



**Jet Propulsion Laboratory**  
California Institute of Technology

# Progress in Understanding the Natural Carbon Cycle with Remote Sensing CO<sub>2</sub> Observations

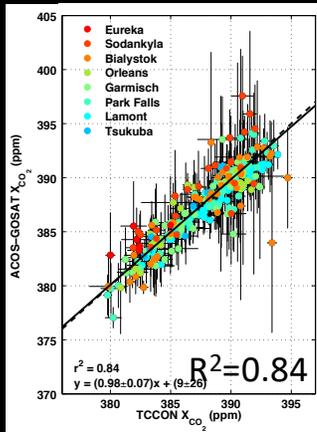
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# Steady Improvement in $X_{CO_2}$ Retrievals

ACOS-GOSAT v2.9



OCO-2

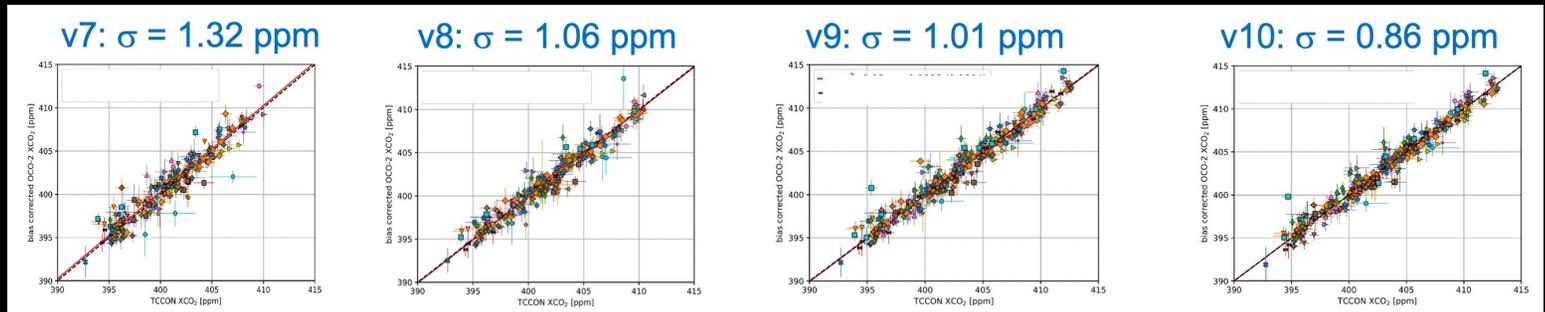
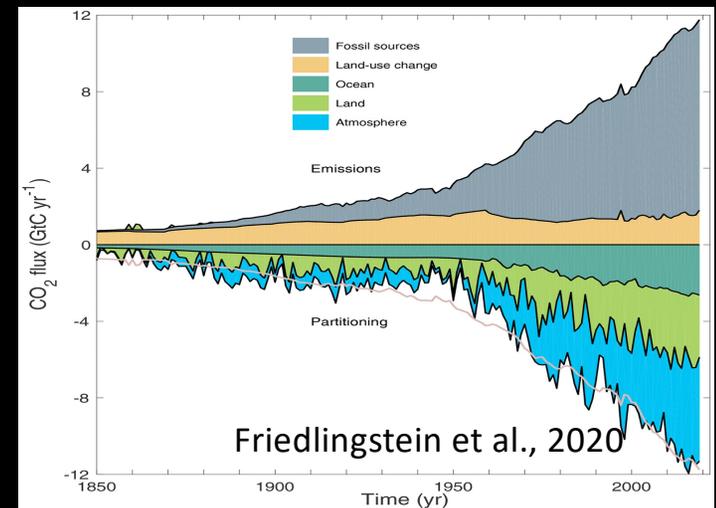


Figure Courtesy: M. Kiel and C. O'Dell

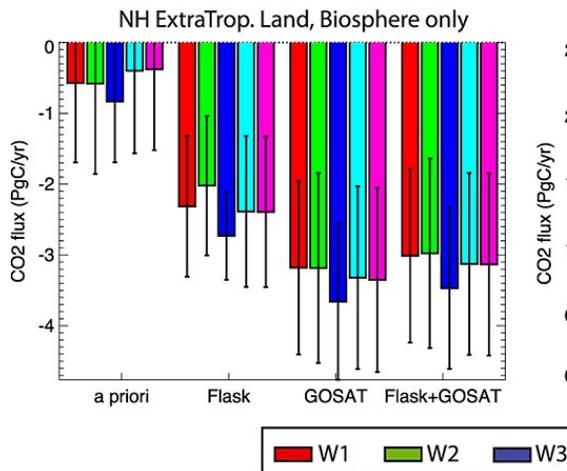
Wunch et al., 2011

- Natural Carbon Sink has Offset more than 50% of Anthropogenic Emissions so far;
- **How much progress have been made in understanding the terrestrial biosphere carbon cycle with remote sensing  $CO_2$  observations?**
- **What are the challenges and opportunities ahead ?**



