



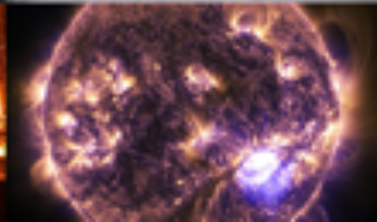
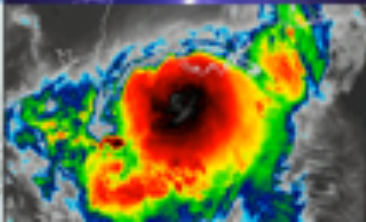
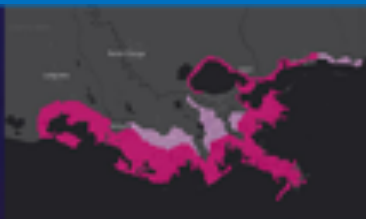
**NATIONAL  
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# Use of Radio Occultation (RO) data in NOAA/NWS for environmental modeling: Current status and future challenges

**Mike Farrar**

*Director, National Centers for Environmental Prediction (NCEP), NOAA/NWS*

April 7, 2021 | International Radio Occultation Work Group (IROWG)



# Outline

- COSMIC-2 Implementation and assessment at JCSDA + NCEP
- NOAA commercial RO delivery order #1: preliminary results for GFS
- Future challenges





# COSMIC-2 NWP assessment and implementation at JCSDA/NCEP

Hui Shao<sup>1</sup>, Kristen Bathmann<sup>2</sup>, Hailing Zhang<sup>1,3</sup>, Zih-mao Huang<sup>4</sup>,  
Lidia Cucurull<sup>5</sup>, Francois Vandenberghe<sup>1</sup>, Russ Treadon<sup>2</sup>,  
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<sup>4</sup>Taiwan Central Weather Bureau (CWB)

<sup>5</sup>NOAA Atlantic Oceanographic and Meteorological Laboratory (AOML)

<sup>6</sup>NOAA National Weather Service (NWS)

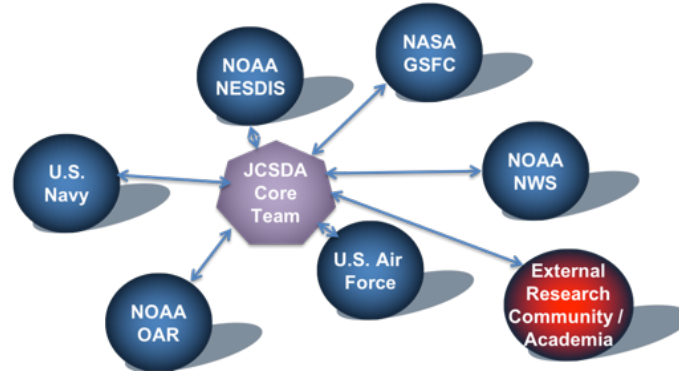
Acknowledgement to UCAR/COSMIC, NESDIS and other COSMIC-2 Cal/Val partners

5<sup>th</sup> International Conference on GPS Radio Occultation  
October 21~23, 2020  
Hsinchu, Taiwan (Virtual)

# NCEP – JCSDA partnership

## The Joint Center for Satellite Data Assimilation (JCSDA)

Accelerate and improve the quantitative use of research and operational satellite data in weather, ocean, climate and environmental analysis and prediction systems.



➤ 490 FTE  
 ➤ 237 Contractors  
 ➤ 20 visitors  
 ➤ 5 NOAA Corps Officers

|                                                                                            |                                                       |                                                      |                                                          |
|--------------------------------------------------------------------------------------------|-------------------------------------------------------|------------------------------------------------------|----------------------------------------------------------|
| <b>Aviation Weather Center</b><br>Kansas City, MO                                          | <b>Space Weather Prediction Center</b><br>Boulder, CO | <b>Storm Prediction Center</b><br>Norman, OK         | <b>National Hurricane Center</b><br>Miami, FL            |
| <b>NCEP Central Operations</b><br>College Park, MD<br>(Supercomputers in Reston & Orlando) | <b>Ocean Prediction Center</b><br>College Park, MD    | <b>Climate Prediction Center</b><br>College Park, MD | <b>Environmental Modeling Center</b><br>College Park, MD |
|                                                                                            | <b>Weather Prediction Center</b><br>College Park, MD  |                                                      |                                                          |

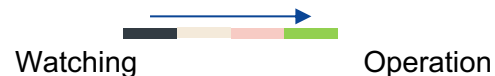
## National Centers for Environmental Prediction (NCEP)

Deliver national and global operational weather, water and climate products and services essential to protecting life, property and economic well-being.






