

# Novel Application of NASA's GEOS-CF CO<sub>2</sub> Forecasting System to ACT-America Airborne Campaign

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## Why do we need a real-time CO<sub>2</sub> forecasting product?

- Forecasting CO<sub>2</sub> for field campaigns.
- Given enough observations, forecasts allow for a quick real-time evaluation of known CO<sub>2</sub> sources.
- In theory, CO<sub>2</sub> forecasting products could assimilate CO<sub>2</sub> observations and perform inversions in near real-time. If we want to monitor CO<sub>2</sub> emissions at a policy level, such a step would be imperative.

# The Atmospheric Carbon and Transport-America (ACT-America) NASA Campaign



C-130 aircraft.



B-200 aircraft.

- 2 aircraft (C-130 and B-200).
- 3 different regions in the Eastern United States: Gulf, Midwest, and Mid-Atlantic.
- 5 seasonal campaigns (2 summer campaigns) over 2016-2019 time period.
- Main mission goals are:
  1. Quantify and reduce atmospheric transport uncertainties.
  2. Quantify and reduce uncertainties in prior CO<sub>2</sub> and CH<sub>4</sub> flux estimates.

## The CO<sub>2</sub> Forecasting Model Used: GEOS-CF

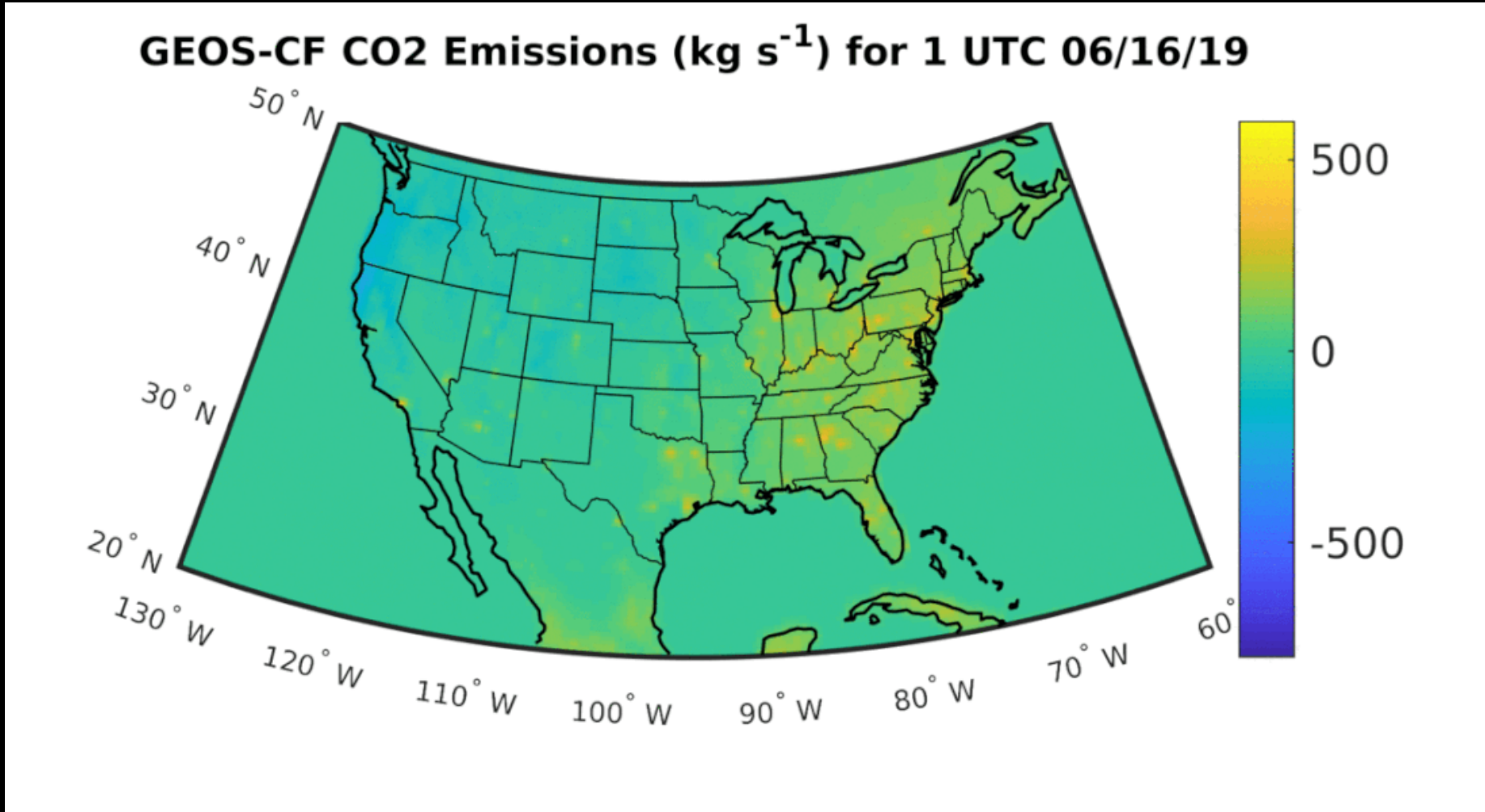
- The model used for ACT-America forecasting operated in two modes: GEOS-Chem and “GOCART”.
- GEOS-Chem operated in online mode providing CO and C<sub>2</sub>H<sub>6</sub>.
- “GOCART” simplified processes to generate CO and CO<sub>2</sub> forecasts.
- Meteorology was simulated with GEOS FP-IT.
- Resolution was 0.25 x 0.25 (~25 km).

## CO<sub>2</sub> from "GOCART"

- Near real-time CO<sub>2</sub> from GOCART (LoFi – Low-order Flux Inversion) is derived from several retrospective flux components.
- LoFi flux package adjusts land and ocean sinks to match global observed CO<sub>2</sub> growth rates.