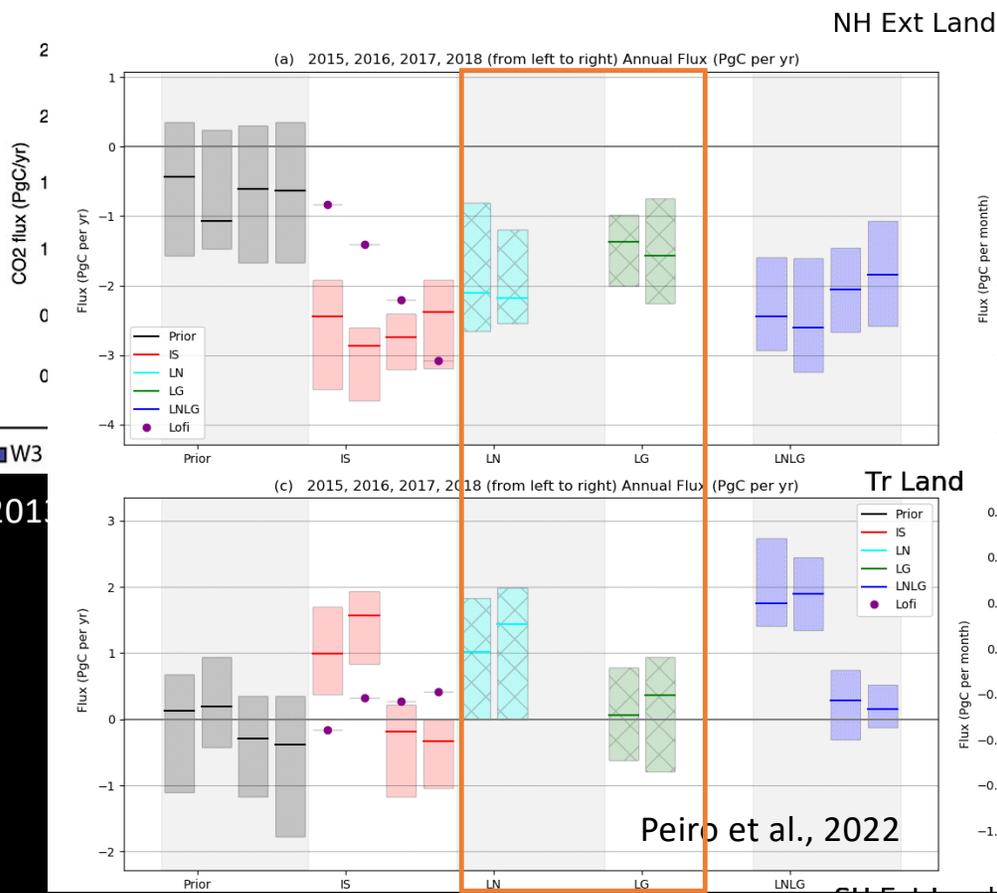
Friedlingstein et al., 2020

# Hemispheric Flux Estimation

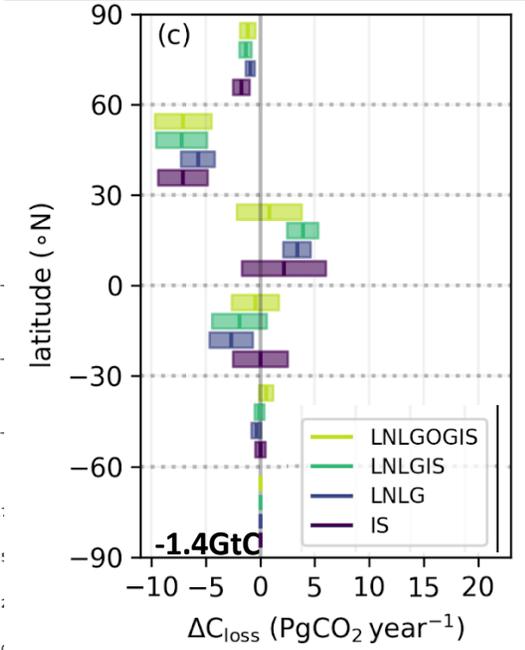


Houweling et al., 2011

- ~1GtC difference in NH Extra Trop and Tropical fluxes between flask and GOSAT inversions;
- Uncertainty is more than 1.0 GtC;



