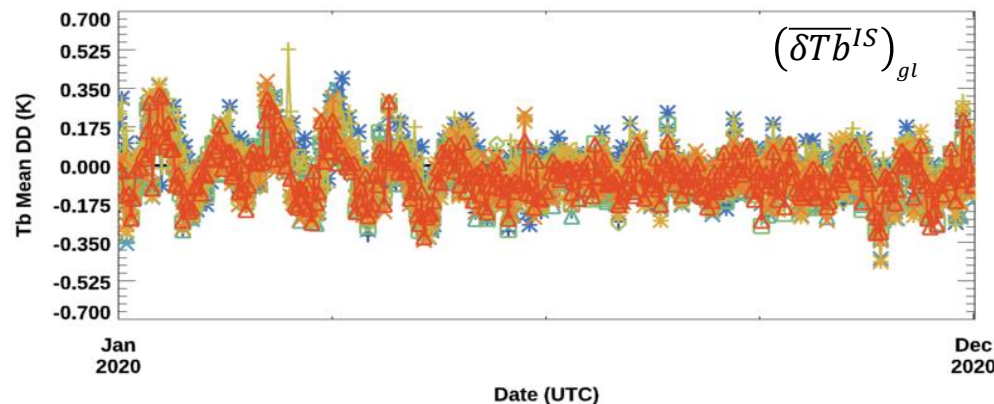


Timeseries mean  $\sim 1.25$  K and min-to-max range  $\sim 0.9$  K



## ATMS Ch 2/AMSU-A Ch 02

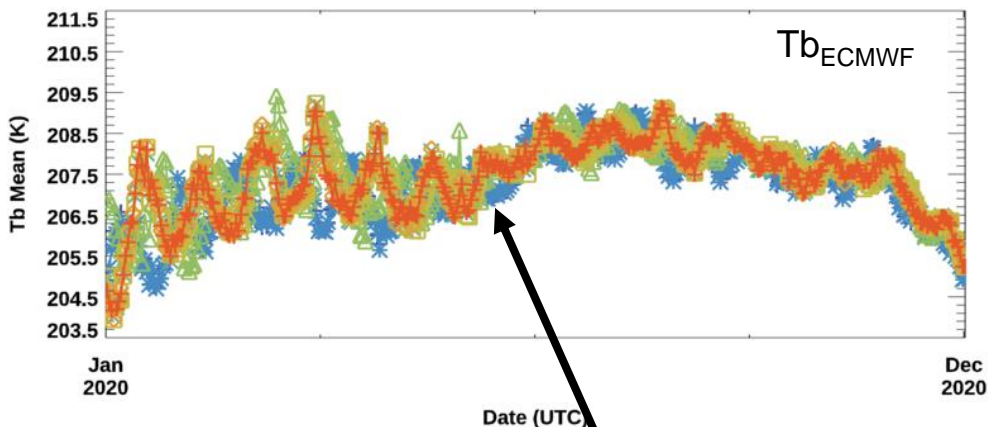
- $Tb_{ECMWF}$  and  $Tb_{RO}$  are within about 1% of each other
- $(\overline{\delta Tb^{SS}})_{gl}$  removes over 75% of the variability in  $Tb_{ECMWF}$ .
- $(\overline{\delta Tb^{IS}})_{gl}$  removes almost all of the bias in  $(\overline{\delta Tb^{SS}})_{gl}$ , and their difference removes about 25% of the time series variability.



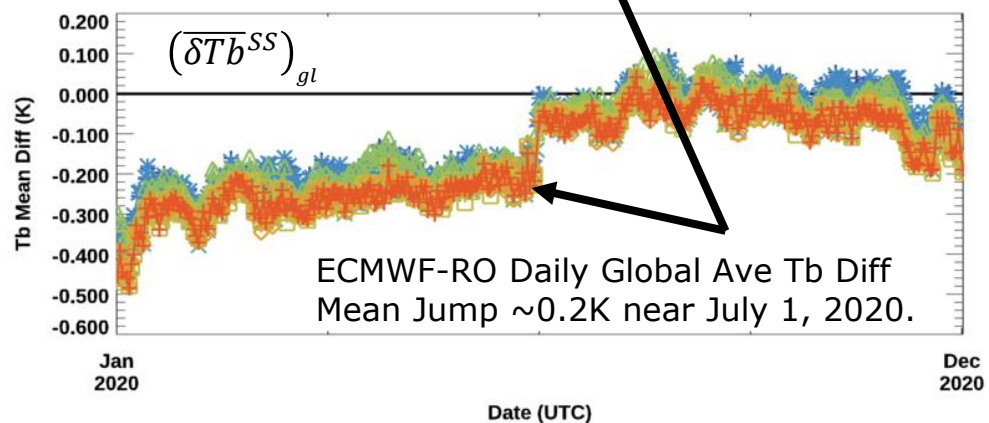
Timeseries mean  $\sim 0$  K and min-to-max range  $\sim 0.7$  K