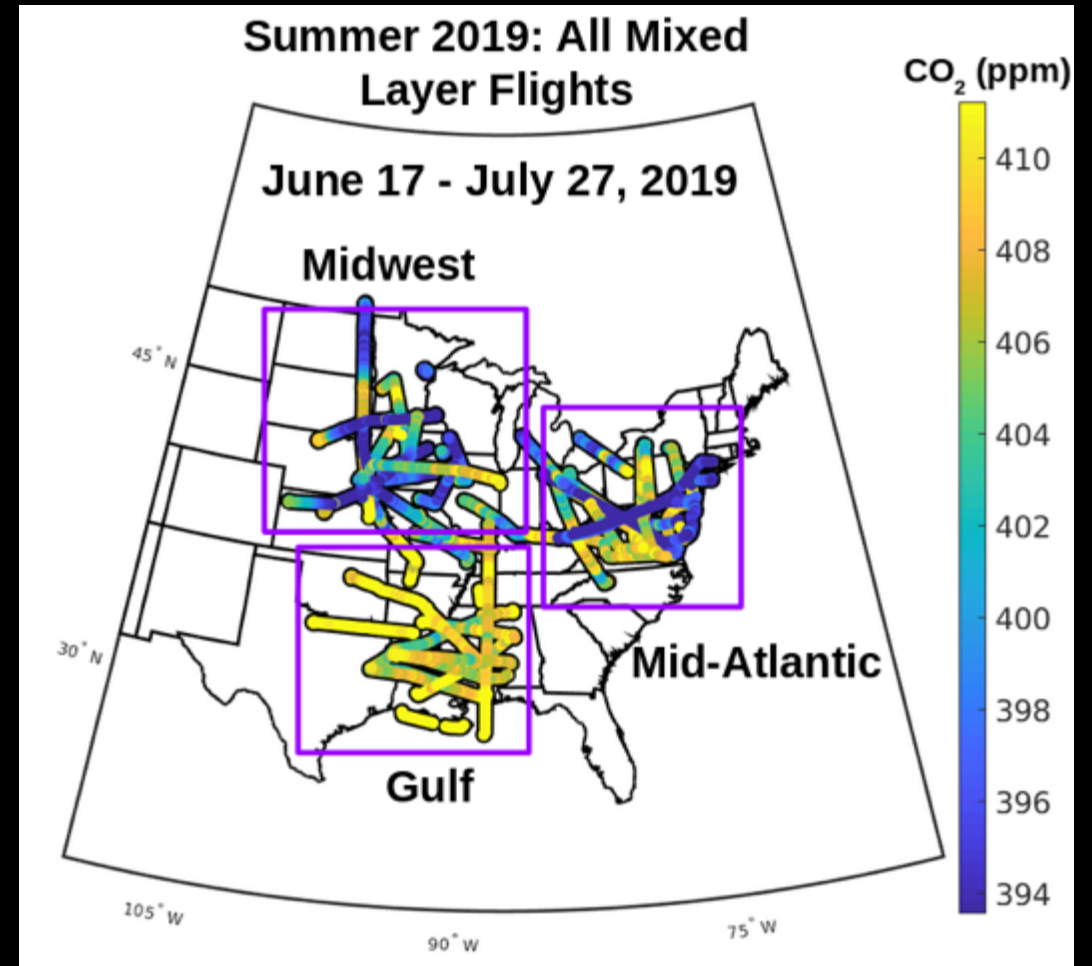
Flux Type	Method
NEE (Net Ecosystem Exchange) & Biofuel	LoFi CASA
Biomass Burning	QFED
Fossil Fuel	ODIAC
Ocean	LoFi Extension to Takahashi Climatology

# Simulated CO<sub>2</sub> Flux



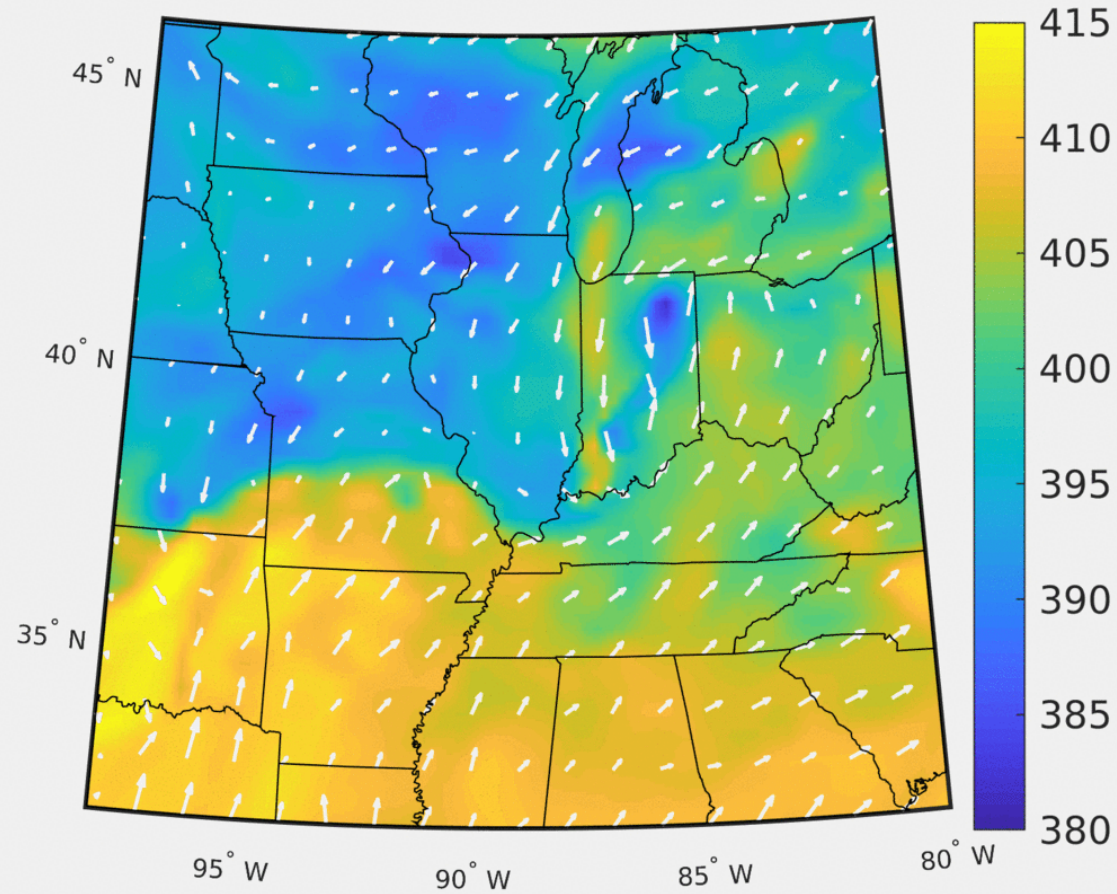
# Forecasting for ACT-America Summer 2019 Campaign

- CO<sub>2</sub> forecasting was experimented with extensively only in 2019 summer campaign.
- The main goal was to help plan research flights.
- Forecasts were used to point out areas of CO<sub>2</sub> gradients.
- Studying these gradients with specific model studies could help better understand the uncertainty of modeled CO<sub>2</sub> due to errors in transport.



