

# 領域アンサンブルデータ同化を用いた メソ対流系の予測可能性に関する研究

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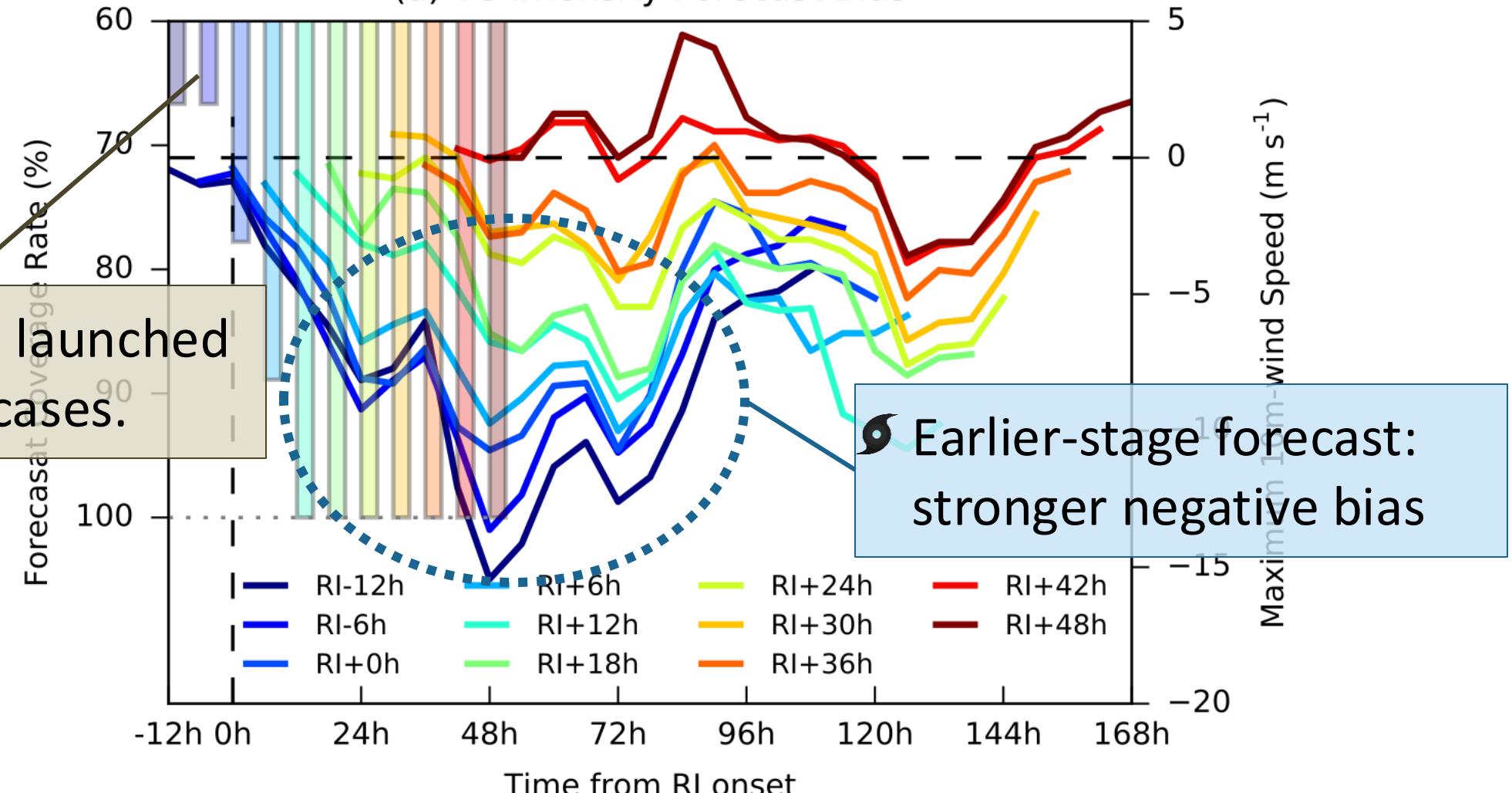
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Coauthors: Fuqing Zhang (PSU), Eugene Clothiaux (PSU),  
Derek Posselt (JPL), Namal Rathnayake (JAMSTEC), Kotaro Kubo (UTokyo)

# Predictability of TC intensification: onset is challenging

🌀 Forecast was launched for only 2/3 cases.

(a) TC Intensity Forecast Bias



# Limited predictability of intensification onset

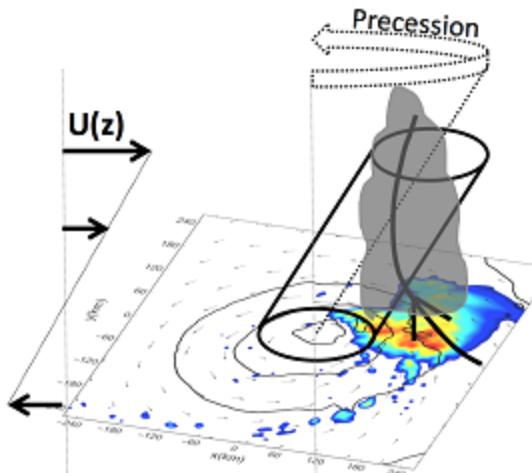
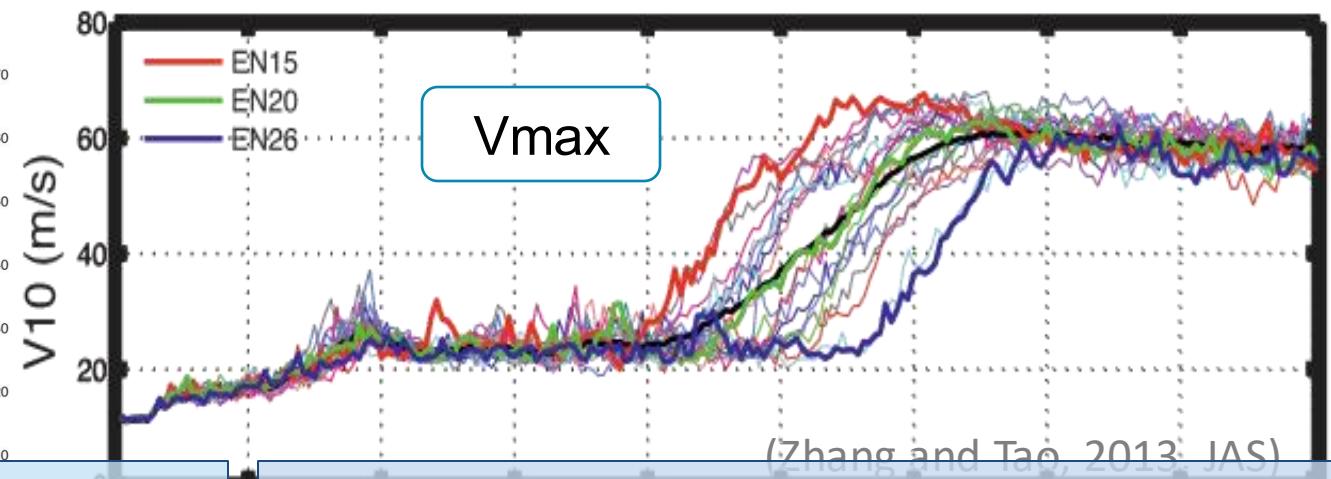
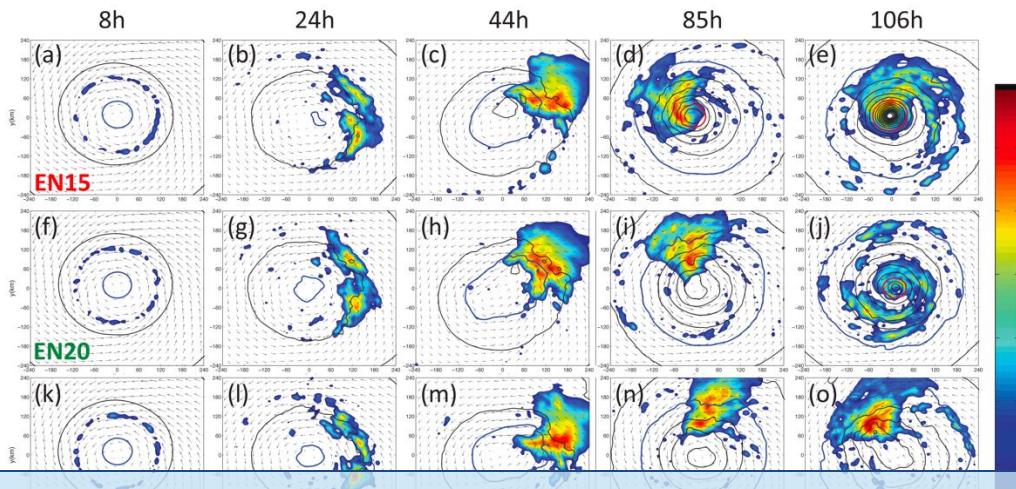