# CRTM-simulated MW Sounder Tb Time Series (3 of 4)



Timeseries mean  $\sim 207$  K and min-to-max range  $\sim 5$  K

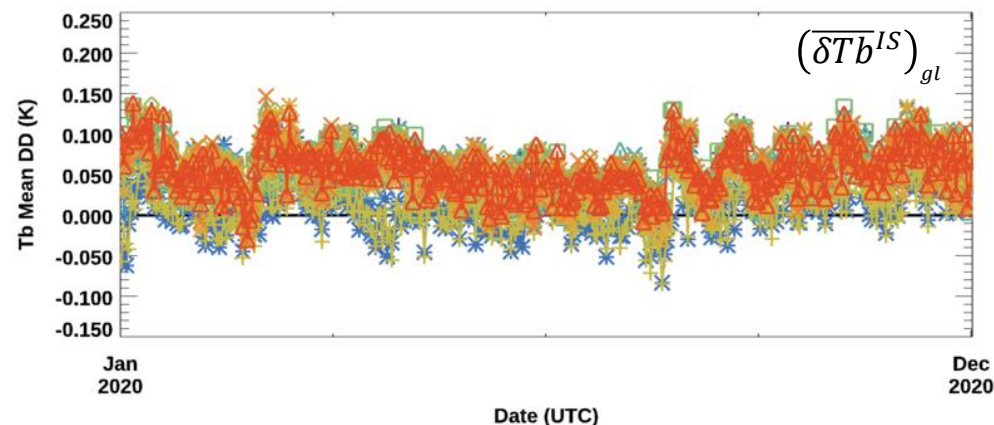


Timeseries mean  $\sim -0.1$  K and min-to-max range  $\sim 0.6$  K



## ATMS Ch 10/AMSU-A Ch 09

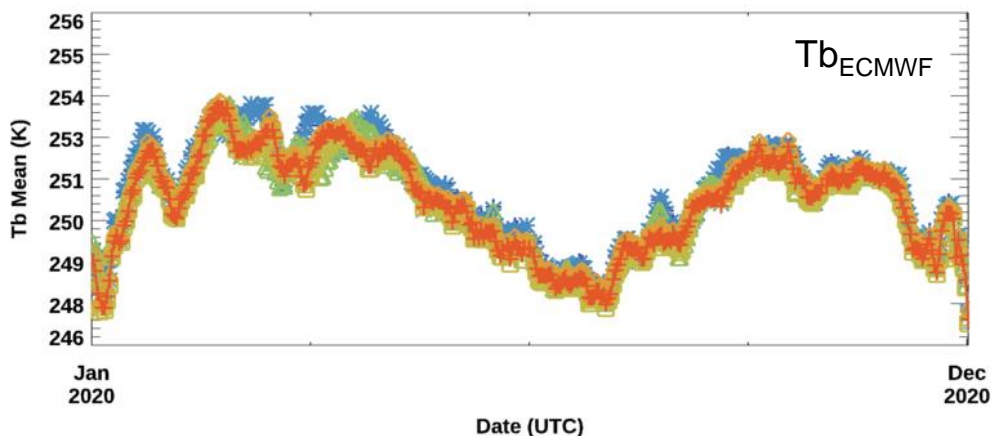
- $Tb_{ECMWF}$  and  $Tb_{RO}$  are within about 0.05% of each other
- $(\overline{\delta Tb^{SS}})_{gl}$  removes over 90% of the variability in  $Tb_{ECMWF}$ .
- $(\overline{\delta Tb^{IS}})_{gl}$  removes 50% of the bias in  $(\overline{\delta Tb^{SS}})_{gl}$ , and their difference removes about 66% of the time series variability.
- There is a clear jump in  $(\overline{\delta Tb^{SS}})_{gl}$ , which cannot be attributed uniquely to  $Tb_{ECMWF}$  or  $Tb_{RO}$ .



