

# Impact of Refractivity Profiles from a Proposed GNSS-RO Constellation on Tropical Cyclone Forecasts in a Global Modeling System



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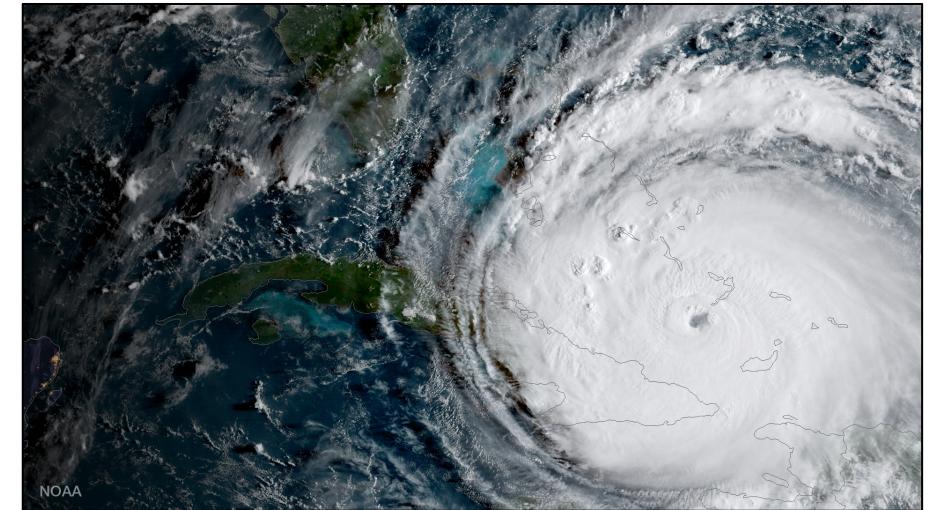


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# Background: Tropical Cyclones

- Tropical cyclones (TCs) pose serious threat to life, disruption to society
- Track and intensity forecasts are heavily scrutinized and used to make very expensive decisions
- TC forecasts challenging due in part to lack of observations
  - Ships and aircraft generally avoid core of the storm
  - Satellite radiances do not sample below dense overcast
  - Very few surface or vertical observations collected in storm environment
- Need better observation coverage over oceanic data void, especially below dense overcast near TC core

Hurricane Irma (NOAA)



Evacuation on I-75



# Background: Radio Occultation

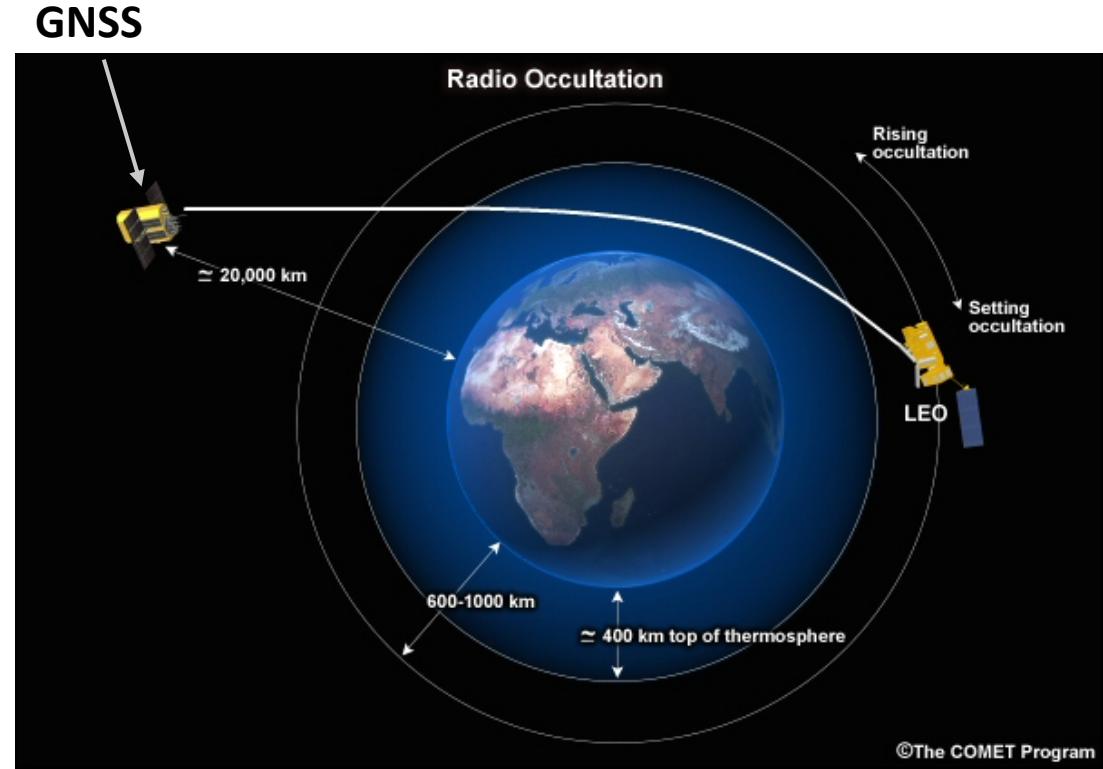
- RO improves global-scale forecast skill

## How does RO work?

- Radio signals from Global Navigation System Satellites (GNSS) traverse atmosphere en route to Low Earth Orbit (LEO) satellite
- Air density refracts radio signal
- Extent of refraction at different levels of atmosphere yields refractivity profiles
- Profiles contain information about temperature, moisture, and pressure

## Why might RO improve TC forecasts?

- Signals minimally attenuated by clouds or precipitation, allowing profiles through TC core
- **Offers coverage over oceanic data voids and under dense clouds**



# Background: Goals and Objectives

## How does global RO data assimilation impact model track and intensity forecasts for tropical cyclones?

We want to use:

1. Many TCs and TC forecasts
2. Global analysis and forecast system, cycled over an extended period
3. Proposed LEO satellite constellation based on original configuration of COSMIC-2
  - 12 satellites: 6 equatorial orbiting, 6 polar orbiting
  - ~12,000 profiles per day worldwide

Since observations don't currently exist, must use Observation System Simulation Experiment (OSSE) framework:

- Simulated "real atmosphere" called Nature Run
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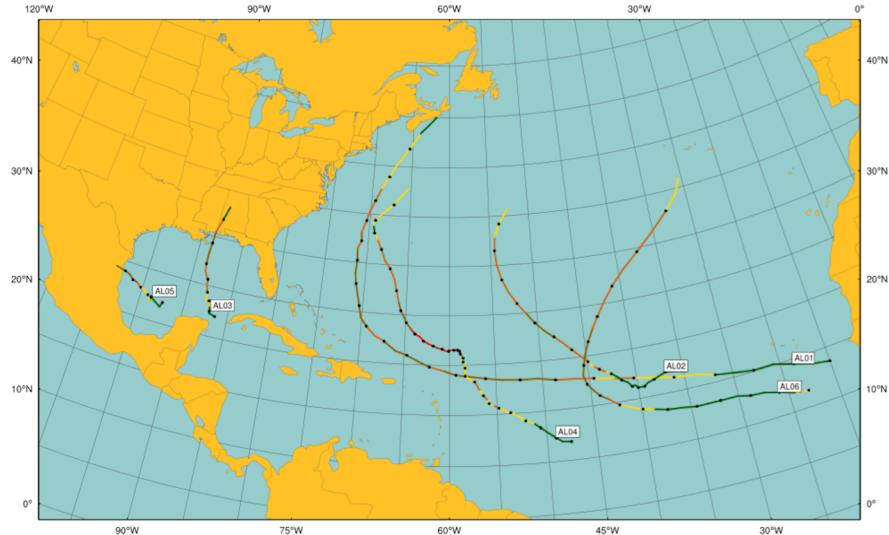
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# Methods: OSSE Configuration: Nature Run

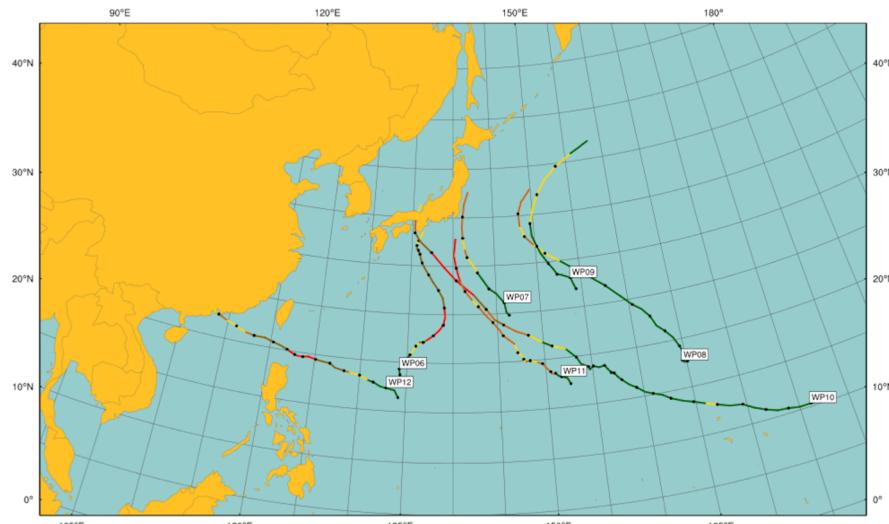
G5NR Atlantic Tropical Cyclones



G5NR Eastern Pacific Tropical Cyclones



G5NR Western Pacific Tropical Cyclones



- NASA/GMAO GEOS-5 global mesoscale nature run (G5NR; Putman et al 2016)
- Stand-in for real atmosphere
- Verified against climatology of real atmosphere (e.g. Gelaro et al 2015; Reale et al 2017)
  - Realistic TCs
  - ~7-km x 7-km horizontal grid
  - 72 vertical levels