Figure courtesy of Dr. Dandan Tao

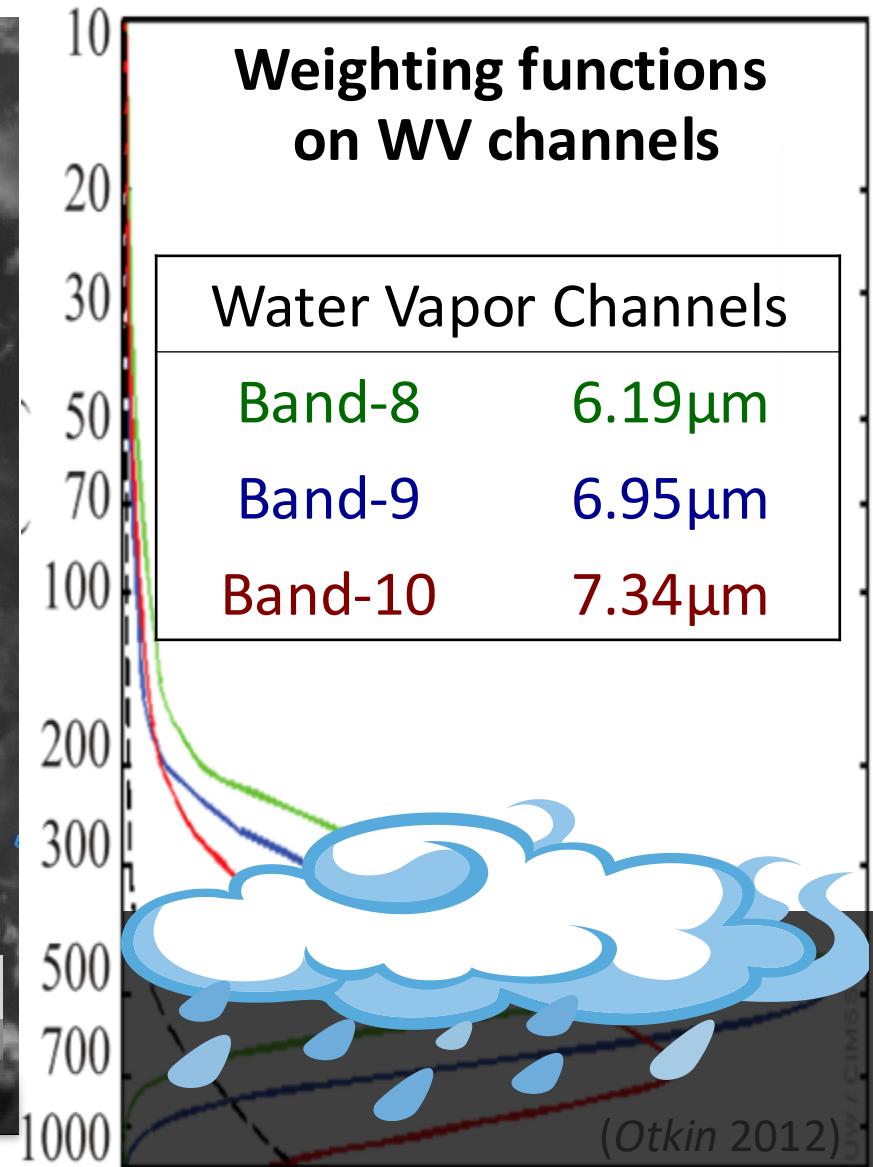
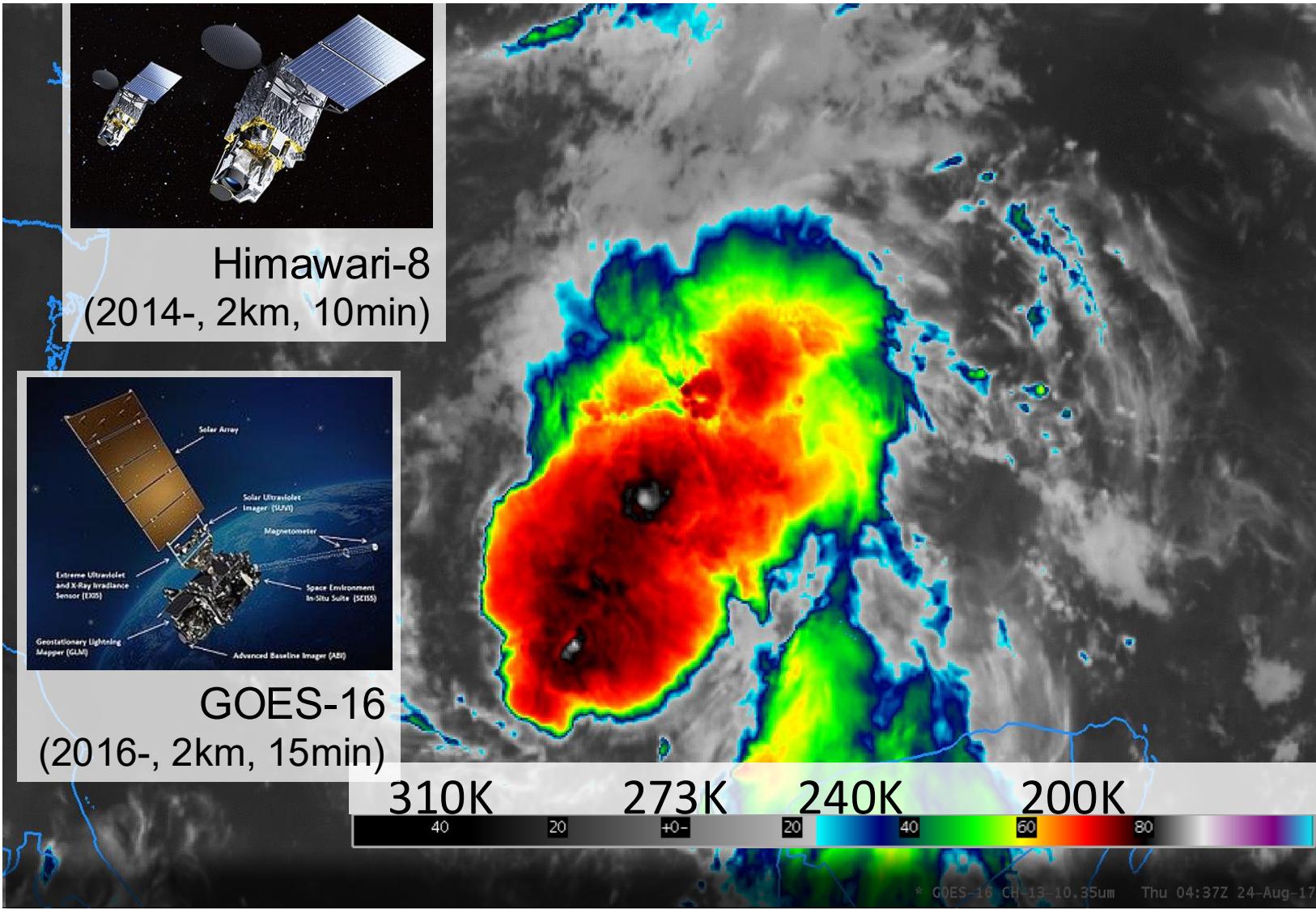
- 🌀 Thermodynamic process contributes to vortex alignment to initiate rapid intensification. (Rios-Berrios et al., 2018; Stone et al., 2023)
- 🌀 Large prediction uncertainty is induced by chaotic nature of moist convection. (Zhang & Tao, 2013)



Impacts of moist convection are key to better understand/predict intensification onset.

