



# NASA's Carbon Cycle OSSE Initiative - Informing future space-based observing strategies

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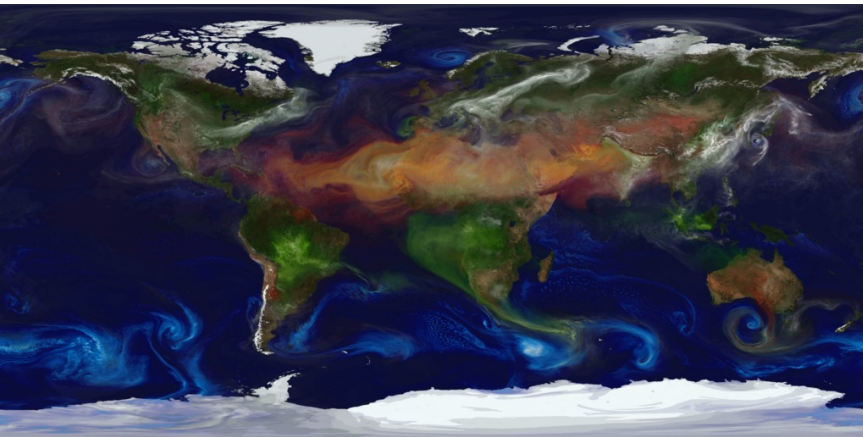
<sup>4</sup>Colorado State University



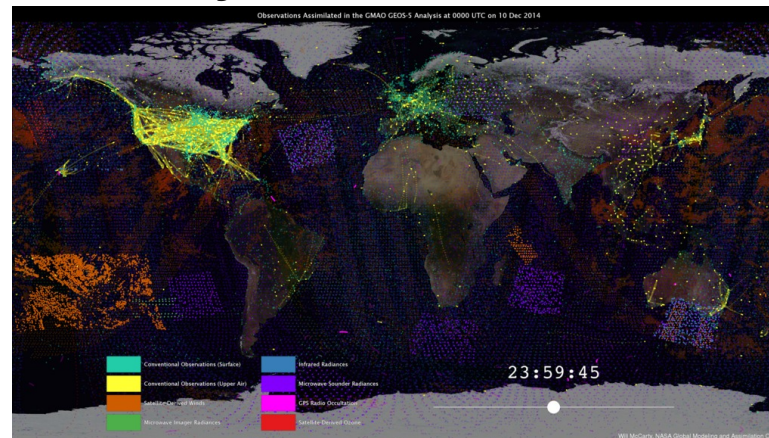
# Observing System Simulation Experiments

**Traditional Met OSSE** – Create hi-res nature run (truth) -> simulate observations (radiance, conventional) for all current observing systems -> simulate proposed new observations -> assimilate all ‘obs’ into coarser resolution model -> evaluate impact of new observations on forecast skill

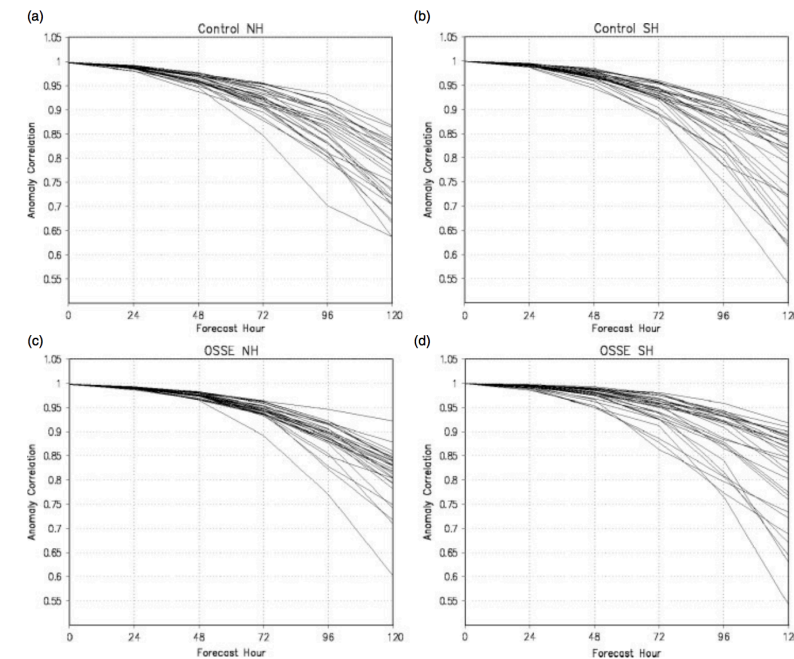
Nature Run (‘truth’)



Synthetic Datasets



Evaluation of assimilation experiments against ‘truth’



# Observing System Simulation Experiments

**Traditional Met OSSE** – Create hi-res nature run (truth) -> simulate observations (radiance, conventional) for all current observing systems -> simulate observations for proposed observing system -> assimilate all ‘obs’ into coarser resolution model -> evaluate impact of new observations on forecast skill

**Retrieval OSSE** – Calculate radiance from nature run met, CO<sub>2</sub>, aerosol fields -> use retrieval algorithm to estimate XCO<sub>2</sub> -> compare with ‘true’ XCO<sub>2</sub> from nature run

**Sampling OSSE** – Sample nature run using different orbit, remote sensing technique, scanning strategy, etc. -> evaluate yield of observations in key regions, ability to constrain key processes

**Flux inversion OSSE** – Create hi-res GHG nature run -> simulate GHG observations -> assimilate synthetic GHG observations into coarser res model (ideally driven with different meteorology) -> compare estimated fluxes with ‘true’ fluxes assumed in nature run