# GNSS-RO: Missions and Status at NCEP

| Missions                | RT availability                | Operation Status                                                                | Coverage                 | Counts/day |
|-------------------------|--------------------------------|---------------------------------------------------------------------------------|--------------------------|------------|
| COSMIC (US/Taiwan)      | GTS, real-time dump            | Decommissioned                                                                  | Global                   | 0          |
| METOP-A/B (EUMETSAT)    | GTS, real-time dump            | In operations (only above 8km)                                                  | Global                   | ~1200      |
| TerraSar-X (Germany)    | GTS, real-time dump            | In operations                                                                   | Global                   | ~200       |
| TANDEM-X (Germany)      | GTS, real-time dump            | In operations                                                                   | Global                   | ~100       |
| KOMPSAT-5 (Korea)       | GTS, real-time dump            | In operations                                                                   | Global                   | ~200       |
| COSMIC2 (US/Taiwan)     | GTS, real-time dump            | In operations                                                                   | 45S-45N (mostly 35S-35N) | ~5000      |
| METOP-C (EUMETSAT)      | GFS, real-time dump            | Retrospective test completed; in parallel assimilation mode                     | Global                   | ~600       |
| Commercial data         | 2021?                          | CWDP data tested. DA capability (with default config.) included in GFS v16 code | Global                   | TBD        |
| PAZ (SPAIN)             | GTS, real-time dump            | Retrospective test completed                                                    | Global                   | ~150       |
| Megha-Tropiques (INDIA) | GTS (missing since March 2020) | Retrospective test completed                                                    | Global                   | ~170->0    |
| Sentinal-6              |                                | Scheduled launch in Nov, 2021                                                   | Global                   |            |

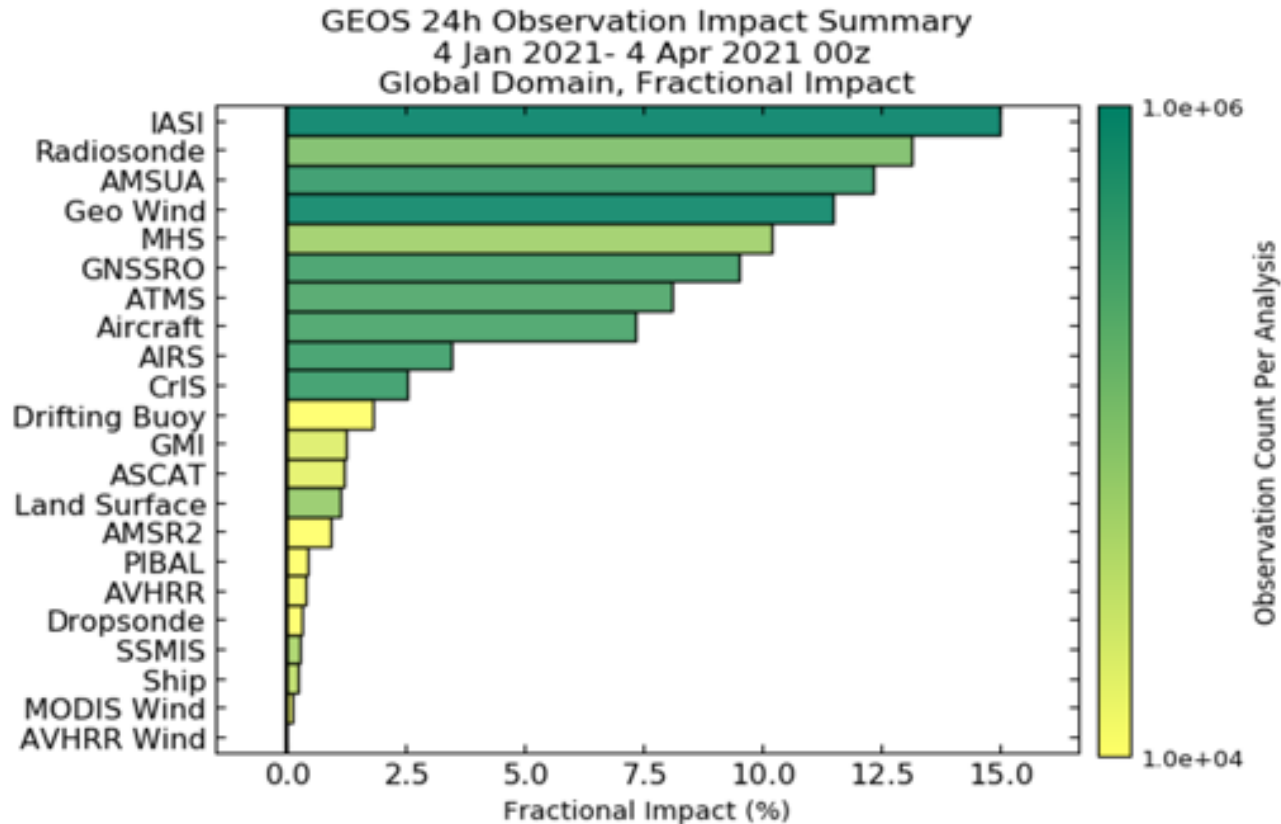
***COSMIC-2, launched on June 25, 2019, has become the primary data resource for GPSRO in the tropical and mid-latitude areas***



