



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

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## Previous GHG OSSE efforts

- 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 are subject to significant methodological weaknesses:
  - 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
  - Lack of maturity of inverse models makes it tough to separate weaknesses in satellite from weaknesses in model



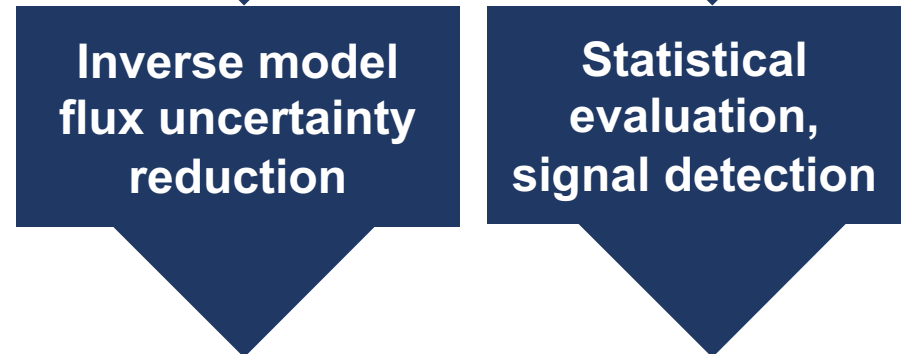
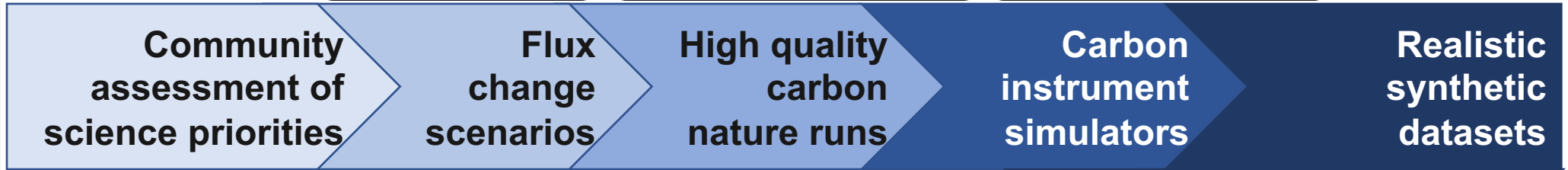
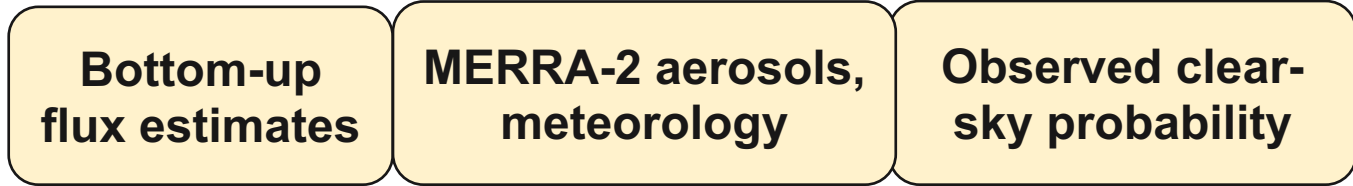
# Need for integrated OSSE system design to support future missions, advanced capabilities

Leverage existing observationally-derived products

Produce new datasets in support of US, international OSSE efforts

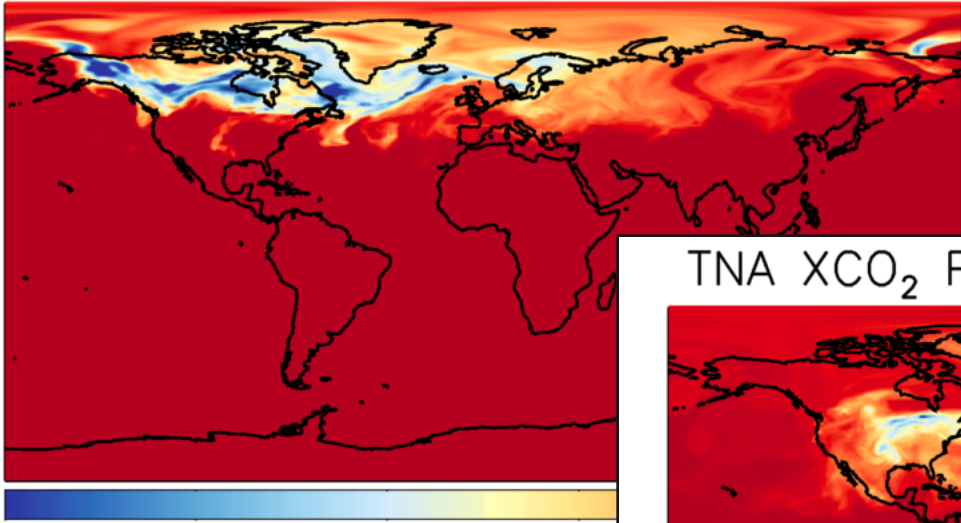
Implement new metrics for assessing missions