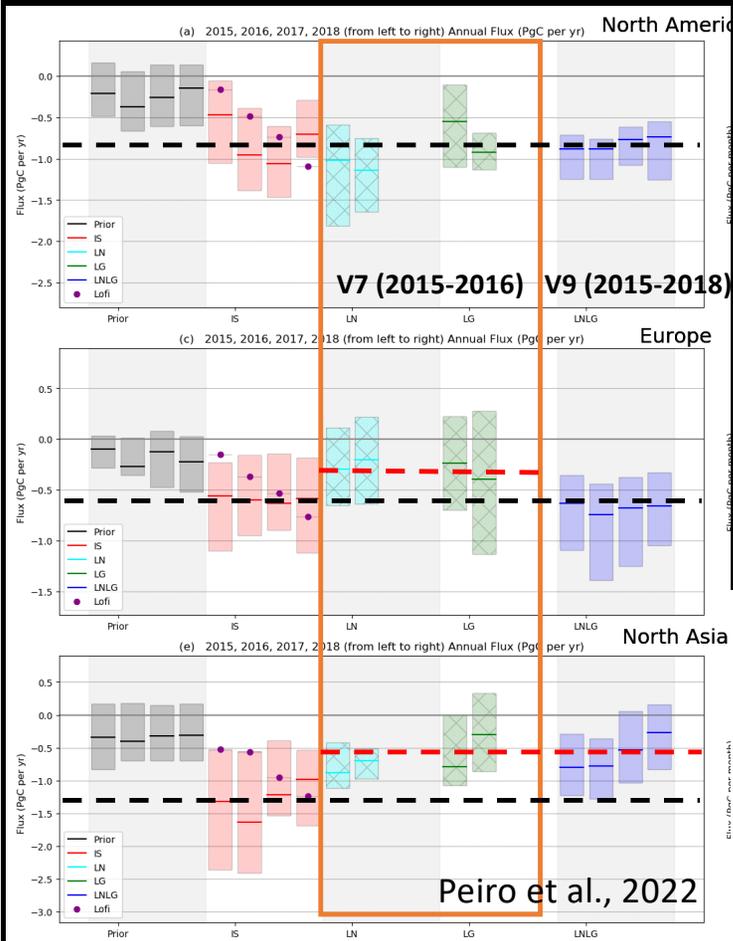
- Difference between IS and OCO-2 v9 is ~0.5 GtC over tropics;
- Uncertainty becomes smaller from V7 to V9;



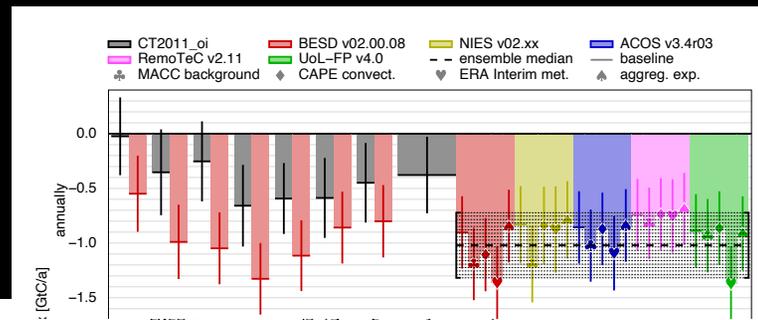
**V10 (6 years)**  
Byrne et al., 2022

- $\Delta C$  includes lateral C transport;
- Difference between IS and LNLGIS is less than 0.5GtC in NH Ext land, ~0.5 GtC in tropical latitude bands;

