



A prototype for monitoring carbon flux anomalies in near real time using NASA's GEOS system: progress and challenges

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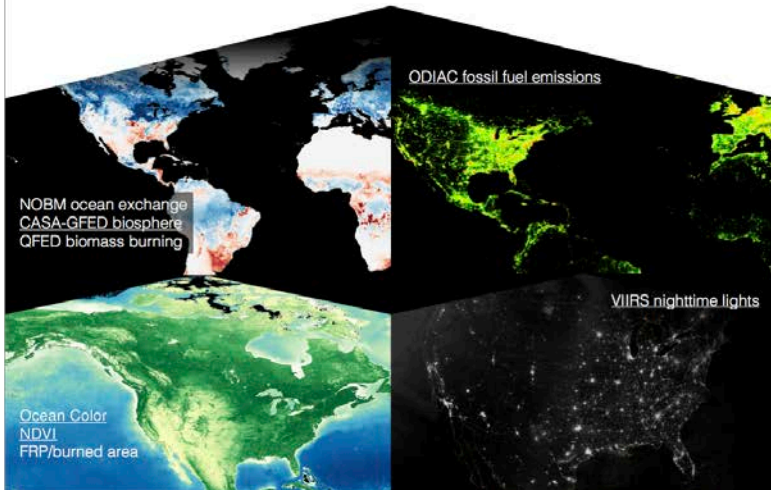
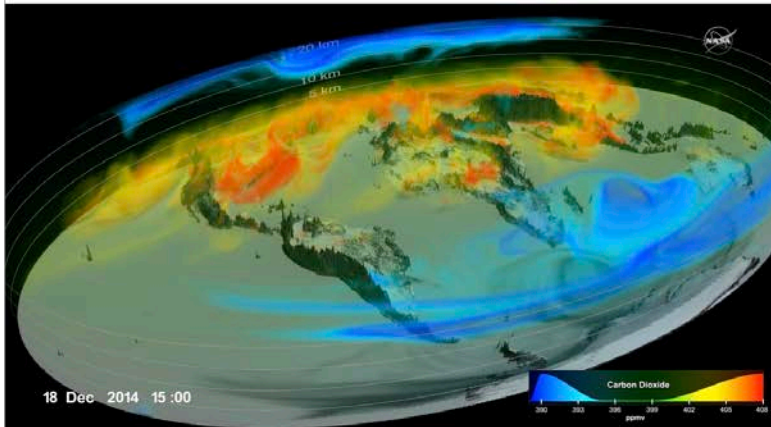
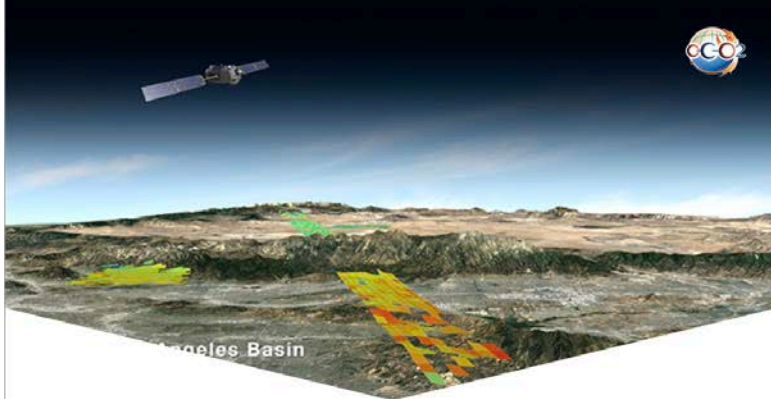
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GEOS CMS System Overview

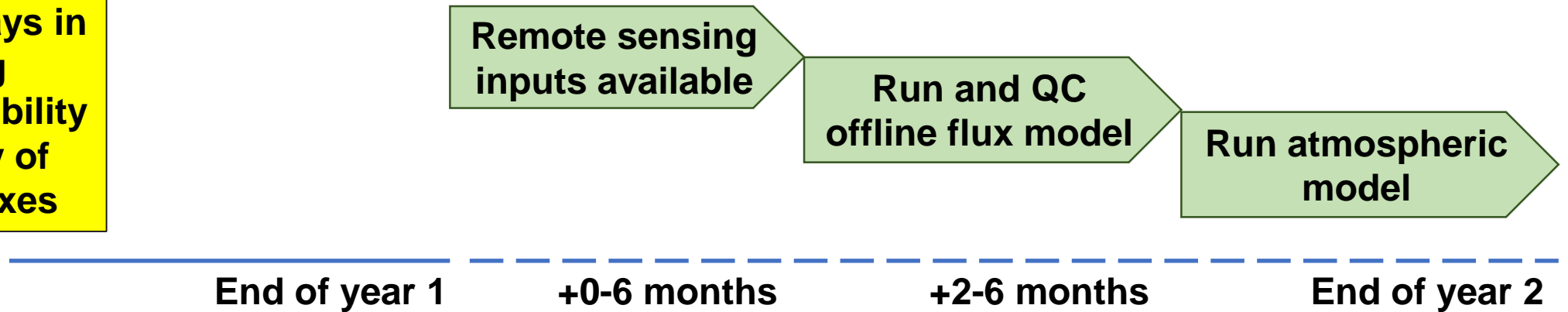
- Satellite observations provide important constraints on carbon flux estimates
- Ocean color and NDVI information inform model-based estimates of ocean (NOBM) and land productivity (CASA-GFED) while observations of fire radiative power, burned area, and nighttime lights support high-resolution fire (GFED, QFED) and fossil fuel (VIIRS) emission inventories
- Flux estimates also incorporate weather information from MERRA-2 to provide a physically consistent flux dataset
- Bottom-up fluxes are transported using NASA's GEOS AGCM, providing high quality, high-resolution simulations of CO₂ and CO
- By assimilating atmospheric CO₂ from OCO-2 and GOSAT, the GEOS-based system also provides atmospheric carbon reanalyses and insights needed to refine flux estimates