Improve ability to deliver missions that fill key data, knowledge gaps



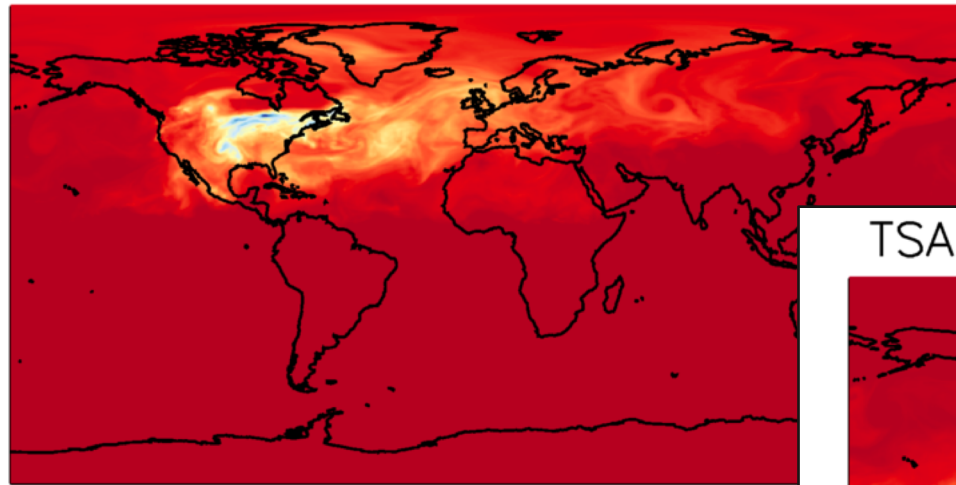
# GEOS tagged tracer approach supports simultaneous analysis of multiple emission scenarios

BNA XCO<sub>2</sub> Pert. (ppmv) – 20130715



-1.0 -0.8 -0.6 -0.4

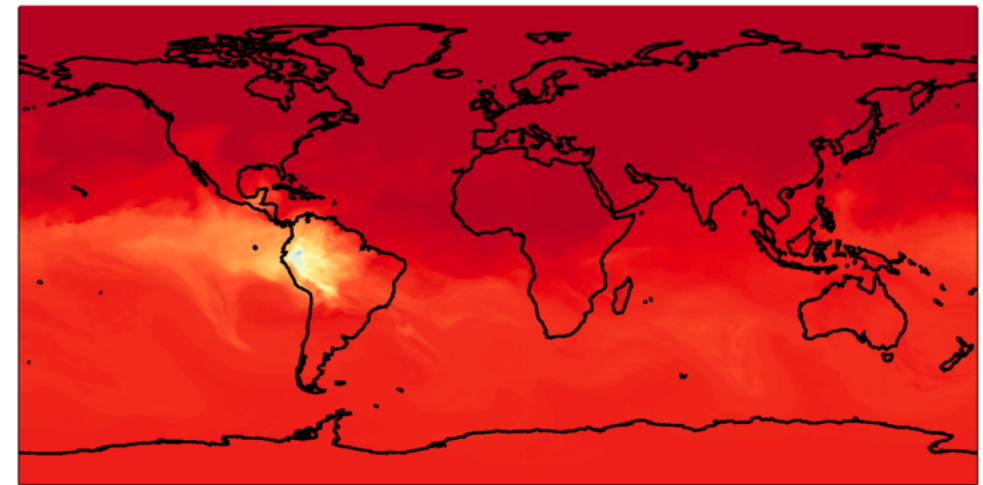
TNA XCO<sub>2</sub> Pert. (ppmv) – 20130715



-1.0 -0.8 -0.6 -0.4 -0.

Example of a 0.5 Pg C sink applied to American regions

TSA XCO<sub>2</sub> Pert. (ppmv) – 20130715



-1.0 -0.8 -0.6 -0.4 -0.2 0.0

Current library of simulations includes dozens of regional biosphere and fossil fuel tracers



