



Quantifying the carbon cycle impacts of extreme events with space-based X_{CO_2} retrievals

Brendan Byrne¹, Junjie Liu^{1,2}, Kevin W. Bowman^{1,3}, and Christopher W. O'Dell⁴

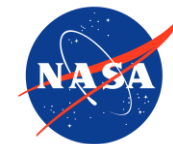
¹Jet Propulsion Laboratory, California Institute of Technology, Pasadena, CA, USA

²Division of Geological and Planetary Sciences, California Institute of Technology, Pasadena, CA, USA

³Joint Institute for Regional Earth System Science and Engineering, University of California, Los Angeles, CA, USA

⁴Cooperative Institute for Research in the Atmosphere, Colorado State University, Fort Collins, CO, USA

Contact: brendan.k.byrne@jpl.nasa.gov

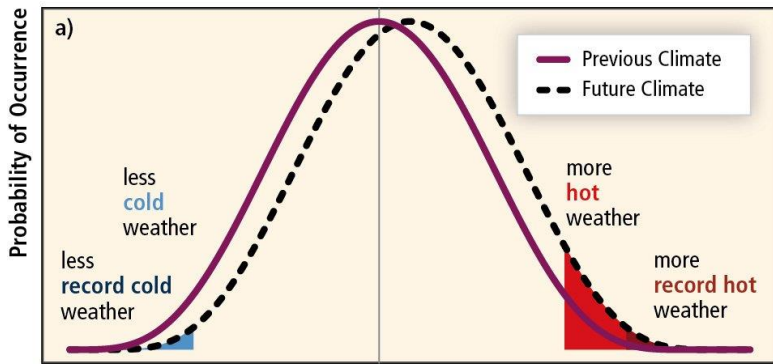


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California Institute of Technology

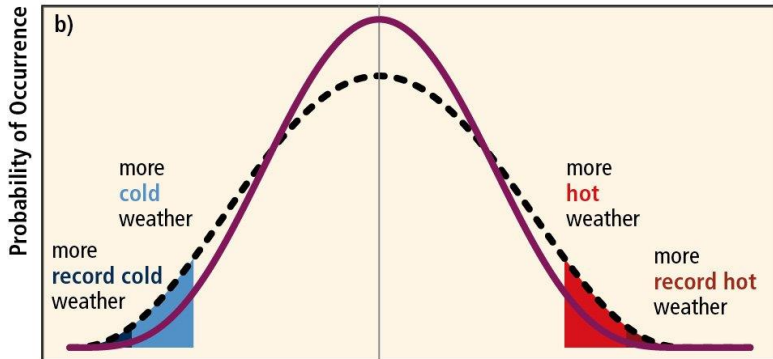
Why we care:

1. Extreme events can become much more common with shift in mean climate

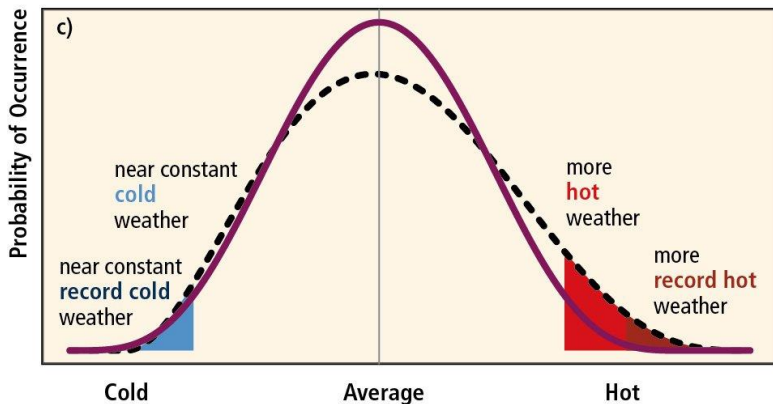
Shifted Mean



Increased Variability

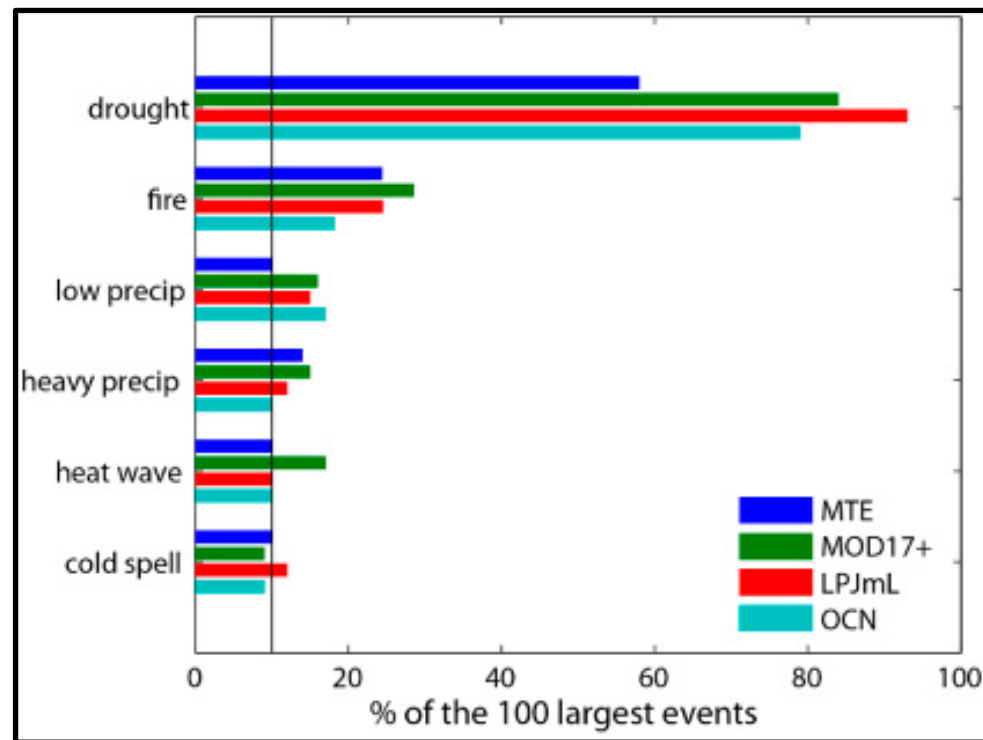


Changed Shape

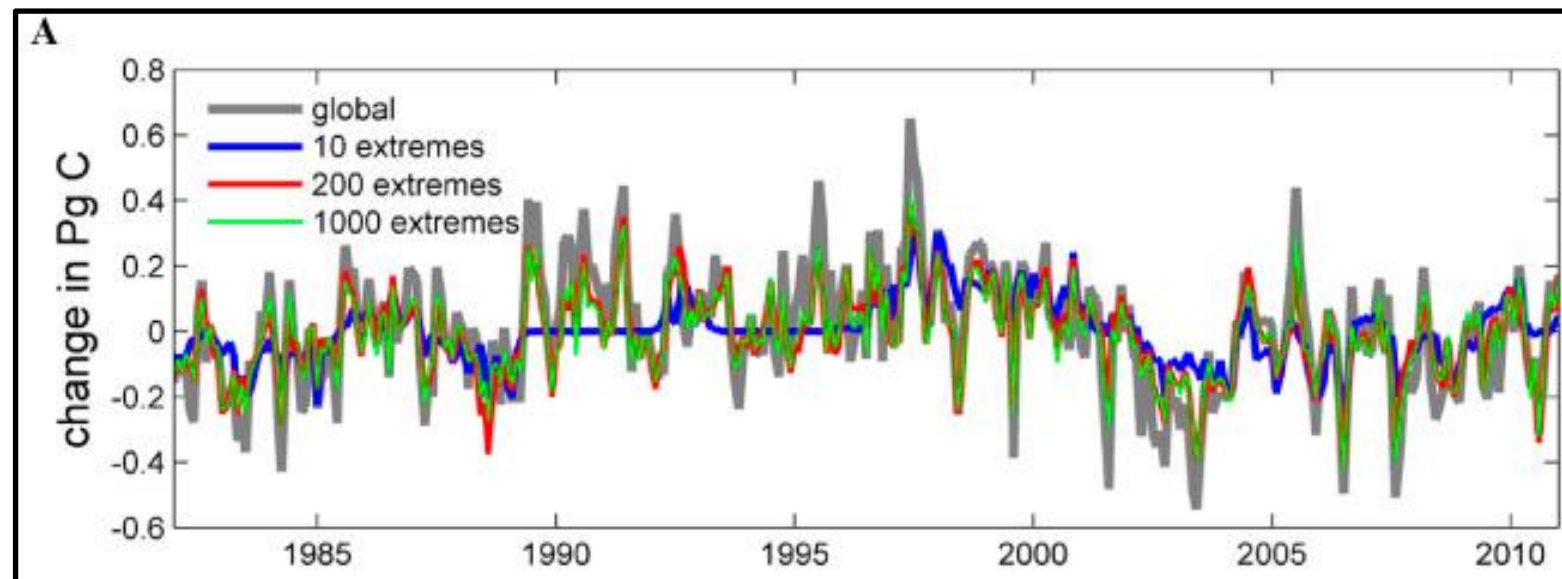


Why we care:

2. Extreme events have an large impact on variability in the carbon cycle.



Zscheischler *et al* 2014 *Environ. Res. Lett.*. Percentages of negative 1%-extreme events in GPP out of the largest 100 that could be associated with extreme drivers



Zscheischler *et al* 2014 *Environ. Res. Lett.*. Global GPP anomaly (gray); 10, 200, and 1000 largest positive and negative tenth-percentile extremes in GPP (blue, red, and green lines, respectively), monthly time scale.

Case Study – Current capabilities

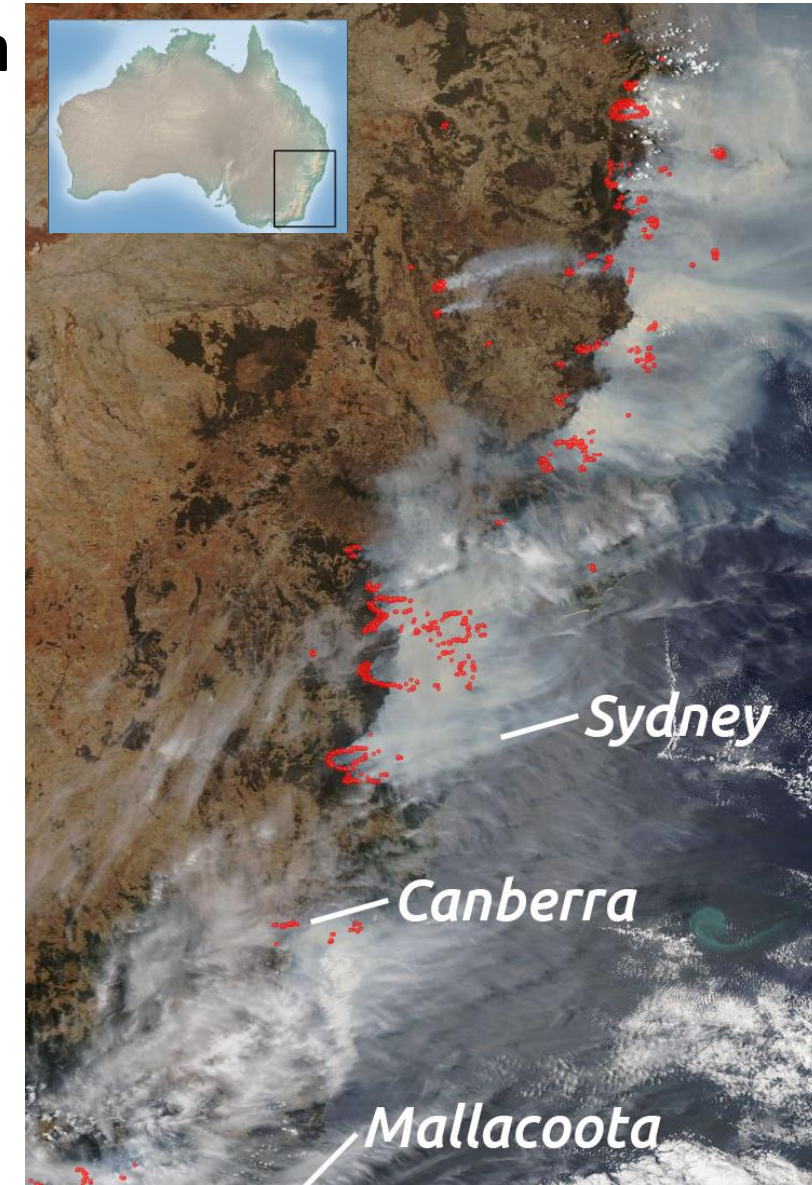
Case Study:

Extreme 2019/20 growing season in southeast Australia

- Extreme year:
 - 2019 Hottest and driest year on record
 - Extensive wildfires in southeast Australia during Nov 2019 – Jan 2020.
 - Sudden shift to cool wet conditions in Feb 2020
- What can we say about the CO₂ flux perturbations?



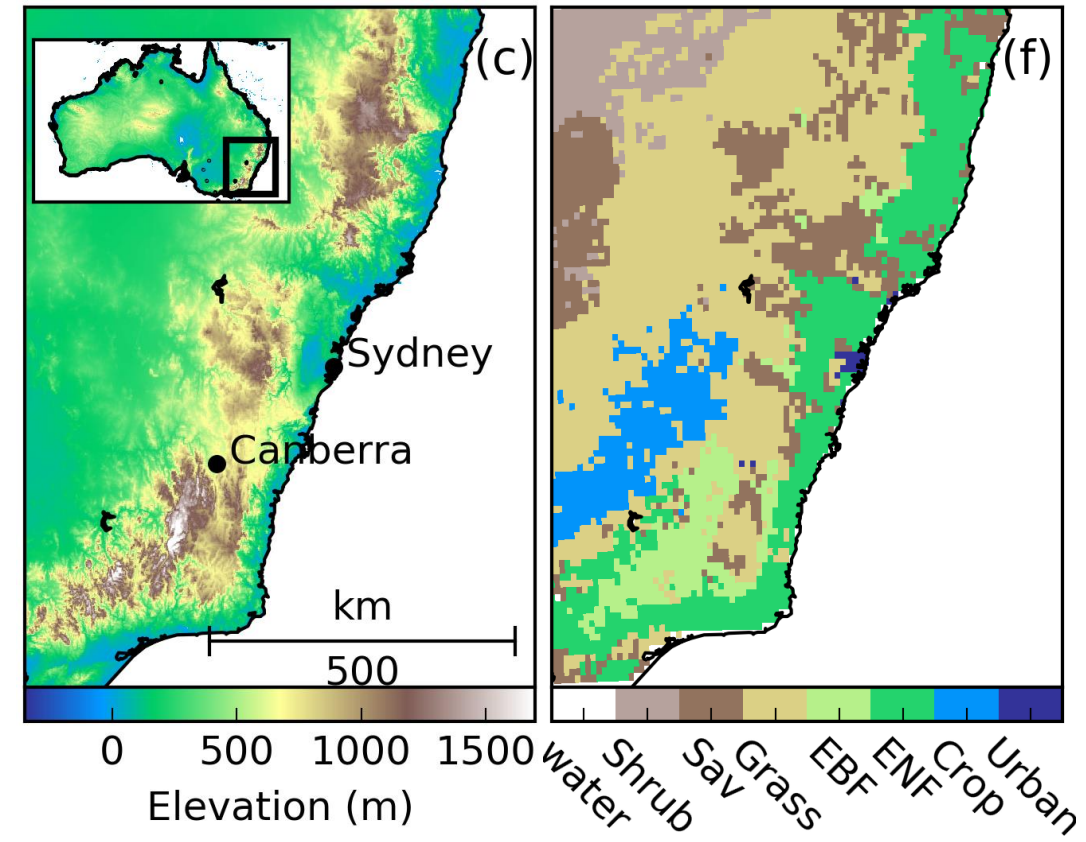
Whittle, L 2020, Analysis of Effects of bushfires and COVID-19 on the forestry and wood processing sectors, Australian Bureau of Agricultural and Resource Economics and Sciences, Canberra. CC BY 4.0. DOI:<https://doi.org/10.25814/5ef02ef4a3a96>