# Sample of 2-Day Forecast

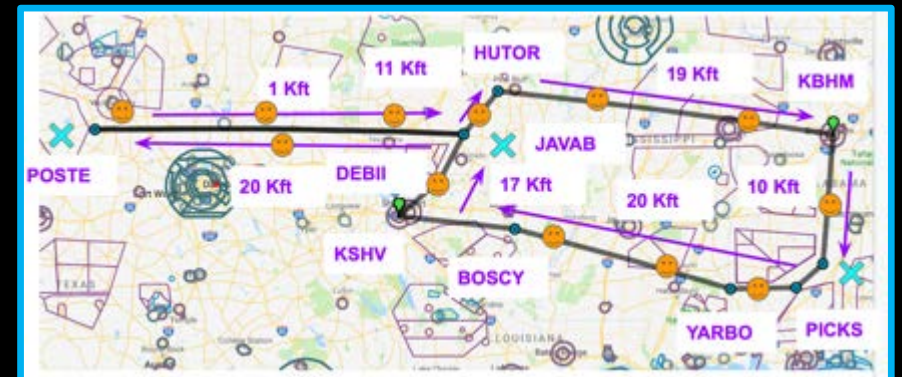
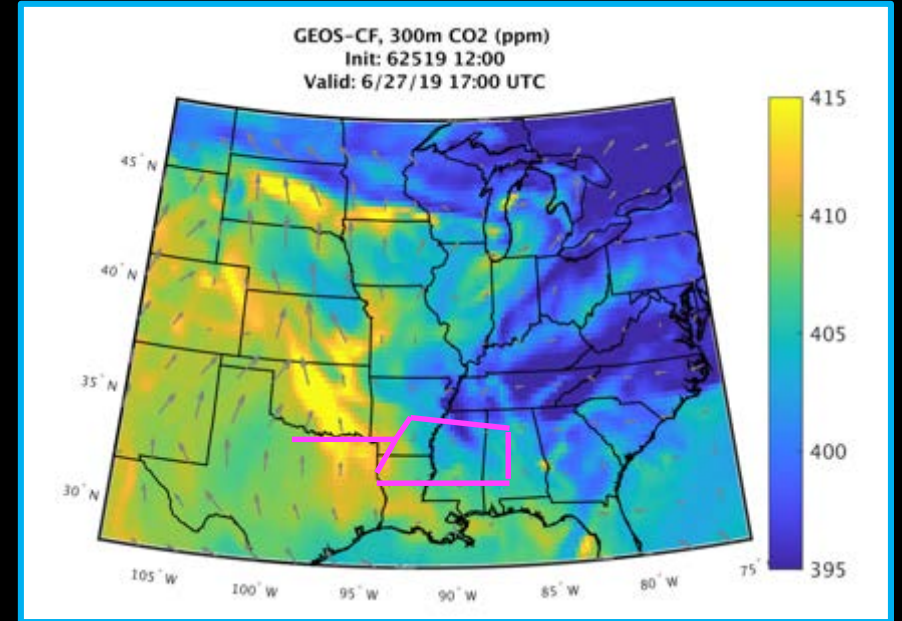
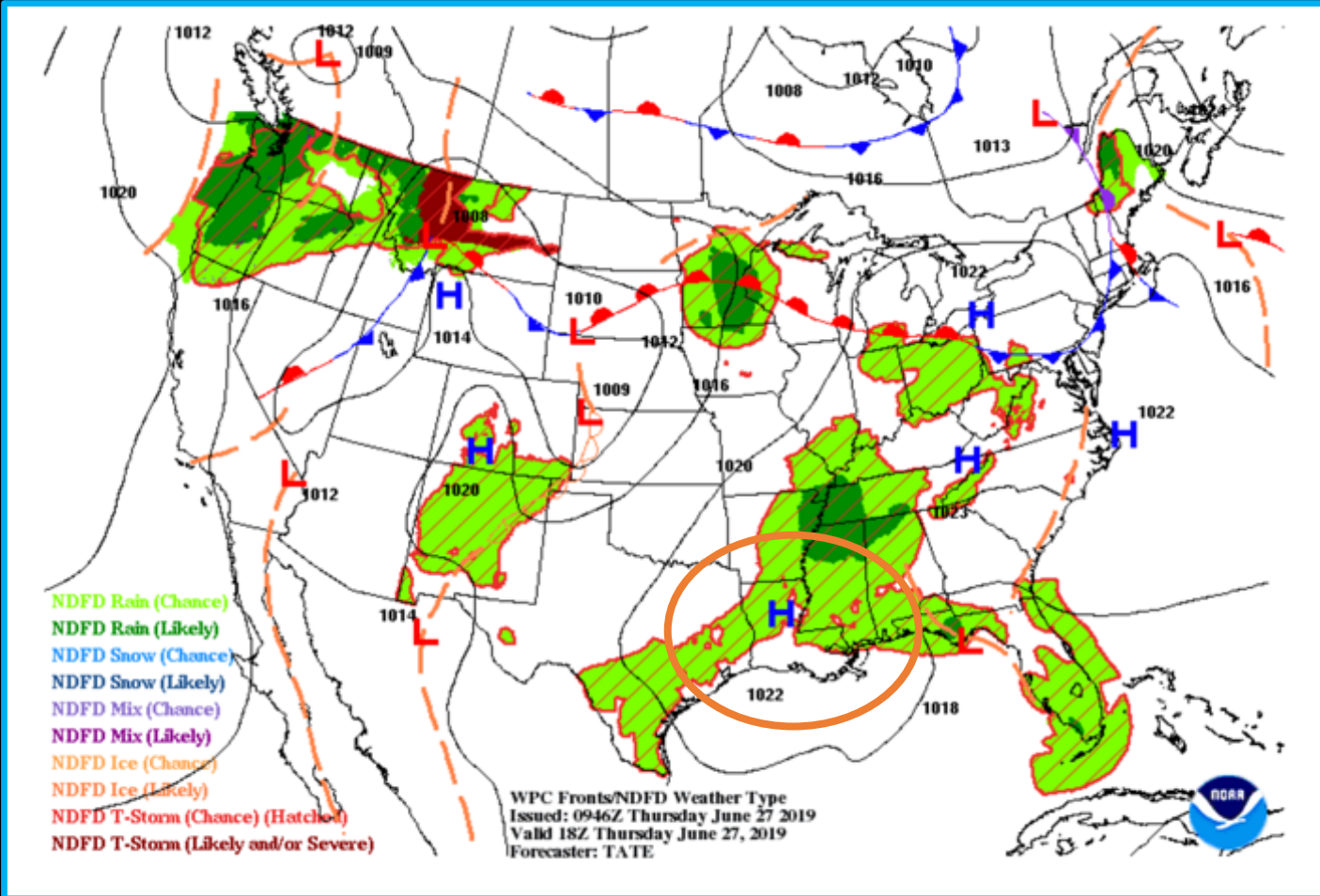
GEOS-CF CO2 (ppm) 2 Day Forecast for 1 UTC 06/20/19