# COSMIC-2: Efforts and Milestones

- **Early data quality** was evaluated throughout the cal/val period  Data provisional release on Dec 10, 2019
- Starting in Nov 2019, numerical experiments were performed for updated **configurations**: (each group includes multiple experiments for finer tuning and tests)
  - Control
  - Control + C2 using default obs. error and QC
  - Control + C2 using default EUMETSAT obs. error and QC (C2 changed its BUFR data vertical distribution to match with other EUMETSAT RO data)
  - Control + C2 with obs error estimated using the method based on Kuo, 2004
  - Control + C2 with turned obs error using the method based on Desroziers, et al., 2005
  - Control + C2 + different gross error threshold (below 5km only, whole profiles) COSMIC-2 public (near real-time) release on March 6, 2020  
GTS release on March 16, 2020
- Performed **final tuning** for COSMIC-2 with inputs from other collaborators (e.g. AOML)  NCEP operational implementation (v15.3) on May 26, 2020
- Continues to work with data processing centers to **evaluate processing changes** and provide recommendation on their implementation. These changes will/will not affect data quality distributed to the operational/research community  Data processing update
- Continue to **improve and advance GNSSRO forward operators and prepare for next operational implementation at NCEP**  Code changes and tests for JEDI and next global system update (GFS v16) at NCEP

# Overall GNSS-RO: Forecast Impacts



Results from NASA  
GEOS-5, which uses  
same FV3 dynamic  
core as NOAA GFS

Courtesy of NASA  
GMAO

[https://gmao.gsfc.nasa.gov/forecasts/systems/fp/obs\\_impact/](https://gmao.gsfc.nasa.gov/forecasts/systems/fp/obs_impact/)