By NASA Earth Observing System Data and Information System (EOSDIS) - Data captured from <https://worldview.earthdata.nasa.gov>, Public Domain, <https://commons.wikimedia.org/w/index.php?curid=85664582>

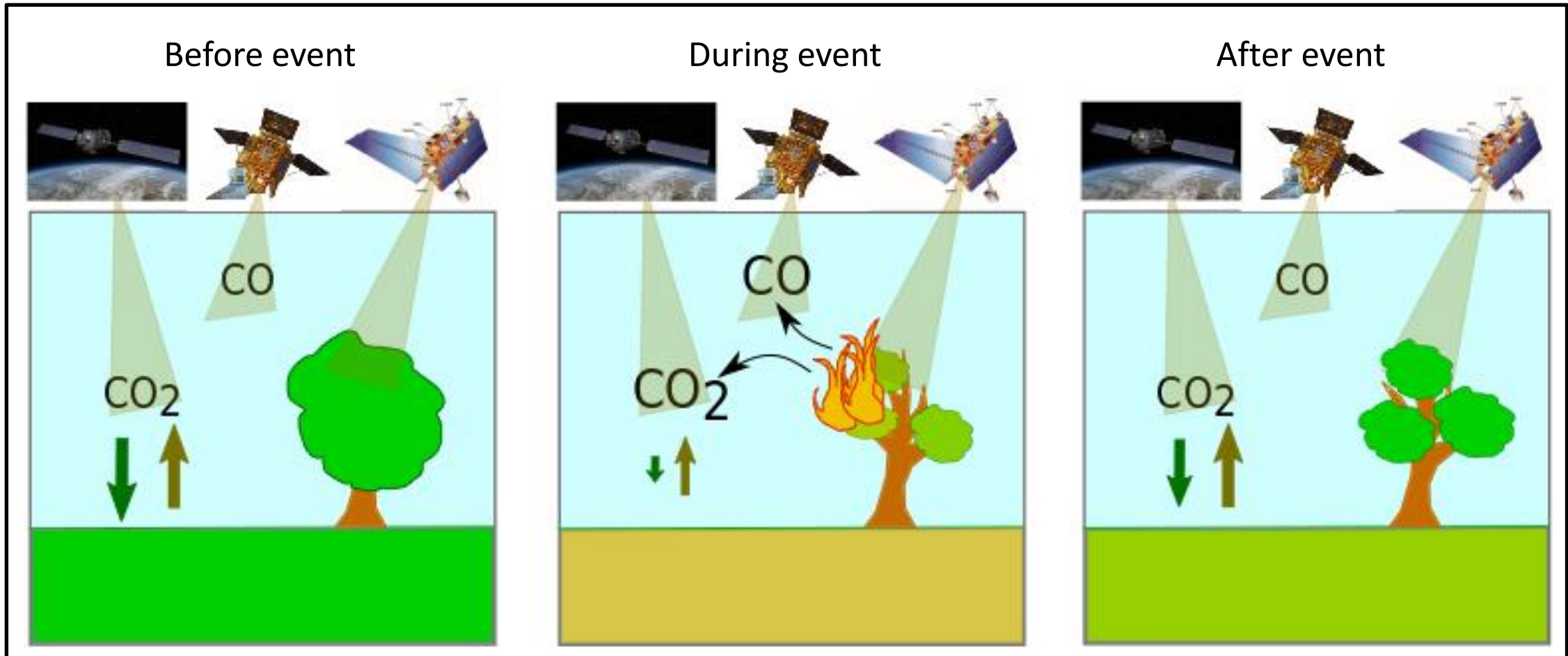
Questions of interest

- How much CO₂ was released to the atmosphere due to drought and biomass burning, respectively?
- Do we see recovery under cool-wet conditions
- How did this event impact forest and non-forest ecosystems differently?
- And what are the differences in carbon cycle perturbations between burned and unburned ecosystems?



Space-based carbon cycle observations

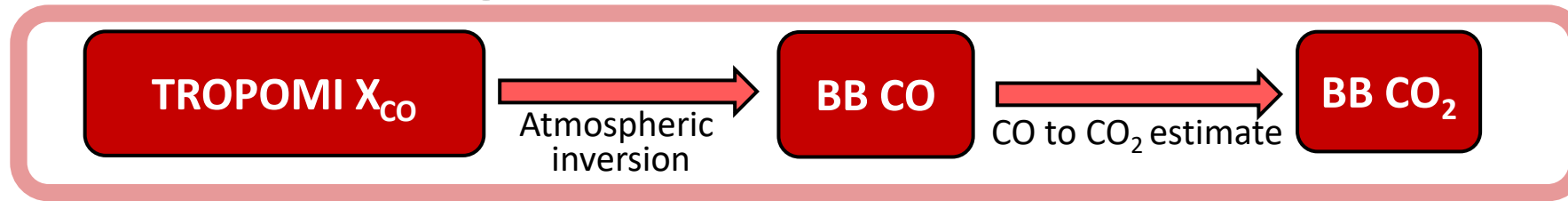
- OCO-2 tracks the atmospheric CO₂ anomalies.
- TROPOMI tracks the CO anomalies
- MODIS tracks the burned area/fire radiative power & vegetation anomalies