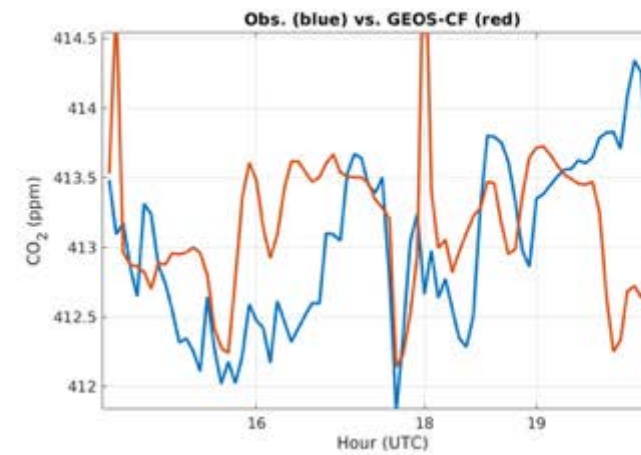
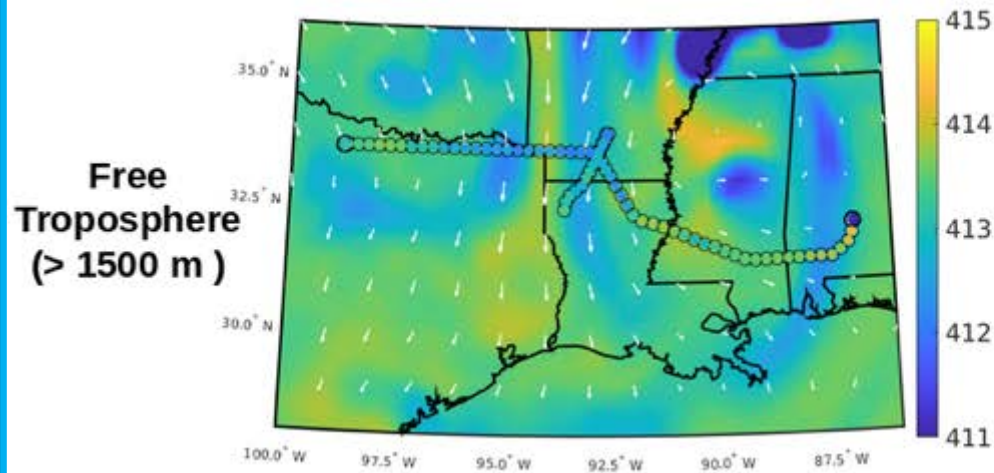
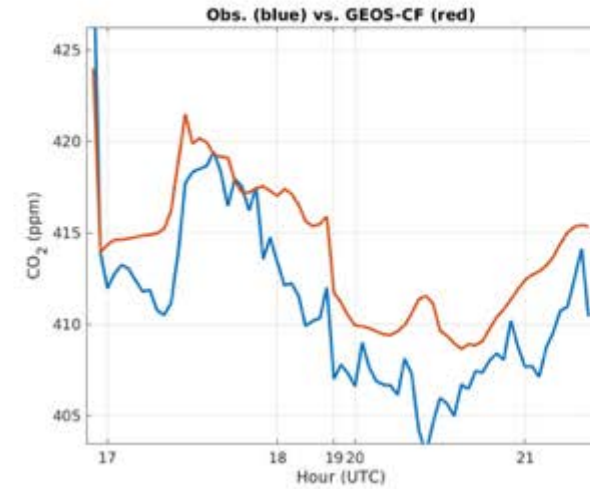
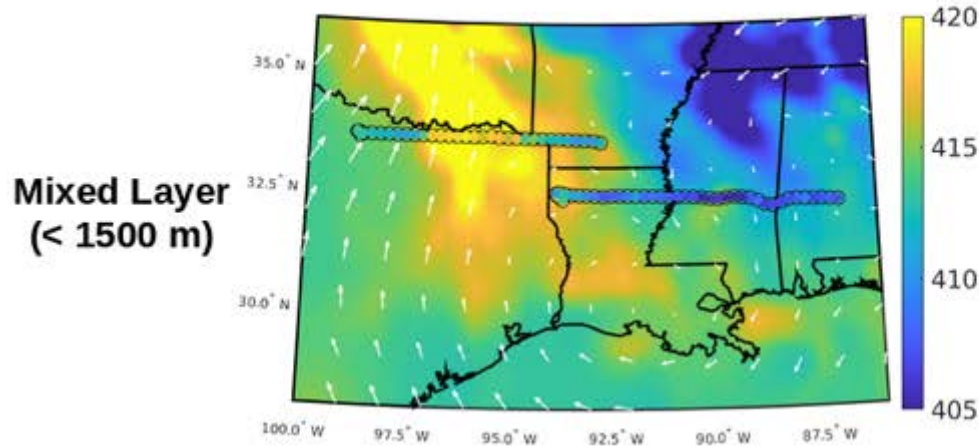
# Forecasting Example 1