## Previous GHG OSSE efforts (or, do we really have to keep doing these things???)

- OSSEs play an important role in assessing the value of new candidate observing systems
- Also needed to test and improve inverse modeling systems
- However, most OSSE efforts are focused on justifying a single mission and contain significant weakness
  - Inconsistent assumptions about the role of random, systematic errors
  - Lack of information about diurnal cloud variability
  - Lack of context about value added in context of existing, planned missions





## NASA's Carbon Cycle OSSE Initiative

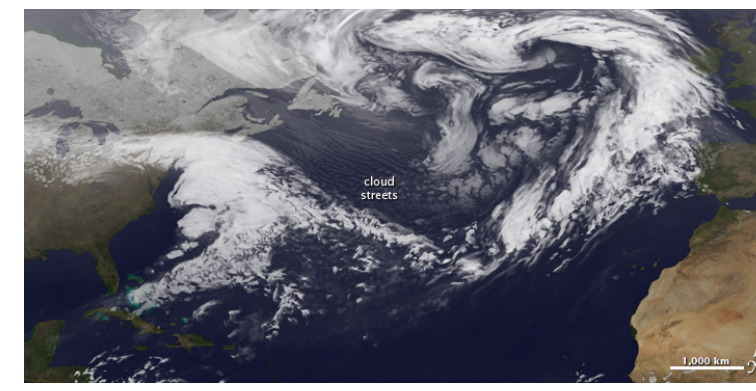
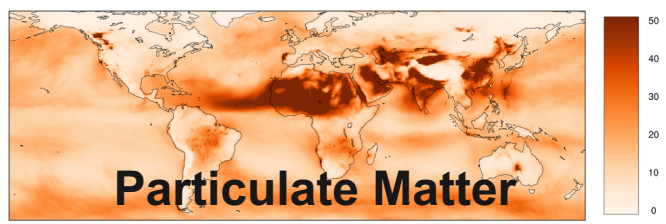
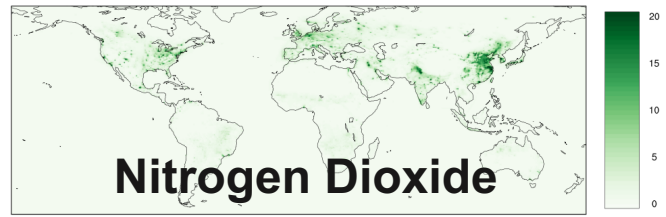
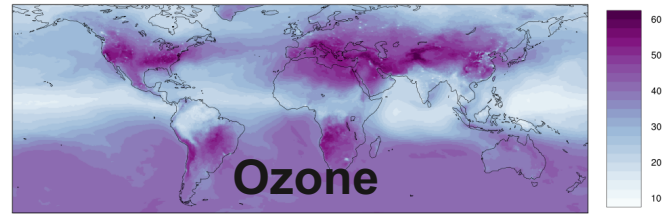
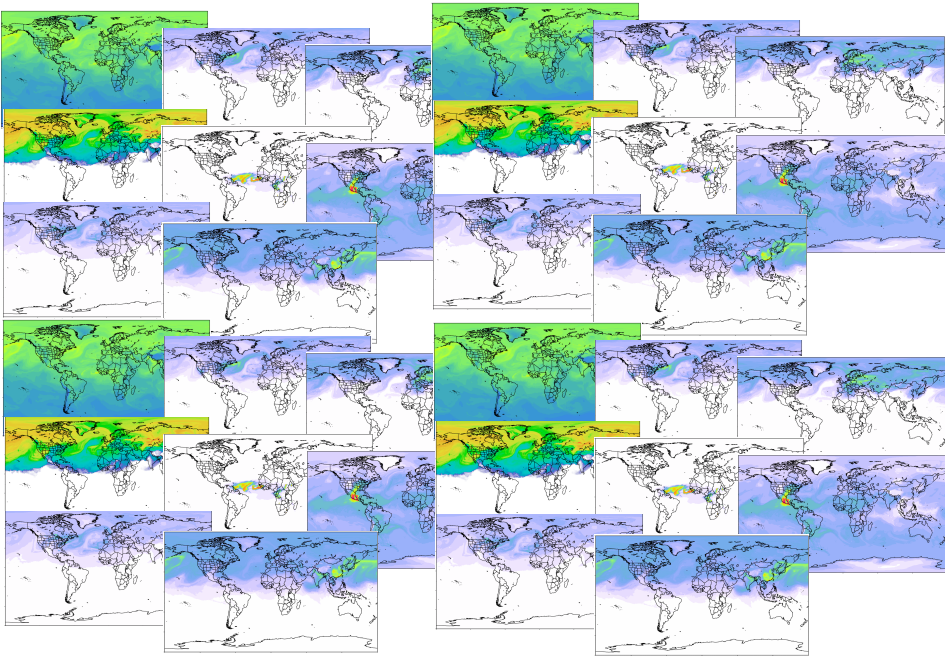
- Collaborative effort between (NASA GSFC, JPL, University of Oklahoma, Colorado State University)
- Funding for 2 years of preliminary activities focused on generating data products to support consistency of Carbon Cycle OSSE efforts:
  - GEOS Carbon Nature Runs
    - 50-km, 7-year GEOS-5 Carbon Nature Run (including CO, CO<sub>2</sub>, and CH<sub>4</sub>) simulating ~50 tracers that represent realistic carbon cycle perturbations
    - 14-km 2-year simulation representing limited number of tracers (ongoing)
  - Multi-sensor cloud probability dataset
  - Pseudo-datasets for generic passive and active LEO and passive GEO missions created by sampling the Nature Run using instrument simulator models
  - Baseline single instrument inversions (ongoing)
  - All data free and publicly available