Limitations for near-real-time atmospheric monitoring

1. Availability of observationally constrained flux data

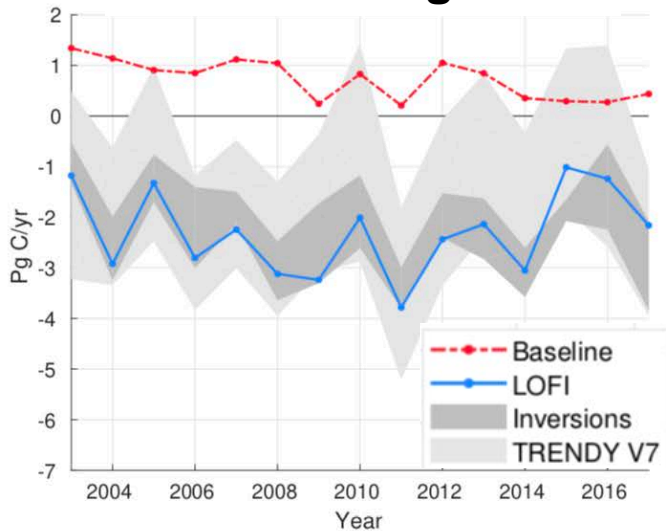
Significant delays in processing decrease availability and reliability of bottom-up fluxes