# Building up instrument simulator infrastructure

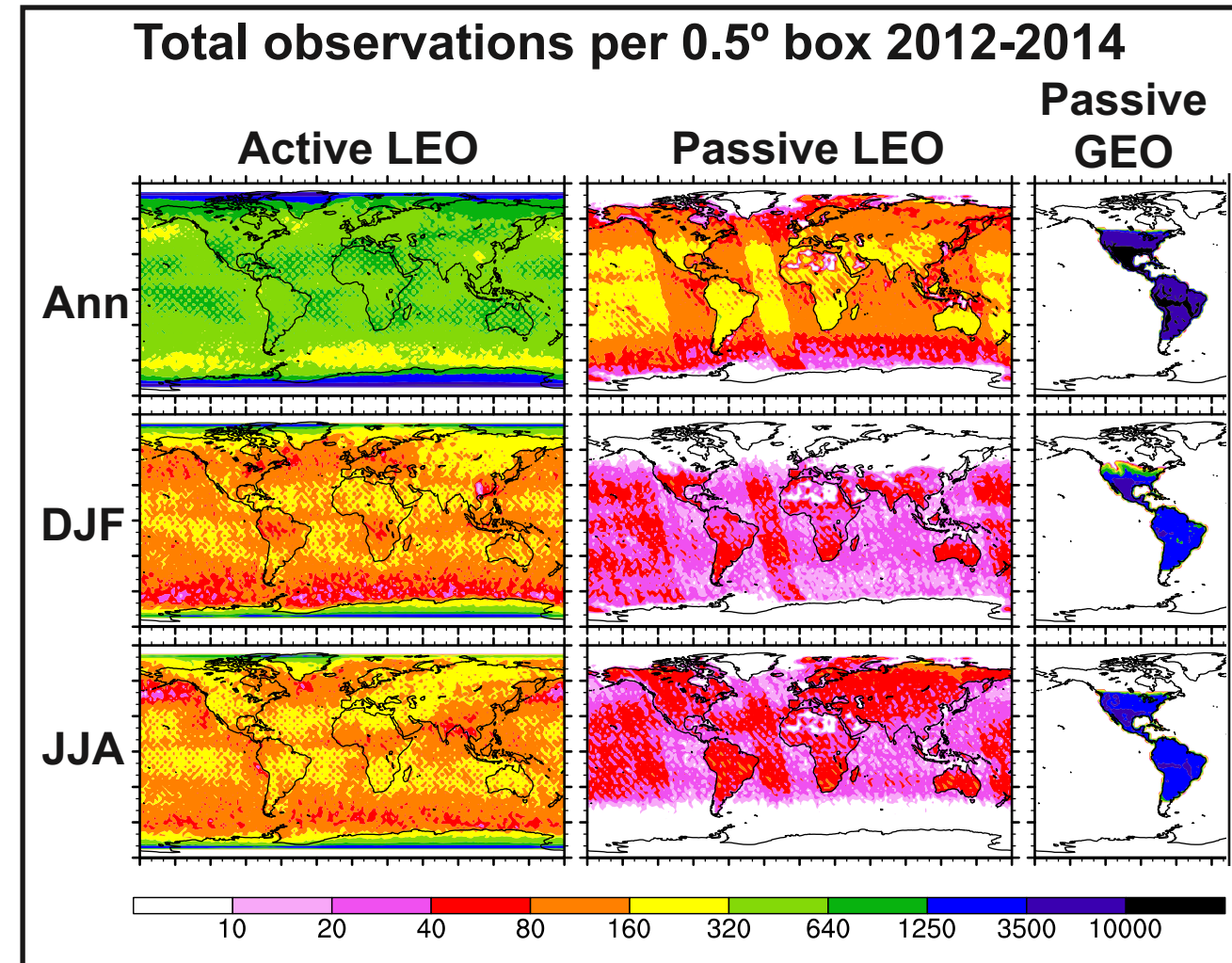
Two classes of instrument simulators

Economy class:

- Model sampled at measurement locations to produce XCO<sub>2</sub>
- Simple screening based on clouds, aerosols, albedo, solar zenith angle
- Random and systematic errors based on current missions, aircraft observations