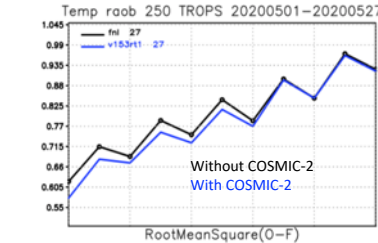
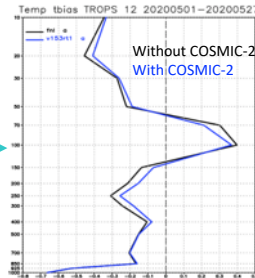
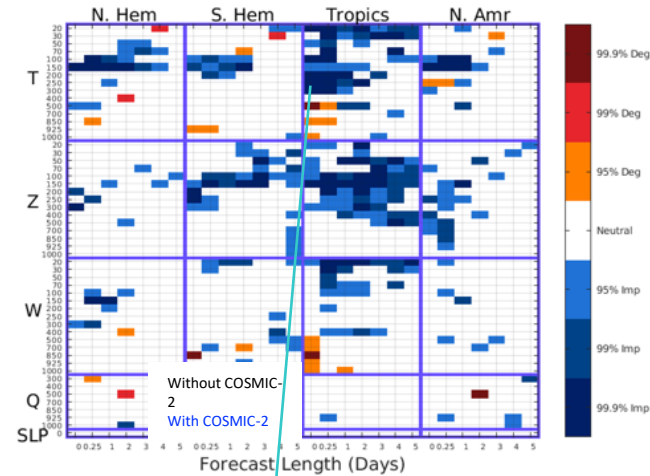
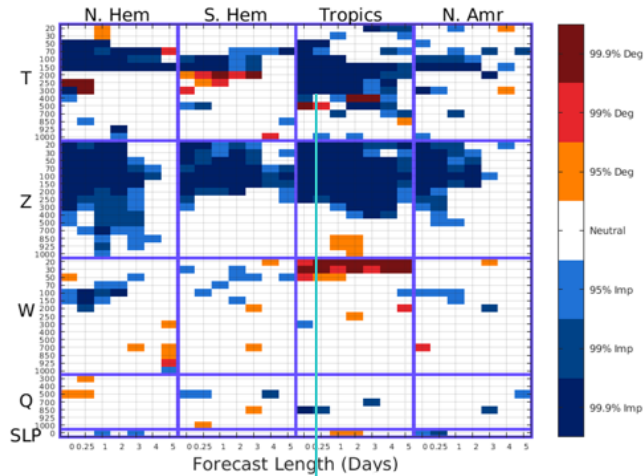


# COSMIC-2: Forecast Impacts

## Forecast Impacts

Blue indicates COSMIC-2 reduced forecast errors

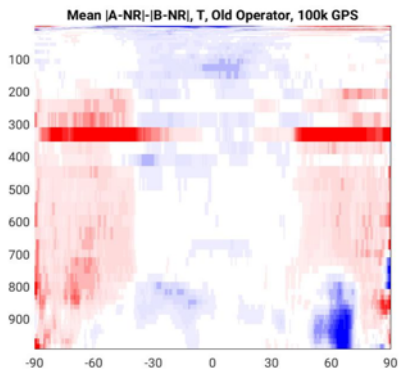
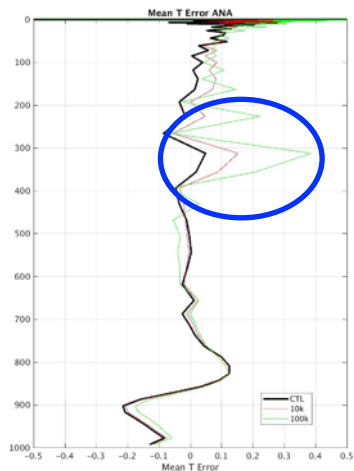
Red indicates COSMIC-2 degraded forecast errors



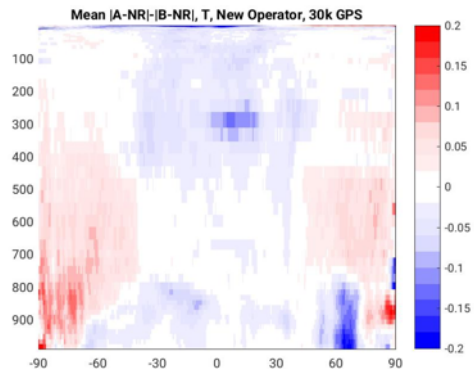
Using results up to May 18, 2020



# COSMIC-2: OSSE Results and related DA code changes



Old (default)



New

- A negative spike in bending angle (O-B) caused a positive temperature increment at this level, leading to an anomalously hot layer, during an OSSE study
- The more GPSRO are used, the larger the magnitude of the positive temperature increment and ensuing (bad) hot layer in the analysis
- Code changes were made related to the interpolation from model space to observation space
- 300-400hpa biases are removed due to the code changes
- Biases in lower mid-polar areas may need a separate investigation

(Collaborated with NASA/GMAO)