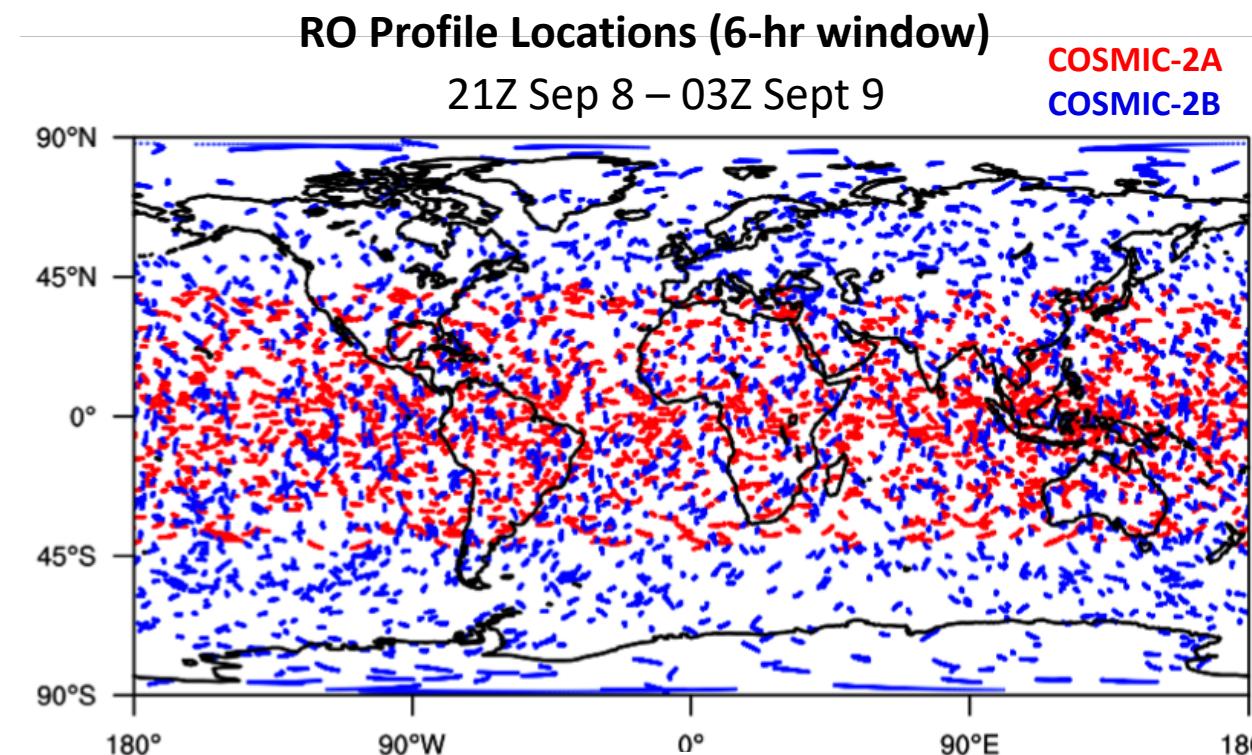
# Methods: OSSE Configuration: Simulated Observations

## Simulated Observations

- Surface pressure, temperature, u-, and v-wind, specific humidity, satellite radiances, and RO refractivity profiles

## Distribution

- Conventional and radiance observations: real-world stats (Aug – Sept 2014)
- RO profiles: Realistic orbits of original proposed COSMIC-2 constellation



# Methods: OSSE Configuration: Analysis and Forecast Cycling System

## NCEP's GDAS/GFS (Q1FY15)

- GDAS cycles 00Z, 06Z, 12Z, 18Z (3DEnVar GSI)
- 6-hr assimilation window
- Global cycling for 2 months: 1 August – 30 September (Nature Run Year)
- Spin up 1 – 14 August
  - Real-world GFS initial conditions converge to Nature Run “reality”
- Experimental period 15 August – 30 September
  - 168-hr GFS forecasts at 00Z
- GFS run at T670L64, GSI at T254L64



## Methods: Experiments

**CTL**

*ps t u v q satellite radiances*

**RO\_err**

*ps t u v q satellite radiances RO with errors added*

**RO\_err\_1cyc**

*Same as RO\_err, but started from CTL background*

**All conventional and satellite radiance data had errors added**

# Methods: OSSE Configuration: Verification

## Datasets

- **Truth: G5NR Global Nature Run (~7-km x 7-km grid)**
- G5NR TC track and intensity based on Reale et al 2017 TC climatology
- GFS forecasts:  $0.25^\circ \times 0.25^\circ$  data; GFDL Vortex Tracker

## The Cases

- 17 TCs occurred from 15 August – 30 September
- Many global forecasts contained multiple TCs: **132 TC forecasts**

## Error Statistics Calculations

- Averaged track and maximum wind speed errors for 132 forecasts
- Statistical significance with respect to CTL assessed using paired t-test