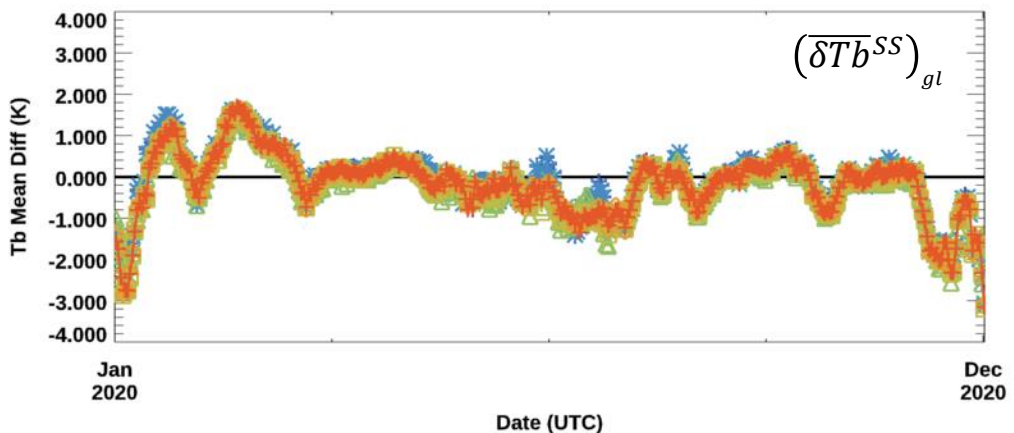
Timeseries mean  $\sim 0.05$  K and min-to-max range  $\sim 0.2$  K



# CRTM-simulated MW Sounder Tb Time Series (4 of 4)



Timeseries mean ~250 K and min-to-max range ~7K

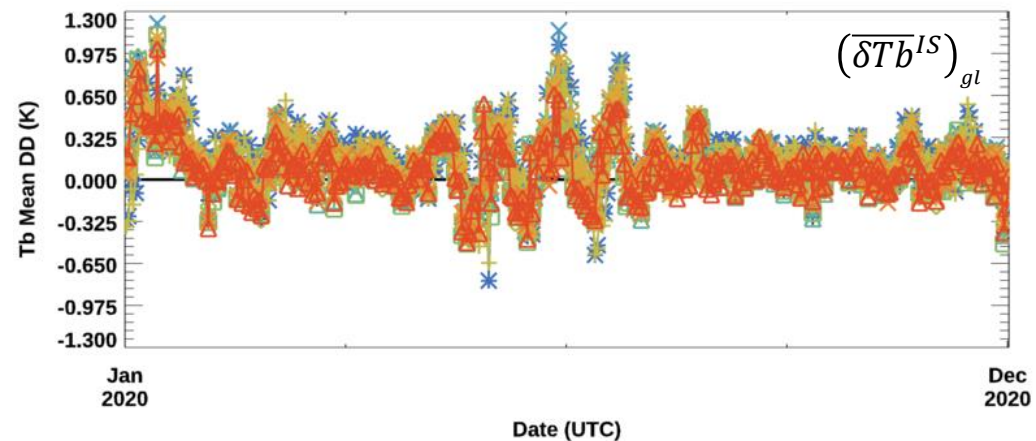


Timeseries mean ~0.5 K and min-to-max range ~5.0K



## ATMS Ch 15/AMSU-A Ch 14

- Tb<sub>ECMWF</sub> and Tb<sub>RO</sub> are within about 0.2% of each other
- $(\overline{\delta Tb^{SS}})_{gl}$  removes only about 29% of the variability in Tb<sub>ECMWF</sub>.
- $(\overline{\delta Tb^{IS}})_{gl}$  removes 75% of the bias in  $(\overline{\delta Tb^{SS}})_{gl}$ , and their difference removes about 70% of the time series variability.