# Regional Flux Estimation

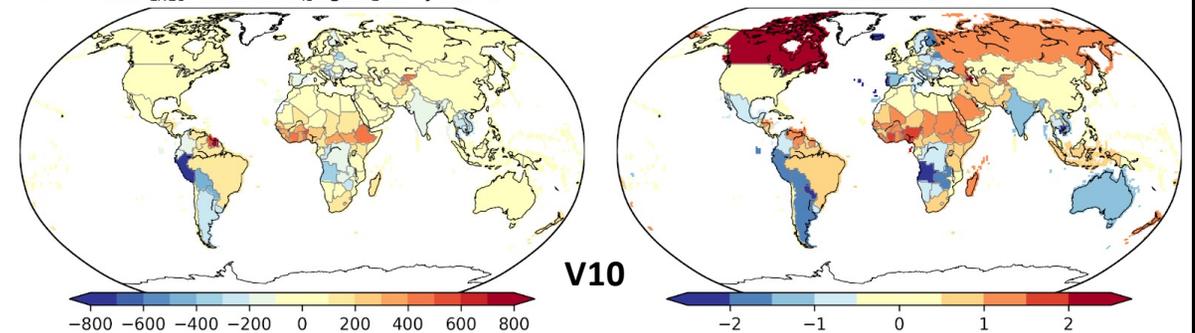


- The flux estimation over Europe becomes more consistent with IS-based inversions from v7 to v9 OCO-MIP inversions, different from results based on early GOSAT retrievals. North Asia shows weaker sink based on satellite XCO<sub>2</sub>.
- Statistically different flux estimates over small countries over the tropics and high latitudes in V9 OCO-MIP inversions.



Reuter et al., 2014

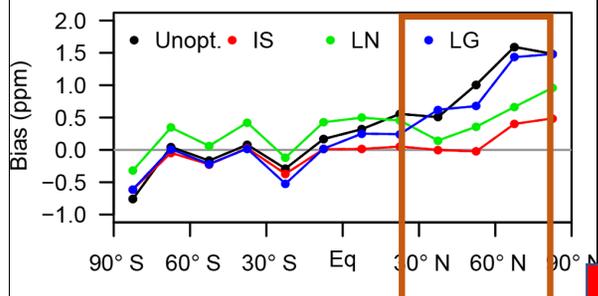
Z statistic



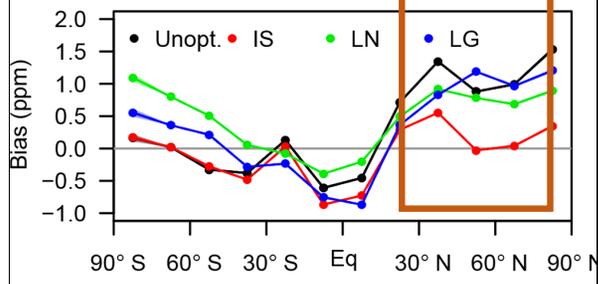
# Evaluation against Independent Observations