## NWS Fronts for 18Z Thursday 06/27/19

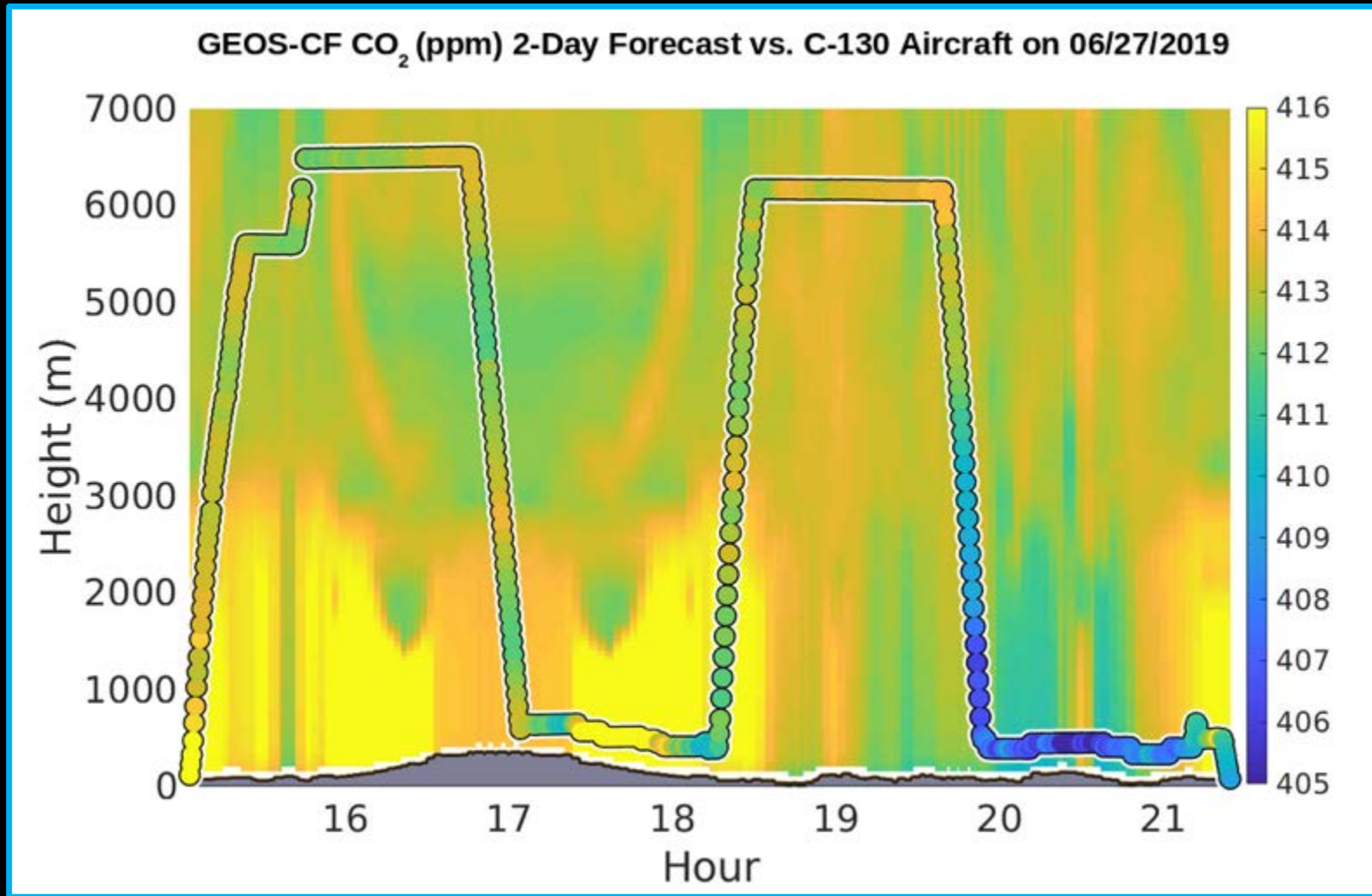


# Forecasting Example 1 (cont.)

GEOS-CF CO<sub>2</sub> (ppm) 2-Day Forecast vs. C-130 Aircraft on 06/27/2019

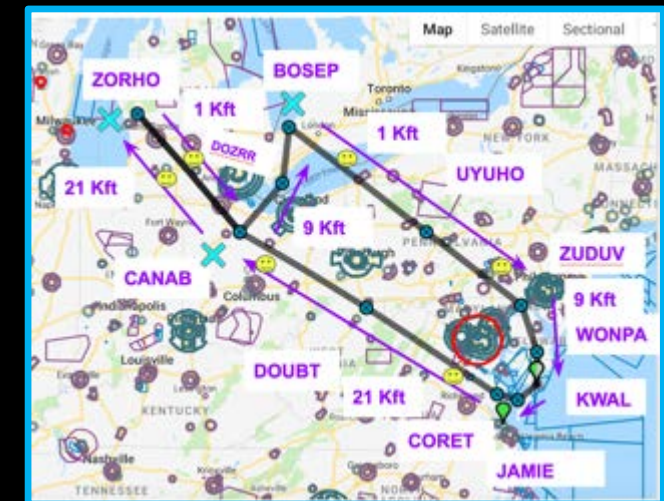
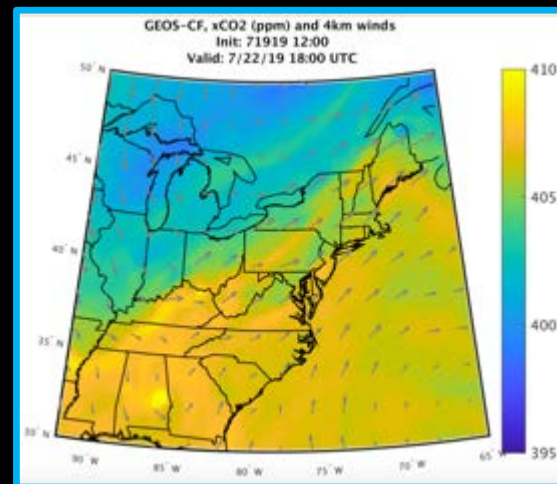
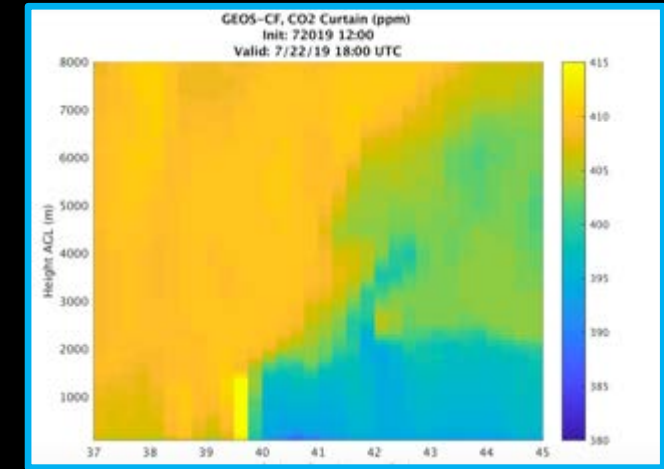
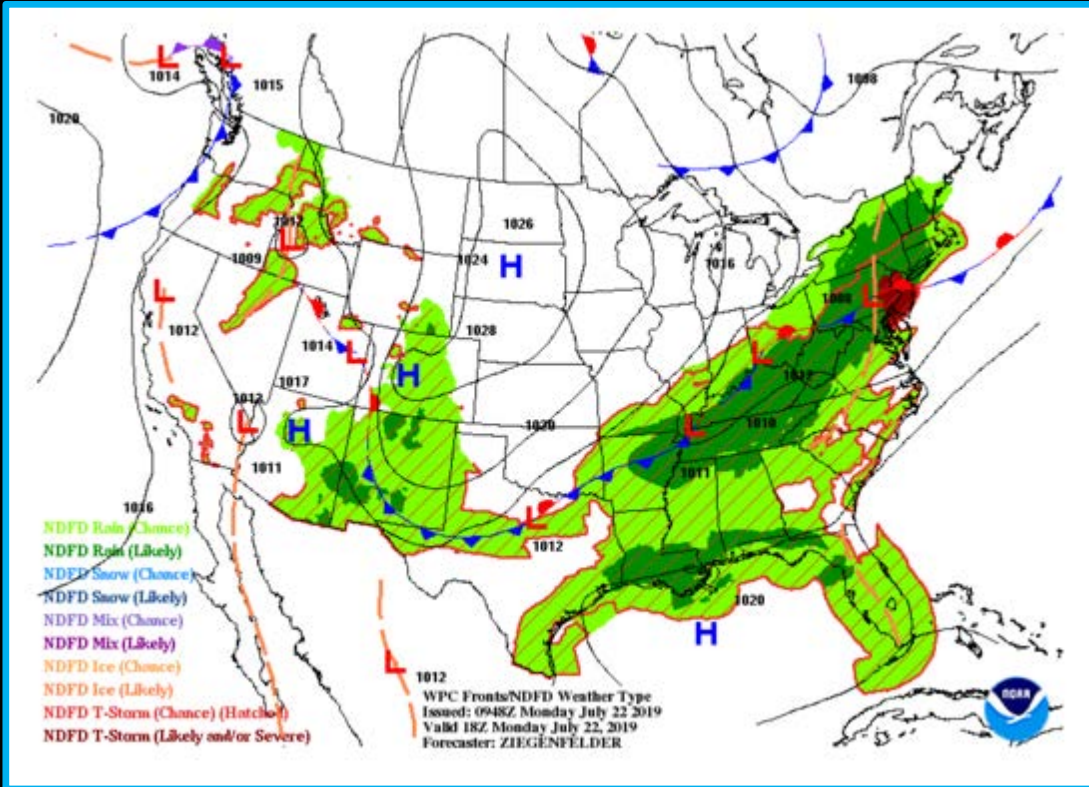