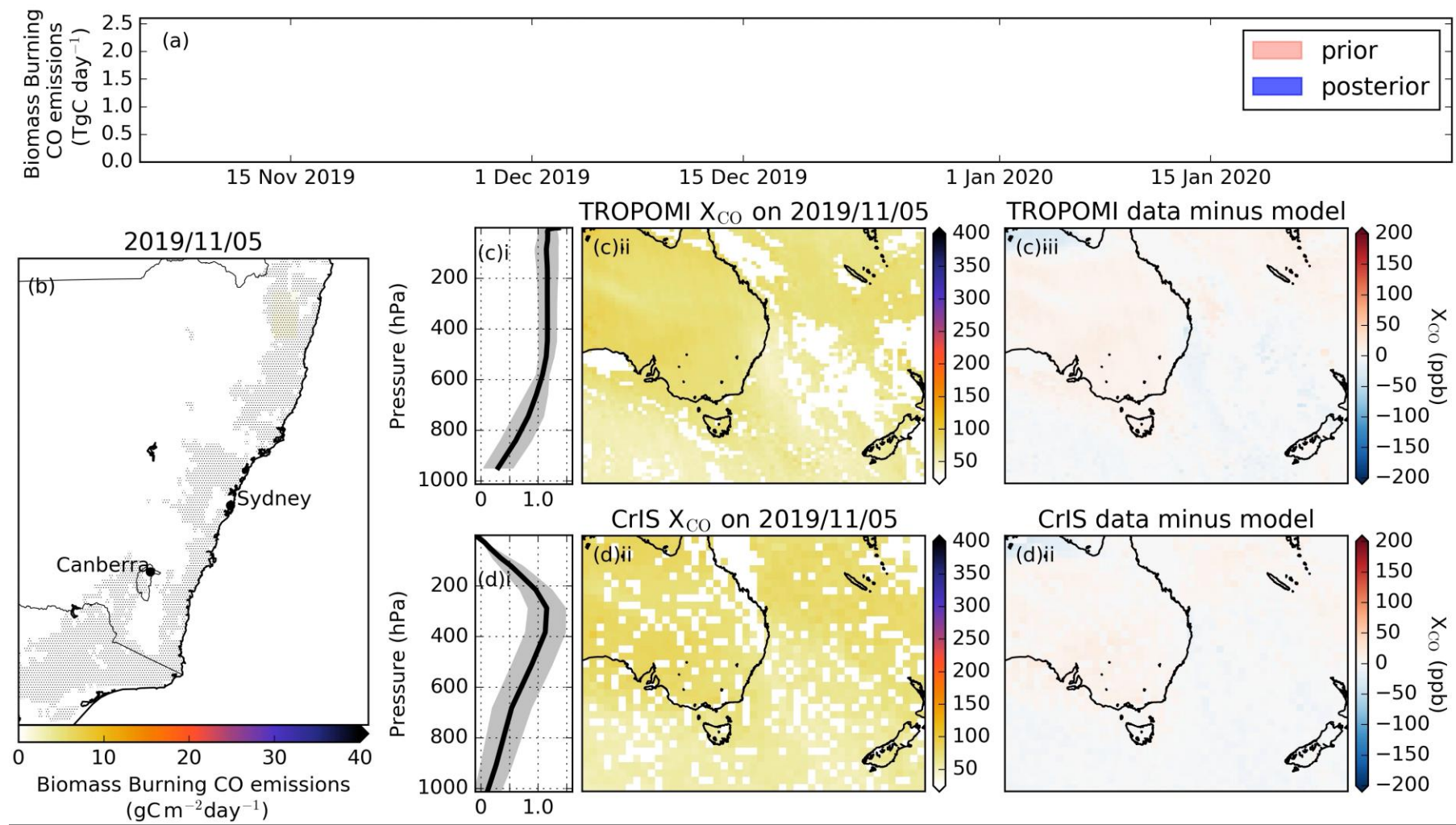
Relating observations to carbon budget

$$\text{OCO-2 } X_{\text{CO}_2} \swarrow \quad \Delta\text{NBE} = \underbrace{\Delta\text{TER} - \Delta\text{GPP}}_{\Delta\text{NEE}} + \text{BB} \quad \swarrow \text{TROPOMI } X_{\text{CO}} \\ \text{MODIS-based FluxSat GPP} \leftarrow$$

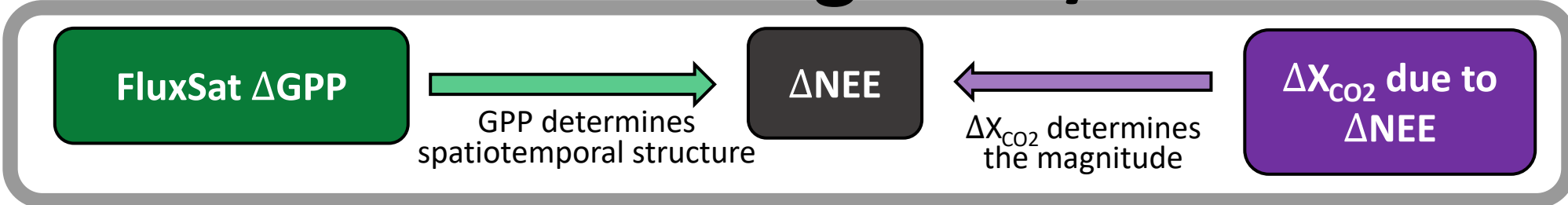
Biomass burning estimates



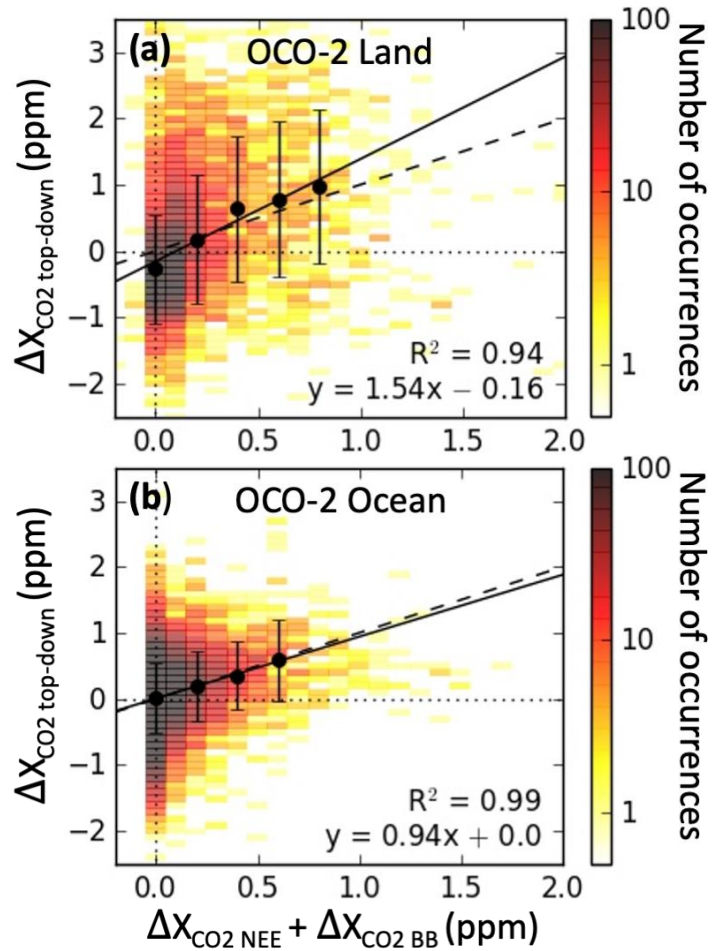
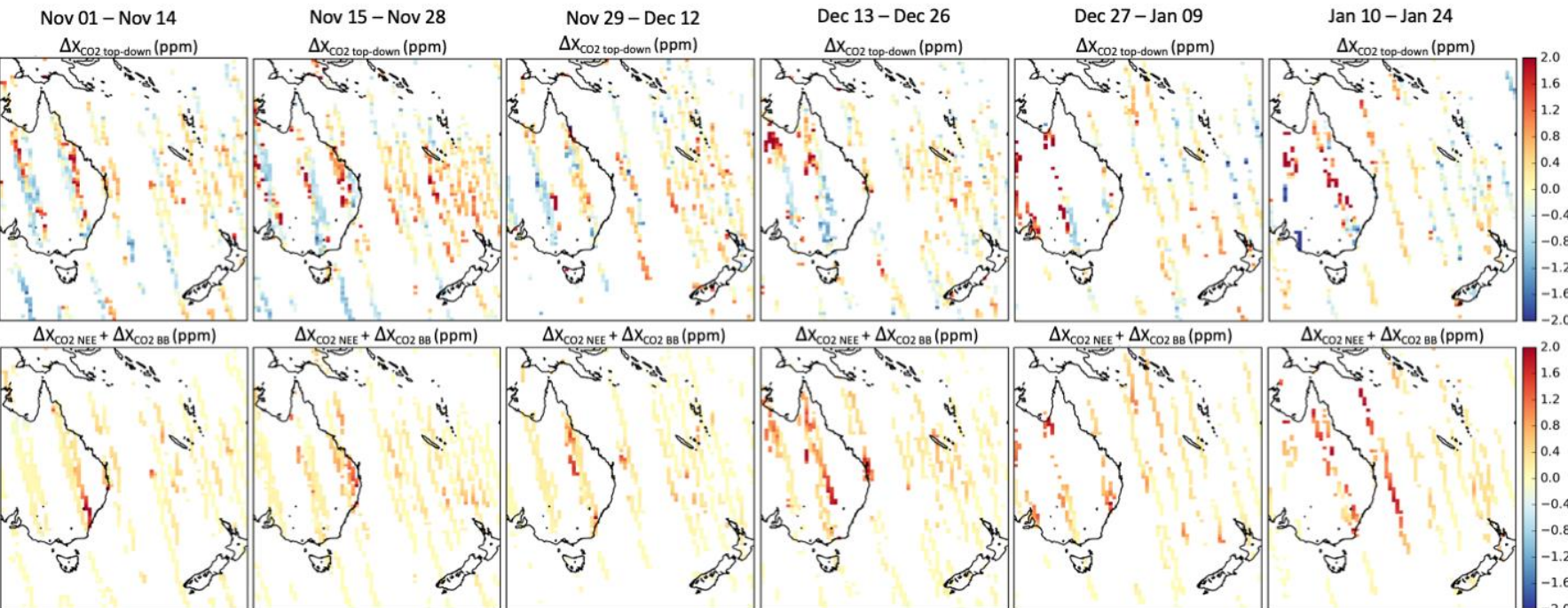
- Perform a high resolution carbon monoxide atmospheric inversion over Australia.
- Use prior fire emissions from the GFAS and GFED inventories.
- Infer a scaling on these prior emissions to match the TROPOMI carbon monoxide retrievals
- Estimate CO₂ emissions based of typical CO₂/CO emission ratios for fires.