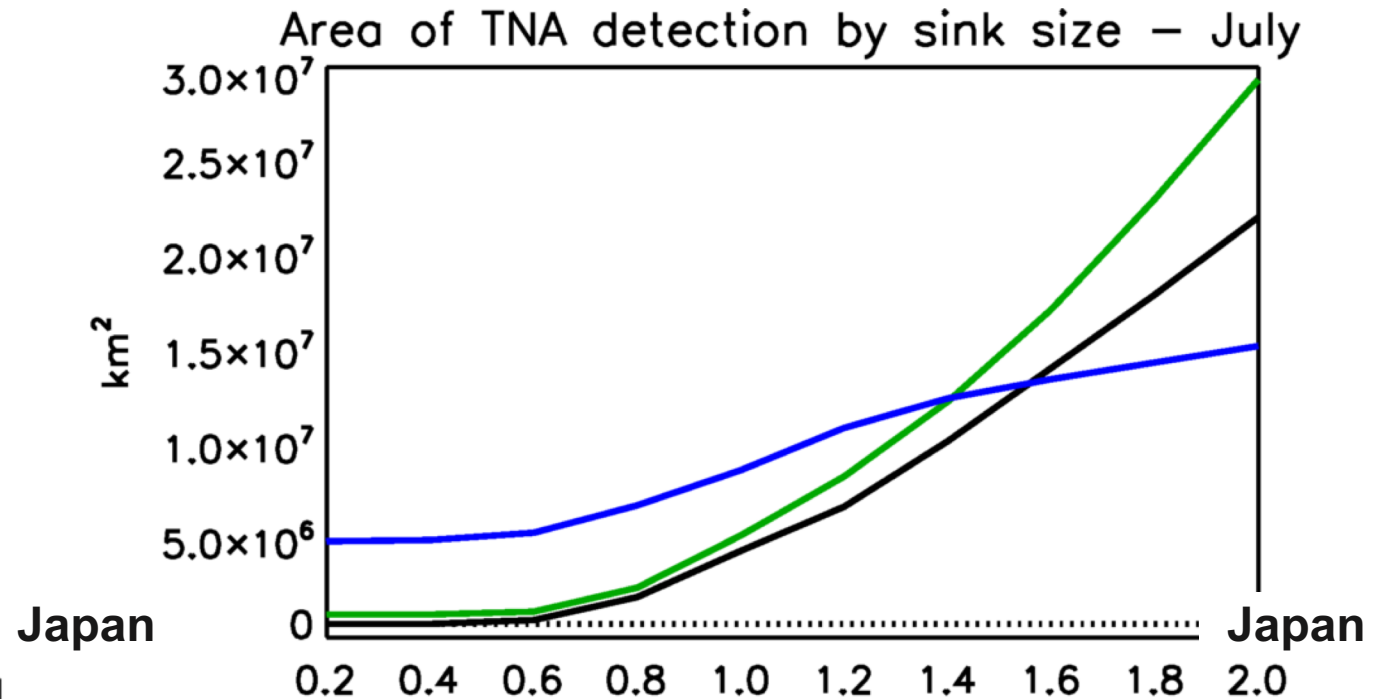
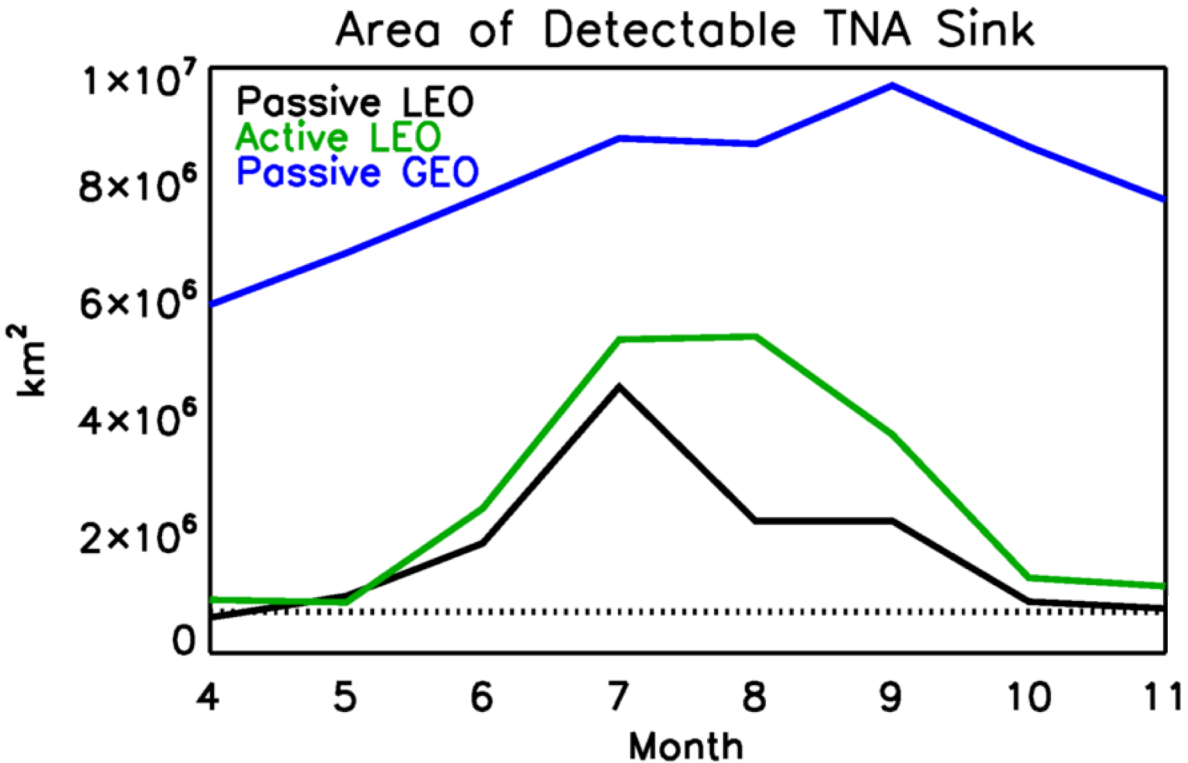
Business class:

- Simulate L1 radiances from model data
- Use actual retrieval algorithm to estimate XCO<sub>2</sub>



**Most of the time we're in economy, but we're really trying to get closer to business**

## Examples of signal detection: how the picture of a detectable sink changes by season and size



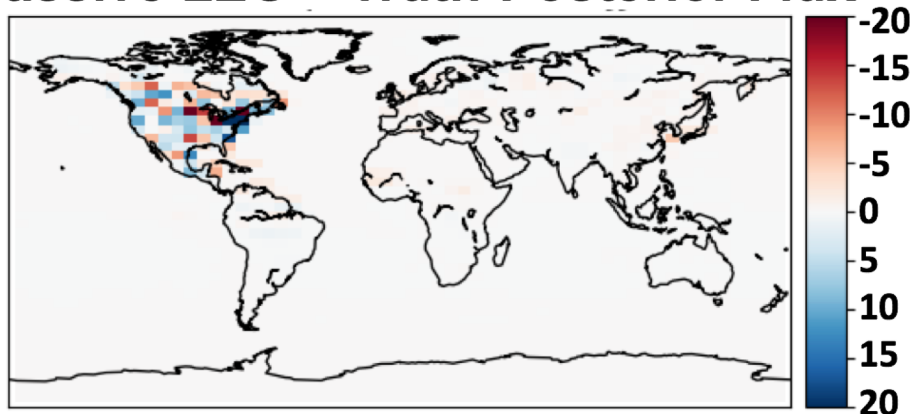
- ‘Detectable area’ – area over which the difference between the baseline and perturbation would be larger than the variance of simulated measurements
- This example shows how the area over which a flux perturbation is detected varies by season (for a 1 PgC sink) and sink size for each observing system