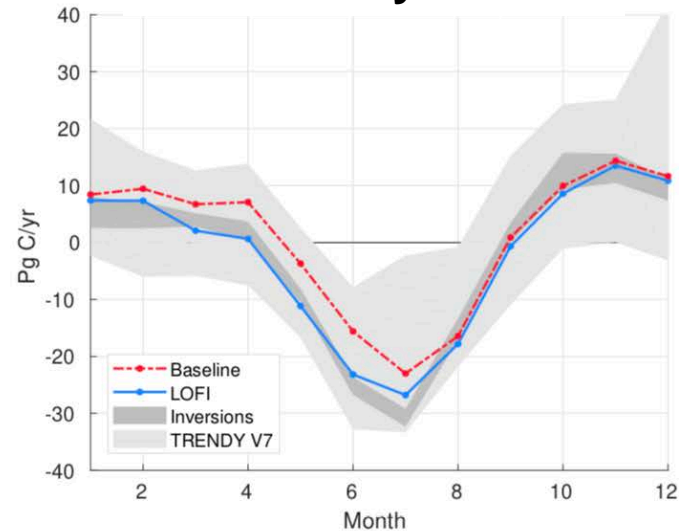
2. Availability of CO₂ observations

1) Improving near-real-time flux estimates

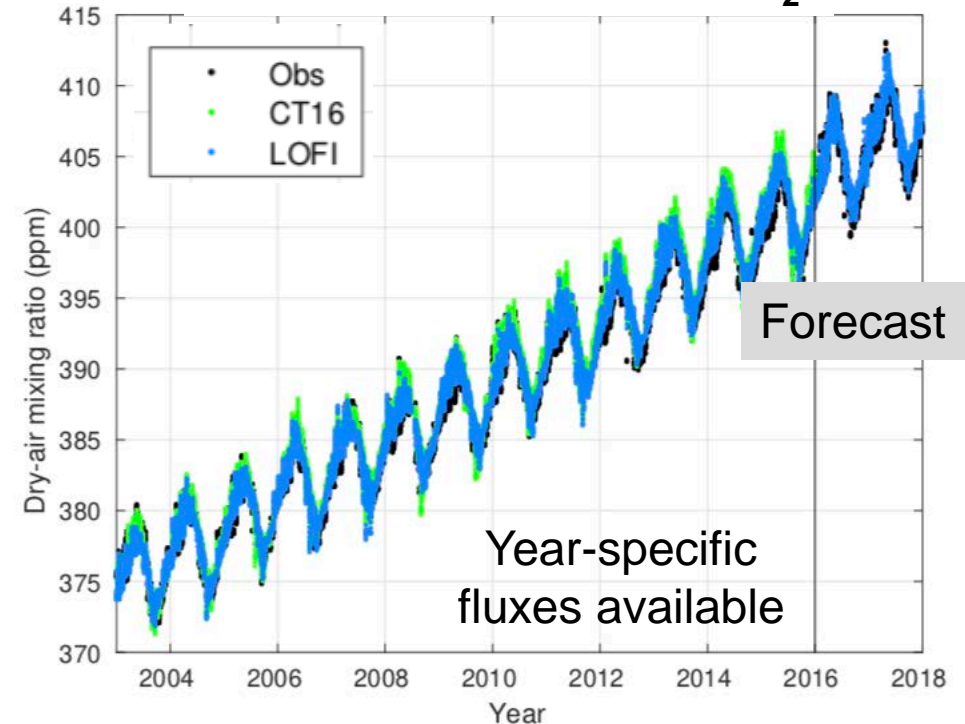
Annual average NBE



Seasonal cycle NBE



Mauna Loa Simulated CO₂

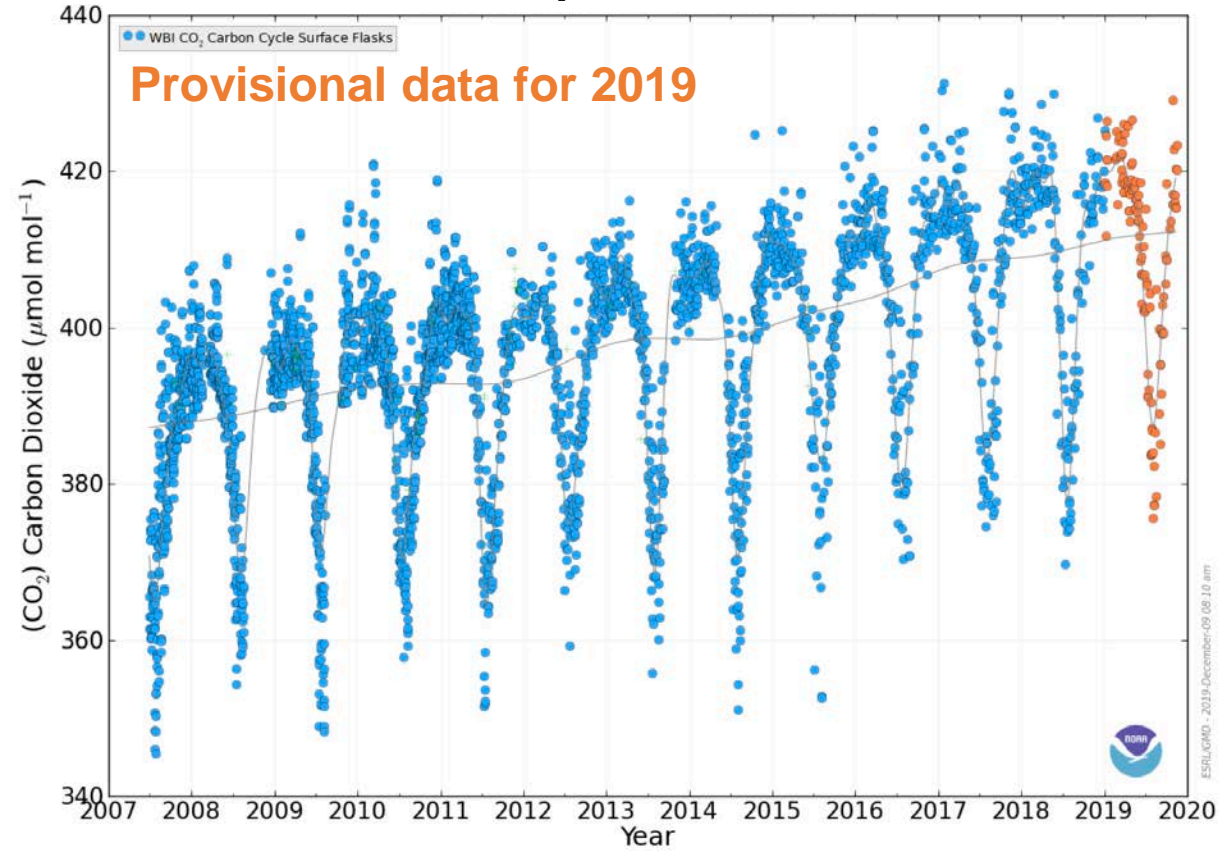


- LoFi flux package uses GEOS CMS bottom up fluxes and adds a land sink constrained by atmospheric growth rate (above)