Timeseries mean ~0.125 K and min-to-max range ~1.5K



## Mean, RMS Std Dev and NSF<sup>^</sup> Derived from Seven Single-sensor $(\overline{\delta Tb}^{SS})_{gl'}$ and 10 ATMS-to-AMSU-A Inter-sensor Pair $(\overline{\delta Tb}^{IS})_{gl'}$ Time Series Mean and Std. Dev. Values

ATMS (AMSU-A) Channel	Single-Sensor All-satellite Population			ATMS-to-AMSU-A Inter-Sensor All-satellite Population		
	Mean (K)	RMS STD (K)	NSF <sup>^</sup>	Mean (K)	RMS STD (K)	NSF <sup>^</sup>
2(2)	1.26	0.11	1E-03	-0.04	0.11	1E-04
3(3)	1.07	0.09	1E-03	0.00	0.10	1E-04
5(4)	0.24	0.05	1E-03	0.04	0.04	1E-04
6(5)	0.00	0.04	1E-04	0.03	0.03	1E-04
7(6)	-0.11	0.05	1E-04	0.02	0.02	1E-04
8(7)	-0.16	0.06	1E-03	0.02	0.02	1E-04
9(8)	-0.18	0.08	1E-03	0.02	0.02	1E-04
10(9)	-0.14	0.11	1E-03	0.05	0.03	1E-04
11(10)	-0.13	0.14	1E-03	0.06	0.04	1E-04
12(11)	-0.12	0.18	1E-03	0.07	0.07	1E-04
13(12)	-0.08	0.29	1E-03	0.08	0.11	1E-04
14(13)	0.02	0.50	1E-03	0.11	0.17	1E-03
15(14)	-0.17	0.76	1E-03	0.12	0.22	1E-03
<b>All Channels</b>	0.28*	0.28	1E-03	0.05*	0.10	1E-04

- Single-sensor (inter-sensor) NSF values of  $\sim 10^{-4}$  are found for 2 of 13 (11 of 13) channels.
- For these channels, Tb uncertainty interfere less with analysis of single- or double-difference calibration equation terms with NSF =  $10^{-3}$ .

$$^{\wedge}NSF = 10^{[INT(LOG_{10}(X) + (\alpha - 1))]}$$

$$X = \frac{RMSE}{300 K} \quad RMSE = \sqrt{Mean^2 + (RMS STD)^2} \quad \alpha = NINT \left[ \frac{X}{INT(LOG_{10}(X))} \right]$$

NSF  $\approx 10^{-3}$

NSF  $\approx 10^{-4}$

\* Computed as the mean of the absolute values to obtain a more realistic values of the absolute differences.





# Summary

- ❖ CRTM-simulated satellite MW sensor Tb uncertainties are estimated to better understand our ability to track NOAA MW sounder data quality, and analyze their calibration anomaly mechanisms.
- ❖ Uncertainties are estimated with CRTM-simulated Tb generated separately with ECMWF ENS and GNSS RO soundings collocated with NPP and N20 ATMS, and MEA, MEB, MEC, N18 and N19 AMSU-A, operational MW sounder data locations
- ❖ Global-average ECMWF ENS and GNSS RO temperature and water vapor soundings can differ as a function of mean sea level altitude and season, which translate directly to single-sensor Tb difference variability between these simulations that have an all-channel NSF value of  $10^{-3}$  ( $\sim 0.3$  K).
- ❖ ATMS-to-AMSU-A inter-sensor simulated Tb differences, derived from the double difference of single-sensor simulated Tb differences, reduce all-channel NSF to a value of  $10^{-4}$  ( $\sim 0.03$  K).
- ❖ It is found that CRTM-simulation Tb uncertainty can be on the same scale as MW instrument calibration anomaly mechanisms for single sensor O-B Ta bias data, but much smaller for many inter-sensor Ta biases.