# Examples of inverse model evaluation: need for constellation observing

True TNA flux perturbation – JJA  
( $\mu\text{C m}^{-2} \text{ yr}^{-1}$ )



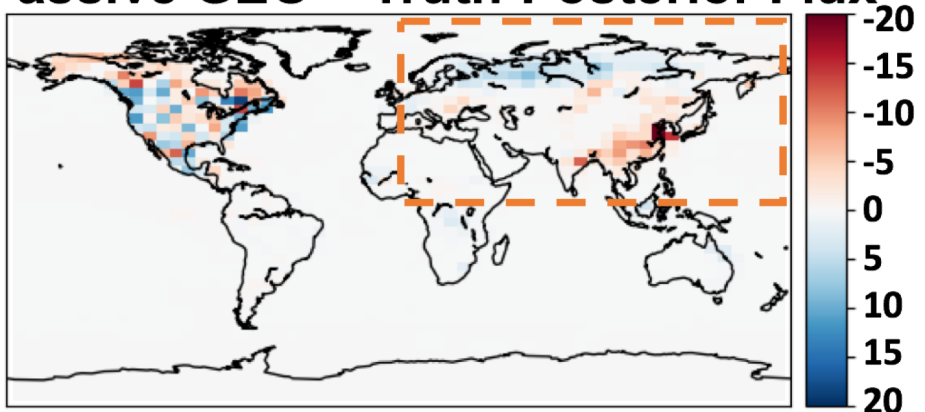
Passive LEO – Truth-Posterior Flux



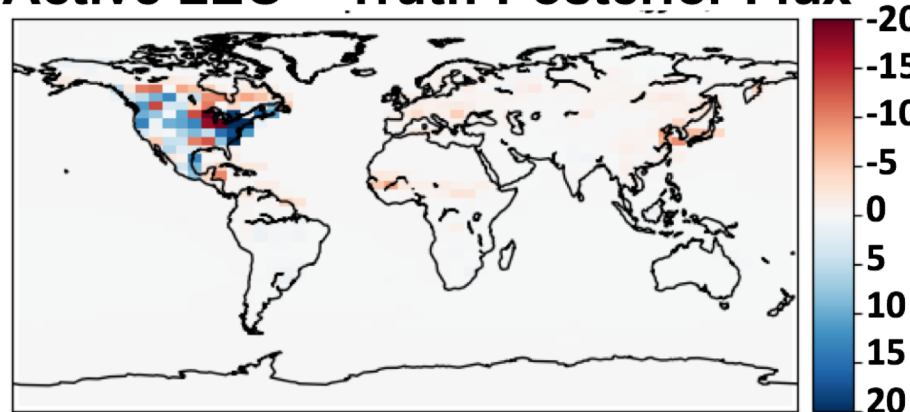
Parallel inverse experiments attempting to retrieve 0.2 PgC sink over NA:

- Random error only
- Perfect transport
- 50% prior uncertainty globally

Passive GEO – Truth-Posterior Flux



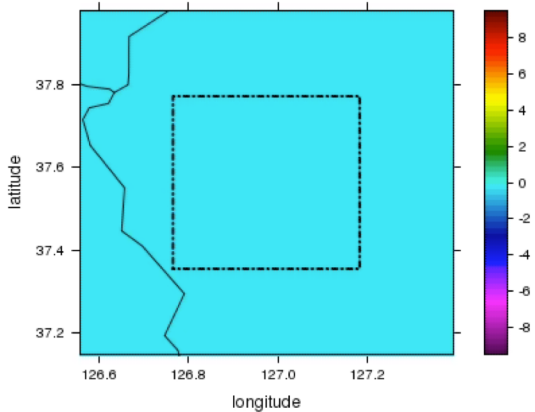
Active LEO – Truth-Posterior Flux



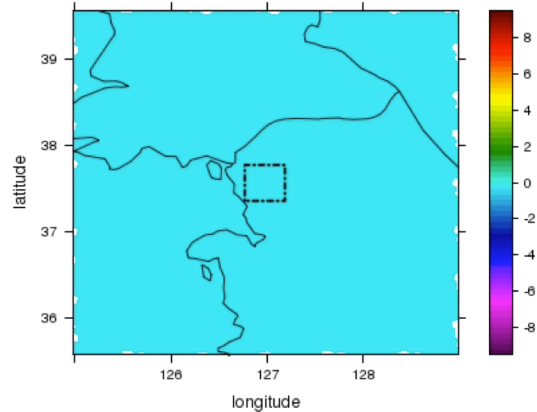
**All missions succeed in identifying sink region, but GEO inversion creates spurious sources, sinks**