- When year-specific flux and atmospheric data are not yet available:
 - Climatological spatial distribution is used
 - Flux trends extrapolated
 - Sink magnitude incorporates seasonal forecast of growth rate

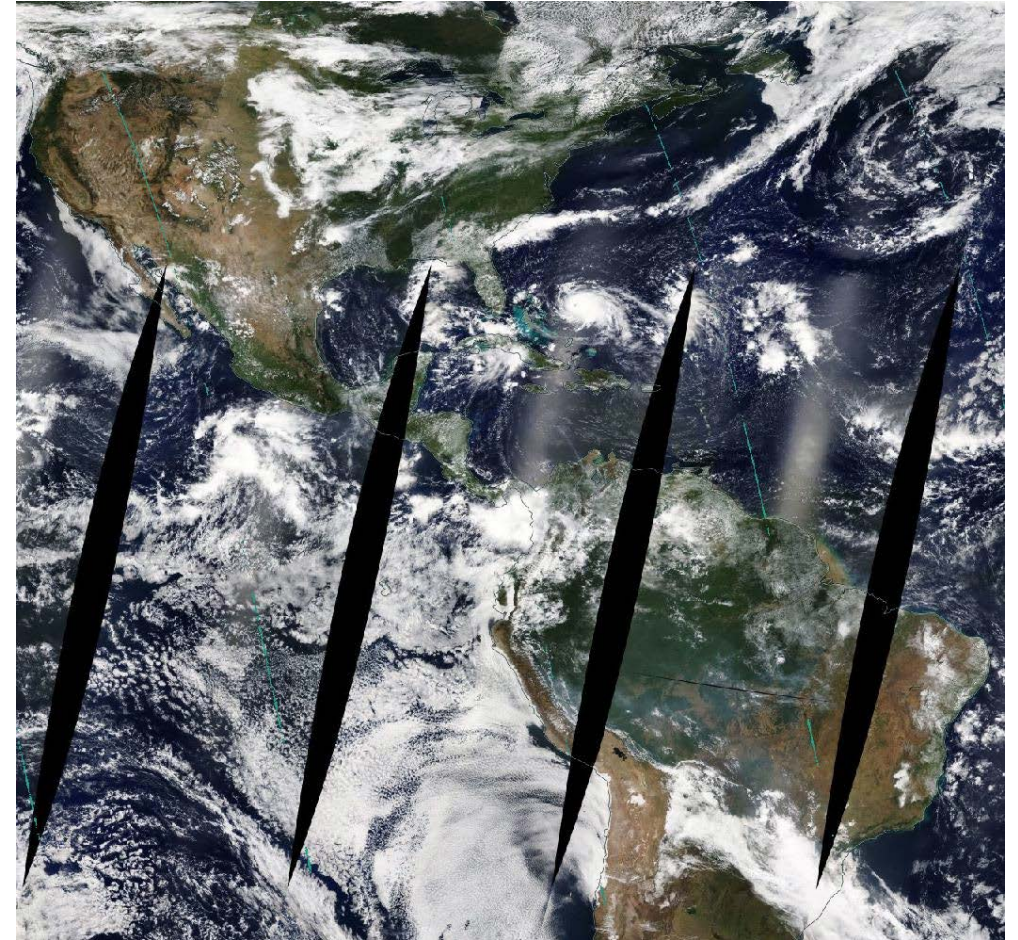
Forecast fluxes succeed in reproducing background atmospheric mixing ratios providing support for assimilation of atmospheric obs.