*Thank You!*

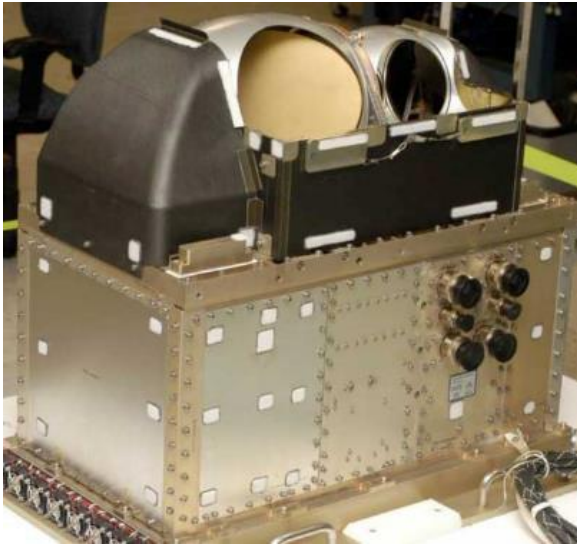
*Any Questions??*



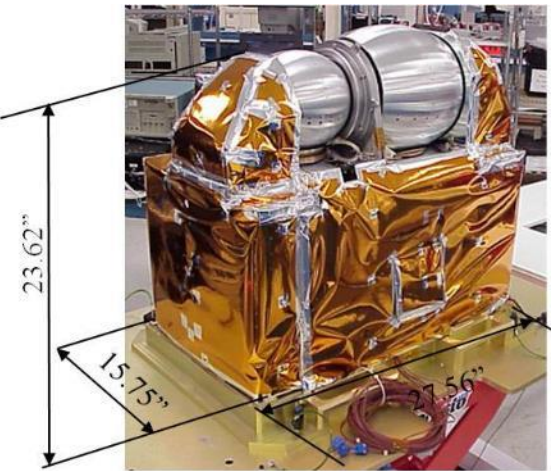
*BACKUP SLIDES*



# Contemporary NOAA MW Sounders



- ❖ The Advanced Technology Microwave Sounder (ATMS) and Advanced Microwave Sounding Unit (AMSU)/Microwave Humidity Sounder (MHS)
  - Flown on-board NASA, NOAA, and EUMETSAT polar-orbiting satellites.
  - Over 20 frequency bands centered between 23 GHz and 183 GHz
    - ✓ 23 GHz – 40 GHz (2 bands): “Window” region that senses earth-surface properties through clouds
    - ✓ 50 GHz – 60 GHz (12-13 bands): Layer-average atmospheric temperature (T) sensing region
    - ✓ 80 GHz – 183 GHz (6-7 bands): Water vapor (WV), precipitation and soil moisture sensing region