Hard to capture/reproduce/predict  
the individual convective activity

# Solution: geostationary satellites?



# Today's outline

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## Part 1. Data Assimilation Methodology Development

1. Adaptive observation error inflation (AOEI)
2. Adaptive background error inflation (ABEI)

## Part 2. Forecast Improvement Assessment

3. Tropical cyclones applications:

## Part 3. all-sky satellite DA to explore convective predictability

4. Insights for convective signals:

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- Minamide, M., and F. Zhang, 2017: Adaptive Observation Error Inflation for Assimilating All-sky Satellite Radiance, *MWR*, 145, 1063-1081

### 2. Adaptive background error inflation (ABEI)

- Minamide, M., F. Zhang, 2018: An Adaptive Background Error Inflation Method for Assimilating All-sky Radiances, *QJRMS*, doi:10.1002/qj.3466

## Part 2. Forecast Improvement Assessment

### 3. Tropical cyclones applications:

- Zhang, F., M. Minamide, E.E. Clothiaux, 2016: Potential Impacts of Assimilating All-sky Satellite Radiances from GOES-R on Convection-Permitting Analysis and Prediction of Tropical Cyclones, *GRL*, 43
- Minamide, M., F. Zhang, 2018: Assimilation of All-sky Infrared Radiances from Himawari-8 and Impacts of Moisture and Hydrometer Initialization on Convection-Permitting Tropical Cyclone Prediction, *MWR*, 146 ,3241-3258
- Minamide, M., F. Zhang, E.E. Clothiaux, 2020: *Nonlinear Forecast Error Growth of Rapidly Intensifying Hurricane Harvey (2017) Examined through Convection-permitting Ensemble Assimilation of GOES-16 All-sky Radiances*, *Journal of the Atmospheric Sciences*, doi: 10.1175/JAS-D-19-0279.1
- Minamide, M., D. J. Posselt, 2025: *Improving tropical cyclone intensification prediction using high-resolution all-sky Geostationary Operational Environmental Satellite data assimilation*, *Quarterly Journal of the Royal Meteorological Society*, doi:10.1002/qj.4958.

## Part 3. all-sky satellite DA to explore convective predictability

### 4. Insights for convective signals:

- Minamide, M., D. J. Posselt, 2022: Using Ensemble Data Assimilation to Explore the Environmental Controls on the Initiation and Predictability of Moist Convection, *Journal of the Atmospheric Sciences*, doi:10.1175/JAS-D-21-0140.1.

# Real-data Experimental settings for TCs

## Advanced PSU WRF-EnKF (APSU) DA system

(Weng and Zhang, 2016; Zhang, Minamide and Clothiaux, 2016)

Model: **WRF** ver.3.6.1(Skamarock 2008), **CRTM** (Han et al. 2006)

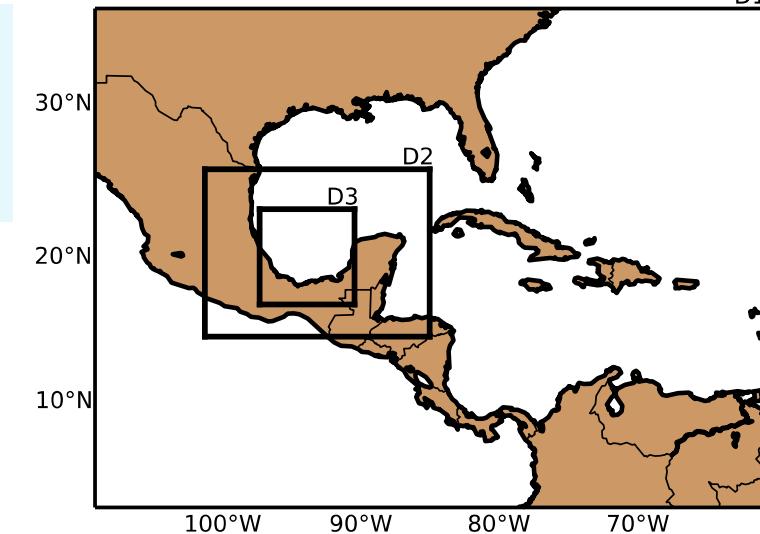
**Ensemble-based data assimilation system** (60-1024 ensemble)

**Regional convective-permitting model**

- Resolution: 27, 9 & 3 km (D1-D3)

**Error modeling**

- Adaptive Observation Error Inflation (AOEI) (Minamide & Zhang, 2017, *MWR*)
- Adaptive Background Error Inflation (ABEI) (Minamide & Zhang, 2019, *QJRMS*)



**All-sky infrared BT (ch8: 6.19 μm); 15 minutely – 1 hourly**

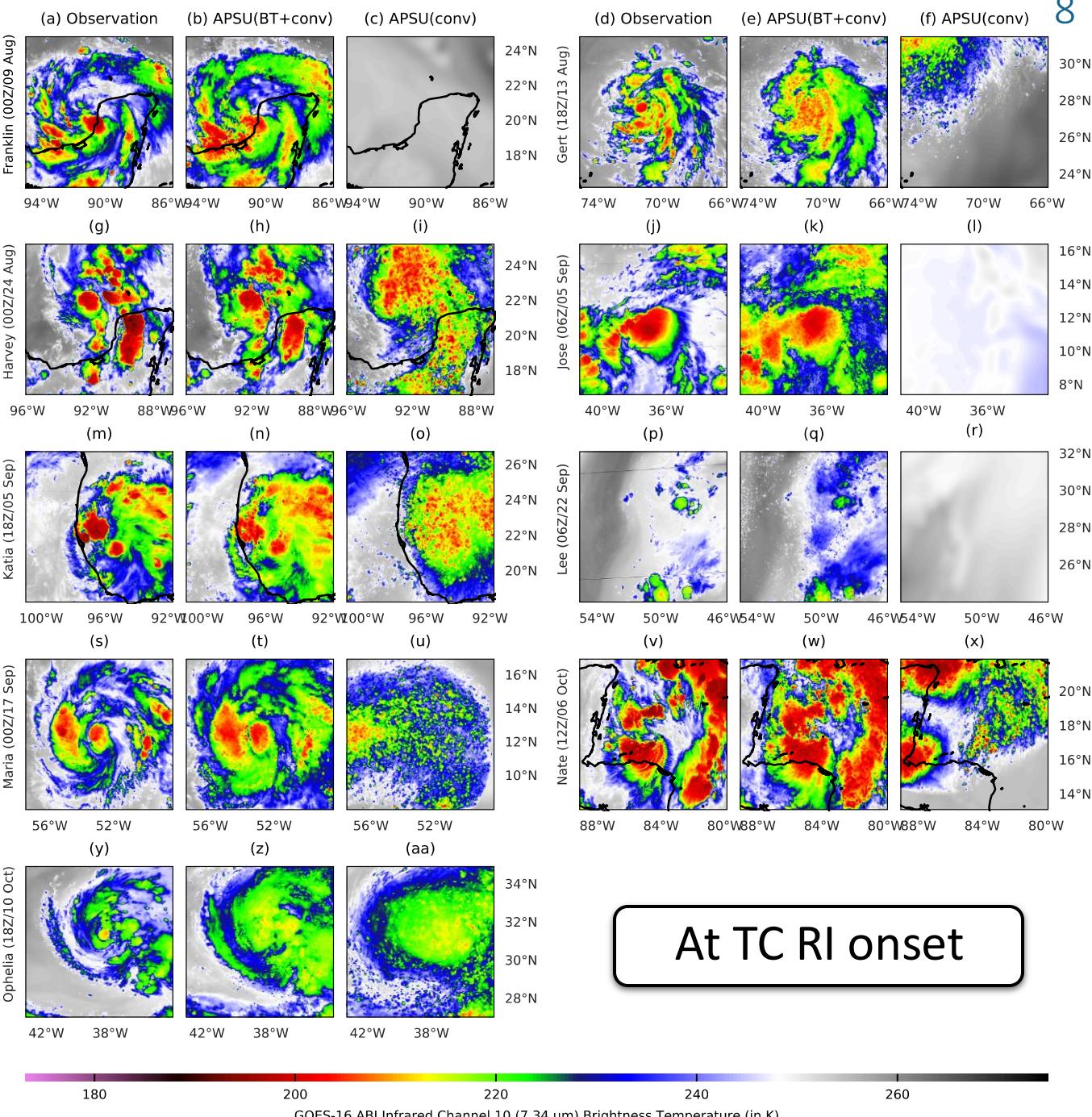
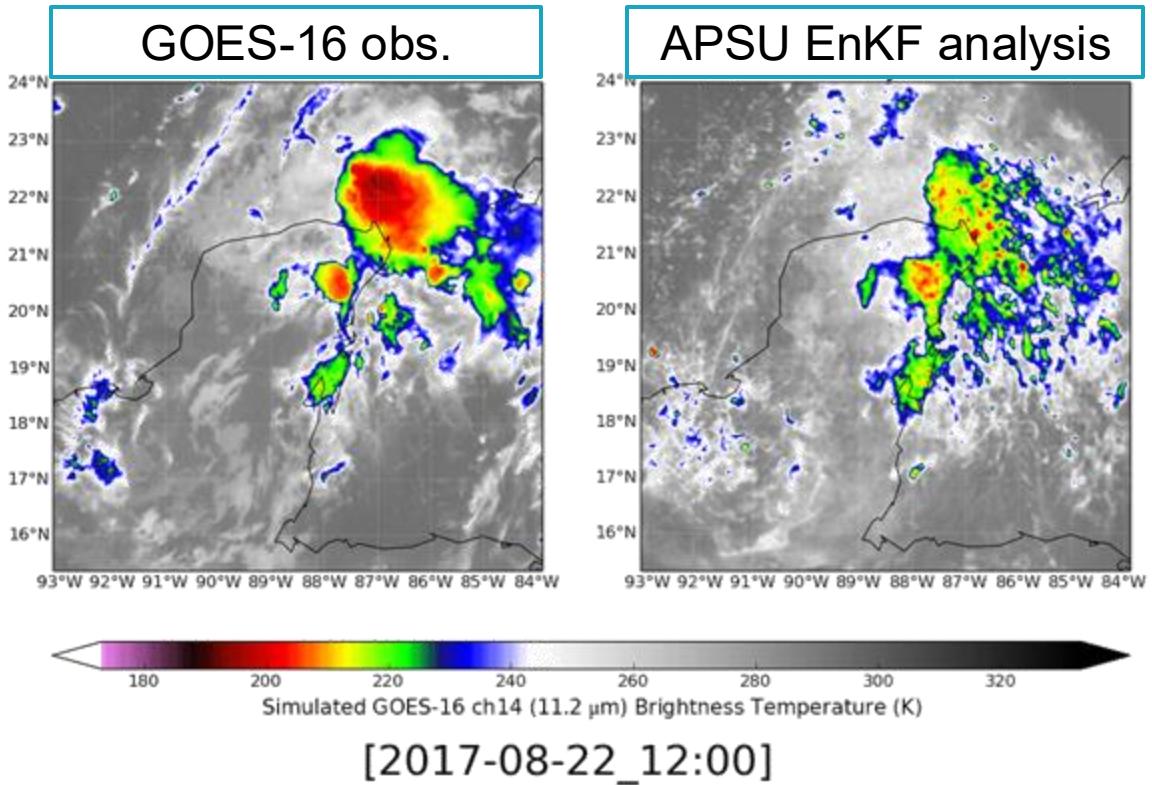
Minimum SLP (Hurricane Position and Intensity (HPI); hourly)