2) Availability of CO₂ data improving, but latency of 1-3 months remains

NOAA NRT Obstack – West Branch Iowa



NASA OCO-2 Data – 20190831

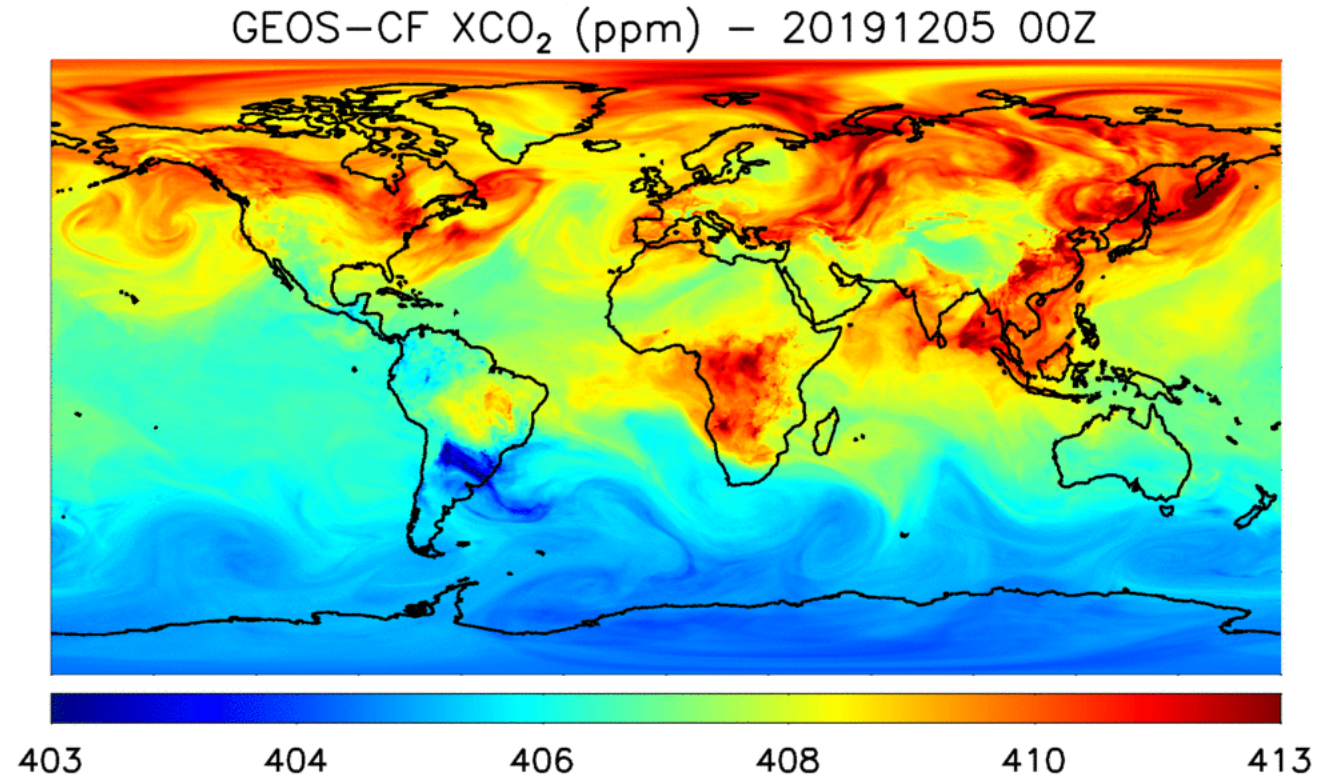


<https://www.esrl.noaa.gov/gmd/dv/iadv/>

<https://worldview.earthdata.nasa.gov/>

Ability to simulate and forecast carbon weather in NRT

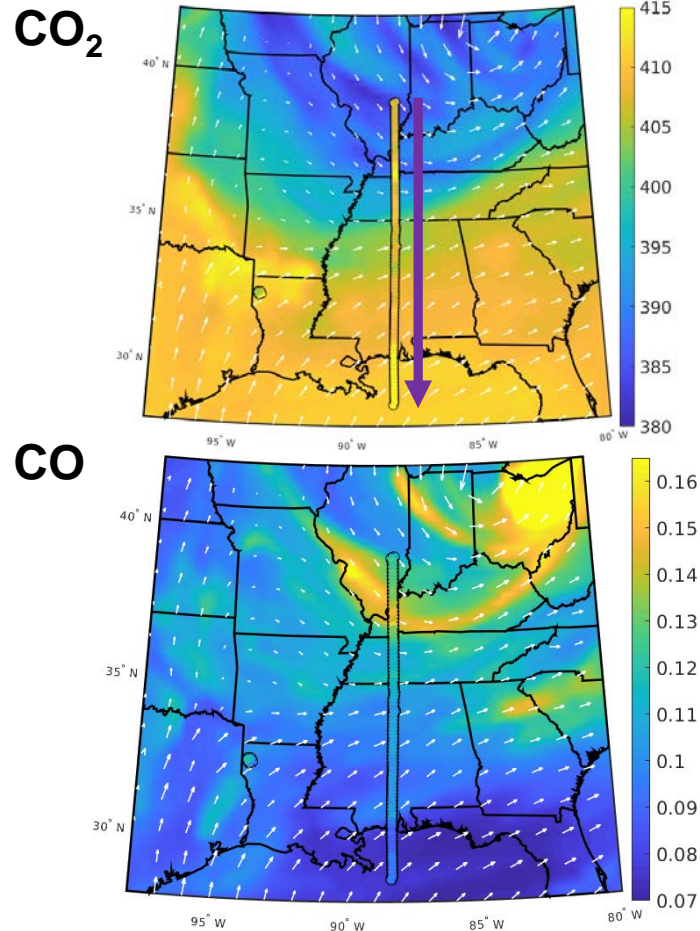
- GEOS Composition Forecast (GEOS-CF) system produces global, 3D distributions of atmospheric composition and 5-day forecasts
- CO₂ fluxes incorporate NRT biomass burning using MODIS fire radiative power + LoFi ocean, land, and fossil fuel
- GEOS-CF also provides estimates of species like CO and NO₂ that provide additional information that may be used for source attribution



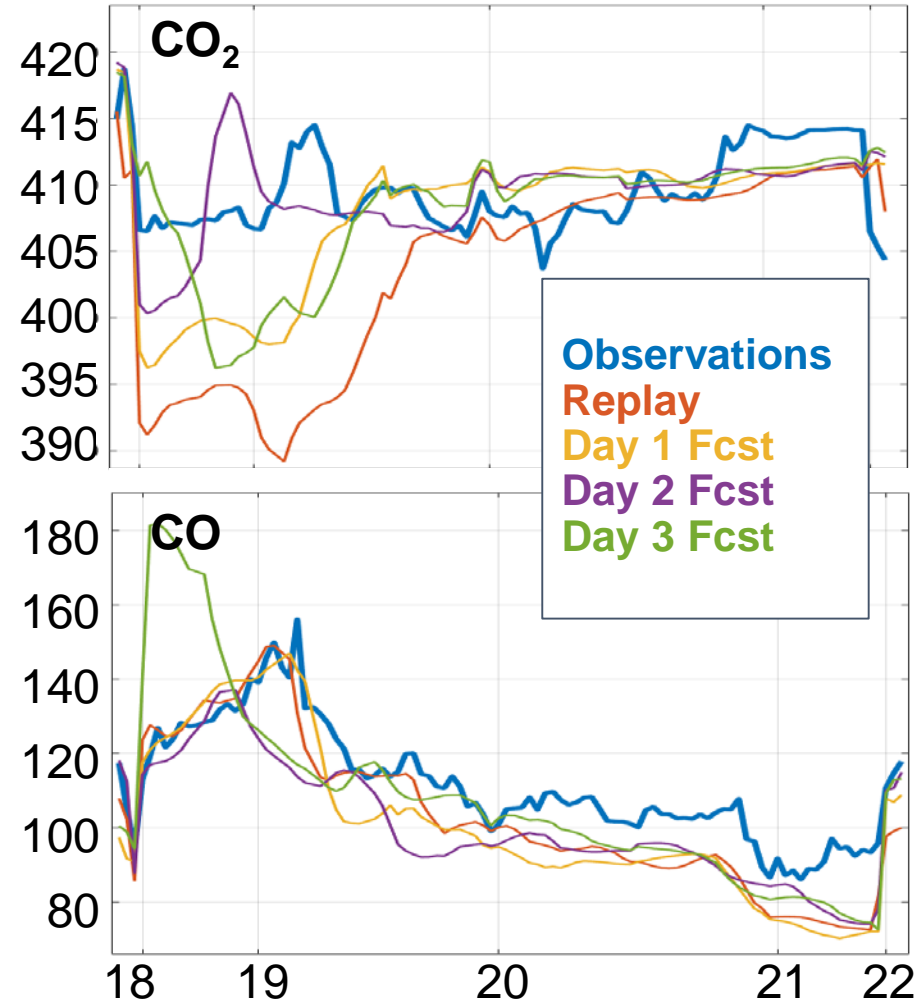
Case study: GEOS-CF forecasts in support of ACT-America

6/20/19

GEOS-CF Replay at 500 m vs. Boundary Layer Aircraft Data



GEOS-CF Replay and Forecasts vs. Obs.