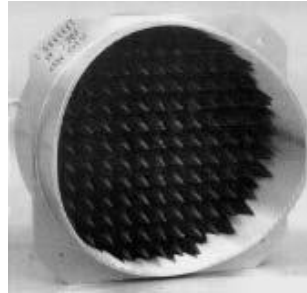


**ATMS Instrument**

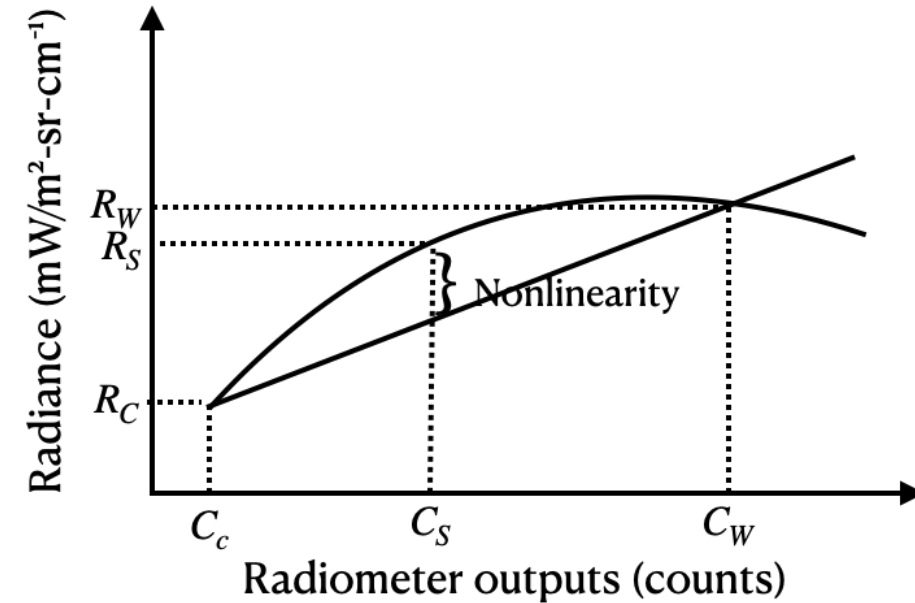
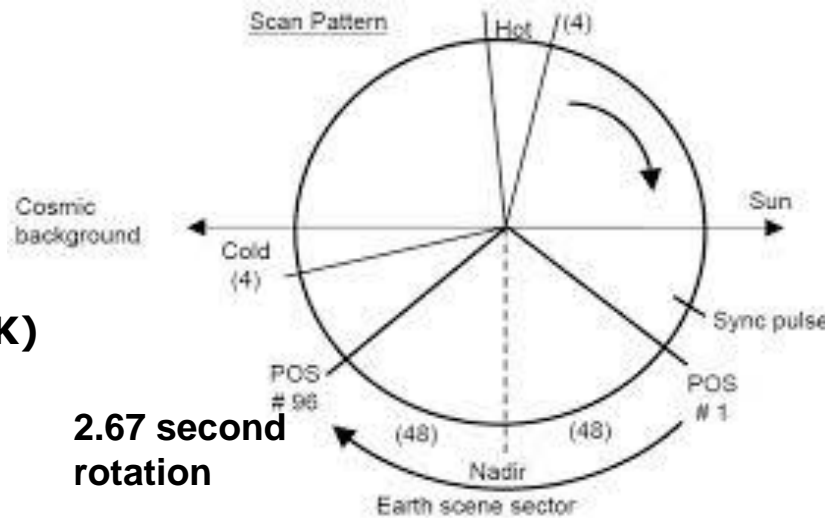
(Images courtesy of Northrop Grumman Electronics Systems)

# 2-Point Linear Instrument Calibration with Adjustment for Weak Response Non-Linearity

Warm load (or blackbody) with NIST-Traceable Platinum Resistance Thermometers (~275 K – 285 K)



Cold Space (2.73 K)