# GNSS-RO Summary and Plans

- COSMIC-2 operational implementation
- GDAS V16 release (implemented March 2021)
- Improving the use of COSMIC-2 and other GNSSRO data in operational system
- Evaluation for NOAA commercial RO data purchase
  - ***See next section for eval of NOAA Delivery Order 1***
- GDAS V16.1 for commercial RO
  - *To be implemented later in 2021*
- ***Advanced forward operator study (JEDI)***

Completed  
In progress



# Major Upgrades to GDAS with GFS v16

- **Local Ensemble Kalman Filter (LETKF)** with model space localization and linearized observation operator to replace the Ensemble Square Root Filter (EnSRF)
- **4-Dimensional Incremental Analysis Update (4D-IAU)**
- **Turn on SKEB** in EnKF forecasts
- **New variational QC**
- Apply Hilbert curve to aircraft data
- **Correlated observation error** for CrIS over sea surfaces and IASI over sea and land
- Update temperature aircraft bias correction with safeguard
- Reduce the distance threshold for inner core dropsonde data to 55km (from 111km or 3\*RMW) and add a wind threshold of 32 m/s to **allow more dropsonde data being assimilated**
- **Use CRTM v2.3.0**
- **Assimilate additional GPSRO** (add Metop-C GRAS, more COSMIC-2)
- **Assimilate CSR data from ABI\_G16, AHI\_Himawari8, and SEVIRI\_M08; AVHRR** from NOAA-19 and Metop-B for NSST
- **Assimilate** high-density flight-level wind, temperature, and moisture observations (**HDOBS in tropical storm environment (first time in operations for GFS)**)
- Assimilate AMSU-A channel 14 and ATMS channel 15 w/o bias correction



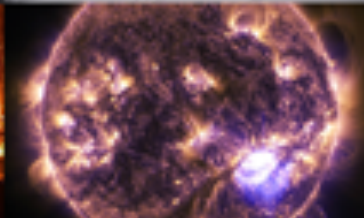
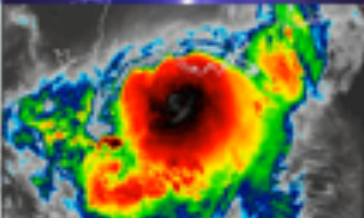
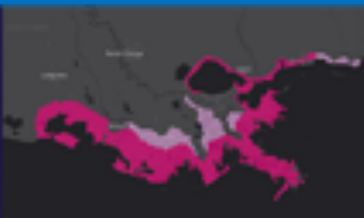
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# Preliminary Results from Delivery Order 1 (DO-1) Commercial GNSSRO Purchase in the Global Forecast System (GFS)

James Yoe<sup>1,2</sup>, Kristen Bathmann<sup>3</sup>, Daryl Kleist<sup>4</sup>, Hui Shao<sup>2,5</sup>, Catherine Thomas<sup>4</sup>, Francois Vandenberghe<sup>2</sup>

<sup>1</sup> NOAA/NWS/NCEP, <sup>2</sup> JCSDA, <sup>3</sup> IMIS @ NOAA/NWS/NCEP/EMC, <sup>4</sup> NOAA/NWS/NCEP/EMC, <sup>5</sup> UCAR

March 24, 2021 | OFCM Working Group on Interagency Coordination on Commercial Weather Data



# Delivery Order 1 (DO-1)

- NOAA's first contracts to purchase commercial space-based radio occultation data were awarded to GeoOptics and Spire Global in November 2020.
- 500 occultations per day for 30 days
  - ~December 15, 2020 - January 15, 2021
- Goals:
  - Test the data flow and reliability
  - Verify data quality
  - Preliminary impact assessment in the Global Forecast System (GFS)
  - Inform configuration for DO-2 testing (including GFS v16.1 implementation)

# Preliminary Testing with the GFS

- Testing was performed in a lower resolution framework
  - 25 km/50 km deterministic/ensemble
  - Operations: 13 km/25 km
- Based on the GFSv16 configuration
  - 127 layers
  - Implemented on March 22, 2021
  - Assimilate GNSSRO up to 55 km
- All tests assimilate Spire and GeoOptics together
  - The commercial RO observations are treated as other operationally assimilated RO observations unless otherwise noted.