# Forecasting Example 1 (cont.)



# Forecasting Example 2 (cont.)

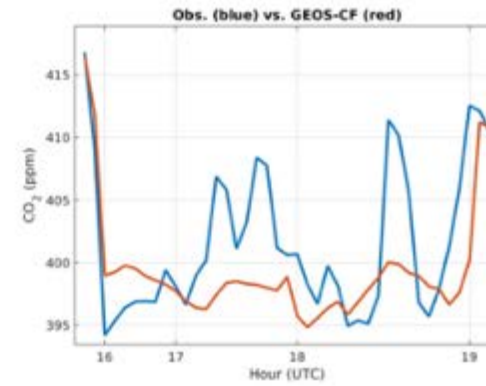
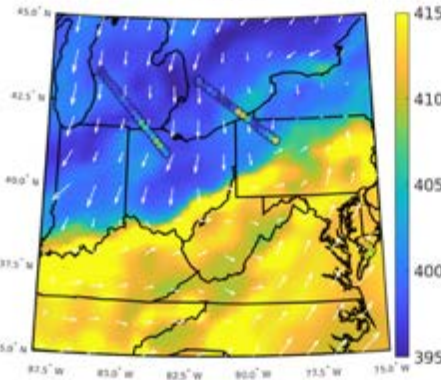
## NWS Fronts for 18Z Monday 07/22/19



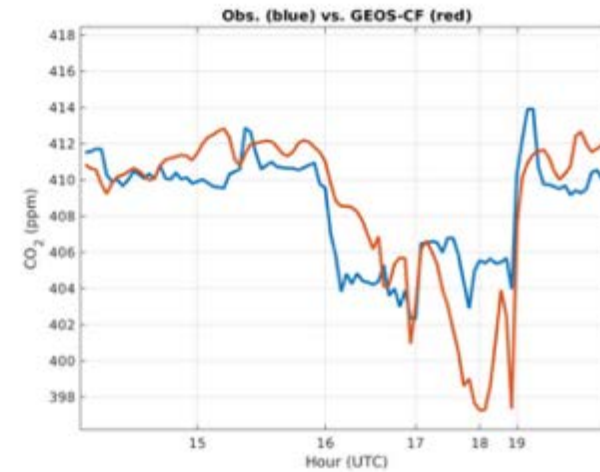
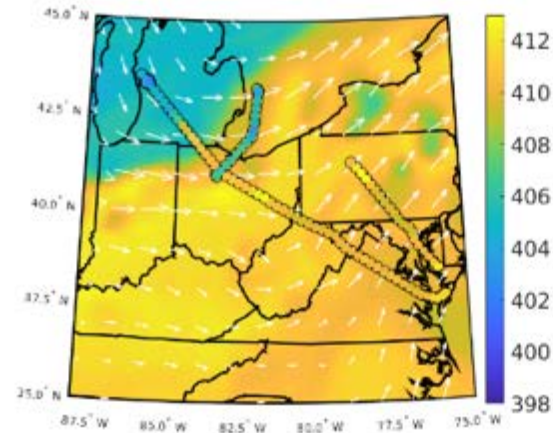
# Forecasting Example 2 (cont.)