# Examining global cities using a global, variable resolution model: Example from Seoul, Korea

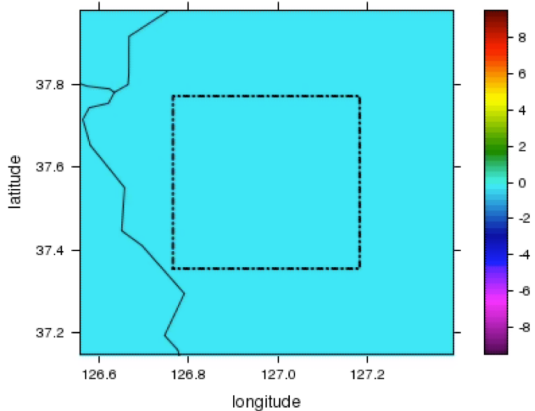
ODIAC FOSSIL TRACER (Refined-Zoom) 2015-08-01 01:00:00



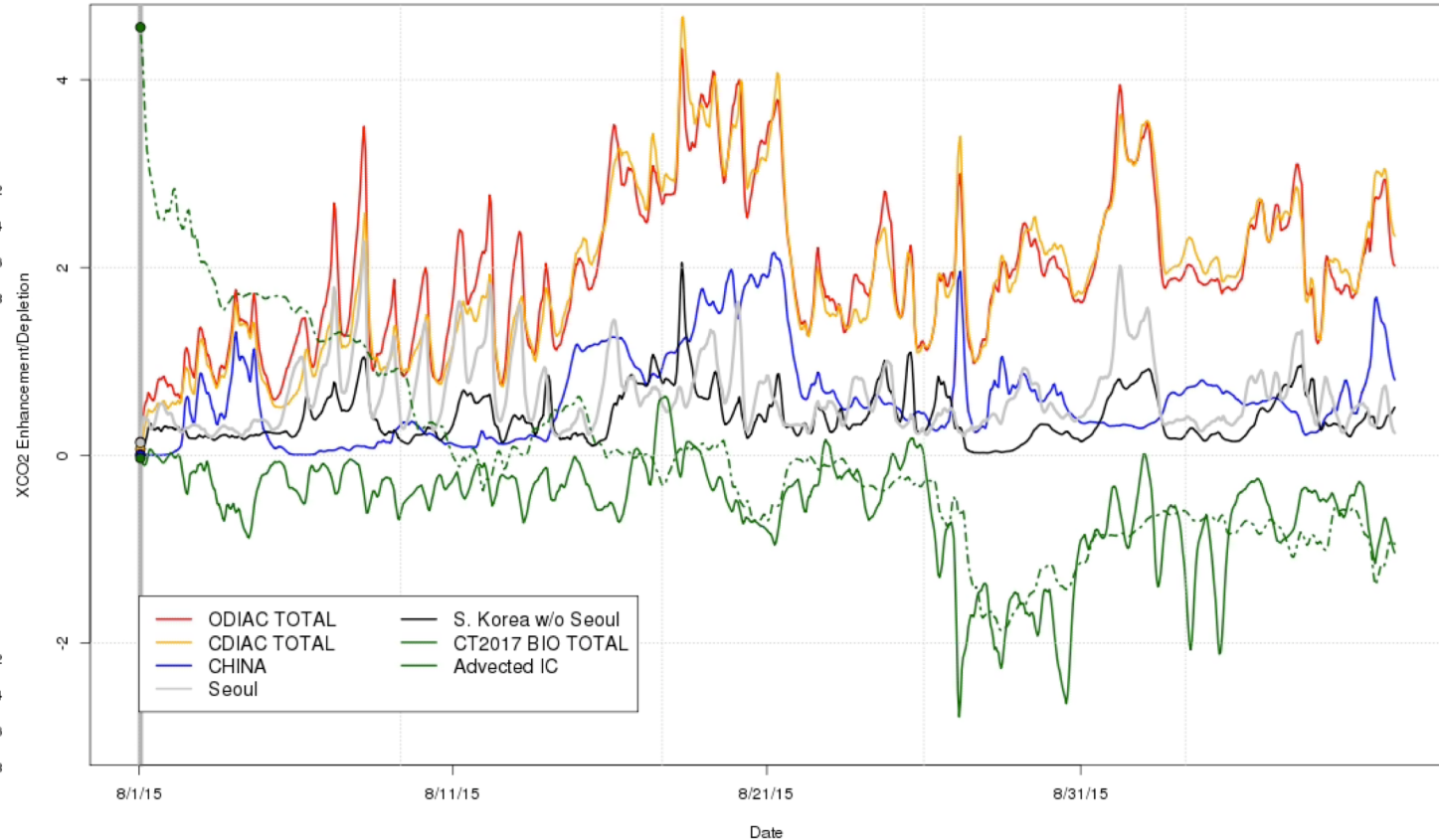
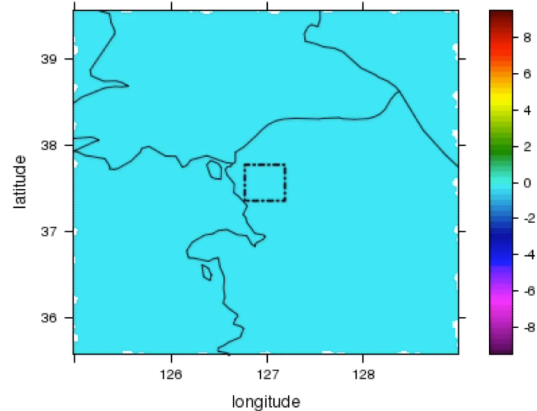
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CT2016 BIO TRACER (Refined-Zoom) 2015-08-01 01:00:00