# Preliminary Testing with the GFS

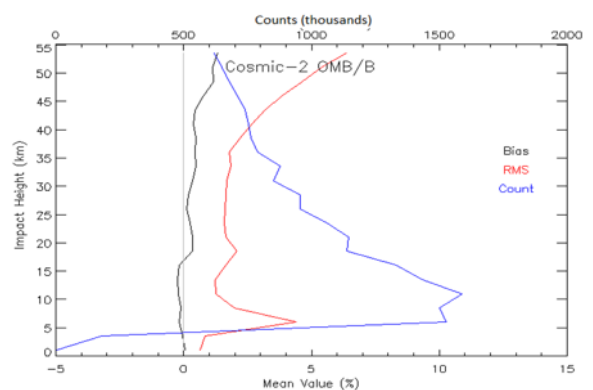
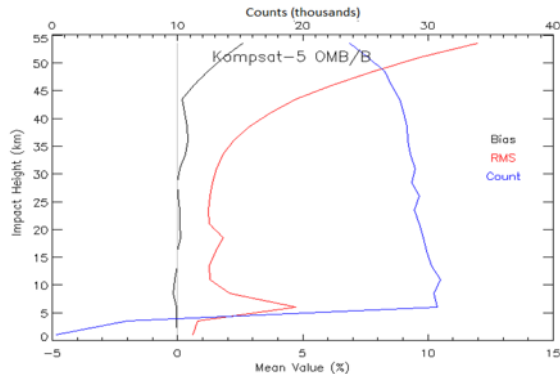
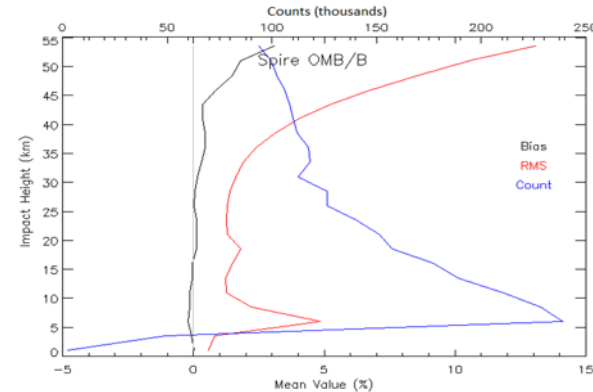
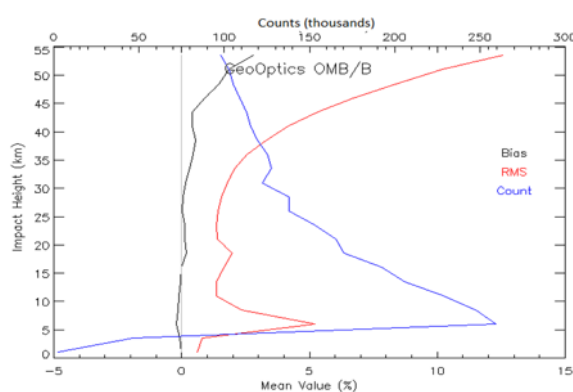
- The first experiment was run assimilating the commercial data the same as other RO data are.
  - Following experiments aim to improve upon that baseline.
- Experiments:
  - **CTL**: Control
  - **EXP**: Control + comm RO
  - **CUTOFF**: EXP + comm RO data removed above 45 km
  - **ERRINF**: EXP + comm RO obs errors inflated by 50% (*ongoing*)



# Quality of Commercial RO

GeoOptics and Spire occultations are found to have similar quality and error characteristics as other operationally assimilated RO data.