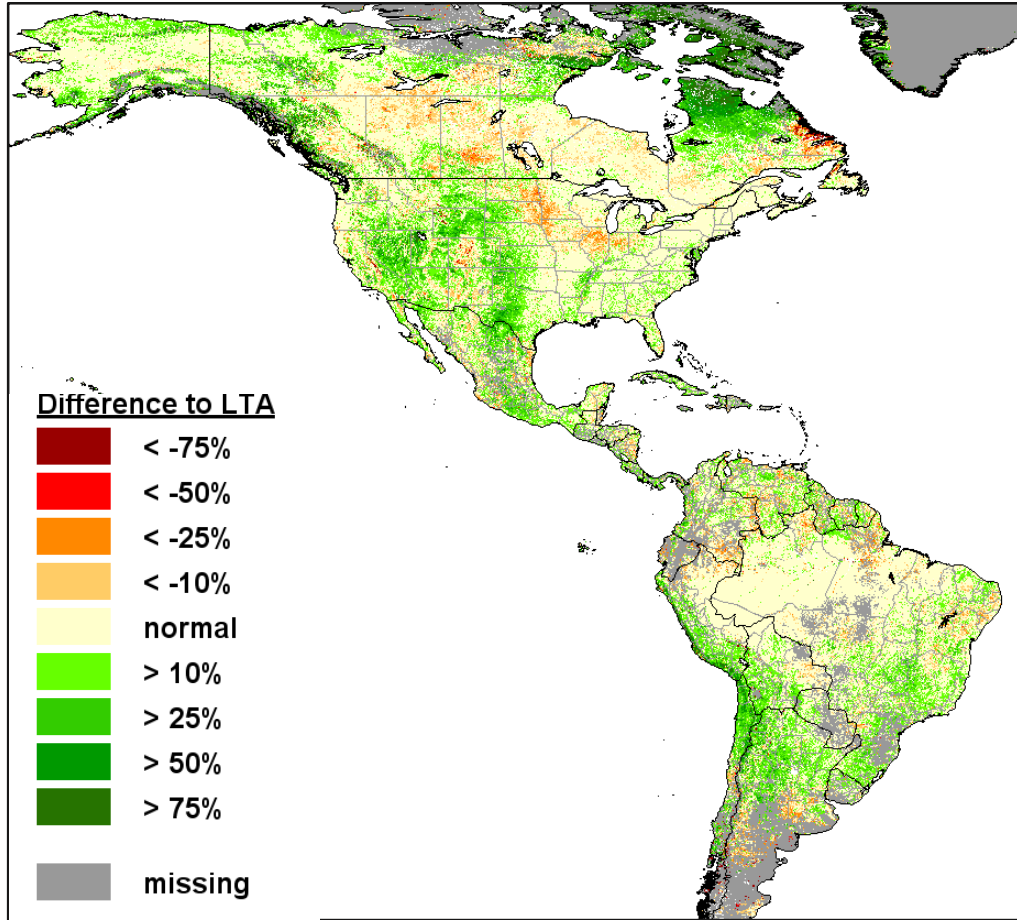


- Two day forecasts tend to predict frontal structures and gradients well (see CO)
- Lack of dynamic emissions can hurt skill for CO₂ but mismatch provides valuable information into flux processes