GPP/NEE anomalies during 2019/2020



- Calculate ΔGPP from FluxSat remote-sensing-based estimate
- Assume $\Delta NEE \propto \Delta GPP$ [Li et al., 2017]
- Scale ΔNEE to be consistent with OCO-2 X_{CO2} anomalies

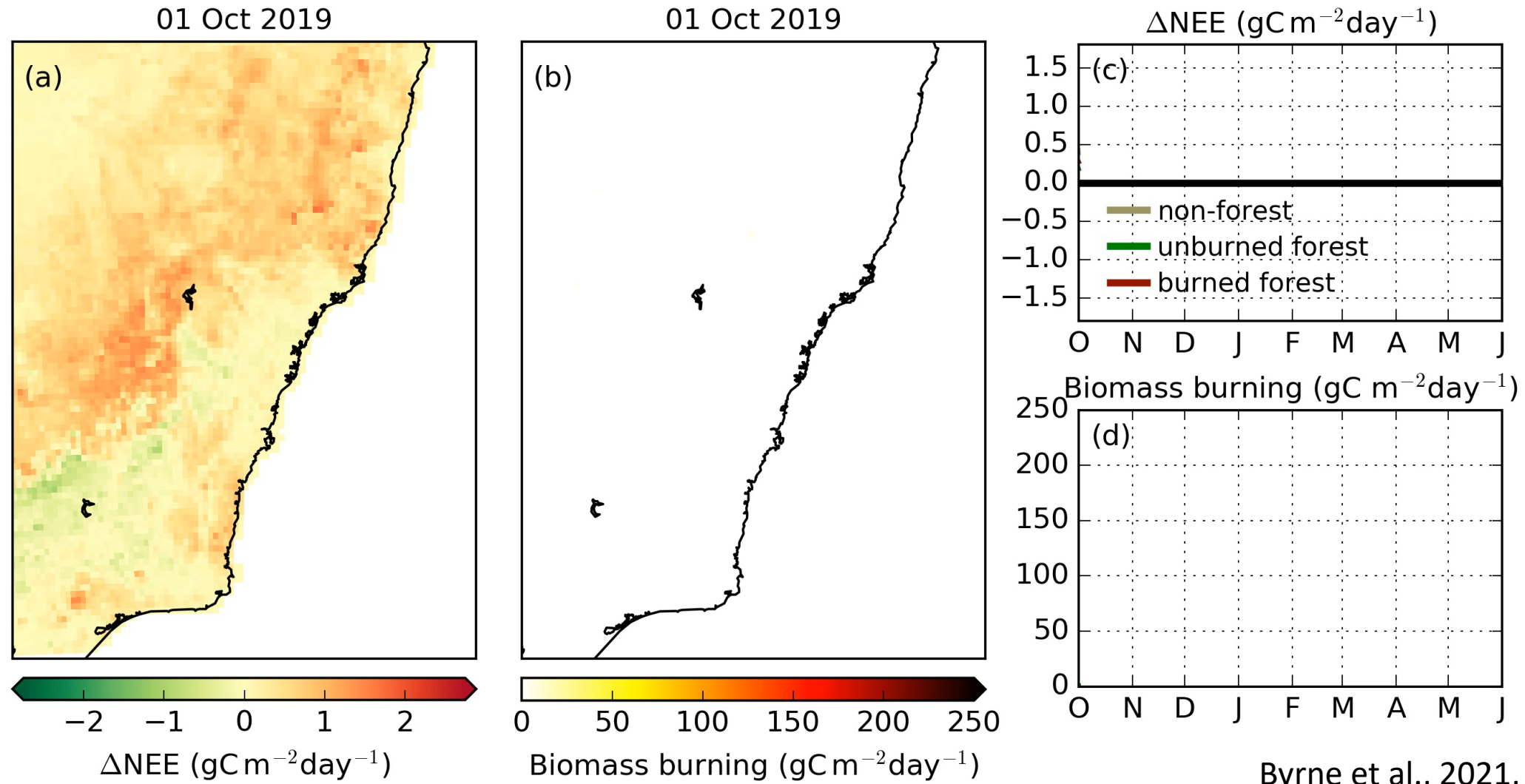


Byrne et al., 2021, AGU Advances

Li et al. (2017). Responses of LAI to rainfall explain contrasting sensitivities to carbon uptake between forest and non-forest ecosystems in Australia. Scientific Reports, 7(1), 1–9. <https://doi.org/10.1038/s41598-017-11063-w>