V7

(a) Bias for PBL



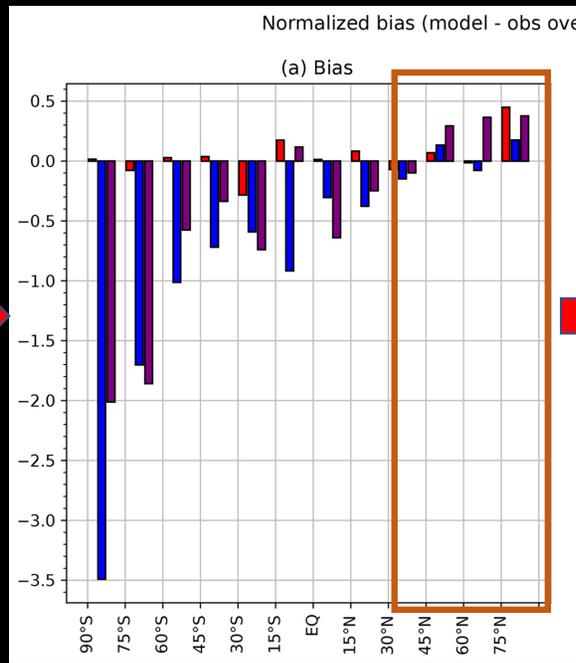
(c) Bias for aircraft below 3000 m



Crowell et al., 2019

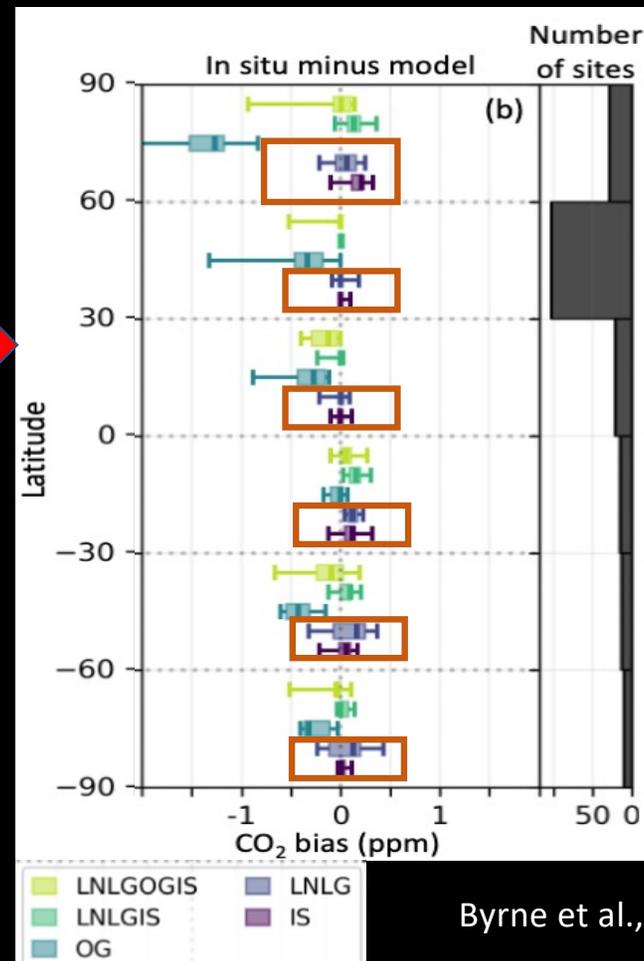
V9

Normalized bias (model - obs over)



Peiro et al., 2022

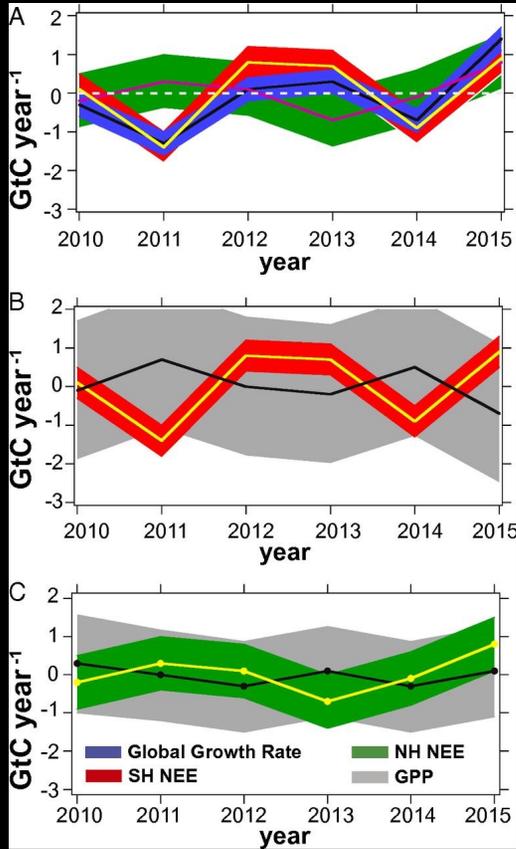
V10



Byrne et al., 2022

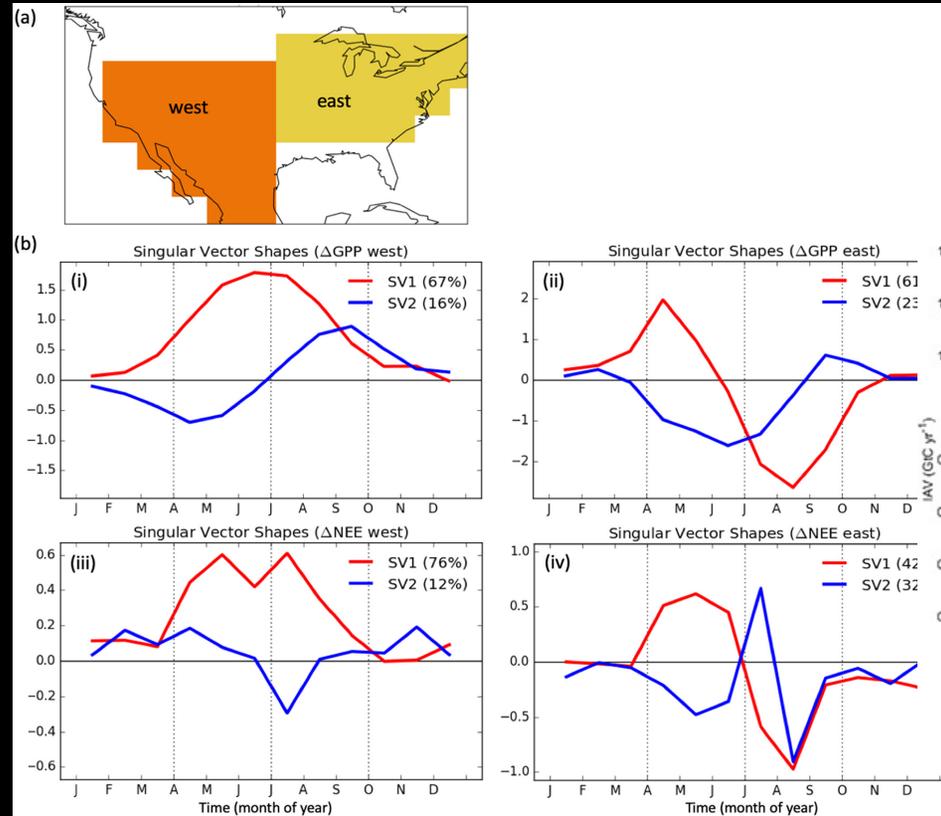
- From V7 to V9 inversions, the posterior CO2 biases become much smaller over NH mid to high latitudes;
- From v9 to v10 inversions, the posterior CO2 biases are comparable between IS and LNLG experiments.