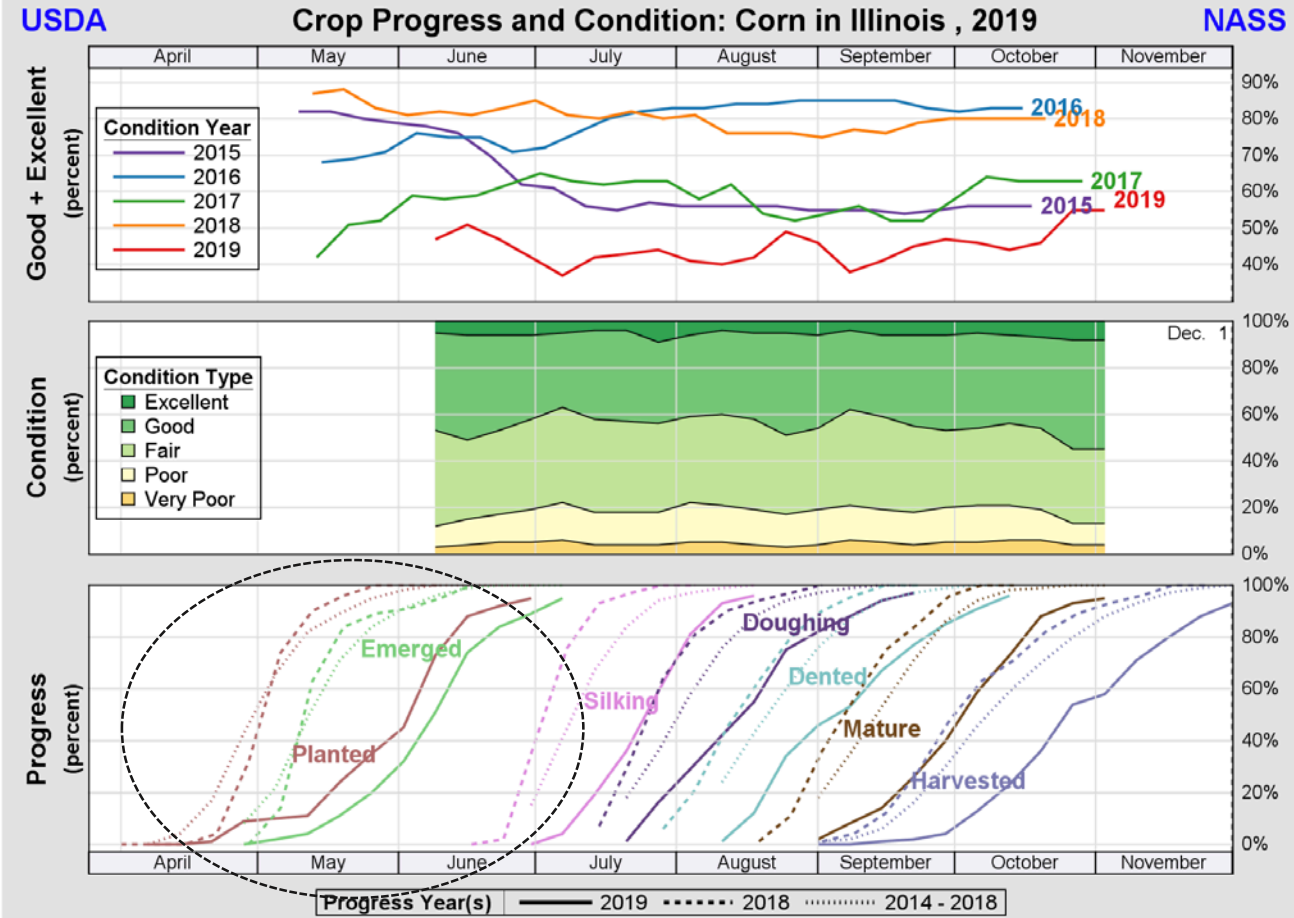
A53I-07 - Nikolay Balashov

2019 Agricultural anomalies after record floods

201906 NDVI Anomaly



USDA Illinois Corn Progress



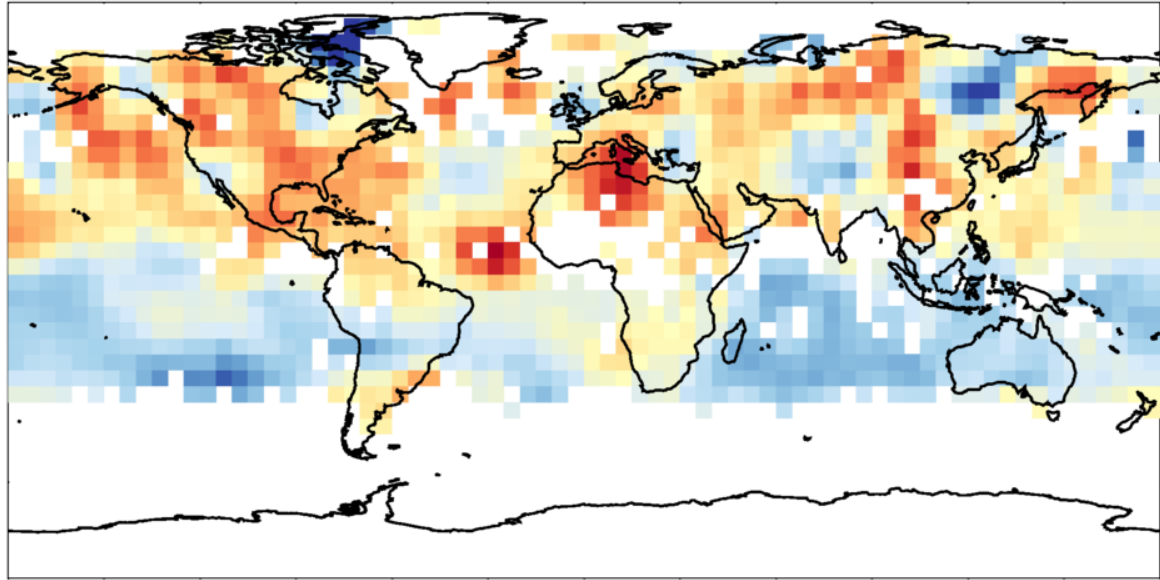
Source: National Agricultural Statistics Service (NASS), Crop Progress Report