Conventional observations; 3 hourly

forecast

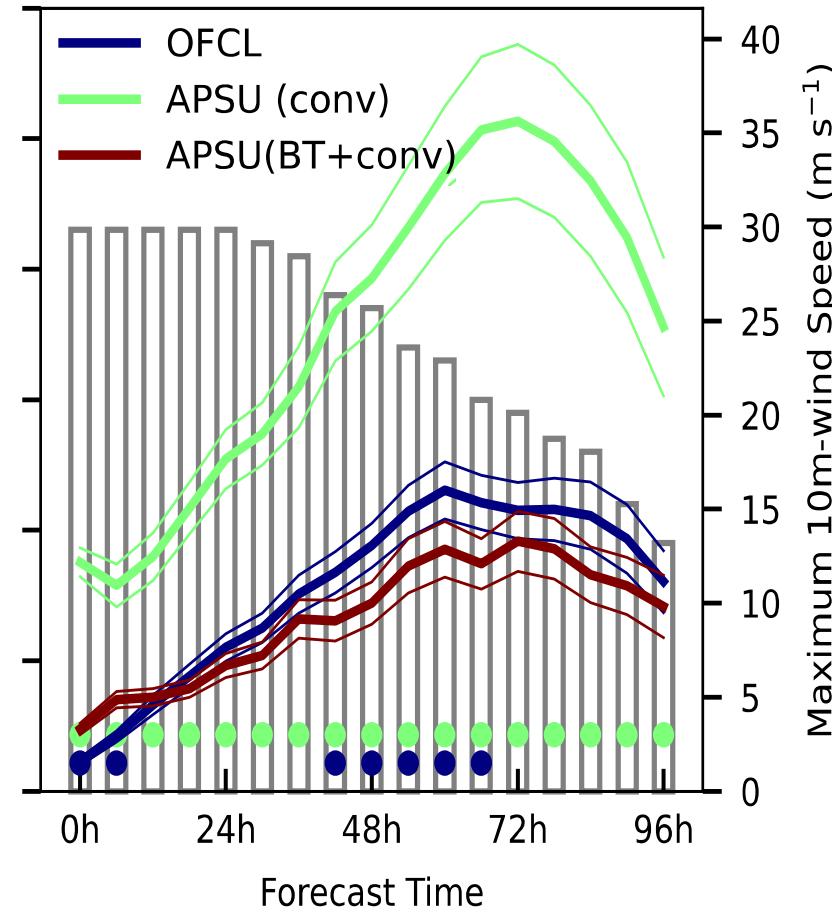
# EnKF Performance

❖ All-sky infrared satellite DA well constrained the TC inner-core structure through entire TC lifecycle.

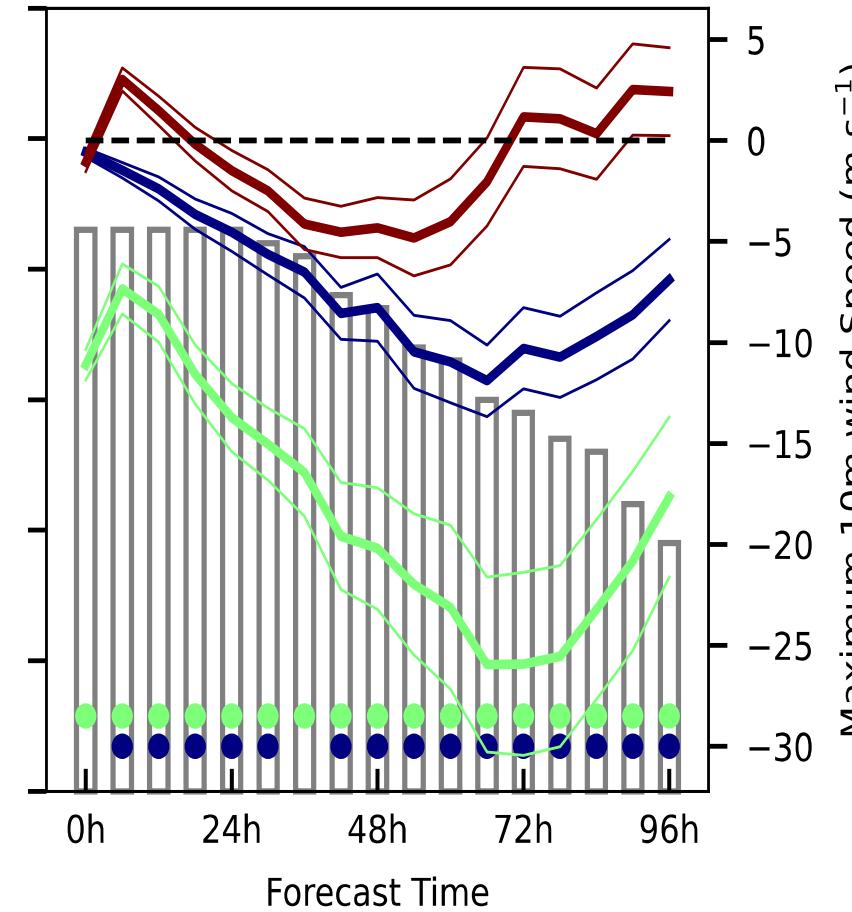


# Hurricane-seasonal analysis of TC intensity forecast

TC intensity fct **RMSE**



TC intensity fct **Bias**



- ~20% RMSE reduction at their peak-time intensities.
- Mitigating the weak intensity bias
  - Inner-core convective structures
  - ↓
  - intensification onset