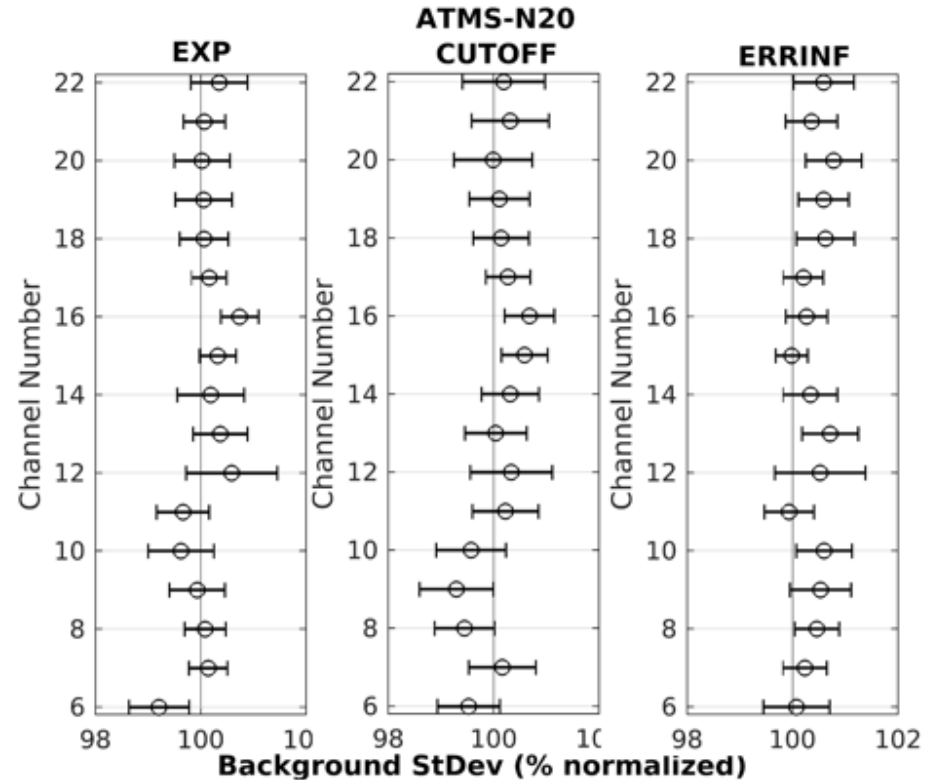
**Bias**  
**RMS**  
**Count**



# Background Fits to ATMS Channels

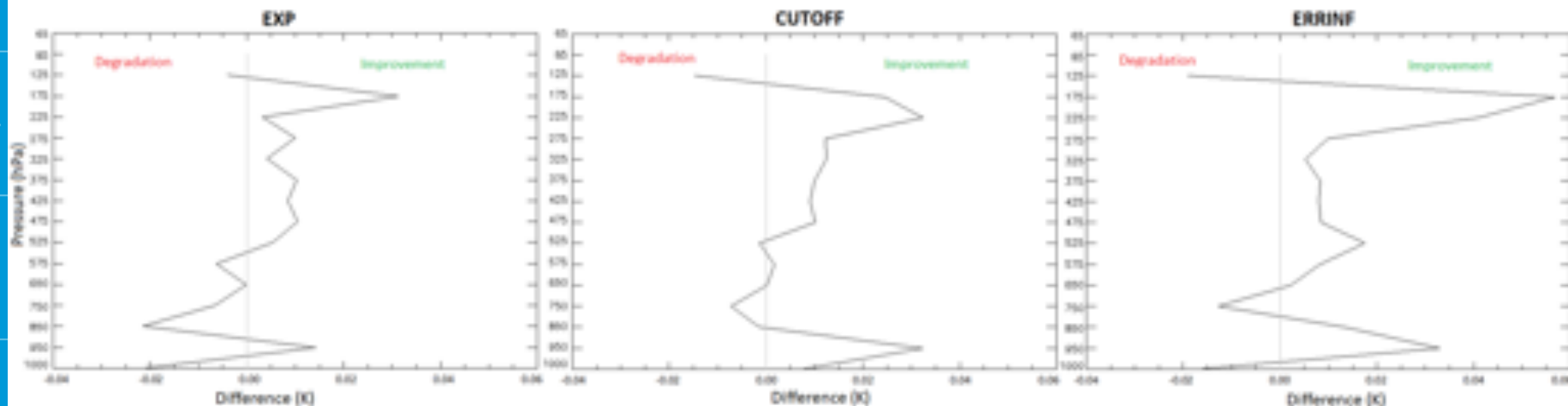
Globally averaged OMB fits to ATMS channels for 2020122000-2020122700.

A percent greater than 100 indicates degradation with the assimilation of commercial RO.