# Scaling complexity of GEOS simulations, resolution

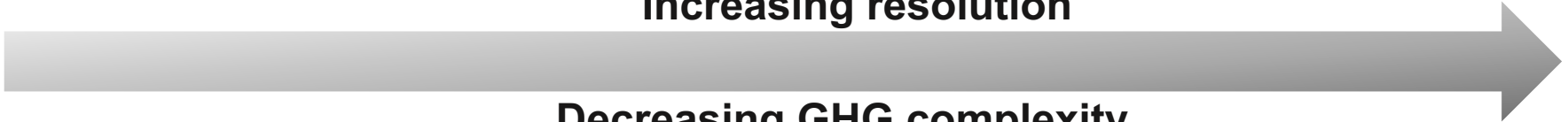
50 km – Supports large number of flux scenarios, use with existing reanalyses

14 km - Ability to model GHGs, aerosols, ozone photochemistry at urban relevant scales

3 km - Global cloud-resolving resolutions in support of retrievals OSSEs



Increasing resolution



Decreasing GHG complexity

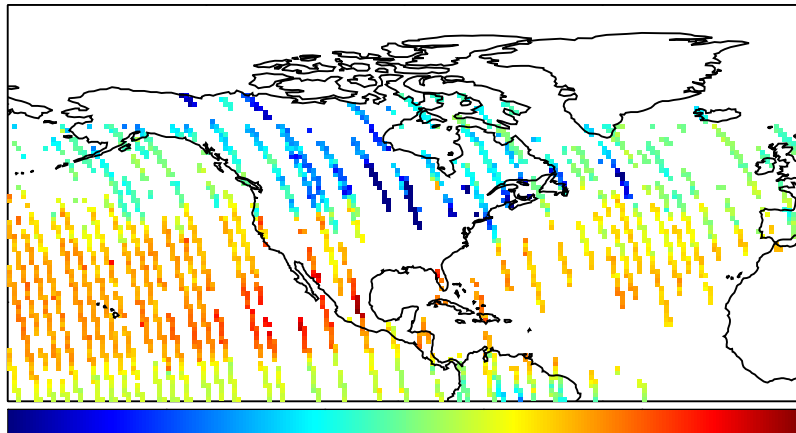
# Carbon OSSE Flux Change Scenarios

- Growing uncertainty in fossil fuel emissions, megacities
  - 25 tracers designed to cover a range of latitudes, cities with both growing and static emissions, city pairs in close proximity, and cities in challenging observing environments (e.g. coastal, near agricultural region)
- Response of Arctic/Boreal Zone to warming
  - Moderate and high emission scenarios based on CLM simulations of CO<sub>2</sub>, CH<sub>4</sub> (Koven et al., 2015)
- Mid-latitude carbon uptake / Tropical carbon uptake changes
  - Includes separate GPP and respiration tracers for 7 continental scale regions based on TRANSCOM region definitions (Gurney et al., 2003)
- Southern Ocean flux change
  - Uses two time-varying ocean flux estimates to assess ability to observe interannual sink variations
- Methane emission changes (anthropogenic and natural)
  - Tagged emissions from 7 wetland regions (Bloom et al., 2017), US fracking emissions (Maasackers et al., 2016), and biomass burning

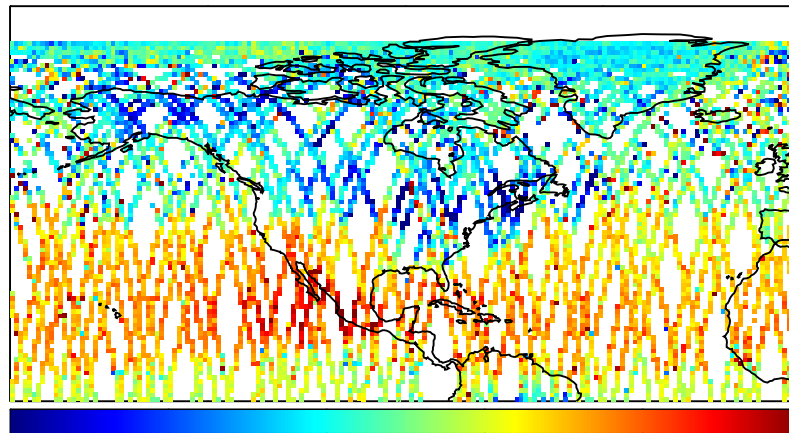
# Nature Run Sampling

- Pseudo-datasets created by sampling Carbon Nature Run fields at measurement locations, applying estimated averaging kernel
- Assumes only random errors, work on implementing biases due to aerosols, airmass, and surface reflectance
- Uses MERRA-2 cloud and aerosol statistics

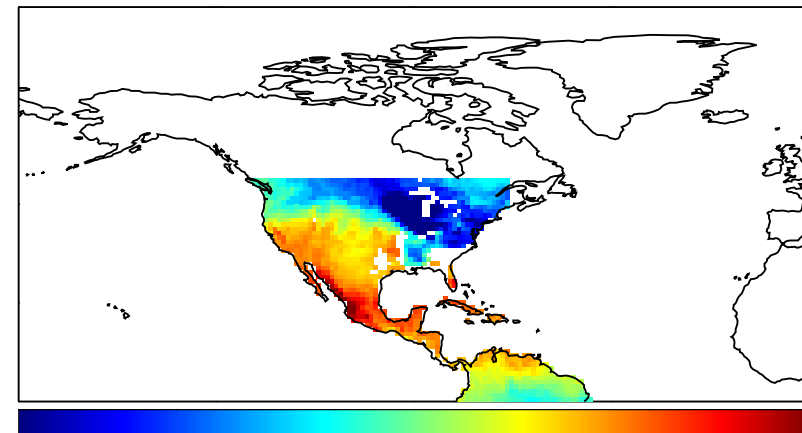
Passive LEO Mean XCO<sub>2</sub> (ppmv)



Active LEO Mean XCO<sub>2</sub> (ppmv)



Passive GEO Mean XCO<sub>2</sub> (ppmv)