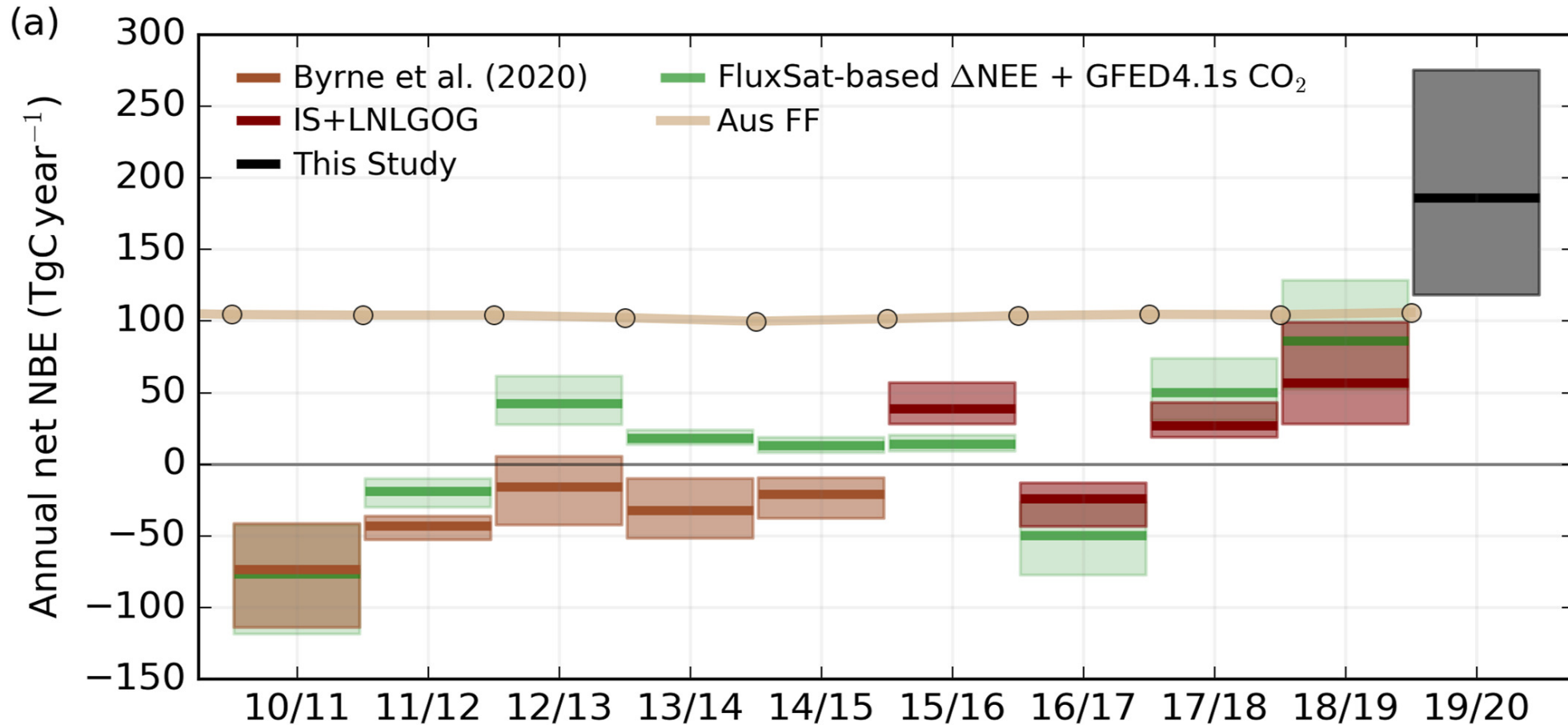
Daily biomass burning and NEE anomalies during 2019/20

- Carbon loss primarily due to biomass burning (83% fires, 17% Δ NEE).
- Carbon losses were concentrated in burned forests, including from Δ NEE. (~82% loss was in burned forests, ~16% non-forest, ~2% unburned forest).



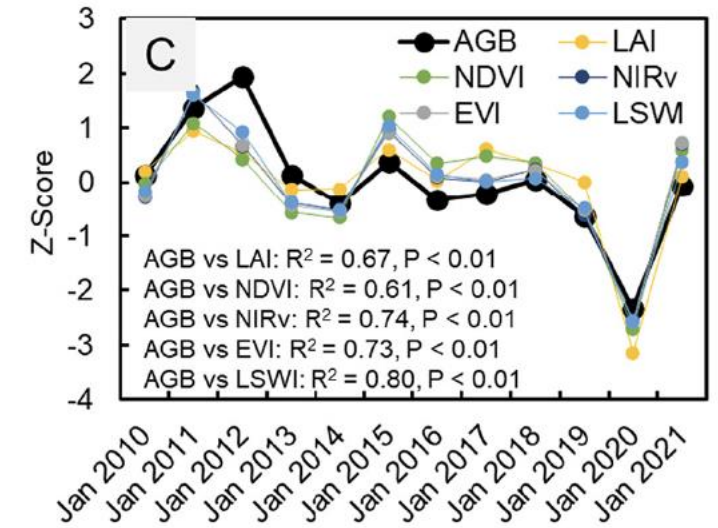
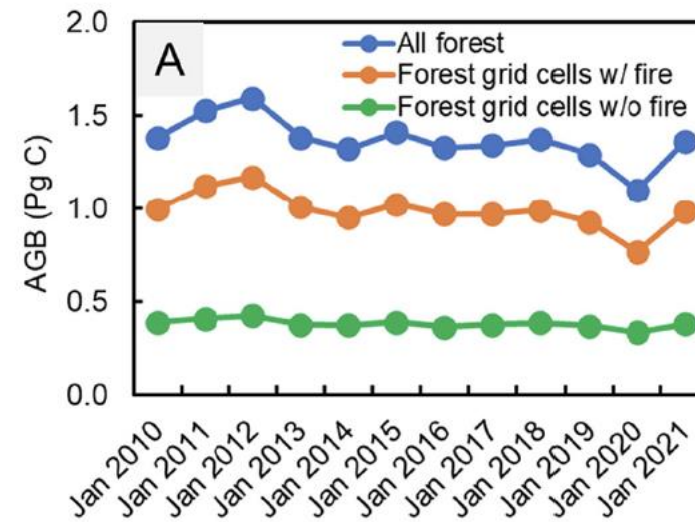
Carbon loss for 2019/20 is large relative to previous years

- 2019/2020 stands out for the large carbon loss, and exceeds the annual net fossil fuel emissions!
- Large impact of this event demonstrate importance of tracking these events for monitoring the carbon budget.



Similar story for aboveground biomass

Qin et al., 2022, Remote Sensing of Environment, <https://doi.org/10.1016/j.rse.2022.113087>