GEOS-CF CO<sub>2</sub> (ppm) 2-Day Forecast vs. C-130 Aircraft on 07/22/2019

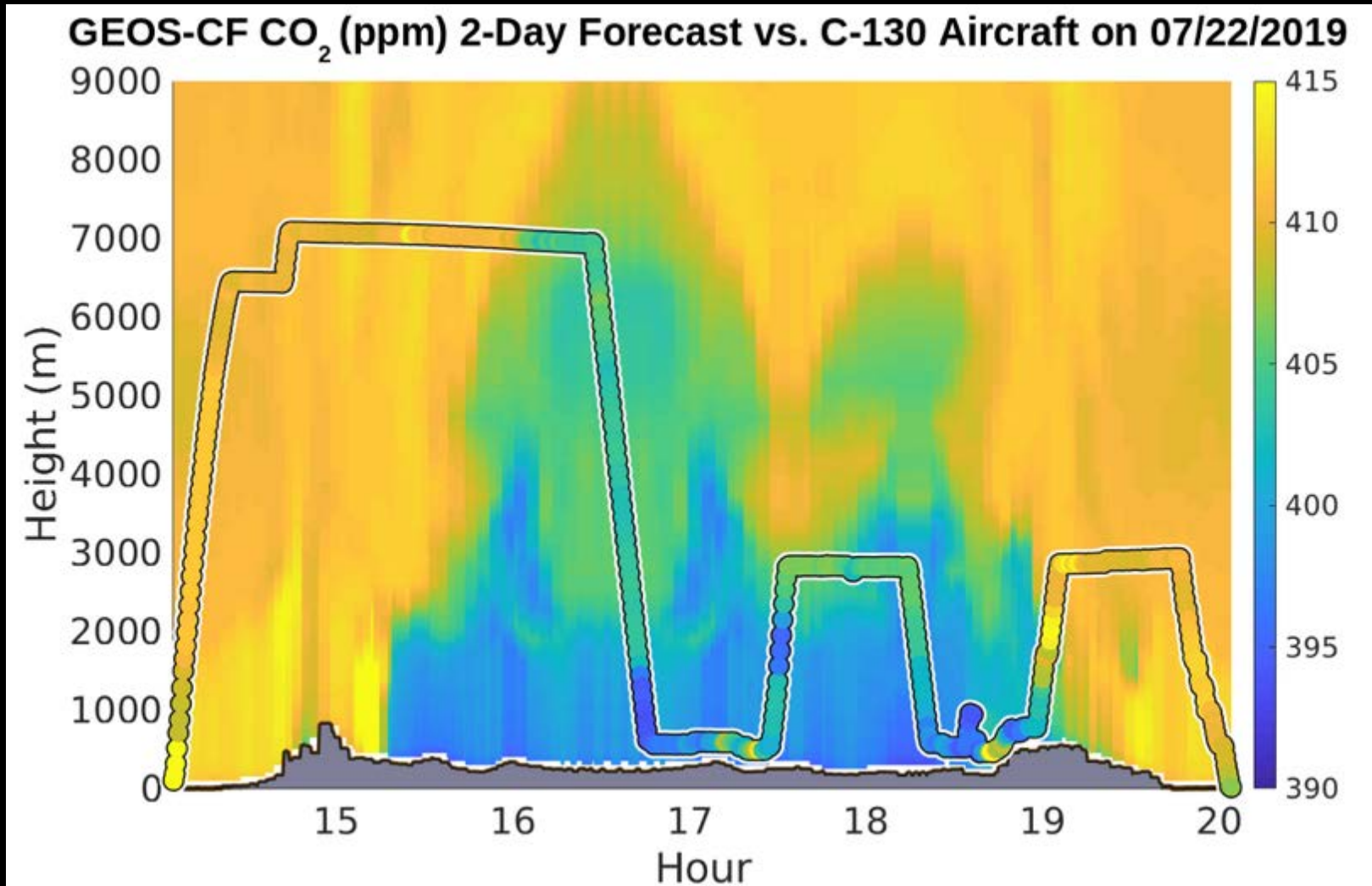
Mixed Layer  
( < 1500 m )



Free  
Troposphere  
( > 1500 m )



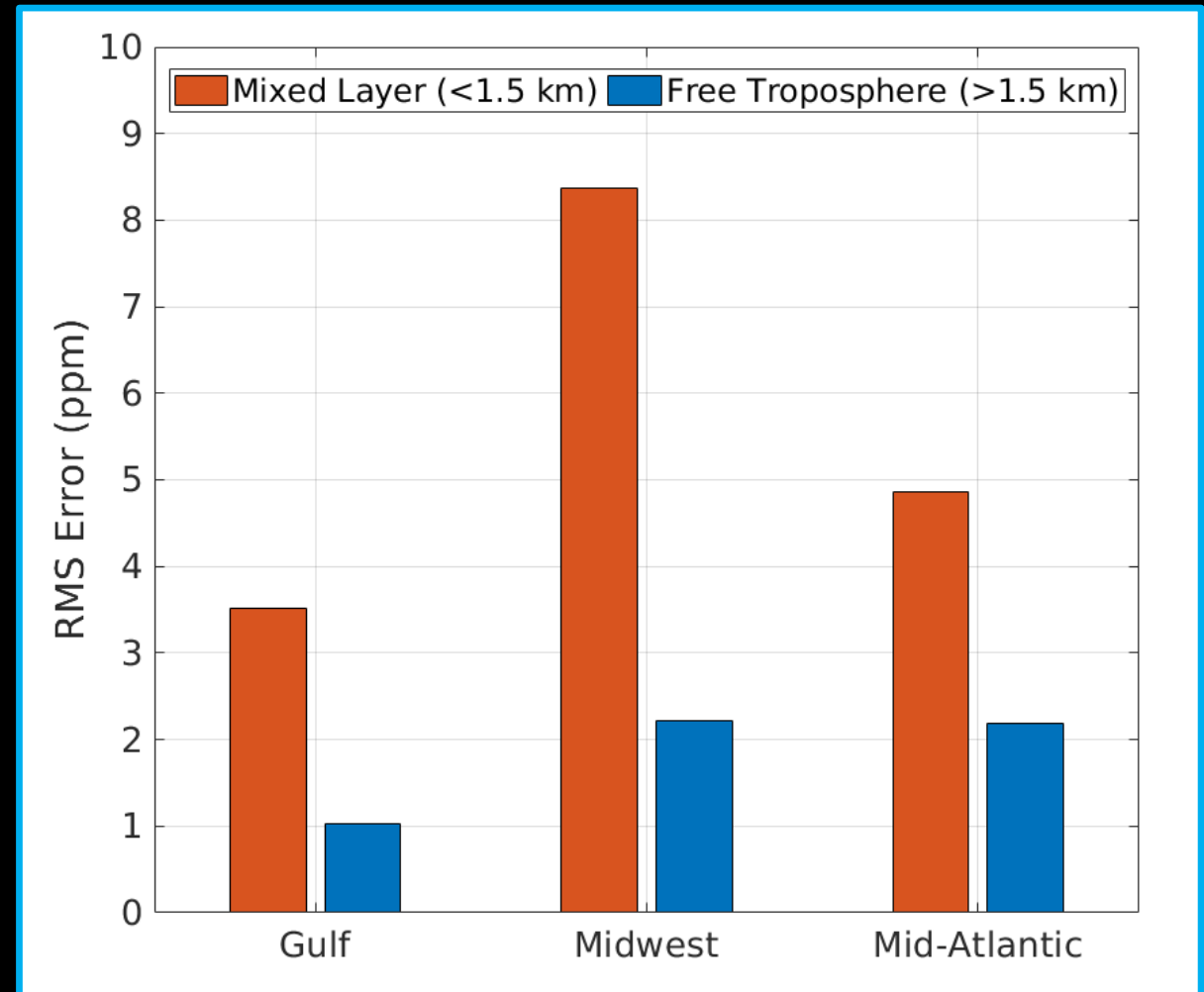
# Forecasting Example 2 (cont.)