# Interannual Variability

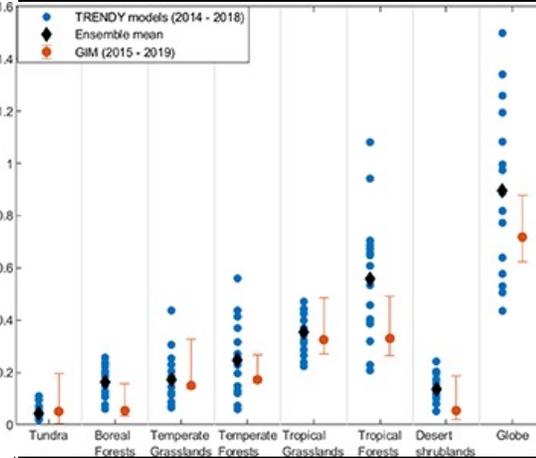


Sellers et al., 2018

- Large hemispheric variability => regional => process understanding

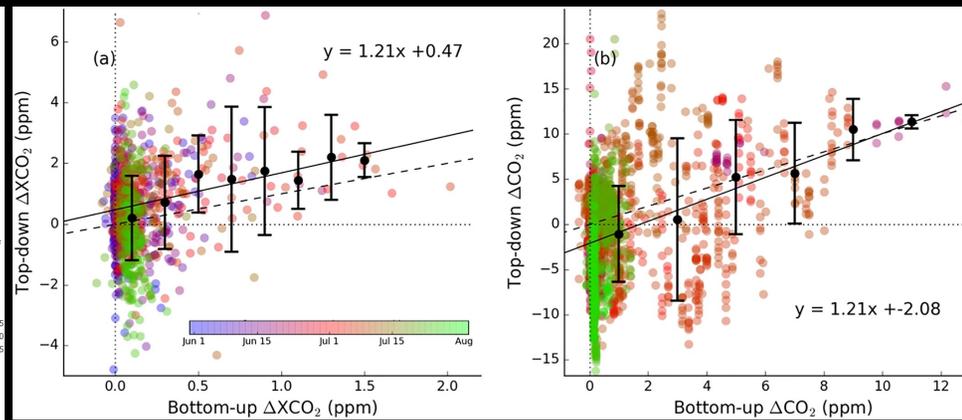
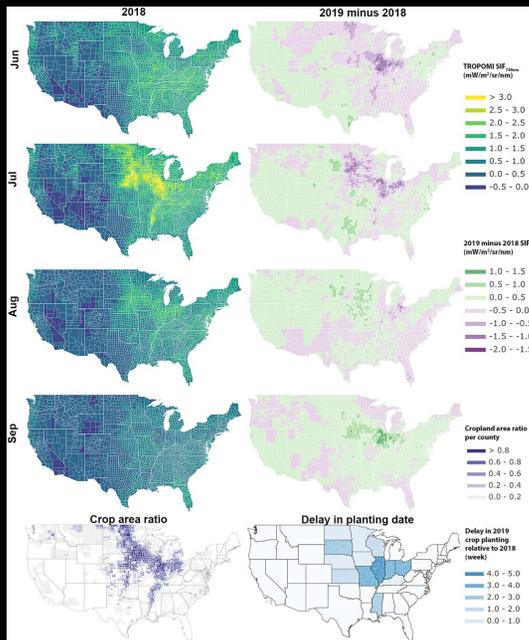