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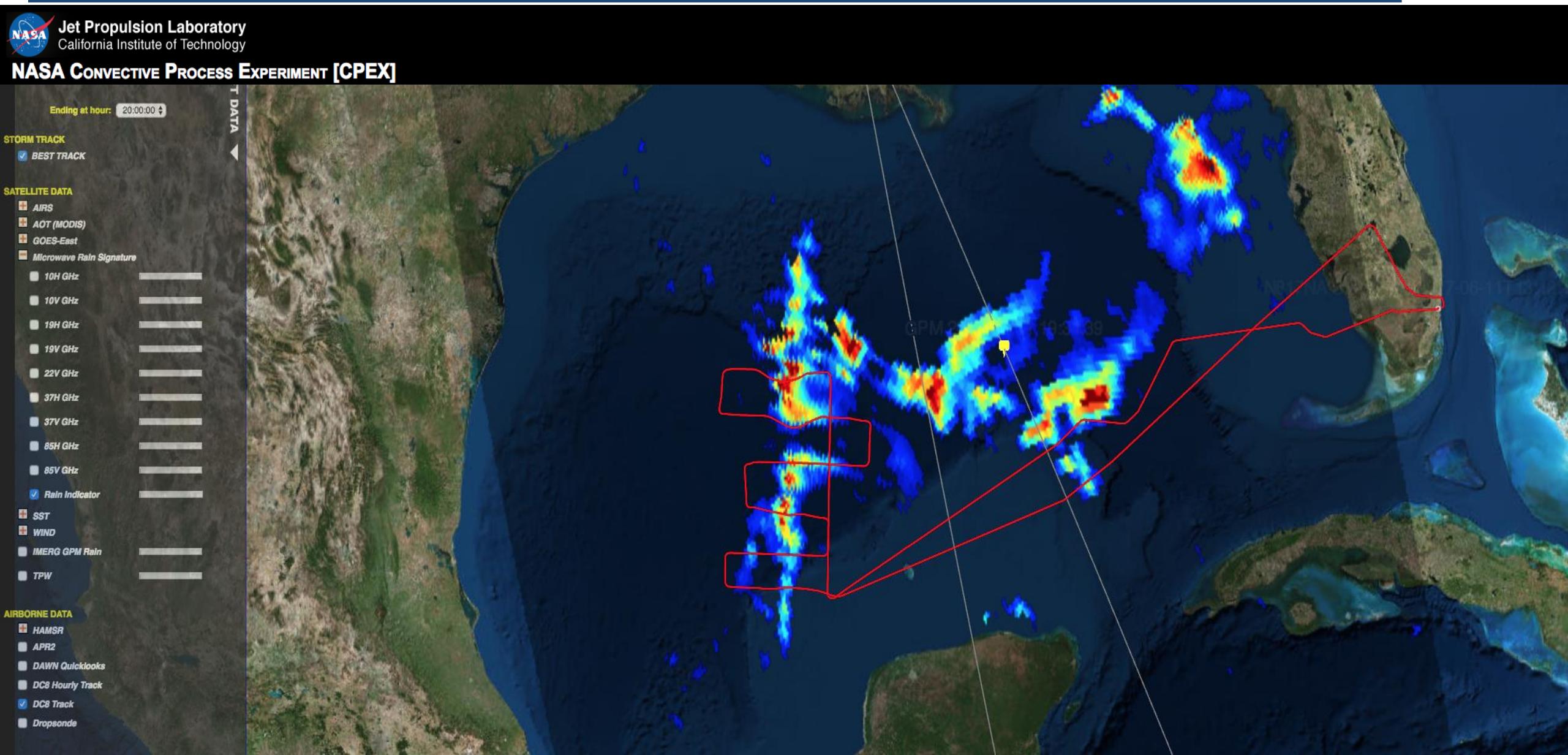
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## Part 3. Exploring convective predictability

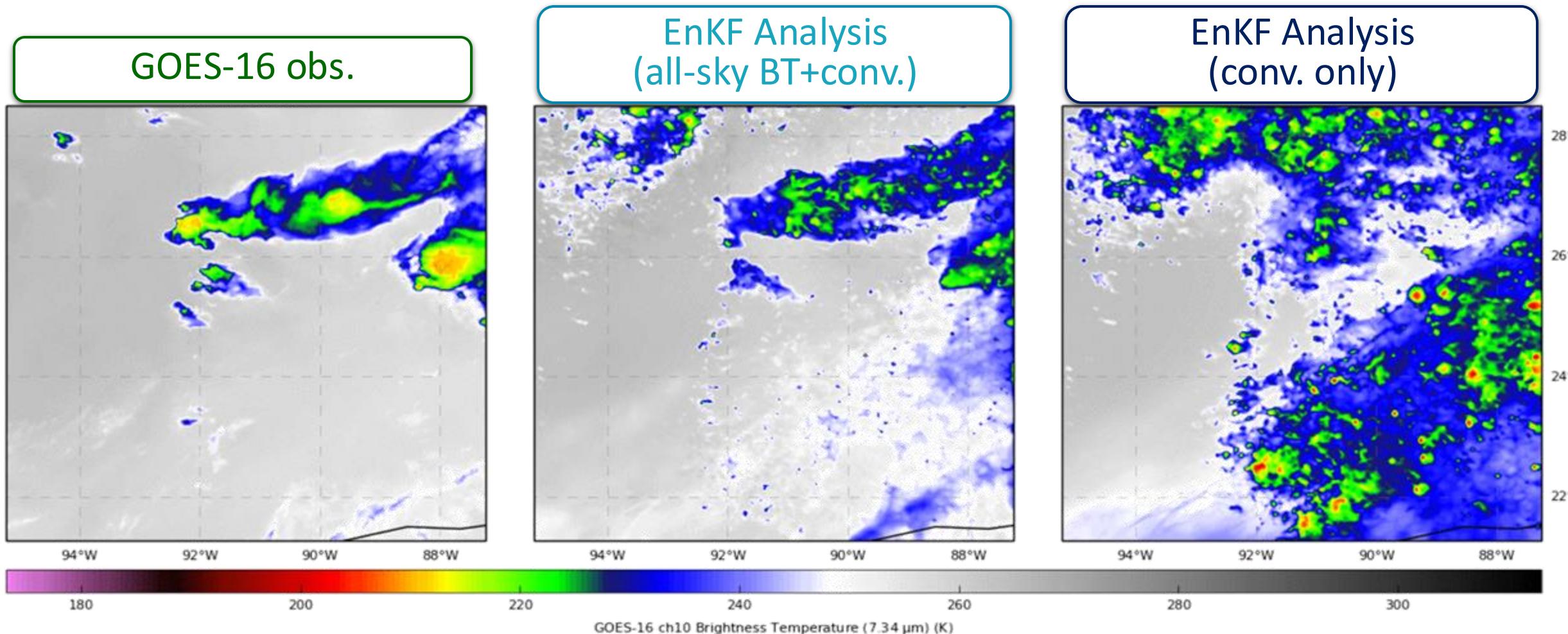
### 4. Insights for convective signals:

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# Case: convections on 06/11/2017 during CPEX



# EnKF Performances of All-sky Satellite DA (MCS case)

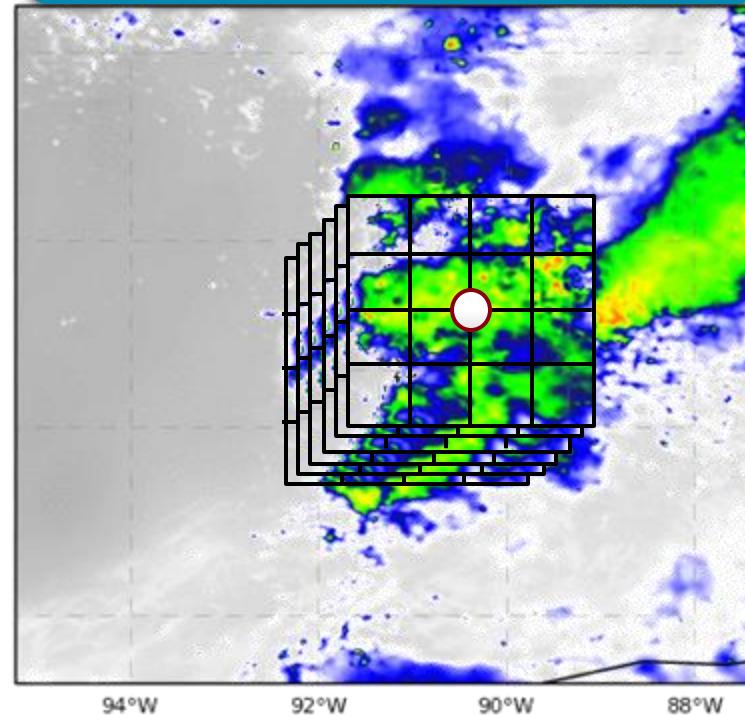


[2017-06-11\_12:00]

(Minamide & Posselt, 2022, JAS)

# How to find signals of convection?

EnKF Analysis  
(all-sky BT+conv.)