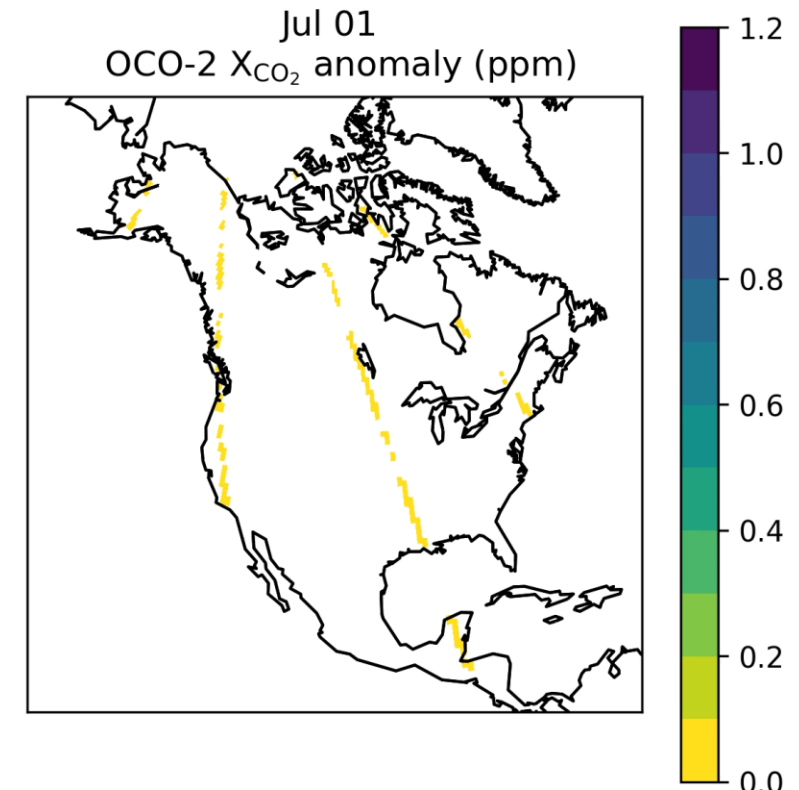
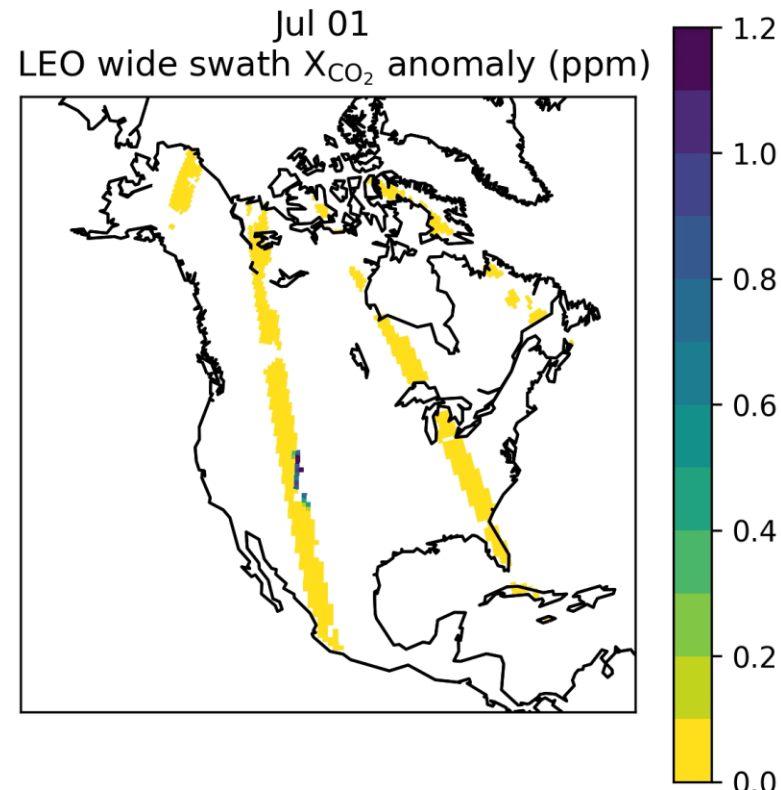
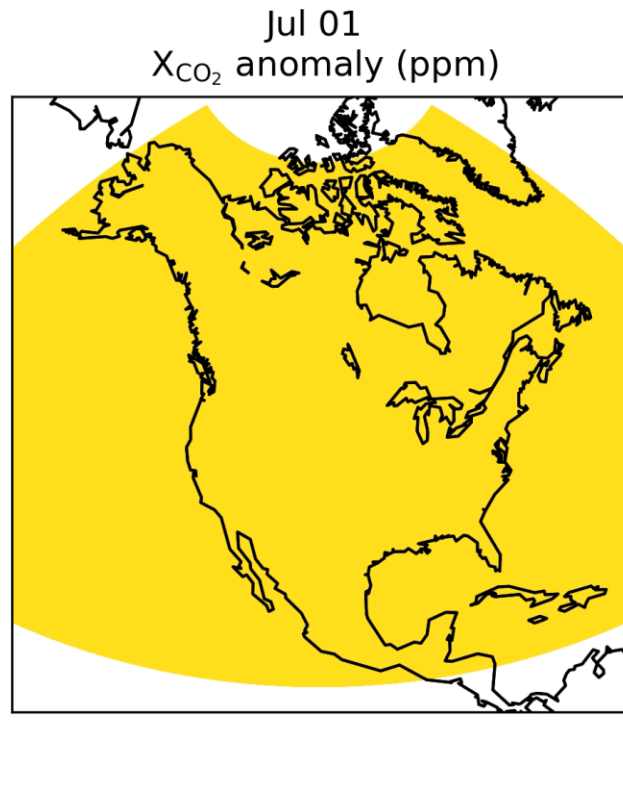
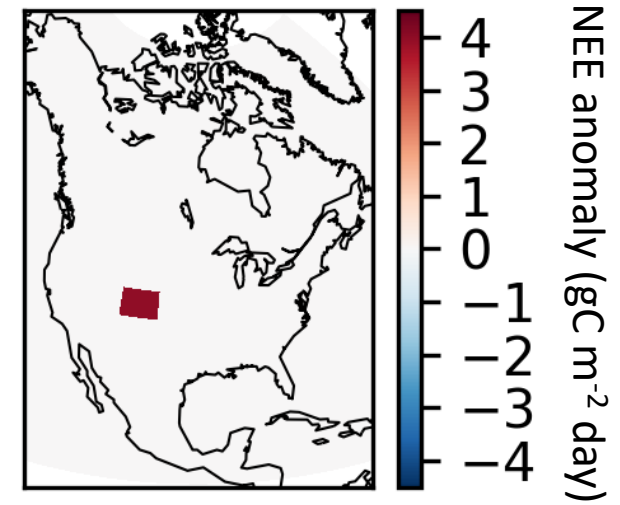


- Large biomass loss in 2019 but large gains in 2020 (~15% variation in AGB).
- Fire-adapted Eucalyptus forests and above-average annual precipitation drove the recovery of vegetation cover
 - Note the forests don't look the same, though.

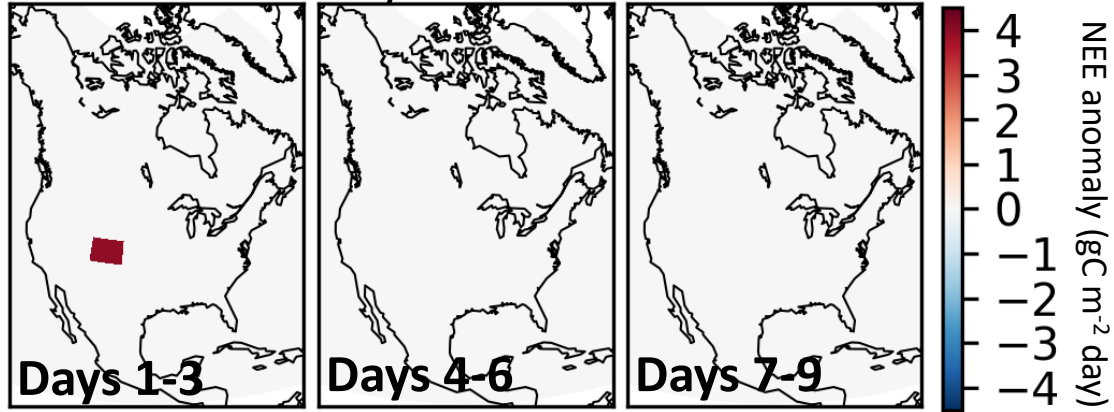
Looking to the Future

Anomaly detection with 200 km wide-swath LEO sampling

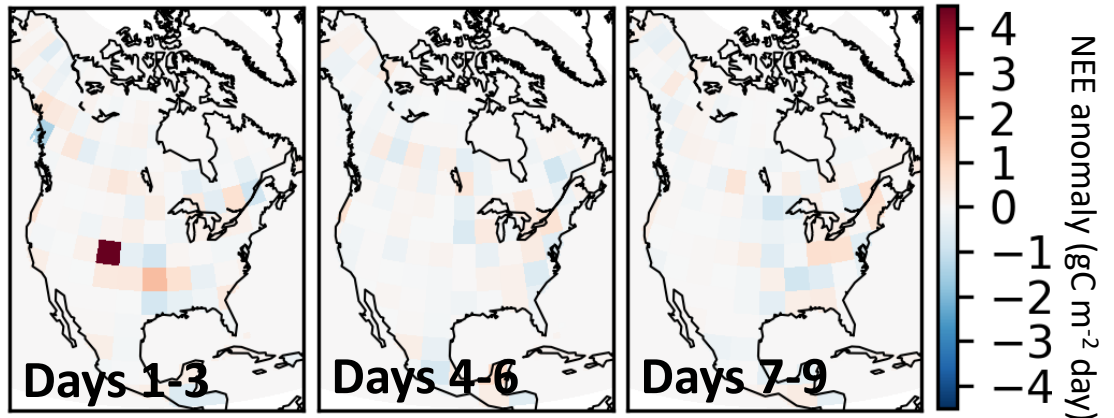
- Test how well a 200 km wide-swath LEO CO₂ mission can detect an extreme event:
 - Release CO₂ pulse over Colorado for three days (~1 TgC/day)
- Atmospheric CO₂ signal is more evident with this sampling relative to OCO-2.