# Results 1

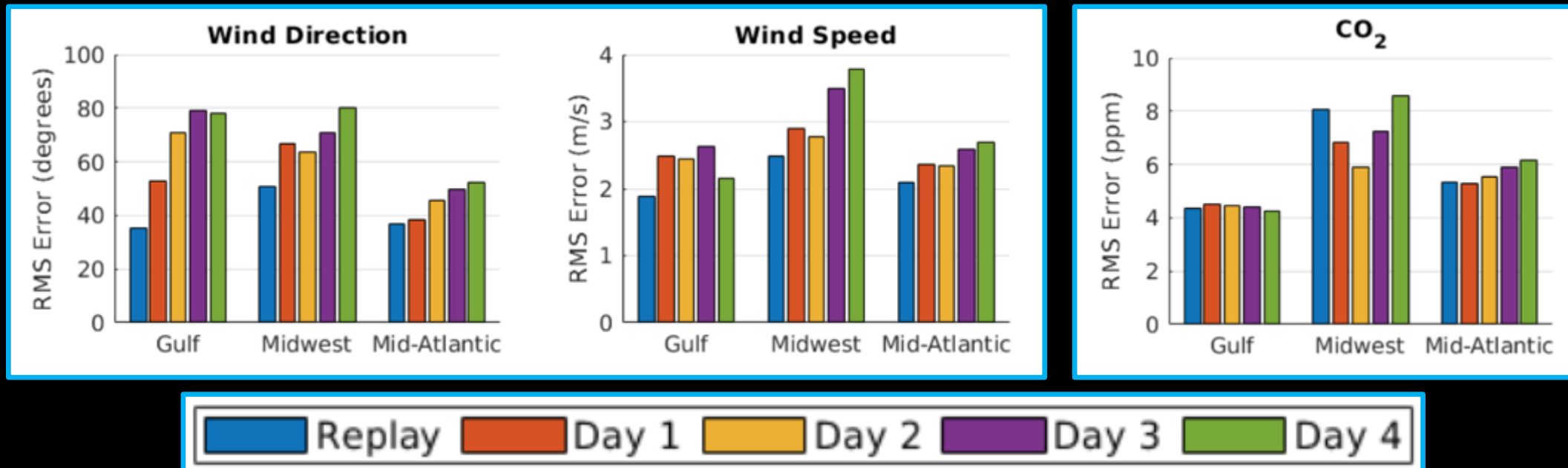
- The model performs much better in the free troposphere than in mixed layer.
- This implies that flux errors are larger than transport errors.
- Extreme flooding of 2019 in the Midwest significantly affected CO<sub>2</sub> sink for the duration of the ACT-America campaign.

RMS Error for Model vs. Aircraft Observations



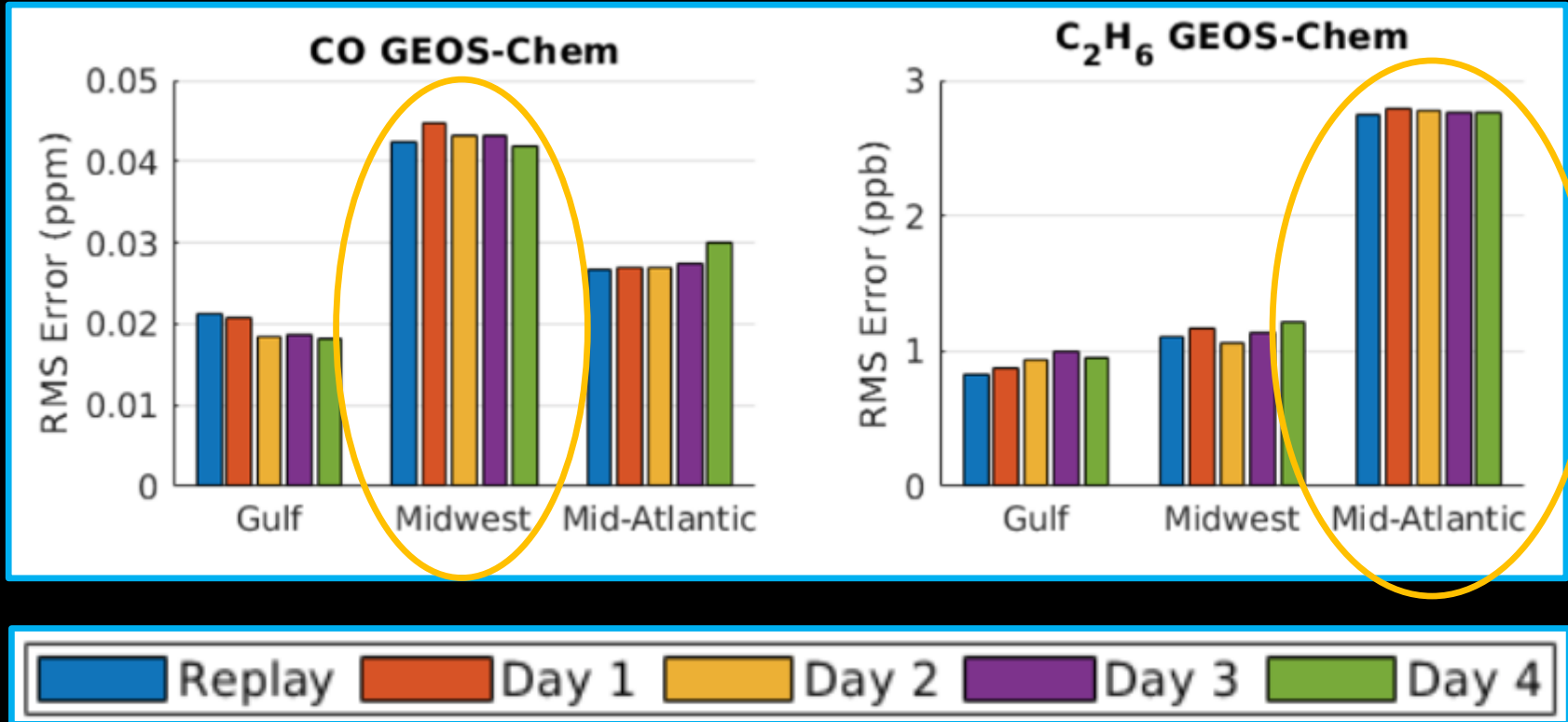
## Results 2

- Forecasts from different lead times indicate that skill in transport prediction is decreasing, while CO<sub>2</sub> forecast skill is relatively consistent.
- This implies that the main source of error in the CO<sub>2</sub> stems from the emissions input (flux) of the CO<sub>2</sub> (at least in Gulf and Mid-Atlantic).





# Results 2 (cont.)



## Conclusions

- The forecasting of CO<sub>2</sub> is useful when planning flight missions (such as ACT-America) by helping to identify interesting CO<sub>2</sub> features such as gradients.
- The model is much more accurate in the free troposphere than in mixed layer.
- The NASA GEOS-CF model's skill of predicting CO<sub>2</sub> remains relatively similar when considering lead times of 1 to 4 days for Gulf and Mid-Atlantic regions.
- Given current analysis, emissions seem to contribute more to CO<sub>2</sub> modeling errors than transport.



## Acknowledgments

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