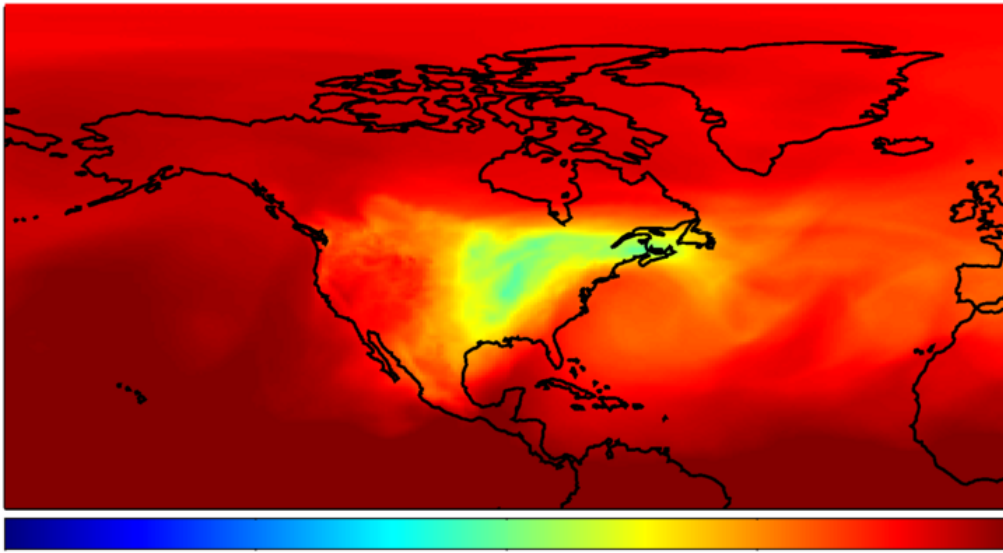


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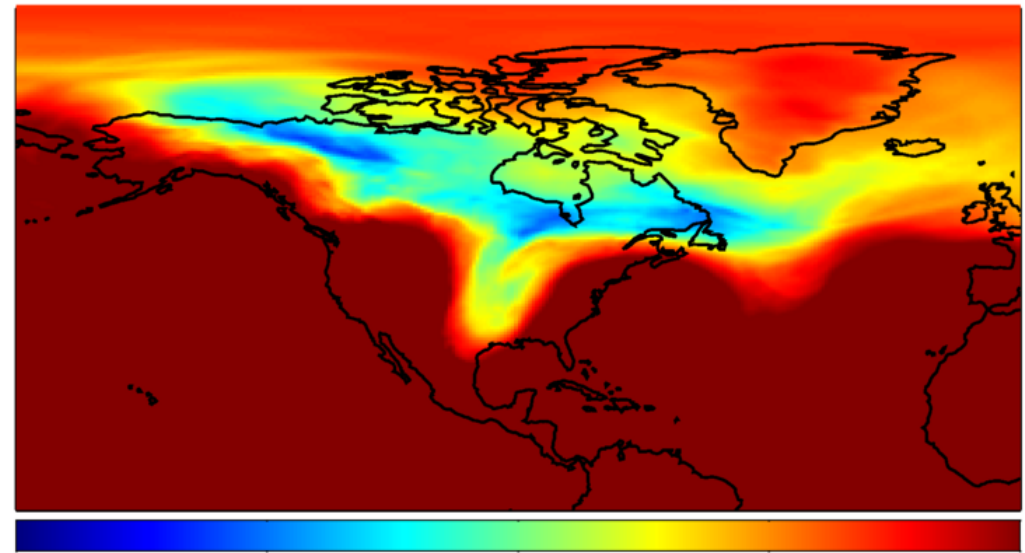
**Average of 7 days of simulated psuedo-data**

## Comparison of 1 Pg C Sink for Temperate, Boreal North America

Enhanced TNA Sink XCO<sub>2</sub> (ppmv)



Enhanced BNA Sink XCO<sub>2</sub> (ppmv)



-2.0      -1.5      -1.0      -0.5      0      -2.0      -1.5      -1.0      -0.5      0

- Imposing a smaller, more realistic 1 Pg C sink results in a smaller concentration signature ranging from 1-2 ppm
- The BNA perturbation has a larger impact on concentrations because it is applied over a smaller spatial area than TNA
- One week averages show that large flux differences can maintain coherence outside of the perturbation region