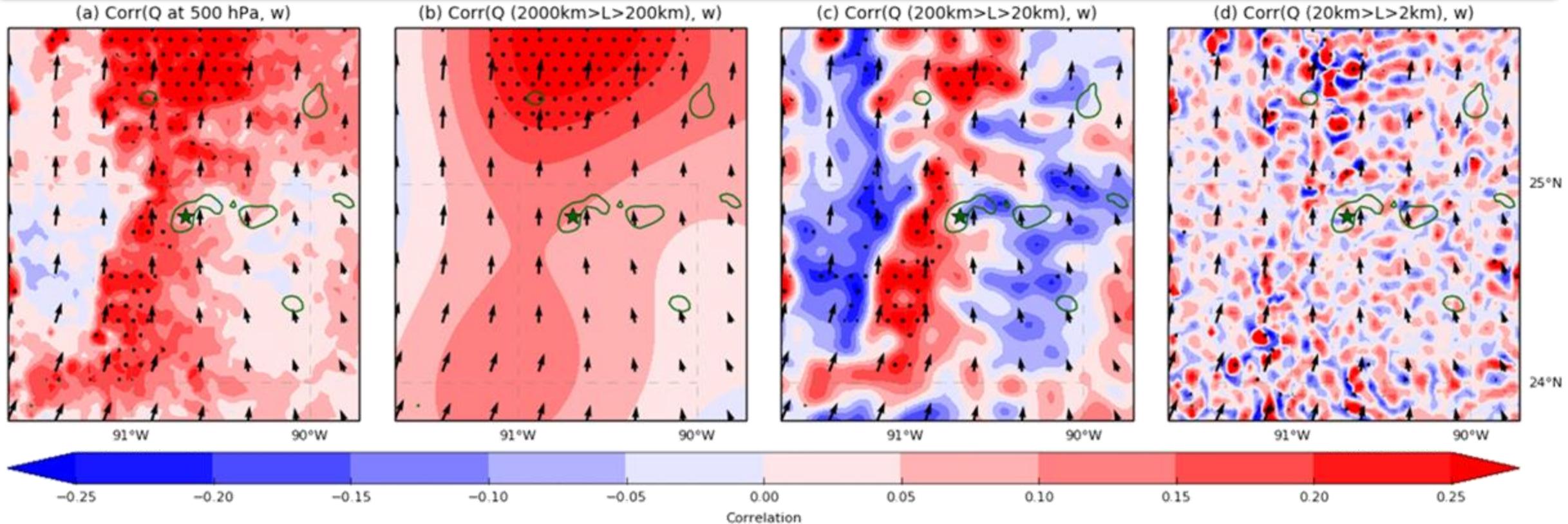
Eulerian approach

Vertical wind at the specific  
timing and location

What are the key signals to determine exactly when and where convection occurs?

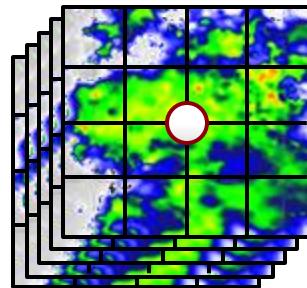
# Eulerian correlation analysis

$\text{corr}\{\text{Qv at 500hPa, w(300-500hPa average)} \text{ at star at 18Z/11}\}$



- Meso- $\alpha$  shows the correlation with general MCS development, which enhances convective activity but does not determine the exact location & timing.
- Meso- $\gamma$  & - $\beta$  scale structures are noisy.

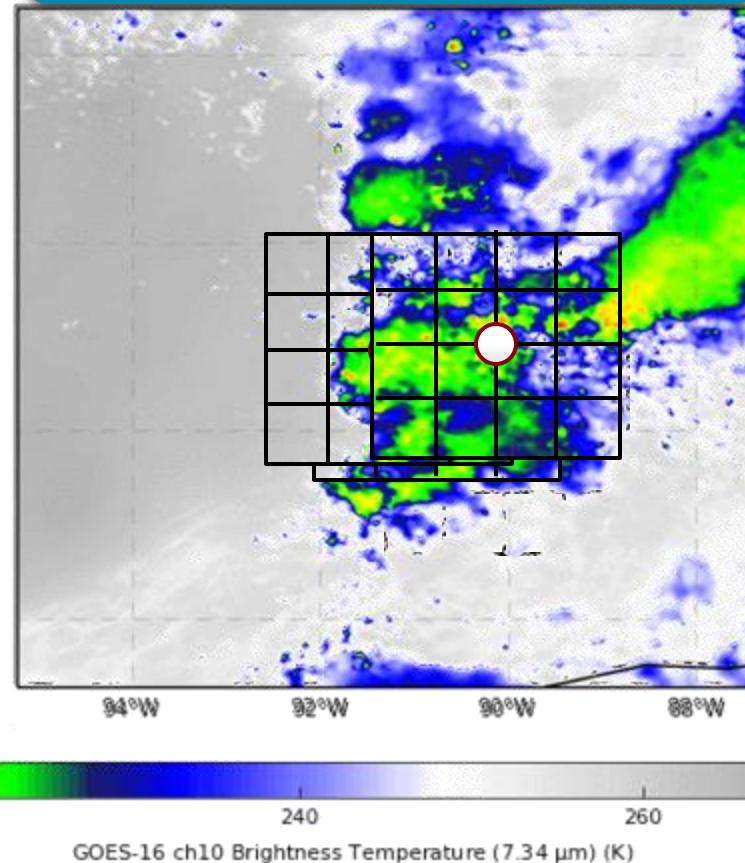
# Lagrangian approach to find convective signals



Eulerian approach

Vertical wind at the specific  
timing and location

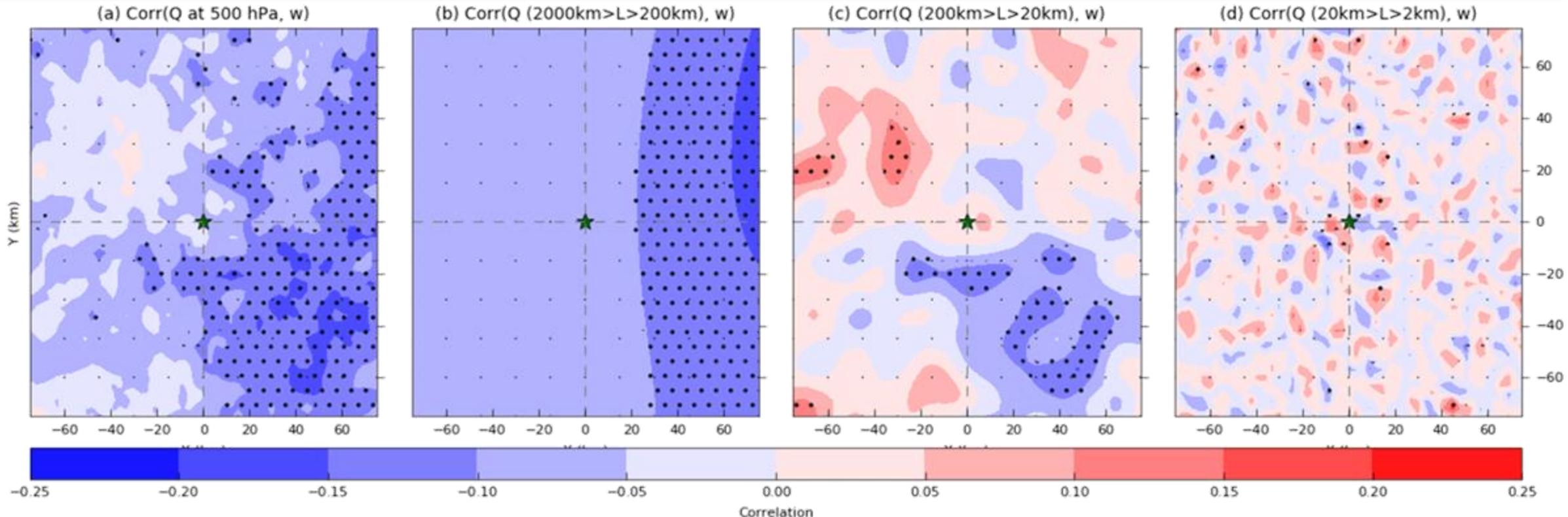
EnKF Analysis  
(all-sky BT+conv.)