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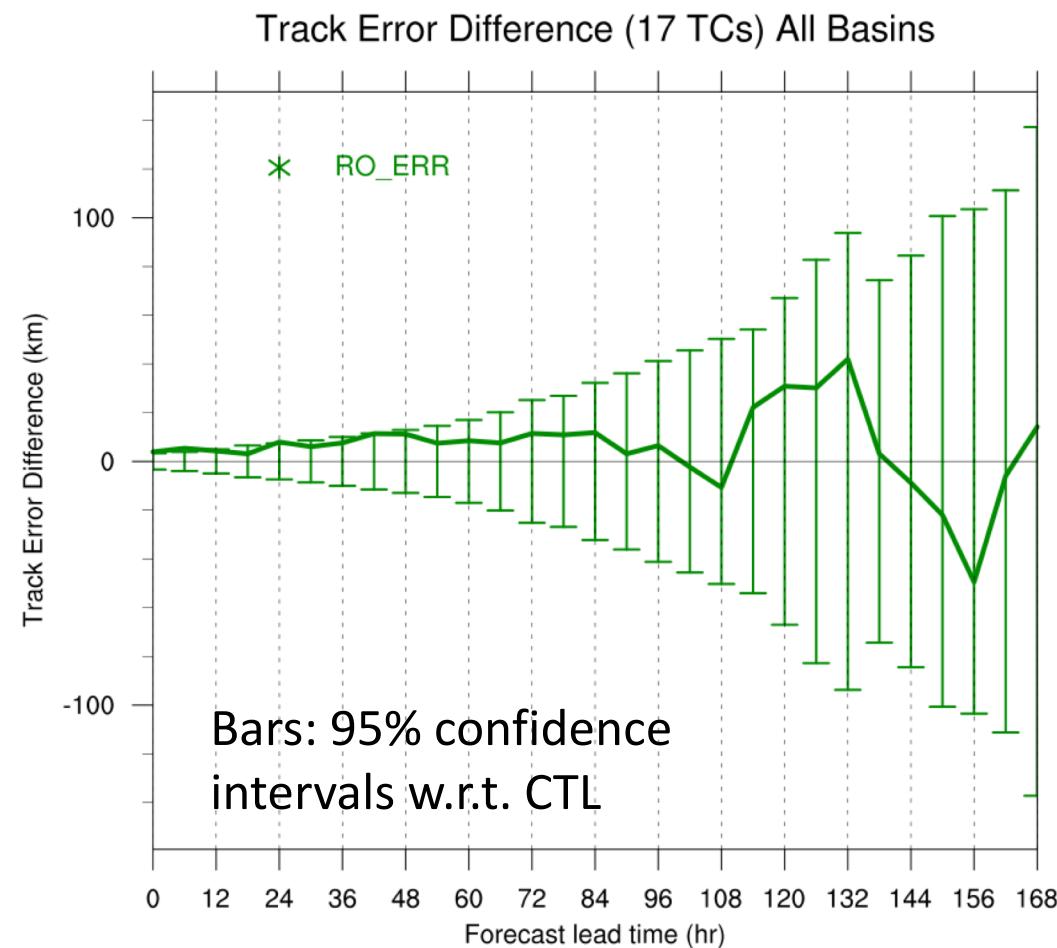
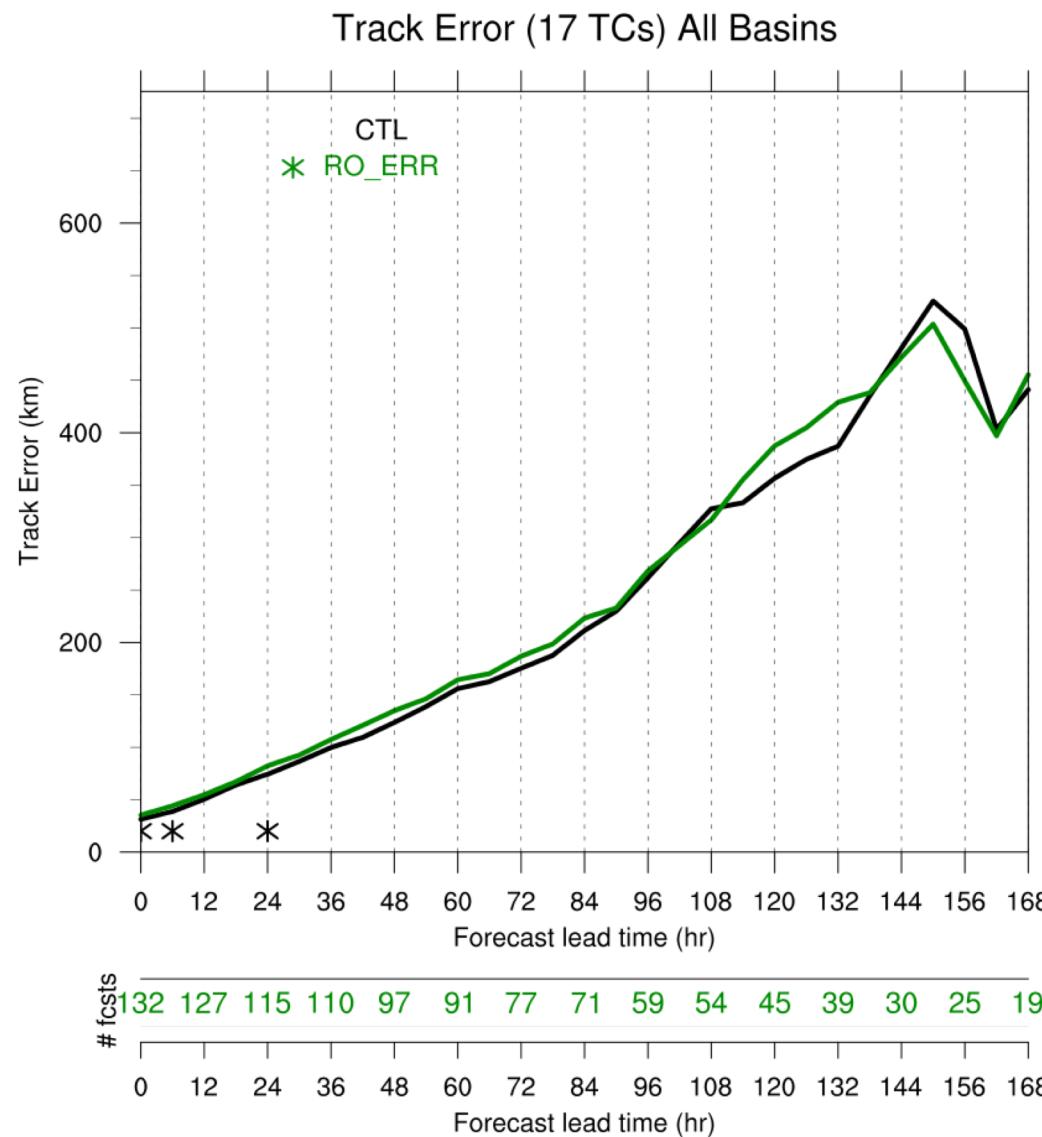
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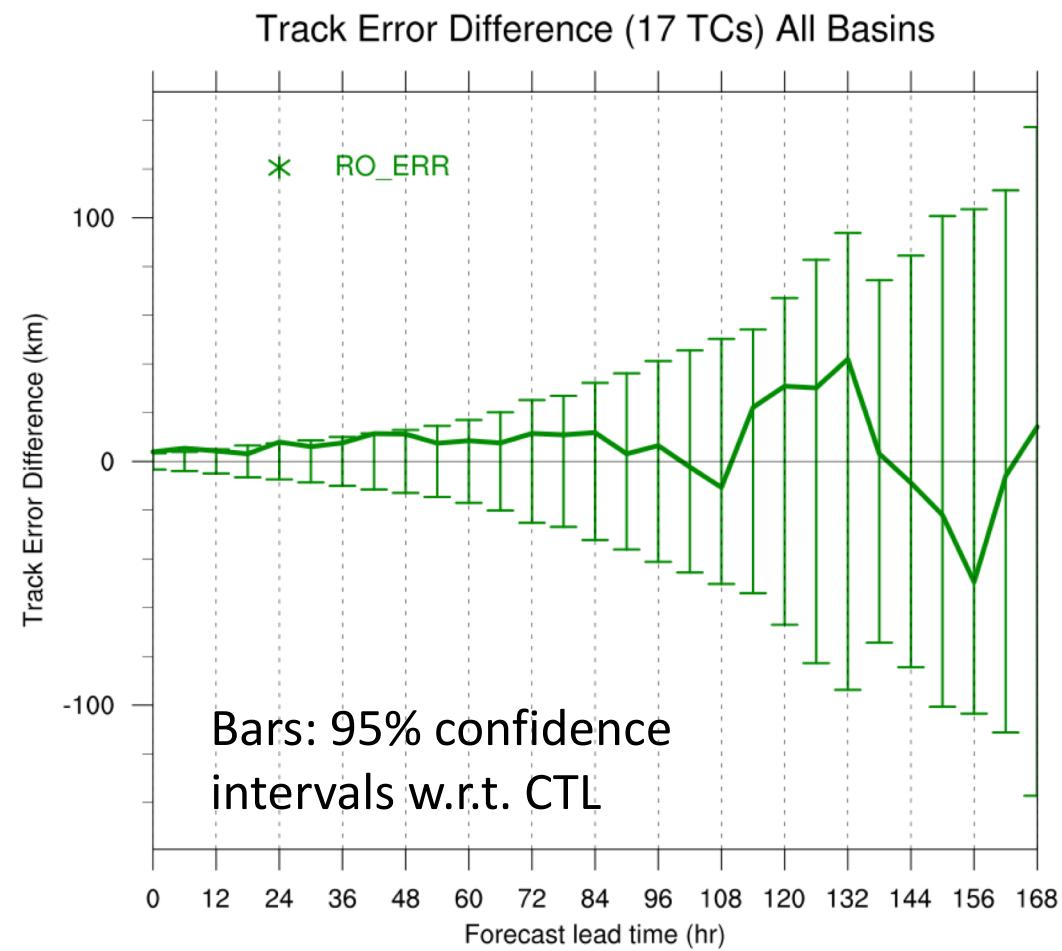
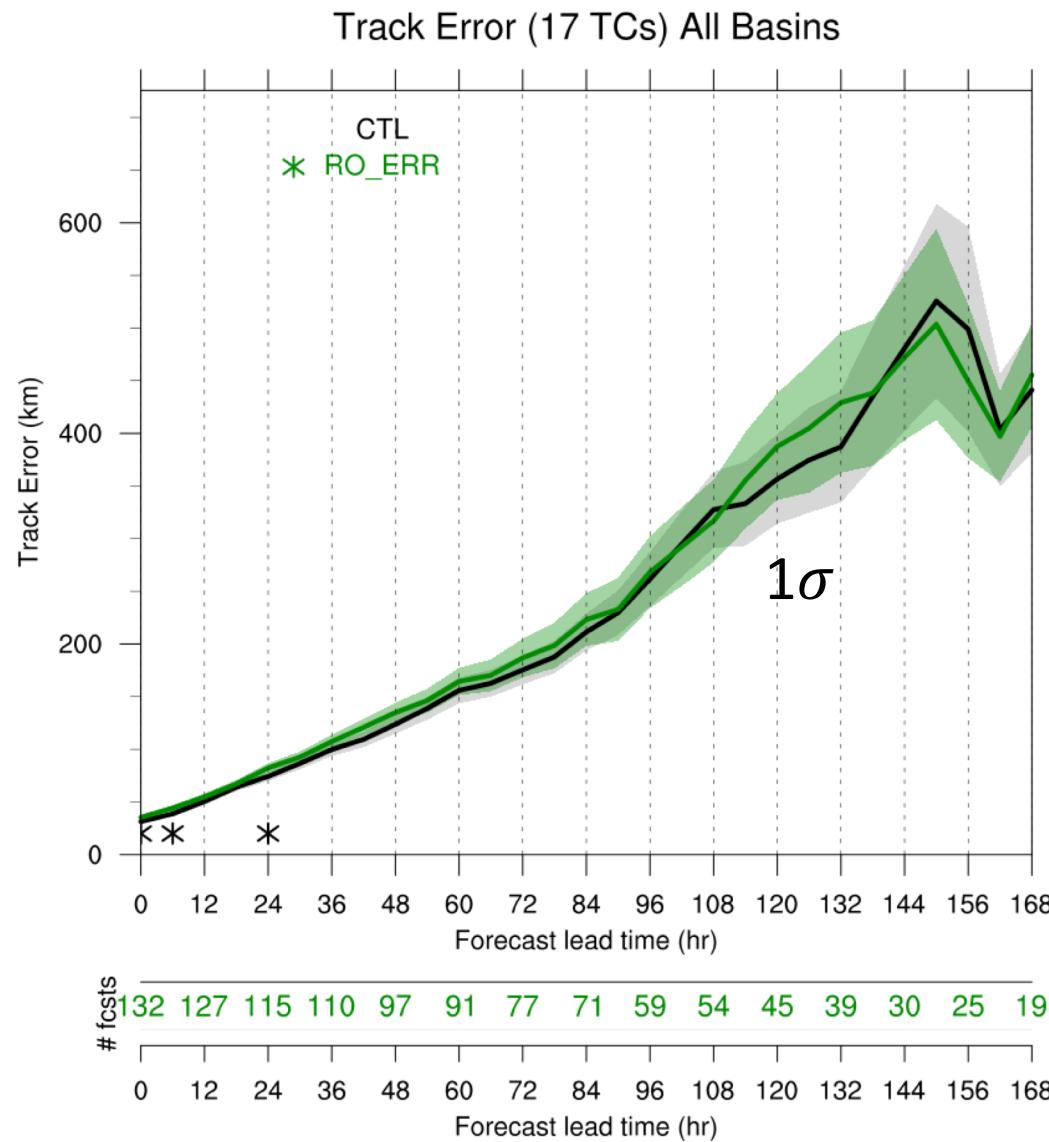
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# Results: Global Track Forecast Statistics (132 forecasts)