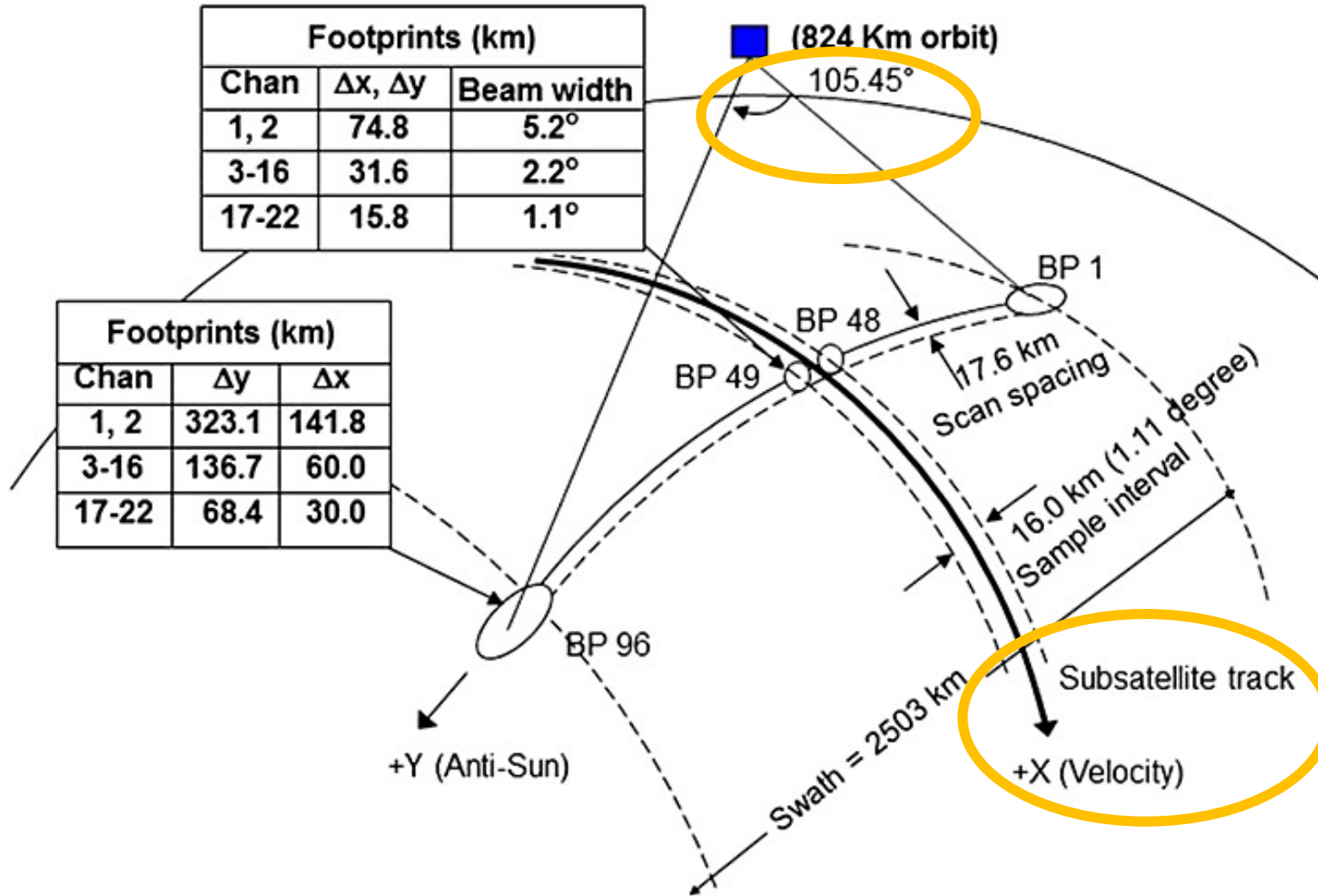


$$R = R_c + \left( \frac{R_w - R_c}{C_w - C_c} \right) (\overline{C_s} - \overline{C_c}) + Q$$

$$= R_c + Gain(\overline{C_s} - \overline{C_c}) + Q$$

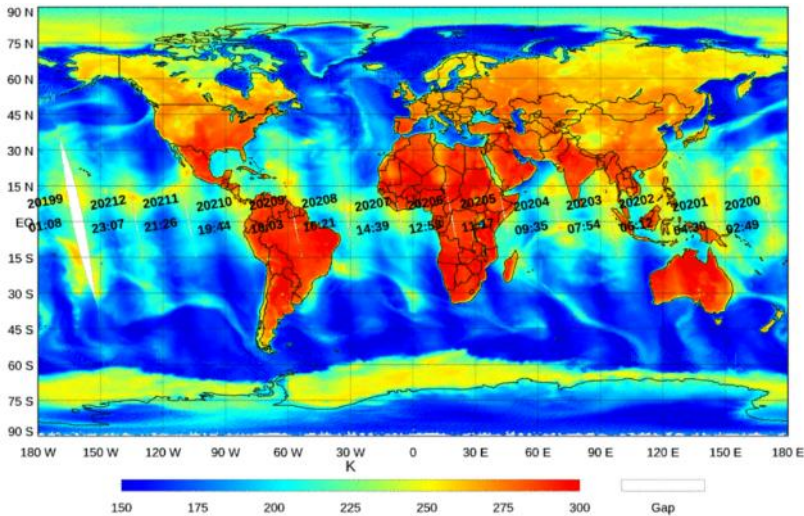
$$Q = \frac{1}{4} T_{nlin}^{max} [4(x - 0.5)^2 - 1]$$