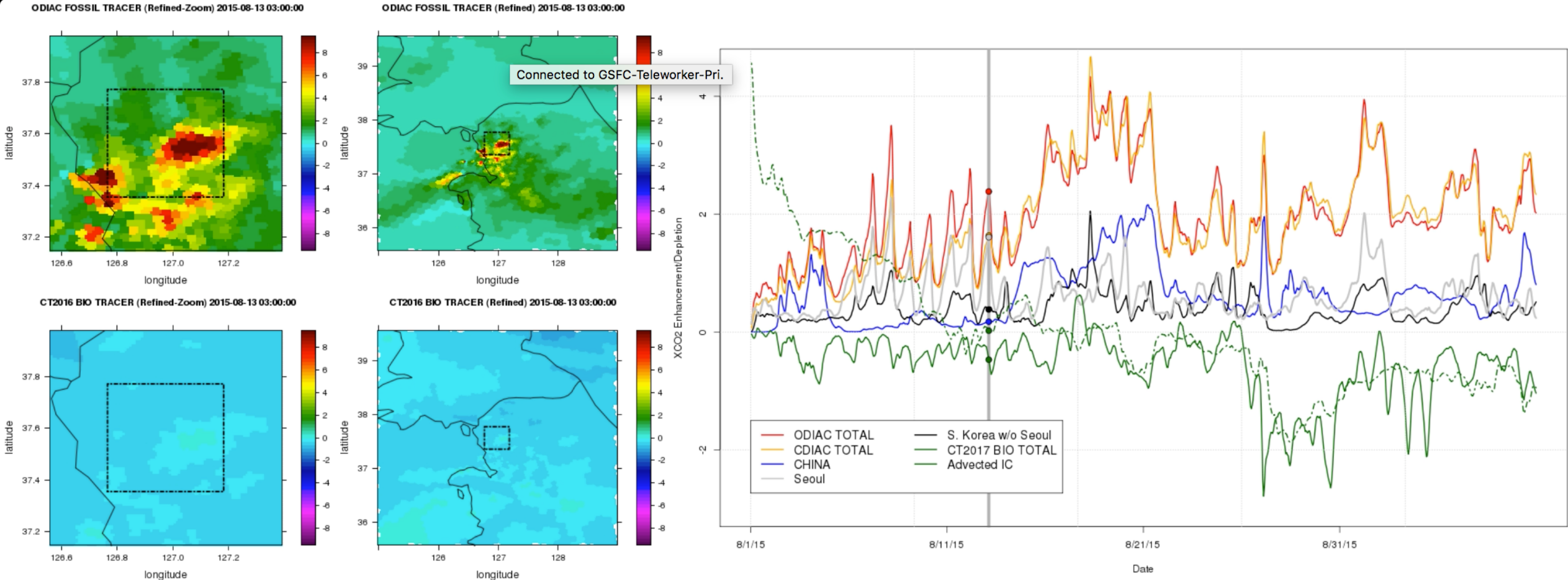
CT2016 BIO TRACER (Refined) 2015-08-01 01:00:00



**Tagged tracers + variable resolution supports evaluation of dozens of cities simultaneously**



# Examining global cities using a global, variable resolution model (backup)



**Tagged tracers + variable resolution supports evaluation of dozens of cities simultaneously**

# Moving toward a more complete evaluation of observing approaches

				Ability to address science requirements	A	B	C	
Observing realistic time and space gradients	A	B	C	Ability to detect small bio perturbation	X	✓	X	
				Ability to detect large bio perturbation	✓	✓	✓	
				Ability to differentiate nearby bio perturbations	--	✓	--	
	Latitudinal gradients	--	--	✓	Ability to observe urban emissions (small-medium)	X	✓	X
	Longitudinal gradients	✓	--	✓	Ability to observe urban emissions (large)	--	✓	--
	Seasonal cycle (phase and amplitude)	✓	✓	✓	Sensitivity in key regions - Arctic	X	X	✓
					Sensitivity in key regions - Amazon	X	✓	--
					Sensitivity in key regions – Southern Ocean	X	X	--
	Vertical information	--	--	--	Ability to improve inverse estimate in perturbed area	✓	✓	✓
	Information content	--	✓	✓	Ability to improve inverse est. in unperturbed area	✓	--	✓
				Ability to improve inverse estimate globally (land)	✓	--	✓	
				Ability to improve inverse estimate globally (ocean)	--	X	✓	