- Neutral impact at most lead times
- Significant degradation at 0, 6, and 24 h

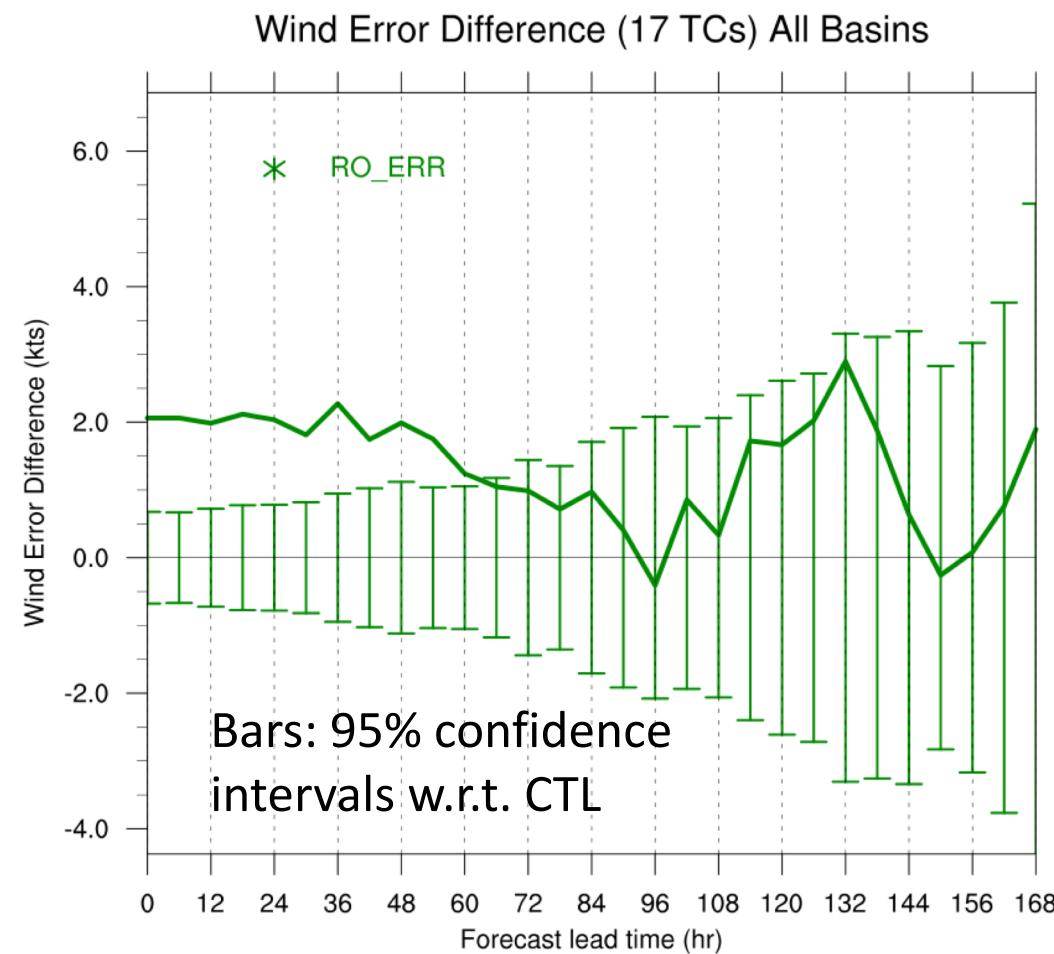
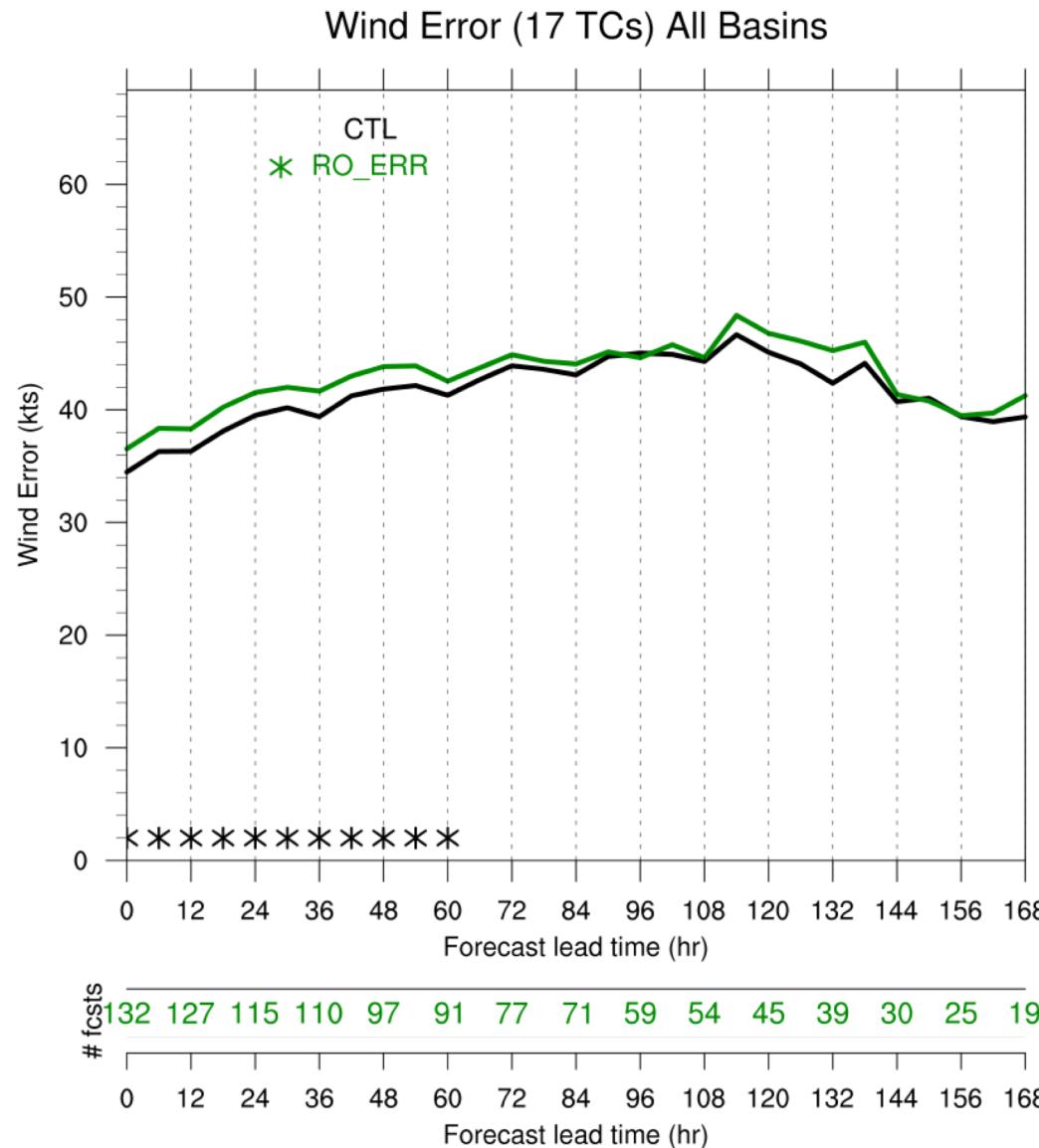
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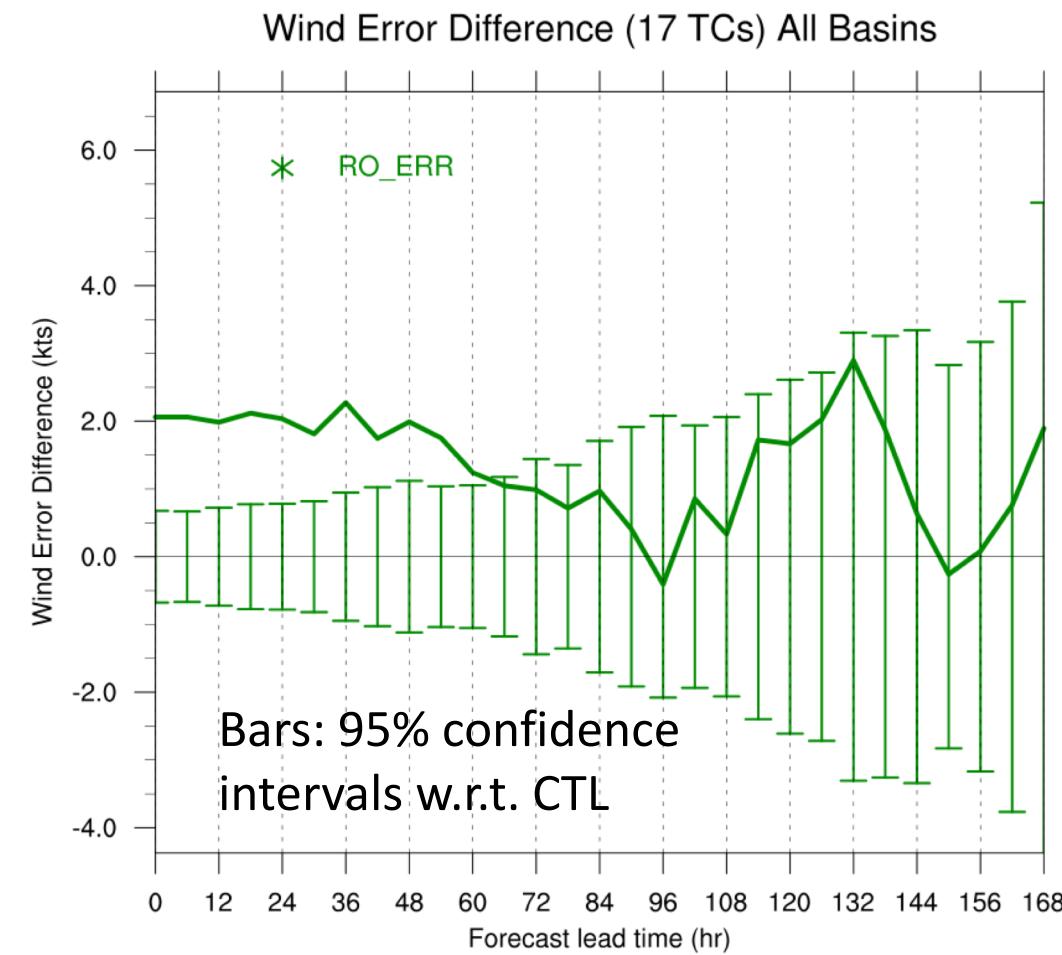
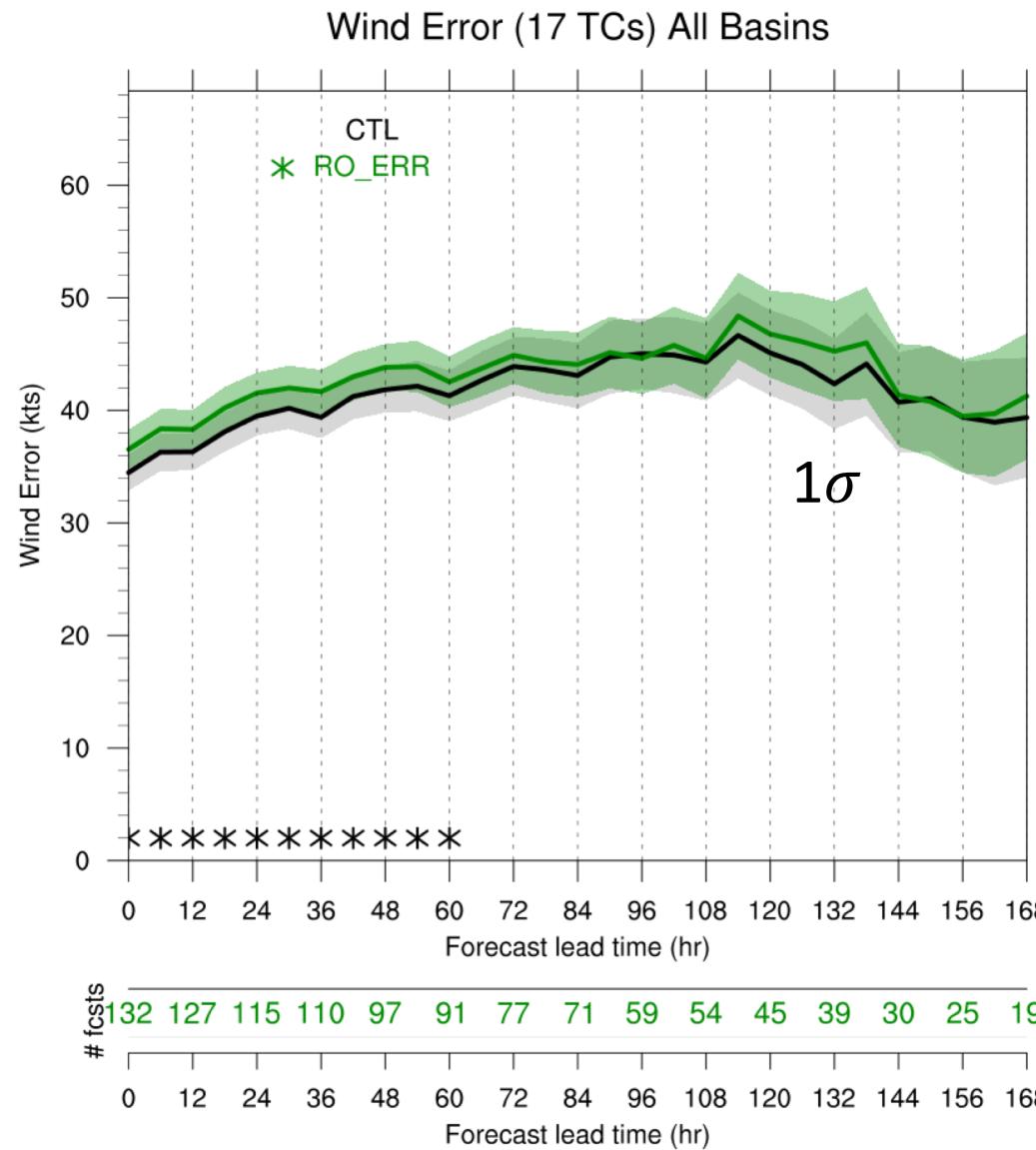
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# Results: Global Wind Forecast Statistics (132 forecasts)