Lagrangian approach  
Compositing the convection  
centers

# Lagrangian correlation analysis (lag-time ensemble)

$\text{corr}\{\text{Qv at 500hPa, w(300-500hPa average)} \text{ at composite convective peak}$



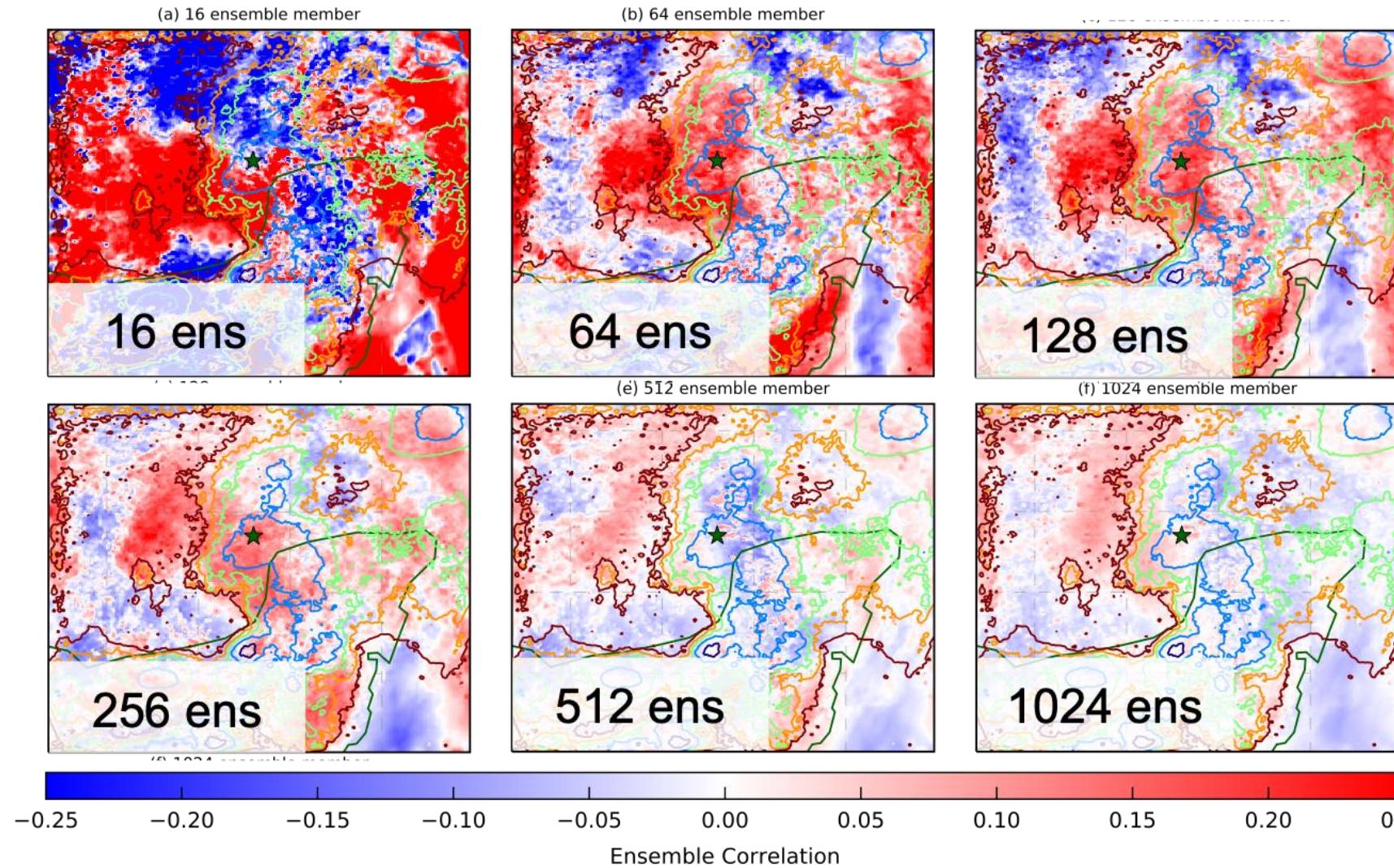
time: -120 min

Relative to convective peak time

- Information that determines the exact position & timing of convective occurrence is in meso- $\beta$  & - $\gamma$  scales (< 30 mins).

(Minamide & Posselt, 2022, JAS)

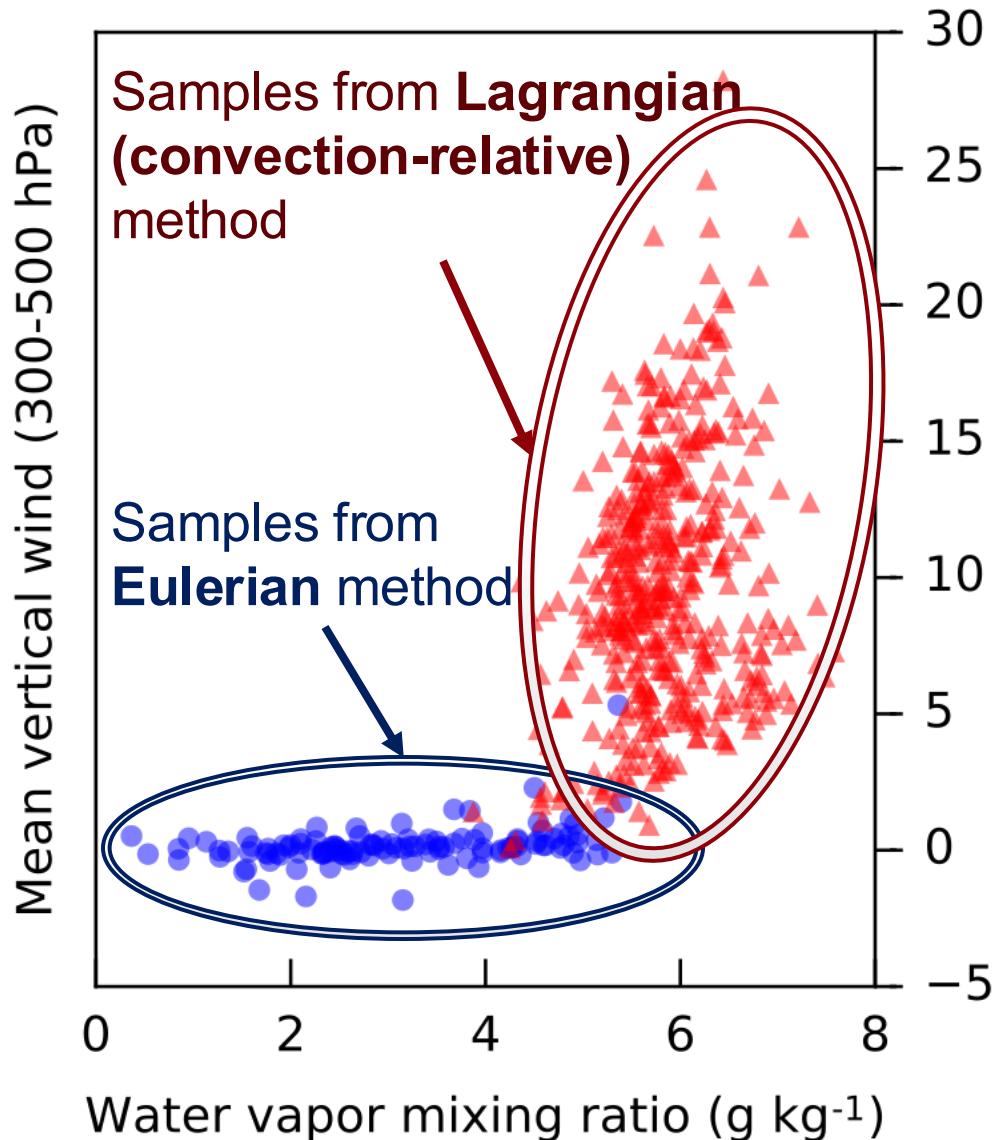
# Eulerian limitation to capture convective scale features



corr{Qv at 500hPa,  
w(300-500hPa  
average) at star}

- 🌀 Larger ensemble helped to reduce noises even for convective scales
- 🌀 “True” correlation structures (~ convective signals) was still not clear with thousands ensembles.