# Comparison of 1 Pg C Sink for Temperate, Boreal North America

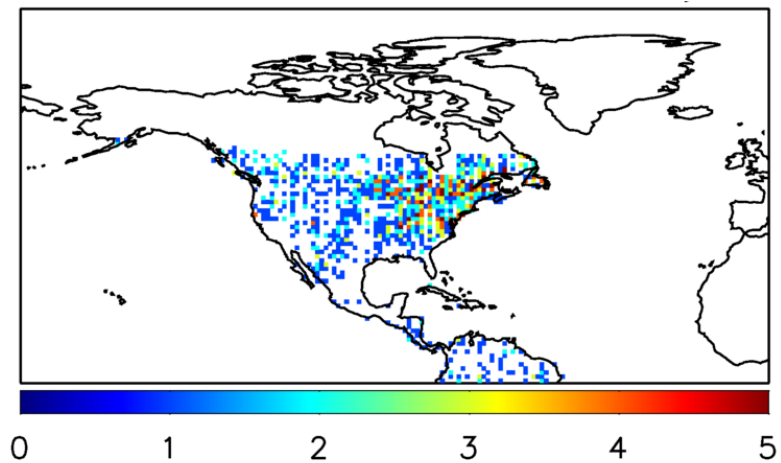
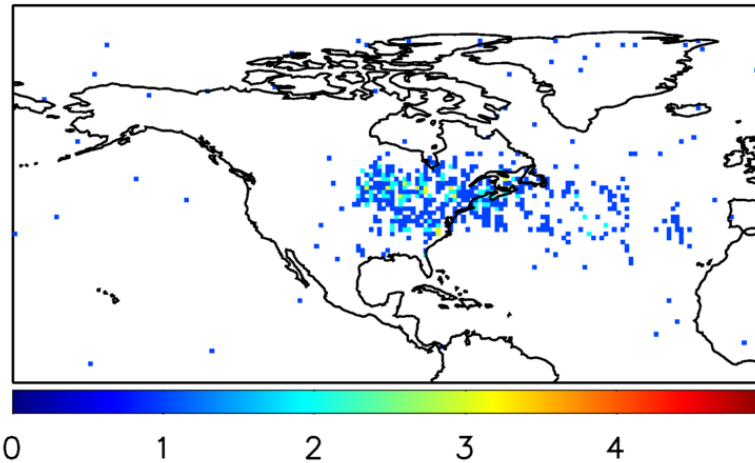
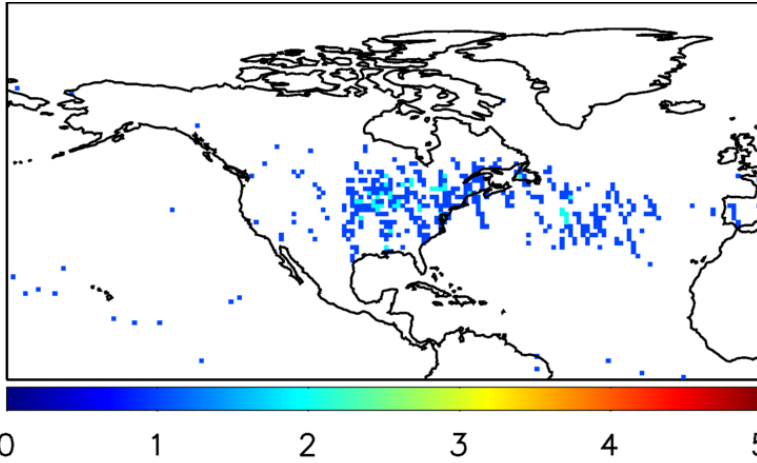
# days during 201307 where flux perturbation is detectable

Passive LEO

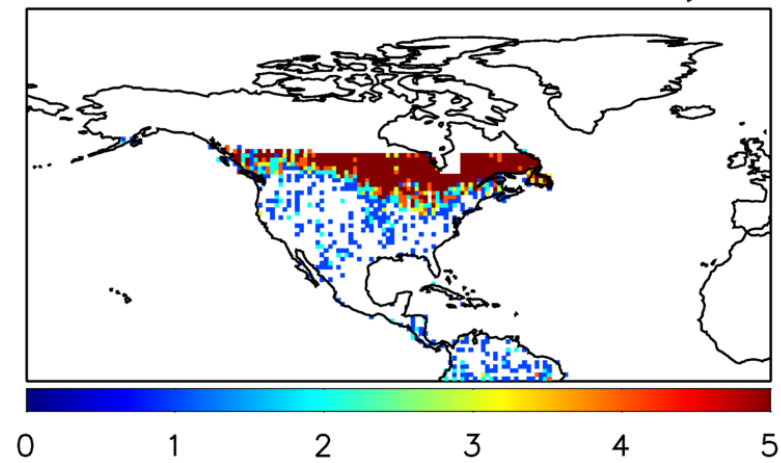
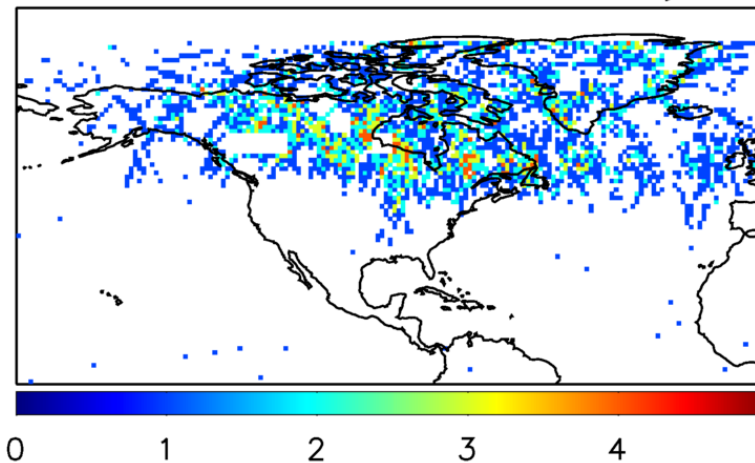
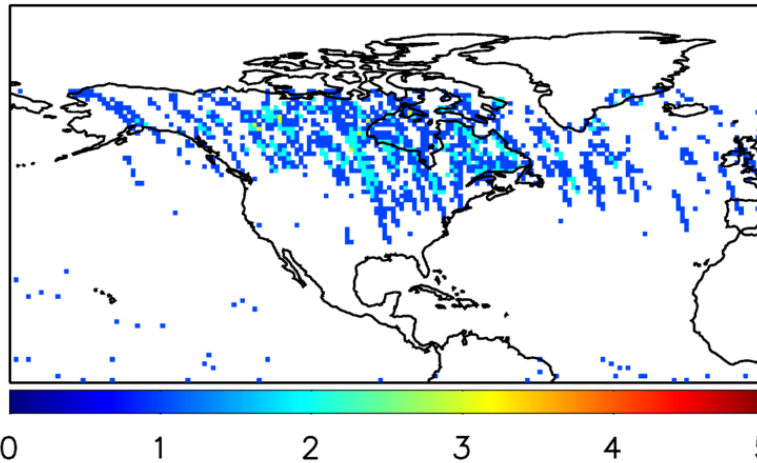
Active LEO