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# What Influences RO Impact?

**Why are some forecasts improved, others degraded?  
Were there storm attributes that influenced RO impact?**

**Categorize storms by attribute:**

- 1. Tropical cyclone basin?**
- 2. Latitude of “real” G5NR storm at initialization?**
- 3. Maximum wind speed of “real” G5NR storm at initialization?**
- 4. RO observations near TC?**

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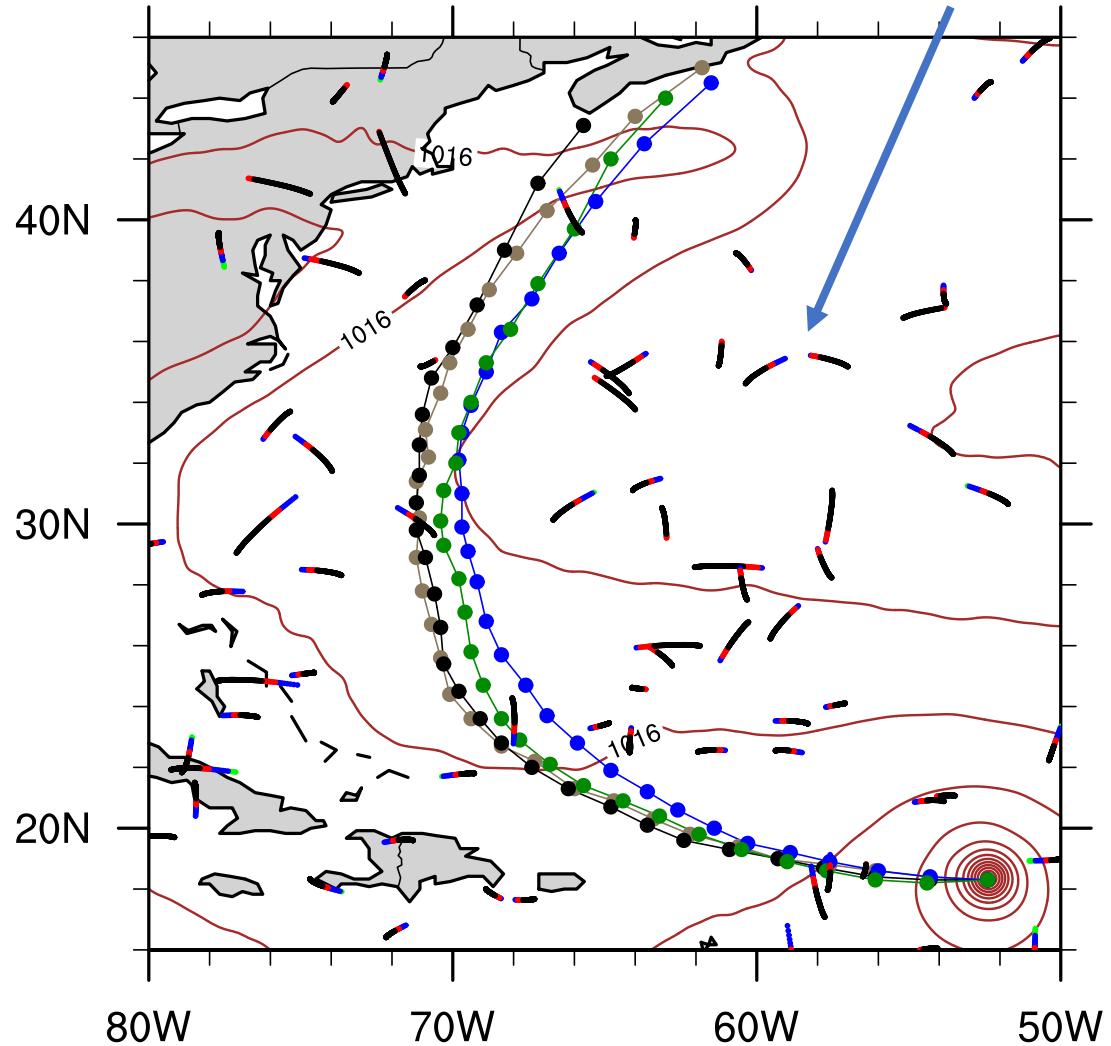
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Go back and look at individual case studies...

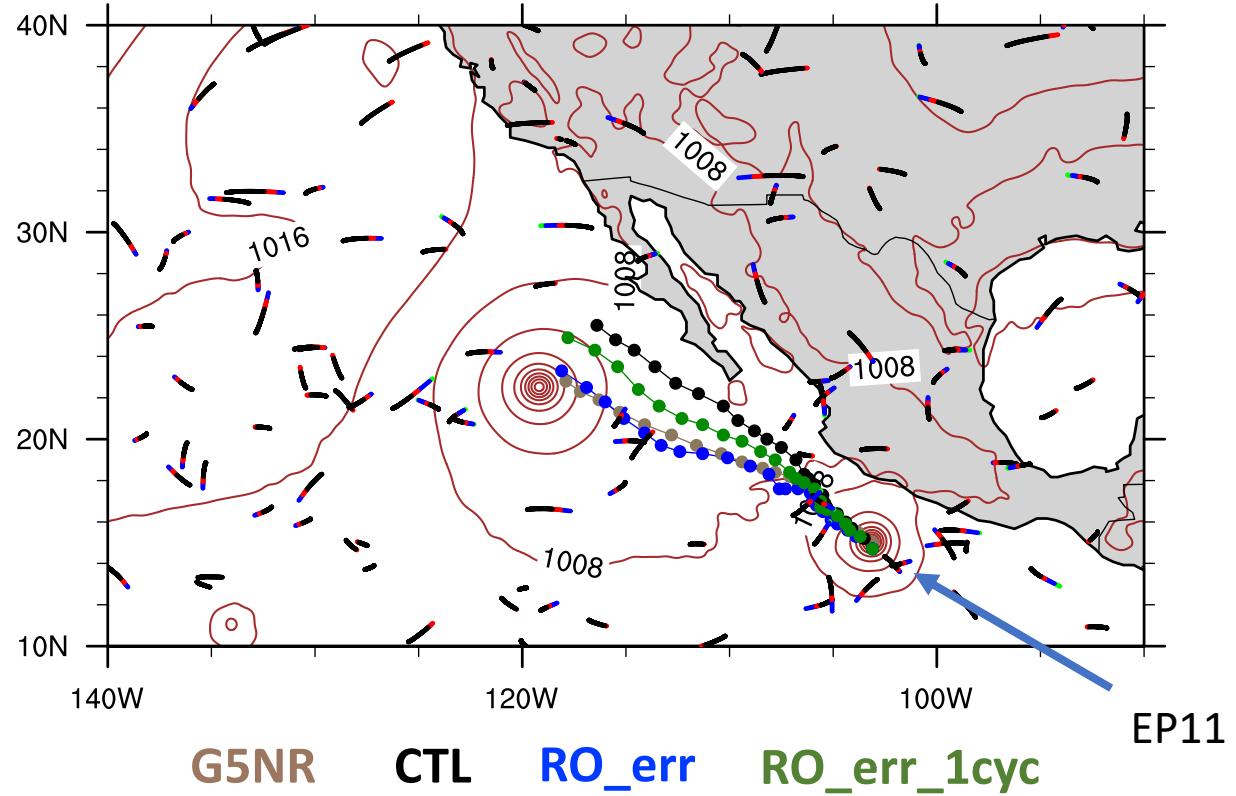
What is really going on meteorologically case by case?