# Why Eulerian approach is limited?

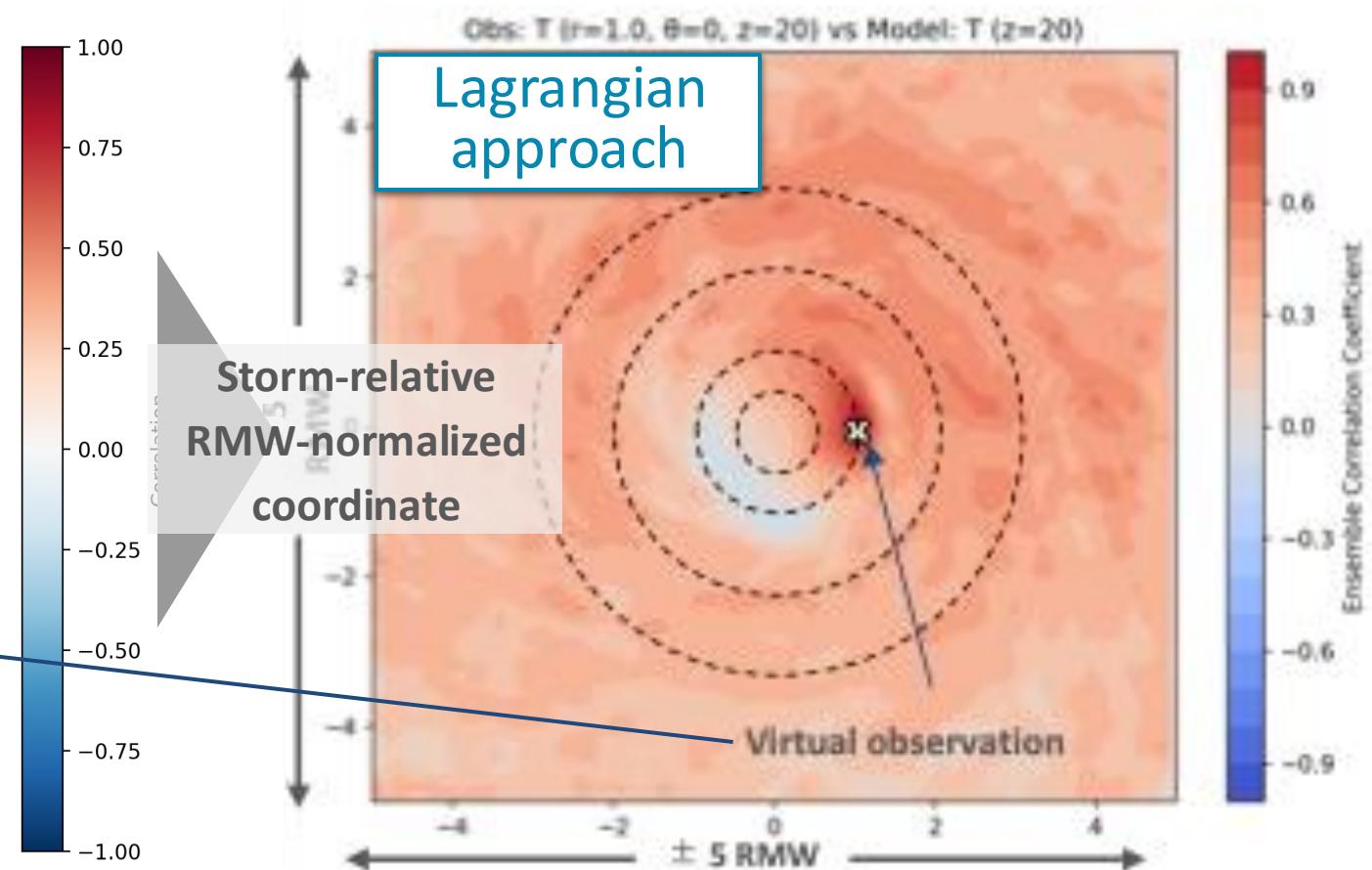
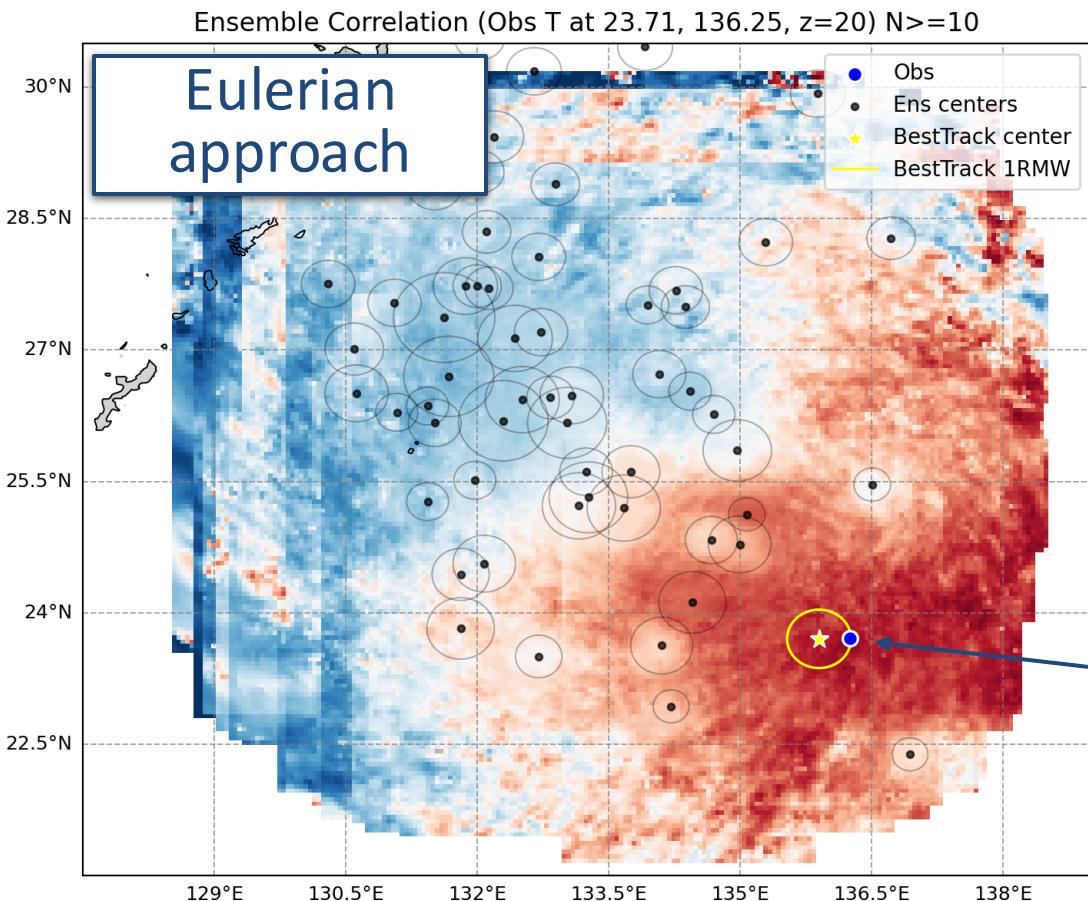


Original samples for correlation calculation

- 🌀 Due to the chaotic nature of convection, only small part of ensemble captured the convection at the exact location
- 🌀 Necessity to further constrain convective activity for ensemble-based DA
  - Potentially, denser observation with more frequent DA cycle and/or finer model resolution

# Eulerian vs. Lagrangian: TC example

corr{T at 500hPa, T (synthetic observation)}



# Summary

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- With Adaptive Observation Error Inflation (AOEI) and Adaptive Background Error Inflation (ABEI), the promising positive impacts of assimilating all-sky BTs, in particular from new-generation geostationary satellites GOES-16 (and Himawari-8), on TC forecasts are demonstrated through the seasonal analysis on 2017 Atlantic hurricanes.
- Using the ensemble forecast constrained by all-sky satellite DA, we investigated the convective predictability and necessity conditions for future observations to capture exactly when and where moist convection occurs: Meso- $\beta$  (200-20km) to meso- $\gamma$  (20-2km) scale information within less than 10-minute frequency will be indispensable.

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