# Cross-track Scanning Image Buildup

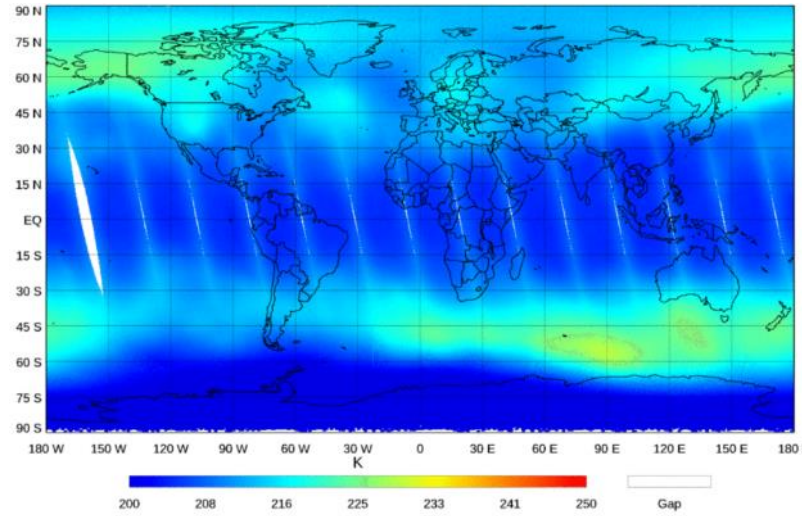


- ❖ Images created by the scanning motion of the rotating antenna and the orbital velocity of the satellite
- ❖ Larger footprints near the scan edge than at "nadir"
- ❖ Swath width is about 2500 km

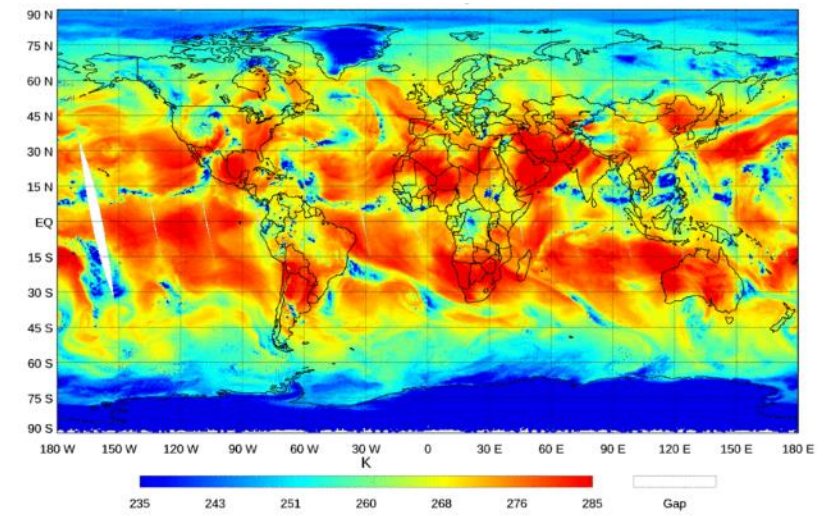
# NOAA-20 Images October 12, 2021



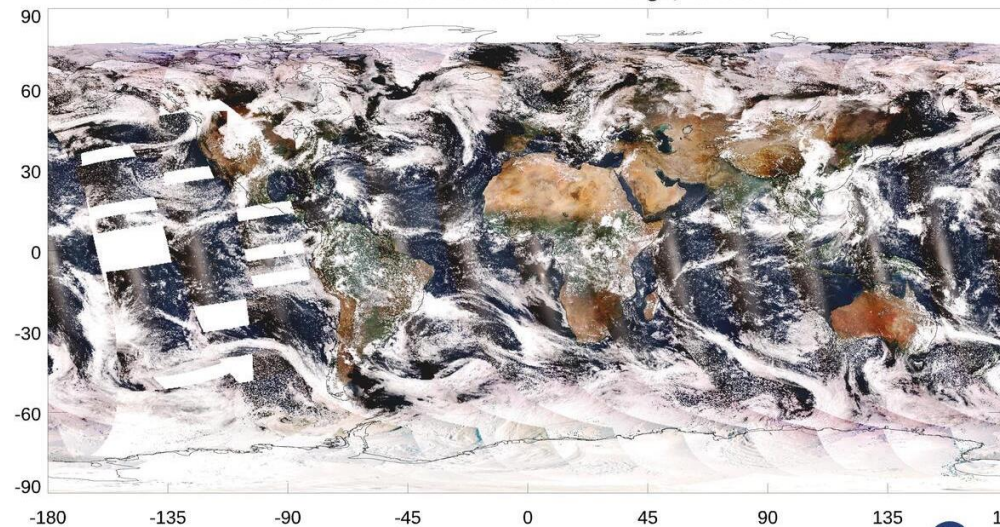
ATMS Surface "Window" 23.8 GHz



ATMS Layer T 57.29 GHz



ATMS Layer WV and Precipitation  
183.31±7 GHz



True color image from the Visible Infrared Visible Infrared Imaging Radiometer Suite (VIIRS) reveals the complimentary information from MW instruments.

Red:SVM05, Green:SVM04, Blue:SVM03