Passive GEO

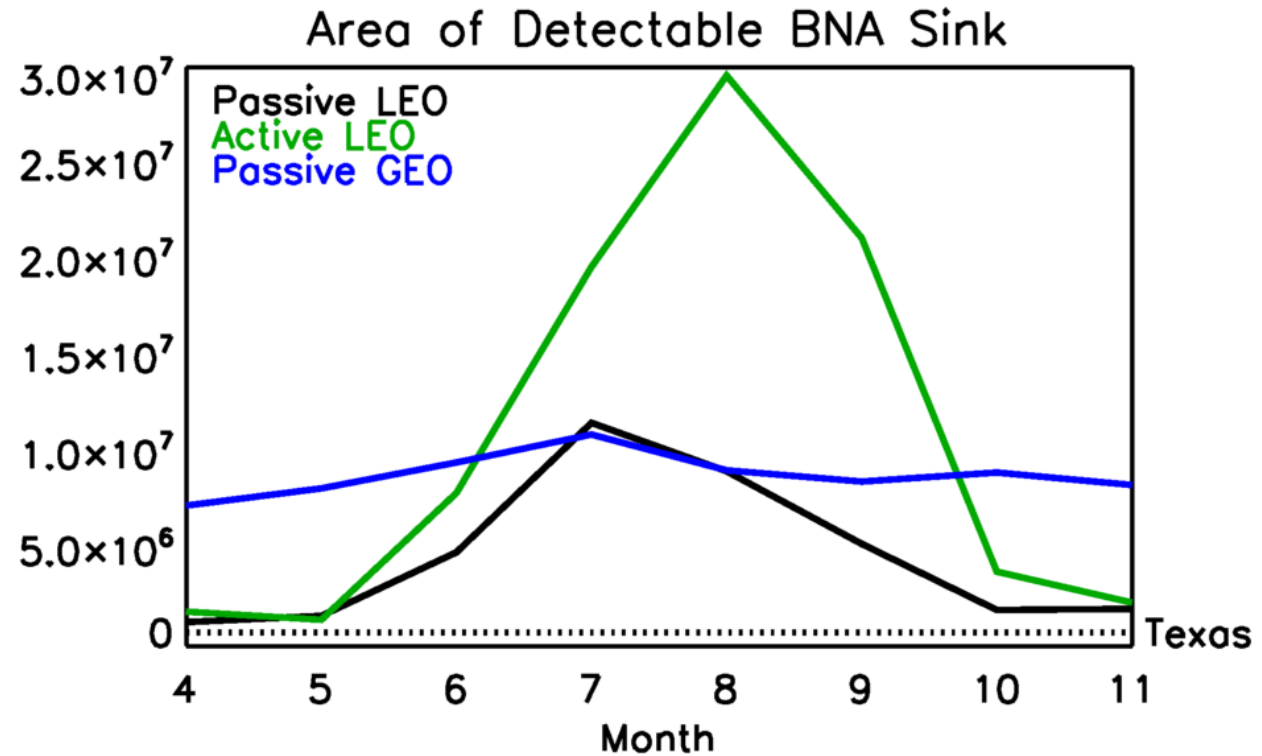
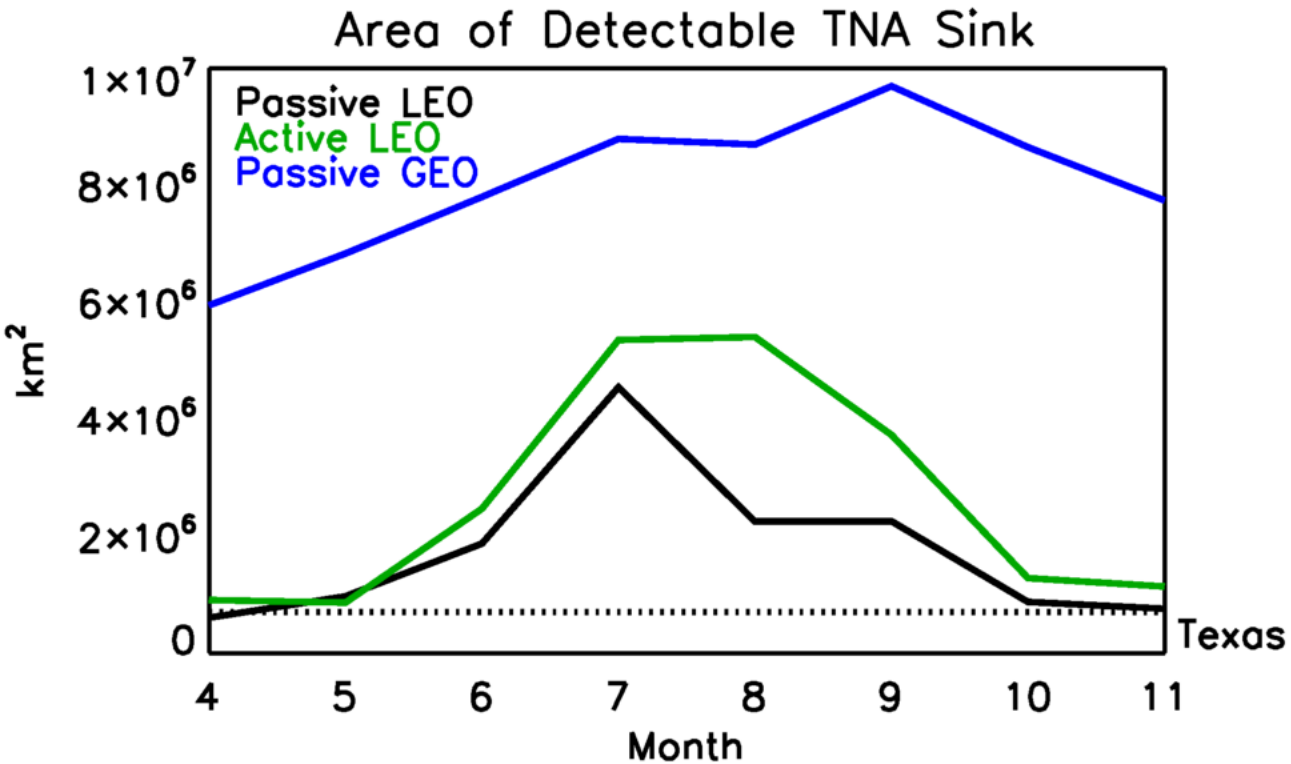
TNA Sink