Byrne et al., 2021

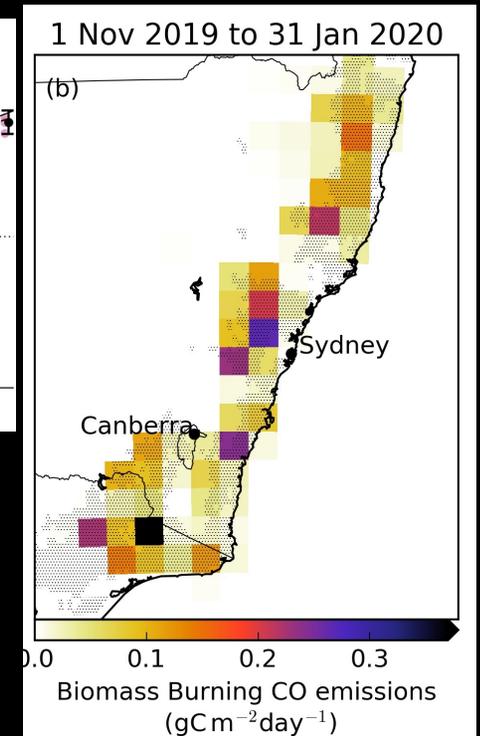


Chen et al., 2022

# Impact of Extreme Climate Events



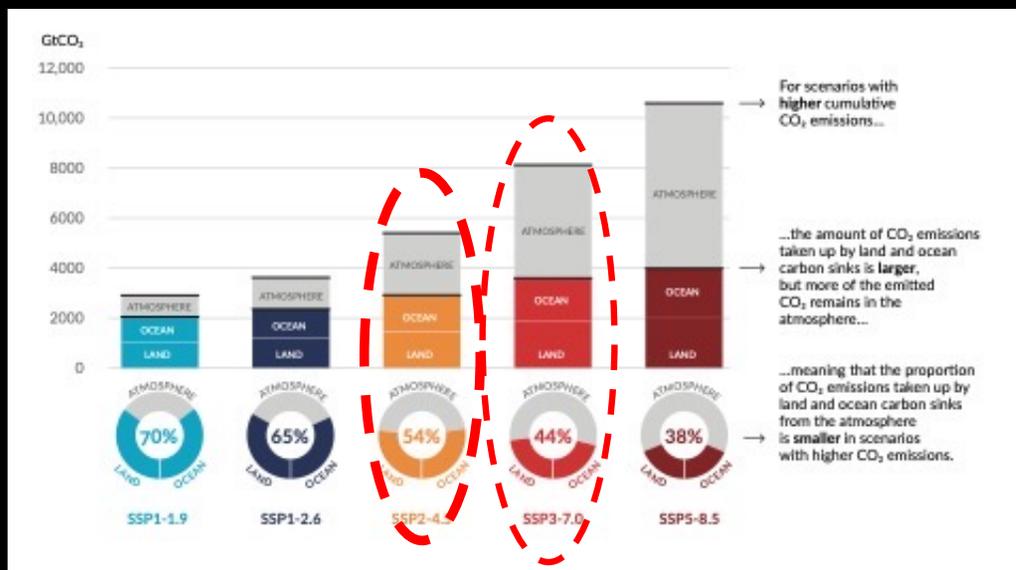
Yin et al., 2020



Byrne et al., 2021

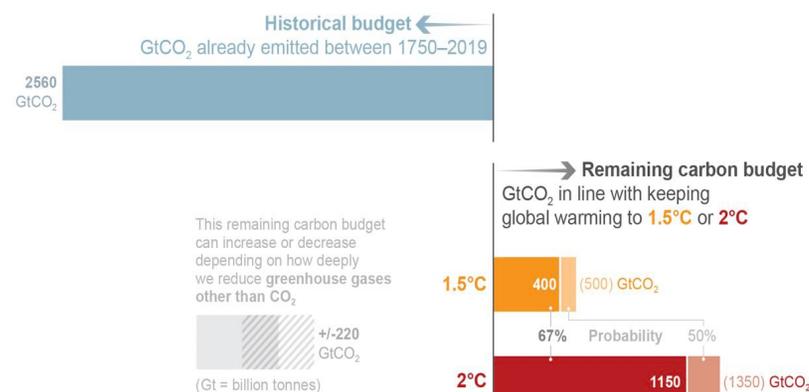
- In combination with data from other sources, satellite XCO2 are used to quantify carbon flux anomaly due to the impact of extreme events **over small region**;