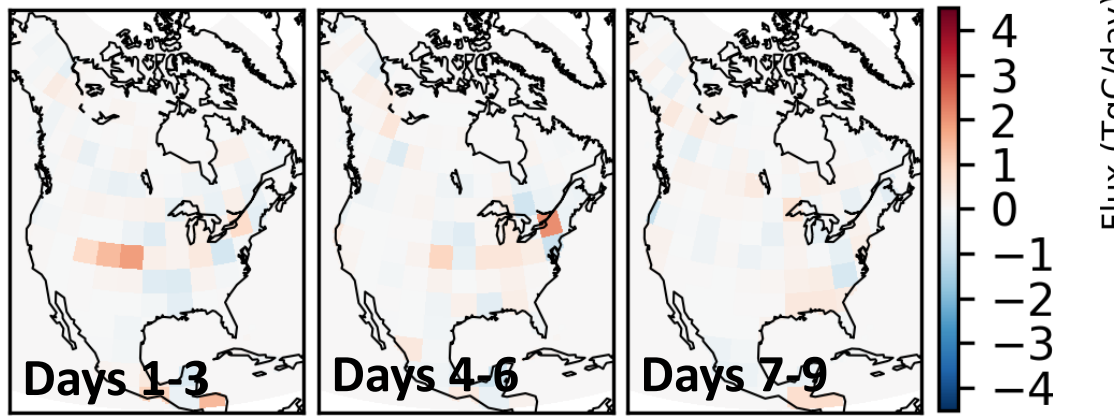
True NEE anomaly



LEO 200km wide-swath



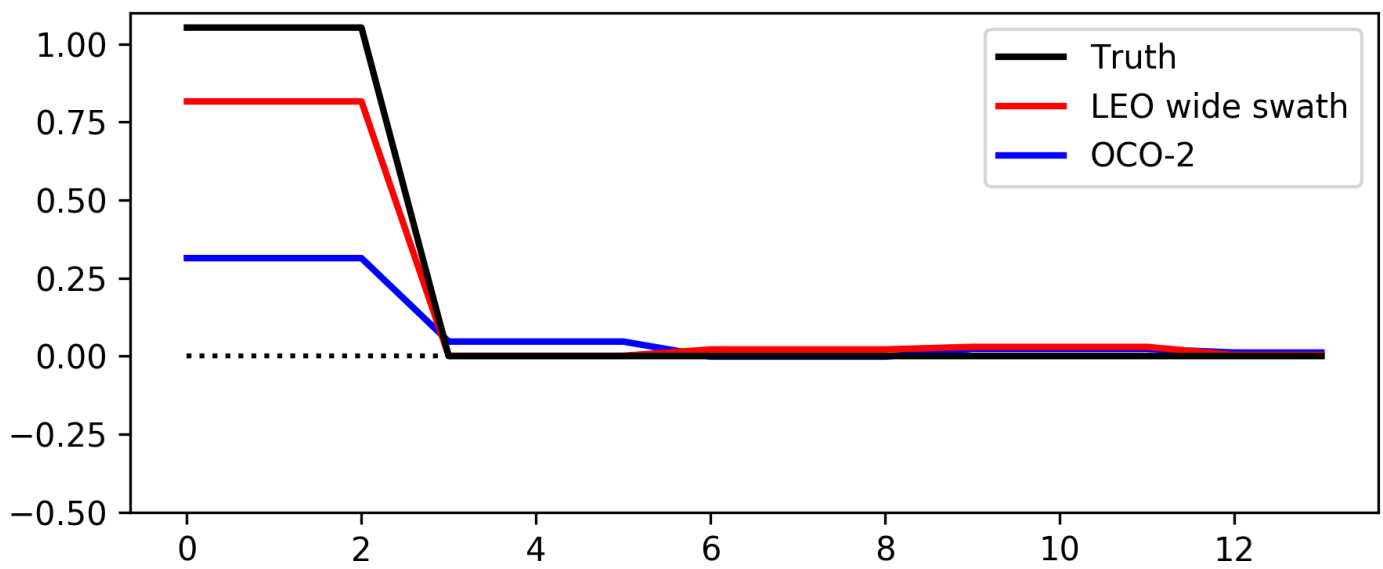
OCO-2



Increase sampling improves quantification & localization of extreme NEE anomalies

- A 200 km wide-swath LEO mission is able to isolate the NEE anomaly to Colorado, while OCO-2 is not.
- Similarly, the wide-swath LEO mission better captures the magnitude of the event.

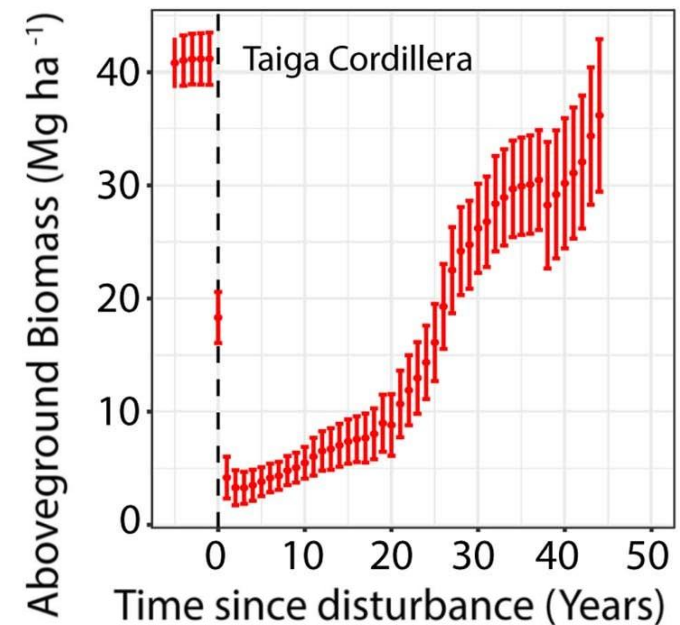
True and posterior NEE anomalies over Colorado



Recommendations / Thoughts

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- Dense satellite data are allowing us to track carbon cycle responses to extreme events with unprecedented detail.
- **Recommendation:** Launch CO₂ missions with dense sampling, this will improve our ability to track carbon cycle responses to extreme events from space.
 - Complementary datasets (e.g., CO & VIs/SIF) are also important for understanding component fluxes.
 - These events have a large impact on national carbon budgets.
- **Challenge:** Extreme events are unique, what generalizations can we take away from the 2019/20 SE Australia carbon cycle anomaly? And what are implications of DGVMs ability/inability to capture this event?



Wang et al (2021) Nat. Clim. Change
Aboveground biomass for 45 years after fire



Mountain Ash Pine

https://en.wikipedia.org/wiki/Eucalyptus_regnans#/media/File:Sherbrooke_forest_Victoria_220rs.jpg