BNA Sink

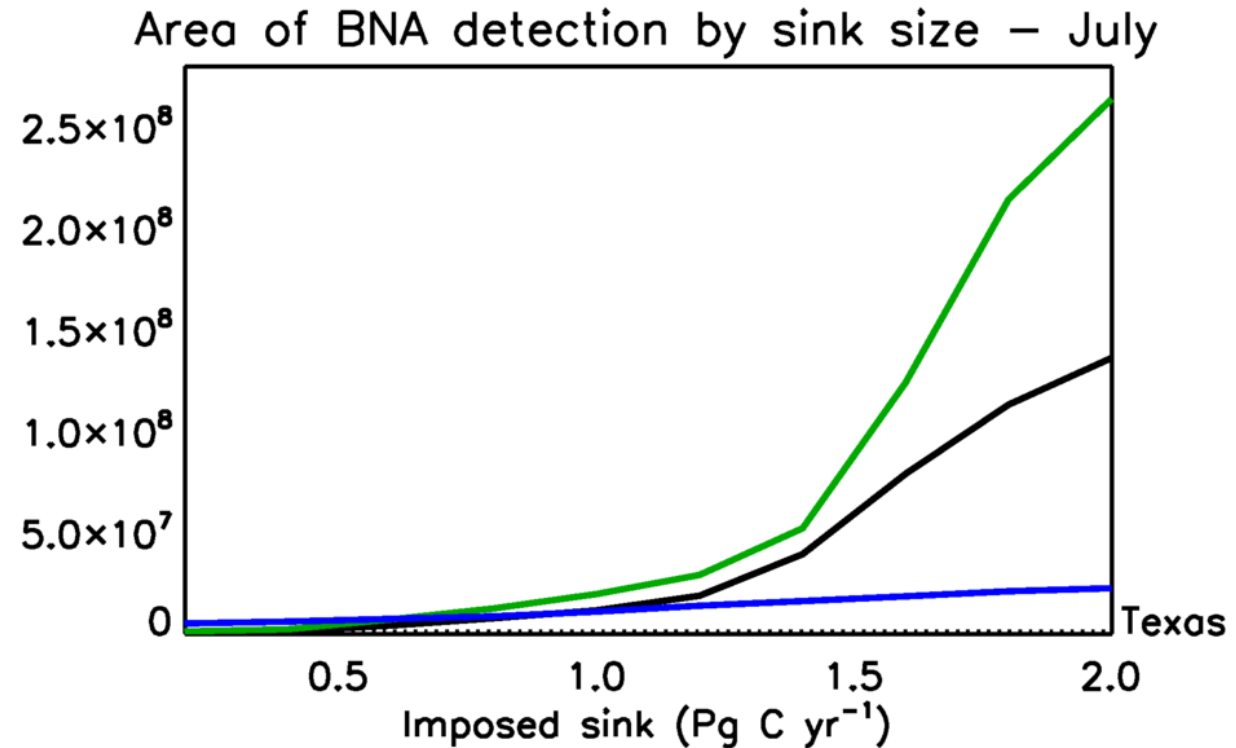
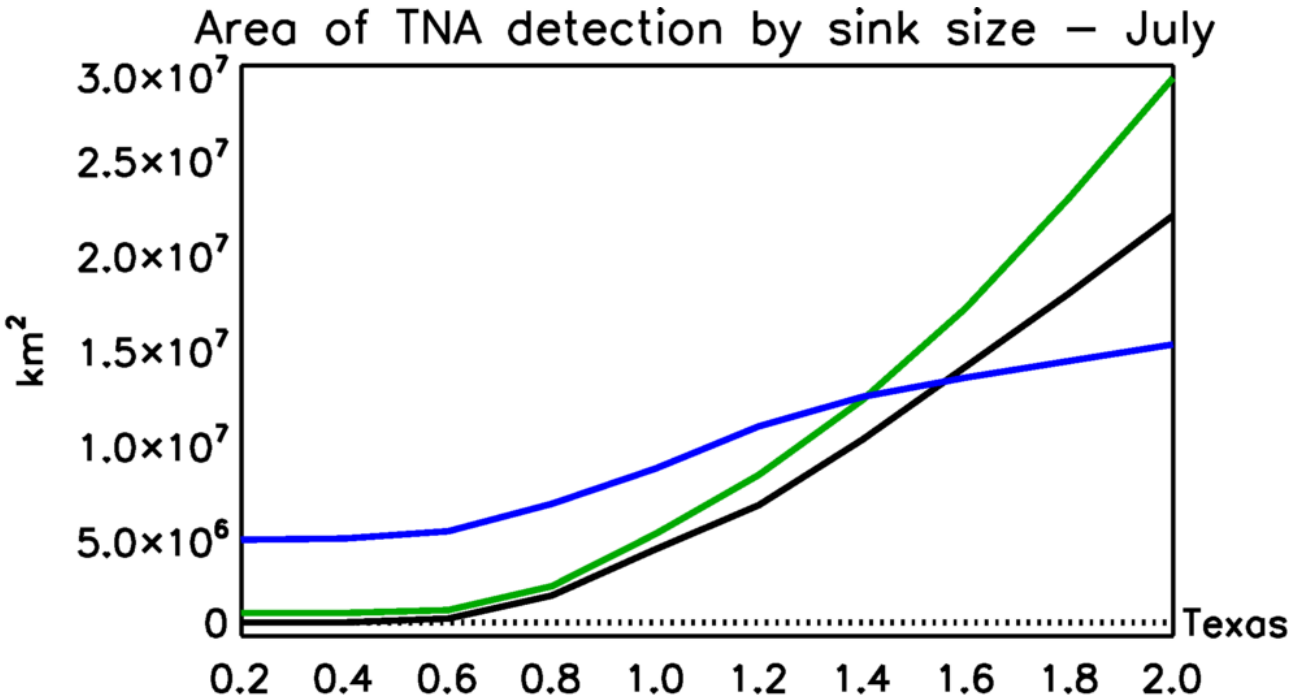