<http://www.fao.org/>

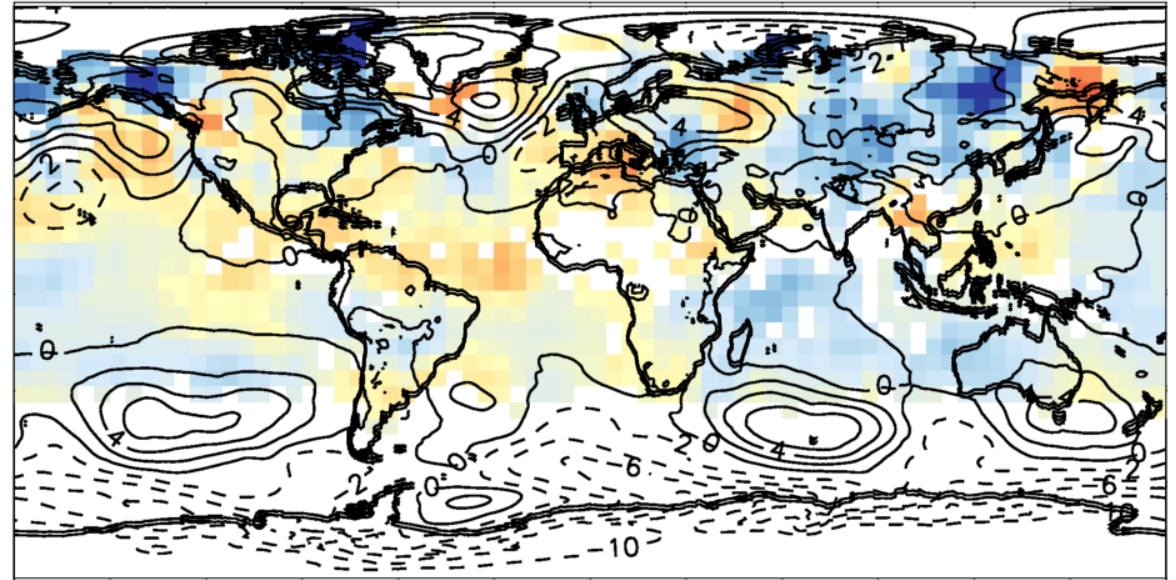
<https://www.nass.usda.gov/>

Disentangling flux and weather influences

OCO-2 total anomaly (ppm) - 201906



GEOS total anomaly (ppm) - 201906



-1.0 -0.8 -0.6 -0.4 -0.2 0 0.2 0.4 0.6 0.8 1.0

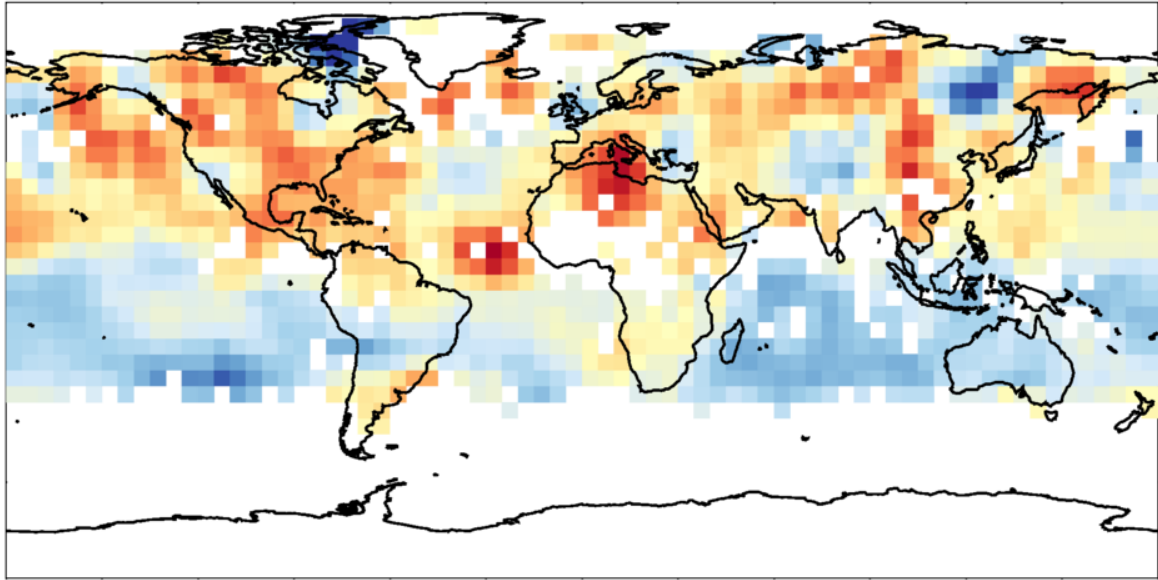
-1.0 -0.8 -0.6 -0.4 -0.2 0 0.2 0.4 0.6 0.8 1.0

OCO-2 XCO₂ anomaly from 201906 shows the collective influence of weather and flux changes

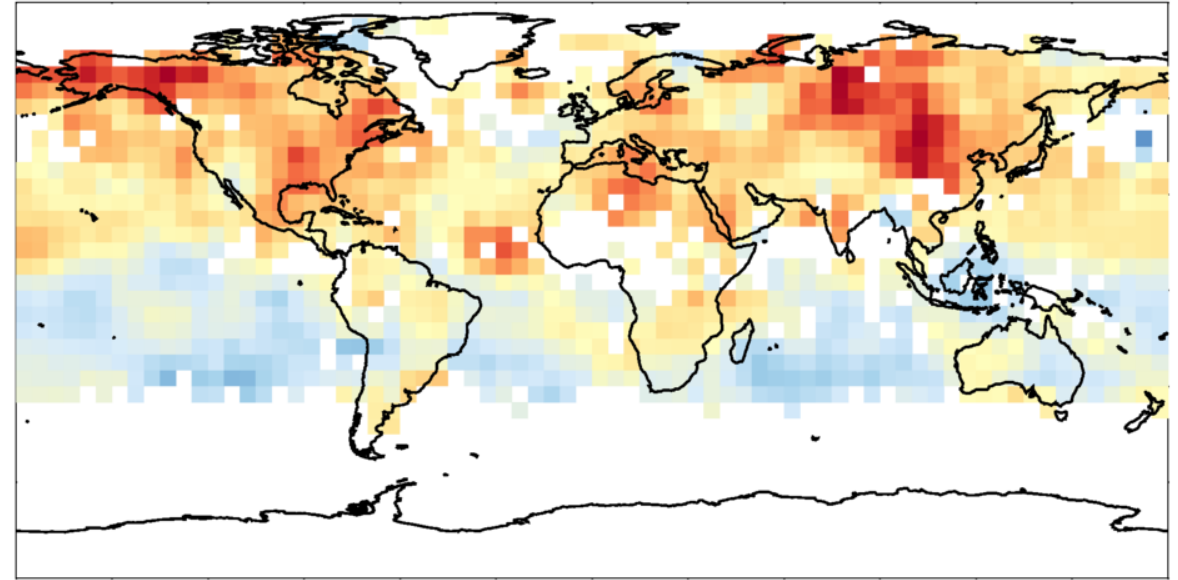
Anomaly from GEOS run with LoFi fluxes represents weather changes + a small contribution from fires

Disentangling flux and weather influences

OCO-2 total anomaly (ppm) - 201906



OCO-2 - GEOS - 201906



-1.0 -0.8 -0.6 -0.4 -0.2 0 0.2 0.4 0.6 0.8 1.0

-1.0 -0.8 -0.6 -0.4 -0.2 0 0.2 0.4 0.6 0.8 1.0

Difference in anomalies highlights the role of flux anomalies over US., Europe



Summary and future directions

- Data-driven modeling tools supported by CMS provide the capability to improve understanding of carbon flux changes as they happen
 - Response to 2019 midwestern floods provides an example where an agricultural anomaly can be rapidly identified and analyzed
- Remaining challenges:
 - Availability of CO₂ data limits ability to estimate concentrations, fluxes with less than 2-3 month latency
 - Progress in bottom-up modeling tools can help bridge the gap, but work needs to be done to incorporate NRT information
- CMS has a valuable role to play in understanding user needs - who needs low latency concentration and flux data and what are their requirements?