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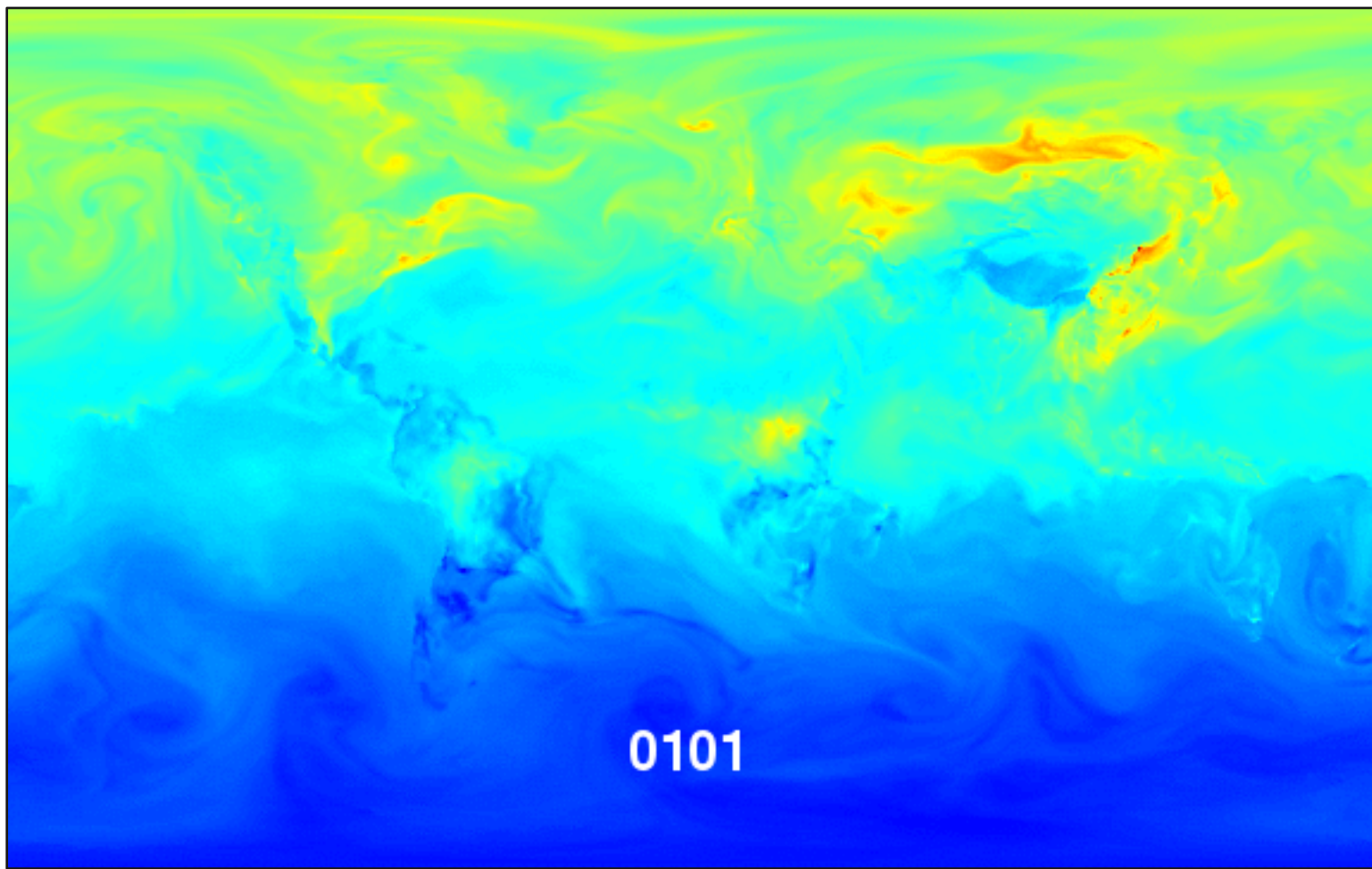
				Ability to address science requirements	A	B	C
Observing realistic time and space gradients	A	B	C	Ability to detect small bio perturbation	X	✓	X
Latitudinal gradients	--	--	✓	Ability to detect large bio perturbation	✓	✓	✓
Longitudinal gradients	✓	--	✓	Ability to differentiate nearby bio perturbations	--	✓	--
Seasonal cycle (phase and amplitude)	✓	✓	✓	Ability to observe urban emissions (small-medium)	X	✓	X
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Information content	--	✓	✓	Sensitivity in key regions - Arctic	X	X	✓
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				Ability to improve inverse est. in unperturbed area	✓	--	✓
				Ability to improve inverse estimate globally (land)	✓	--	✓
				Ability to improve inverse estimate globally (ocean)	--	X	✓

## Summary and conclusions

- Collaboration between universities, NASA centers has helped to standardize datasets, expand metrics used to evaluate new satellite missions
- Much progress on building infrastructure that we need to 'harden' inversion systems, but lots more left to do
- Urgent need to develop techniques that combine multiple satellite datasets

### Opportunities for collaboration:

- **Realistic prior flux errors**
- **Better information on systematic errors**
- **Better assessment of transport model errors**



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