## Seasonal variations in detectable area



- Detectable area provides a simple metric for assessing the ability of different systems to observe flux changes
- This example shows how the area over which a flux perturbation is detected varies by season and observing system

## Variations in detectable area due to sink strength in July



Detectable area can also be used to examine how well different systems observe flux perturbations of different magnitudes



## Ongoing Work

- Working on documenting these datasets and releasing publicly
- Producing ensemble of single instrument inverse flux estimates for biosphere flux scenarios
- Moving from 50 to 14-km nature run to explore urban cases, aerosol influence

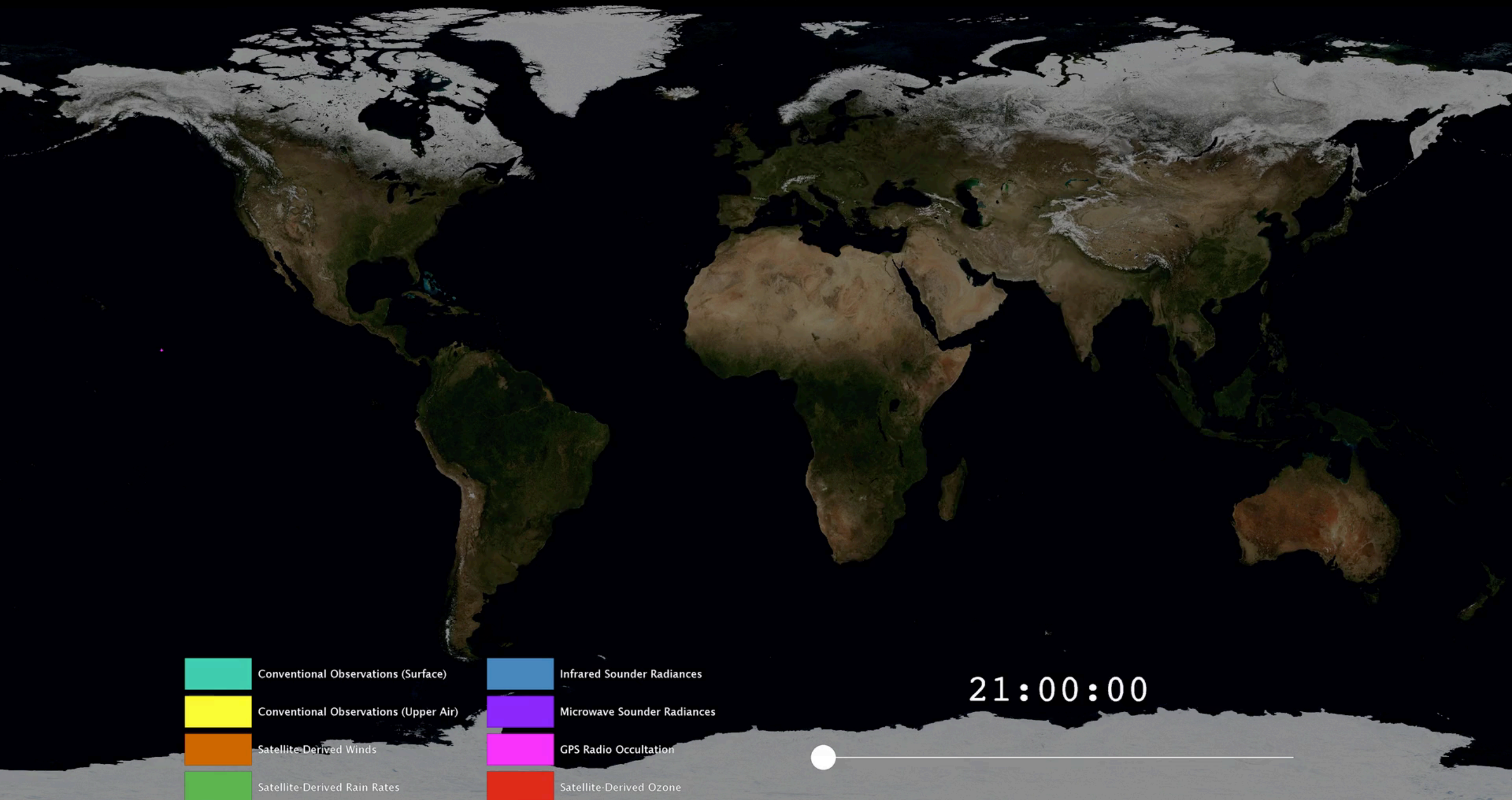
## Future OSSE Needs

- Need framework for assessing the benefit of other trace gas measurements (CO, NO<sub>2</sub>)
- Move toward retrieval OSSEs for GHGs to more realistically represent measurement errors
- Need a better way for representing transport error influence – could be addressed through coordinated nature run efforts
- Develop ability to assess how new satellites fit into the GHG constellation





All Observations



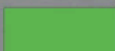
Conventional Observations (Surface)



Conventional Observations (Upper Air)



Satellite-Derived Winds



Satellite-Derived Rain Rates



Infrared Sounder Radiances



Microwave Sounder Radiances



GPS Radio Occultation



Satellite-Derived Ozone

21:00:00