# What Influences RO Impact?

AL01: 23 August RO profile



EP11: 8 September



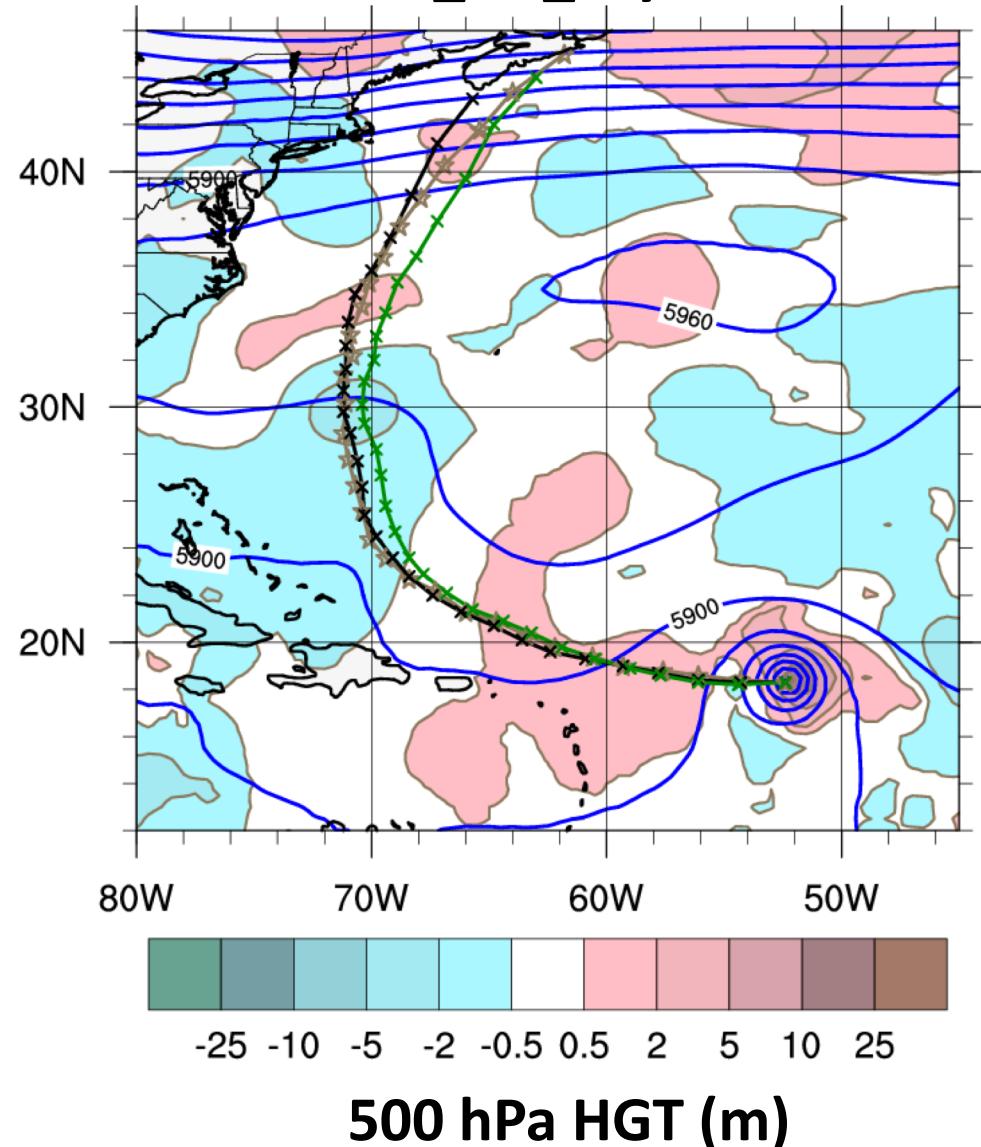
G5NR    CTL    RO\_err    RO\_err\_1cyc

- Contours of MSLP
- Assimilated RO observations
  - **BLACK: 5km-30km**
  - **RED: 3km-5km**
  - **BLUE: 1km – 3km**
  - **GREEN: below 1km**

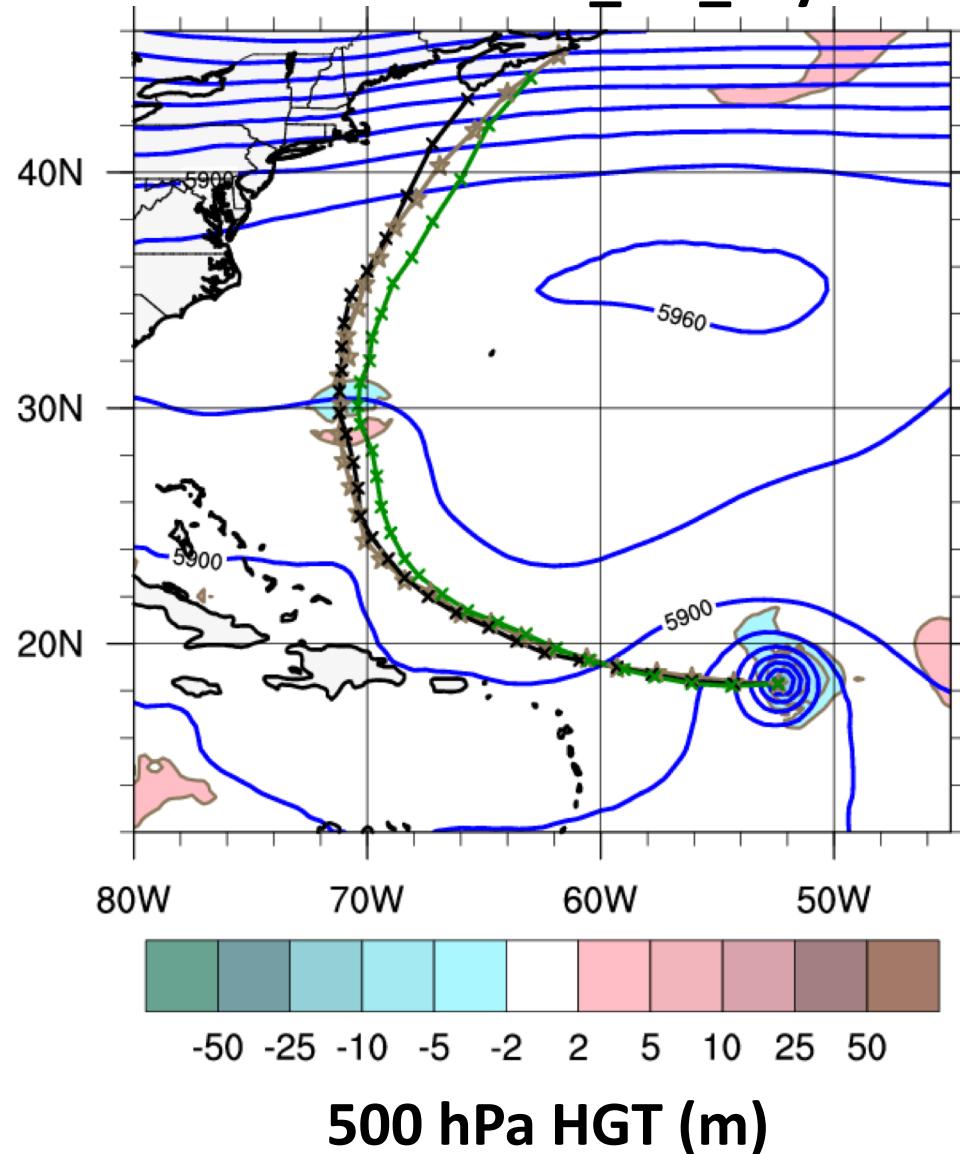
# AL01: 23 August (500hPa Heights)