# Remaining Carbon Budget Depends on Changes of Natural Carbon Sink with Climate as well as Anthropogenic Emissions



## FAQ 5.4: What are Carbon Budgets?

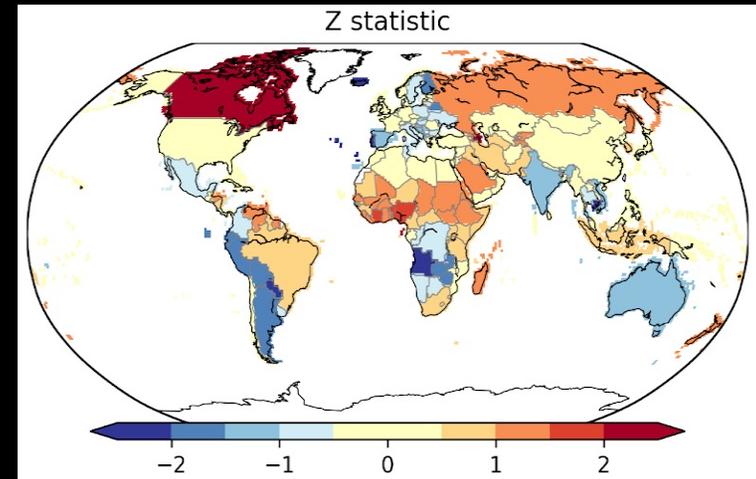
The term carbon budget is used in several ways. Most often the term refers to the total net amount of carbon dioxide (CO<sub>2</sub>) that can still be emitted by human activities while limiting global warming to a specified level.



IPCC AR6

- More fraction of emitted CO<sub>2</sub> remains in the atmosphere with high cumulative CO<sub>2</sub> emissions;
- Understanding spatiotemporal distributions of the natural carbon sources and sinks and its changes with climate are as important as monitoring anthropogenic emissions to achieve climate goals.

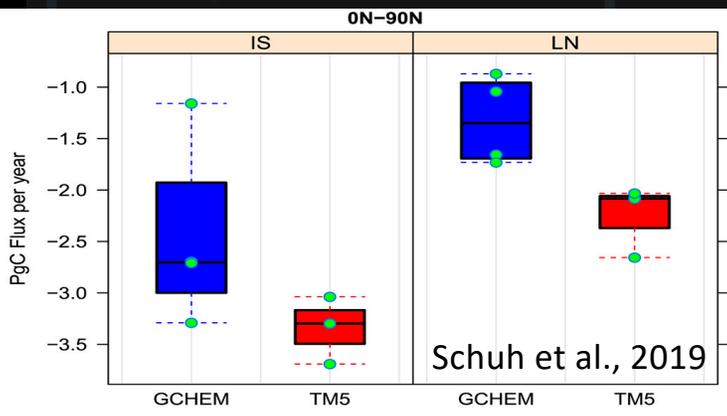
# Increasing Independent observations



- Regions with no independent observations collocate with large flux differences between LNLG-based and IS-based results.

# Continue Improving Atmosphere Transport and Flux Inversion Infrastructure

Bottom-up models and uncertainties

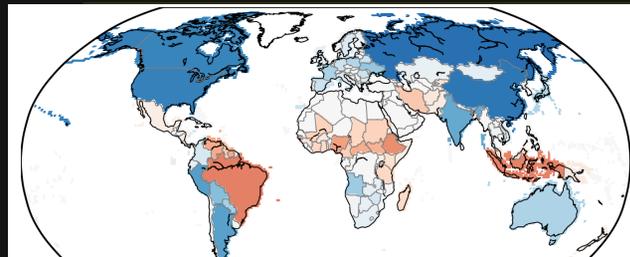


Atmosphere Transport Model

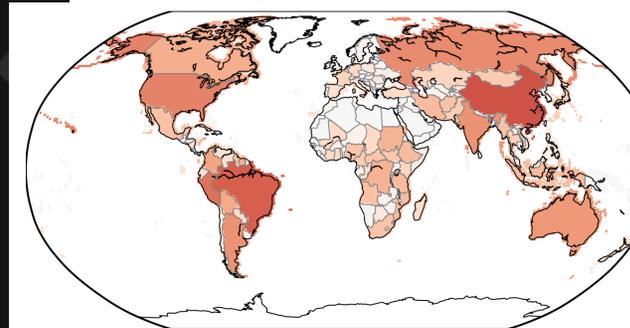


Atmospheric inverse model

$$J(x) = (x - x^b)^T B^{-1} (x - x^b) + \sum_{i=1}^n (y - h(x))_i^T R^{-1} (y - h(x))_i$$



Terrestrial biosphere carbon flux (GtC/year)



Posterior fluxes and uncertainties

Science analysis and applications