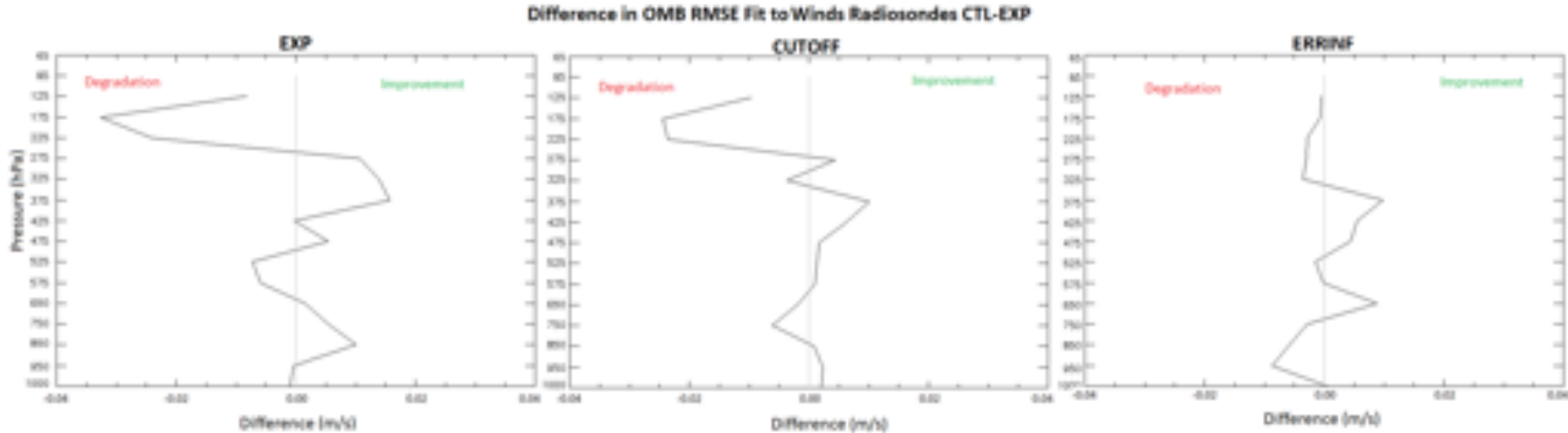
# Fit to Temperature RAOBS

Difference in OMB RMSE Fit to Temperature Radiosondes CTL-EXP



The differences in OMB RMS fits to temperature radiosonde measurements in the tropics, from 2020122000-2020122700.






# Fit to Winds RAOBS



The globally averaged differences in OMB RMS fits to U winds radiosonde measurements, from 2020122000-2020122700.








# Summary of DO-1 Results

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- Initial experiment assimilating the commercial RO data had neutral to negative forecast impact in low resolution GFS testing.
  - Indications of improvements in fits to temperature, but degradation was seen in the upper layers.
  - Two mitigation measures were tested: cut off the commercial RO data above 45 km and inflate the observations errors by 50%.
  - Preliminary results show that both methods improve background fits to temperature and wind measurements. Inflating observation errors improves forecast metrics impact at higher levels.



# Looking Ahead to DO-2

- Delivery Order 2 has been awarded to GeoOptics for 1300 occultations a day for six months (March through September).
  - Data started flowing on March 17 and an operational resolution parallel is running in near real time with the upper layer cutoff included (inflation is pending more testing).
  - Implementation of the assimilation of these data in GFS is currently planned for May-June 2021 (GFS v16.1).
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# Future Challenges and Activities

- Optimize value from assimilation of commercial RO data
  - Added value in tropics/mid-lats given overlap with COSMIC-2?
  - Greater value over high/mid-lats given absence of COSMIC-2?
  - Determine optimal cost vs. benefit for variable data density/distribution, for global as well as limited area/regional high-res models (e.g., HRRR)
  - Determine value in absence of other data vs. just adding to status quo
- How to handle potential exponential growth of new commercial data?
  - New smallsat data may come with short lead time and stay on orbit for only a few years; need capability to rapidly test, eval, and implement
  - NOAA is unlikely to be able to afford all available commercial data >> need ability to determine net forecast benefit per unit cost