Storm Tracks: G5NR CTL RO\_err\_1cyc

Fill: RO\_err\_1cyc - CTL



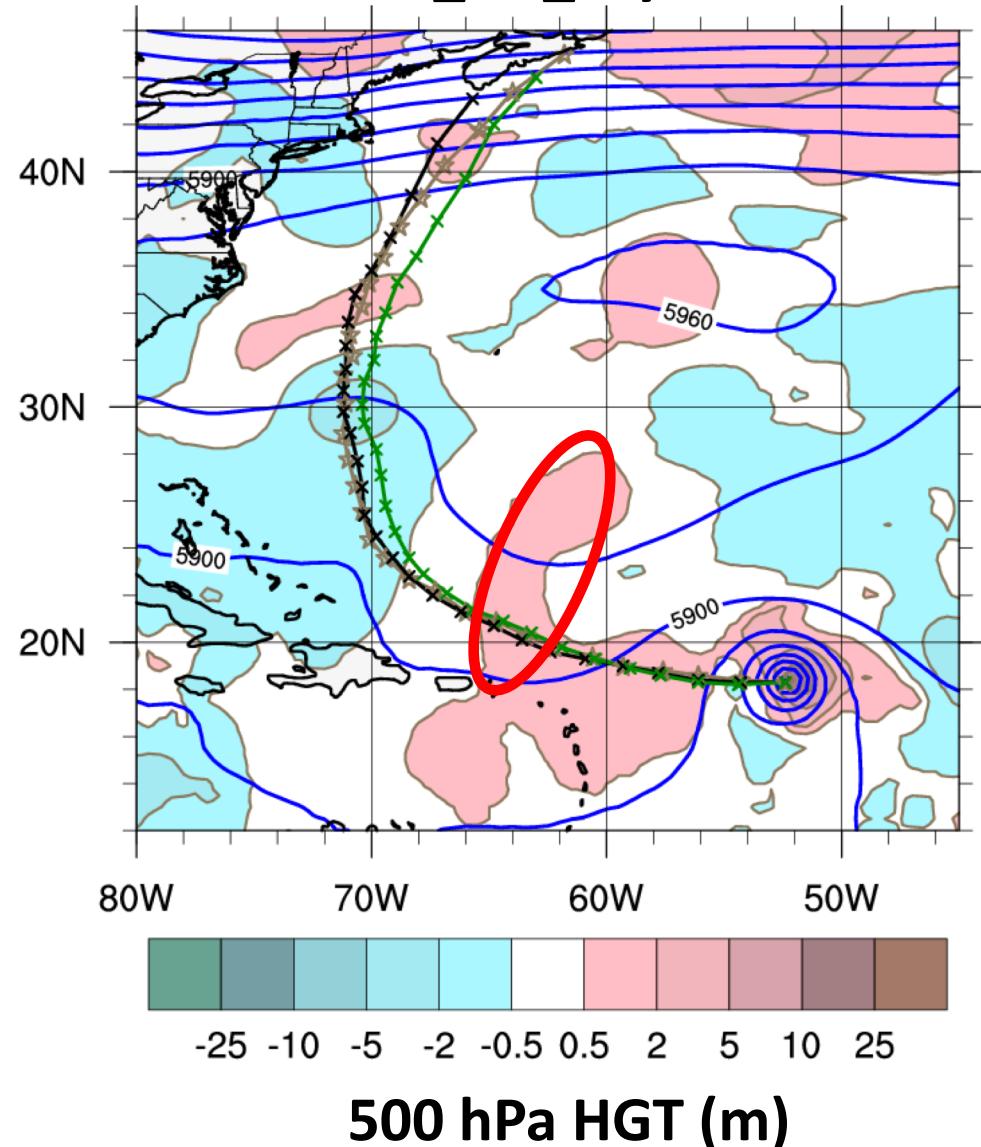
Fill: CTL error – RO\_err\_1cyc error



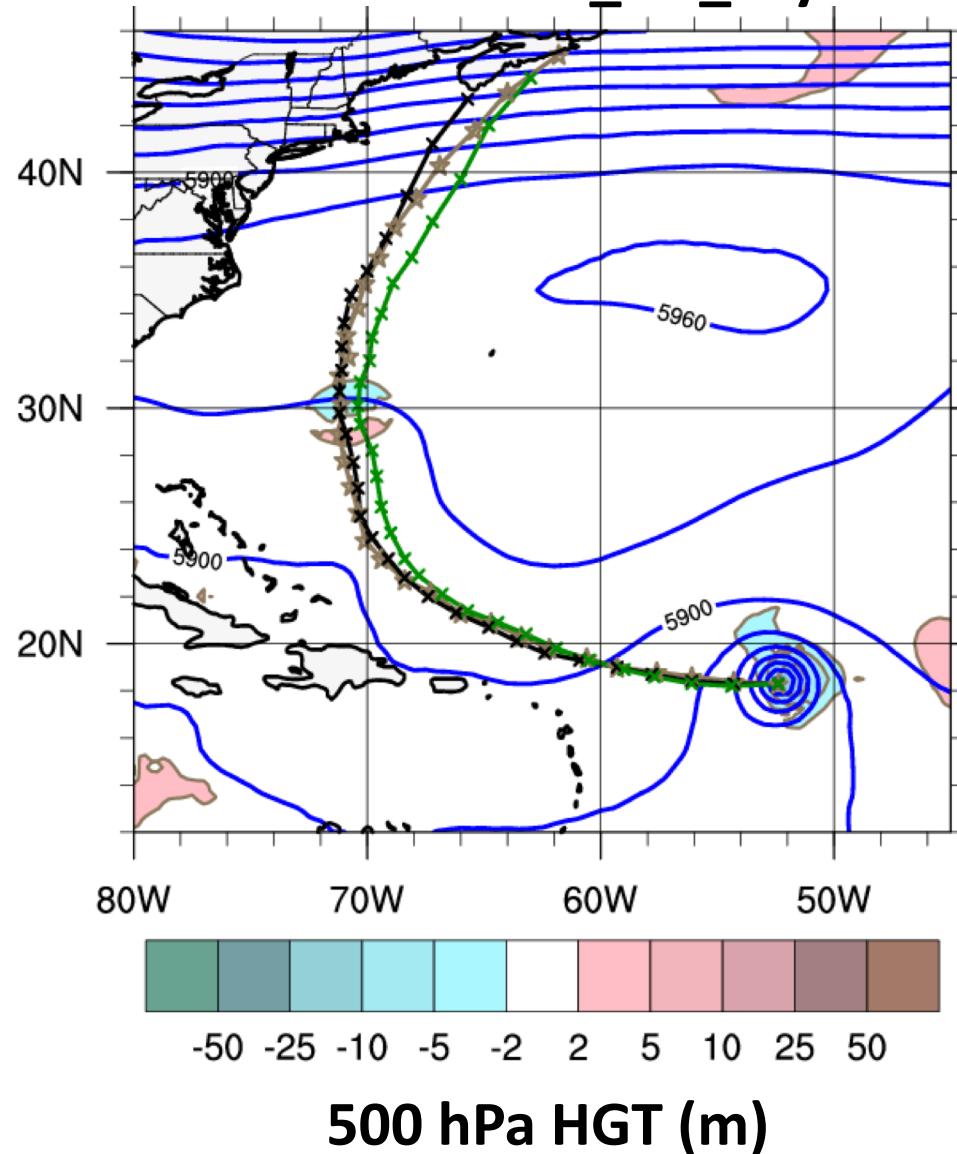
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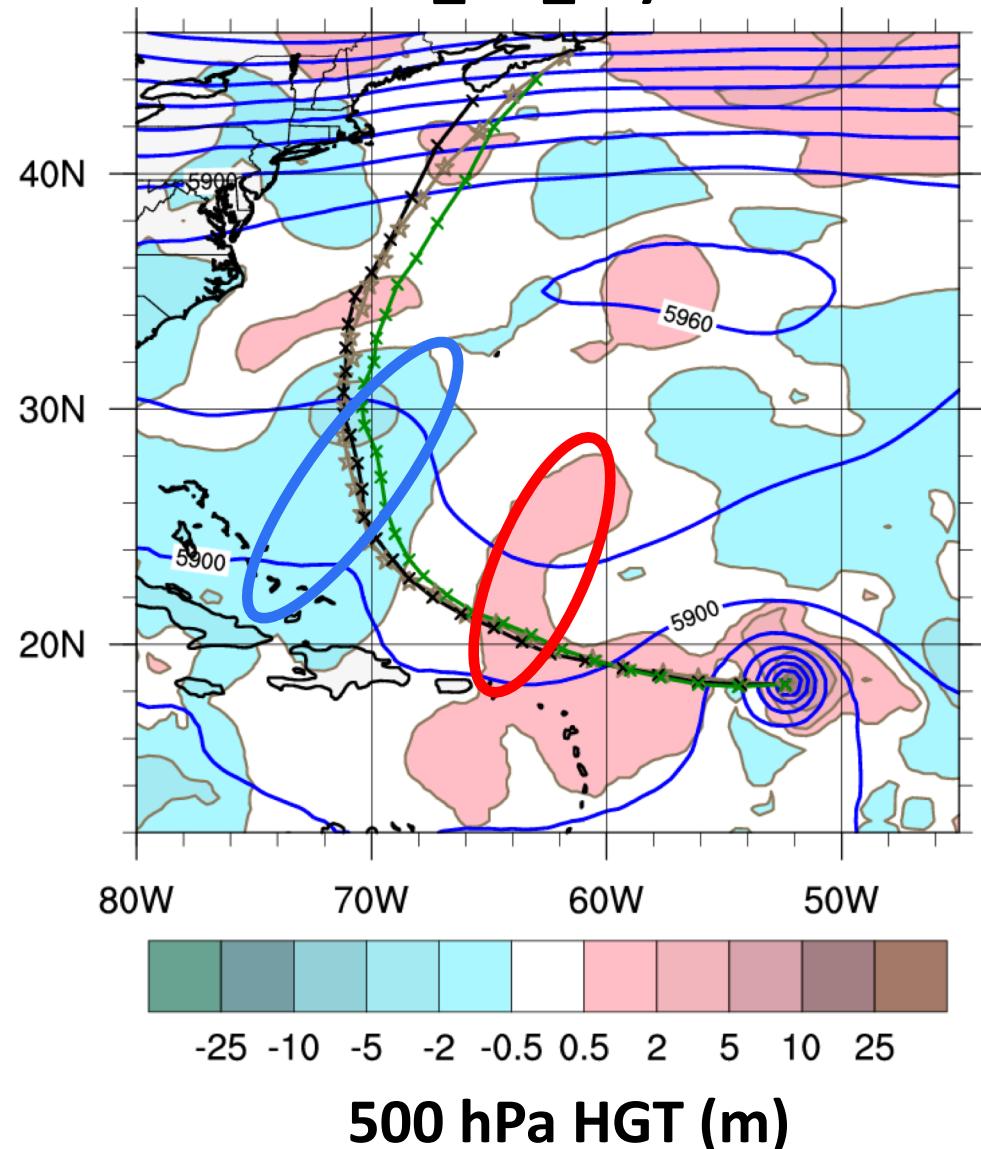
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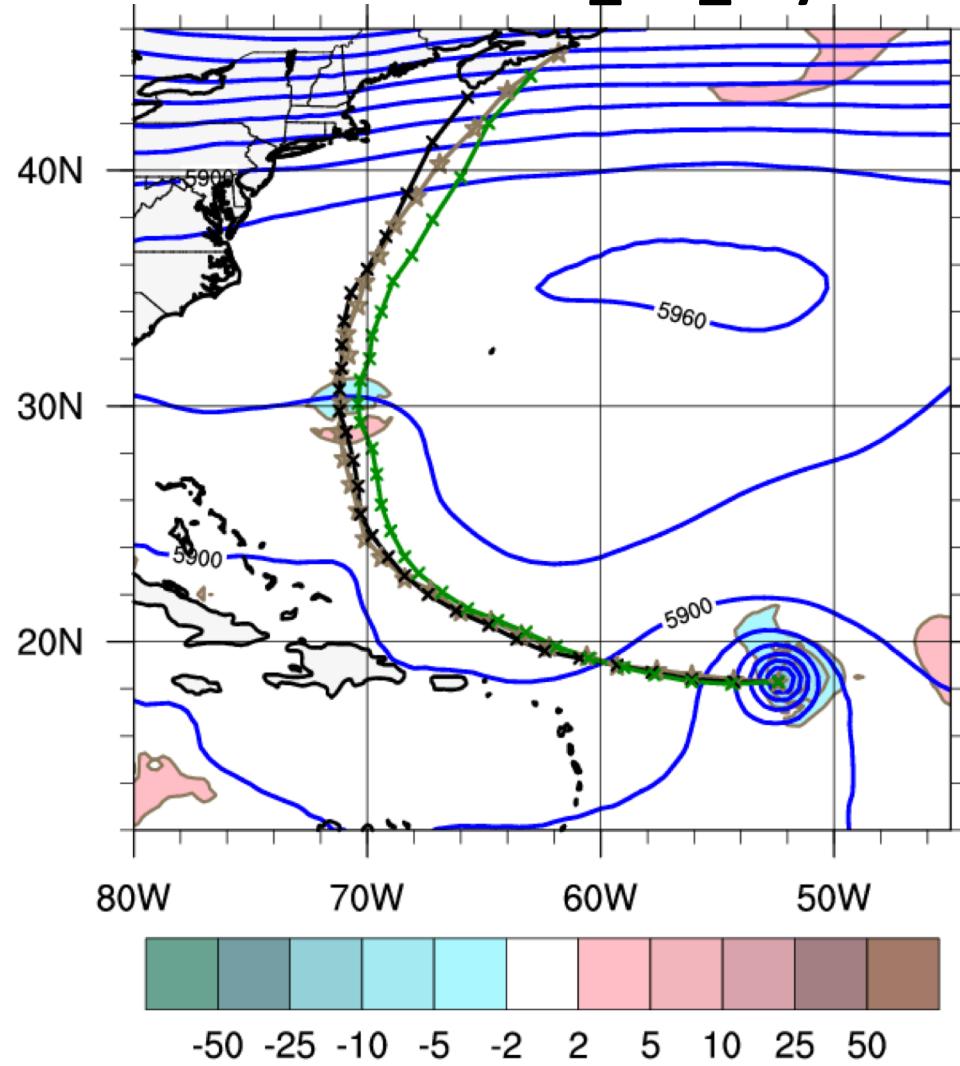
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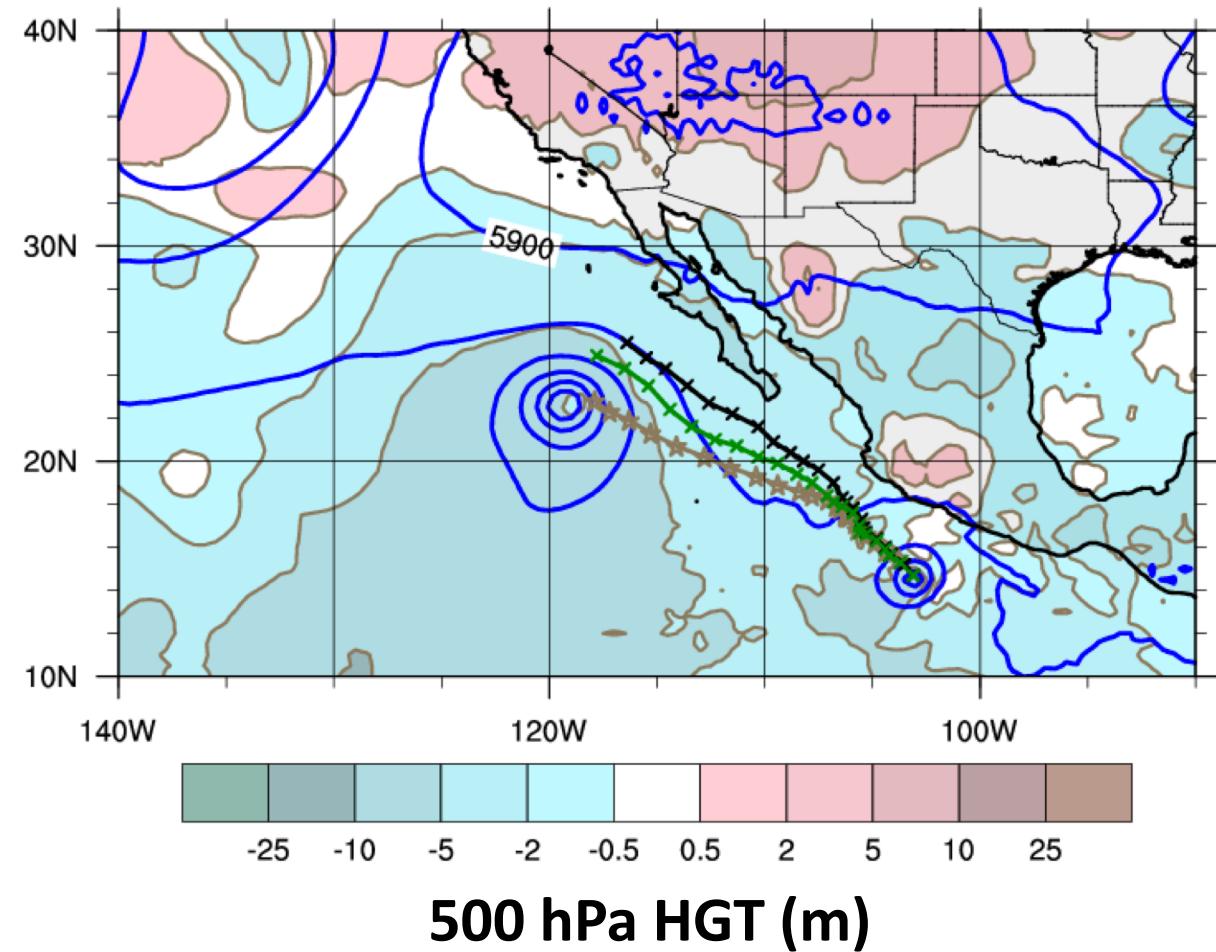
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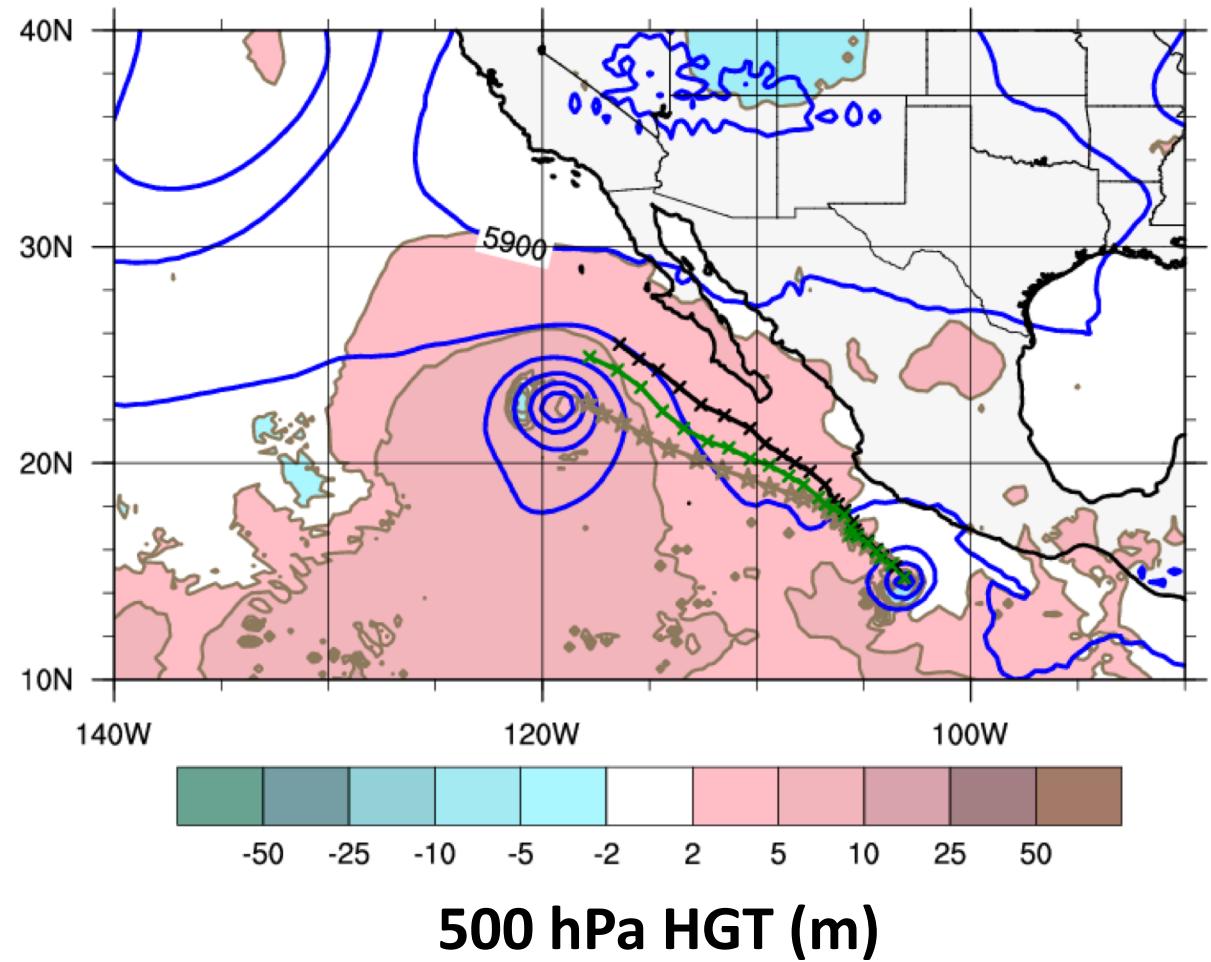
# EP11: 8 September (500hPa Heights)

Storm Tracks: G5NR CTL RO\_err\_1cyc

Fill: RO\_err\_1cyc - CTL



Fill: CTL error – RO\_err\_1cyc error



# Conclusions and Next Steps

**How does global RO data assimilation impact model track and intensity forecasts for tropical cyclones?**

## What We Know

- Neutral impact on track
- Statistically significant wind degradations 0-60hrs
- Results differ from forecast to forecast, especially for track forecasts
- Maybe a matter of impact in sensitive regions

## Next Steps

- Investigate degradation in near-term wind forecasts
- Strengthen investigation of track impact variability

# Acknowledgments

- Co-Authors Andrew Kren, Lidia Cucurull, Robert Atlas, Ross Hoffman, and Tanya Peevey
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# Thank You!

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