



Using satellite observations to model net carbon dioxide emissions from AFOLU (REgional Carbon Cycle Assessment and Processes (RECCAP) under the Global Carbon Project

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Presenter: Yohanna Villalobos Tuesday, 6 September 2022

What is RECCAP-2?

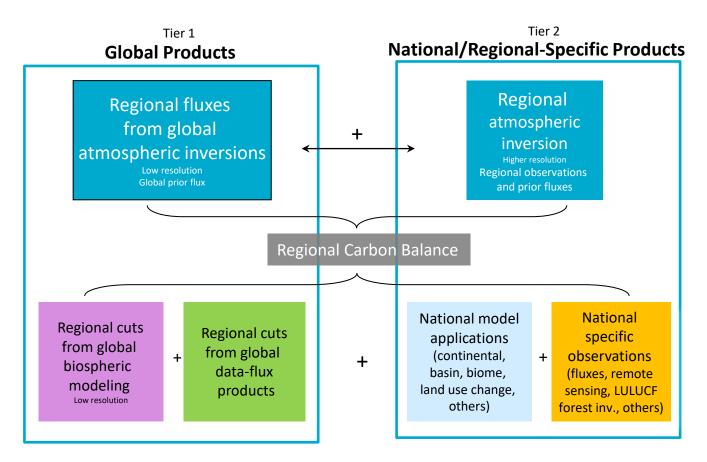


- RECCAP-2 is a global assessment to develop regional and national (for big countries) carbon, methane and nitrous oxide budgets.
- To contribute to the Paris Agreement global stocktake and tracking towards net zero emissions of anthropogenic and natural GHG sources and sinks.
- To quantify and further constrain anthropogenic greenhouse gas emissions and thus support the improvement of National greenhouse gas inventories (NGHGIs).

Figure 1: The RECCAP2 budget considers ten land regions and five ocean regions that together cover the entire globe (Kondo et al., 2021)



Two-tier approach for national/regional GHG balance



GCP, RECCAP1

How we compare AFOLU/LULUCF from NGHGI with inversions?

National GHG inventory (NGHGI) (IPCC guidelines, 2006, 2019)

National/Regional Carbon Budget

Agriculture, Forestry and Other Land Use (AFOLU/LULUCF)

In Australia, all lands are considered managed lands (except 8 per cent from desert areas).

National/Regional Atmospheric Inversion

Satellite-based inversion Provides best estimate of net C balance



Global Atmospheric Inversions

National/Regional Atmospheric Inversion

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> Spatial & temporal resolved fluxes Prior fluxes for assimilation

National/Regional Carbon Budget

Comprehensive C balance Anthropogenic and natural fluxes (NGHGI, biospheric modeling, other data & modeling,

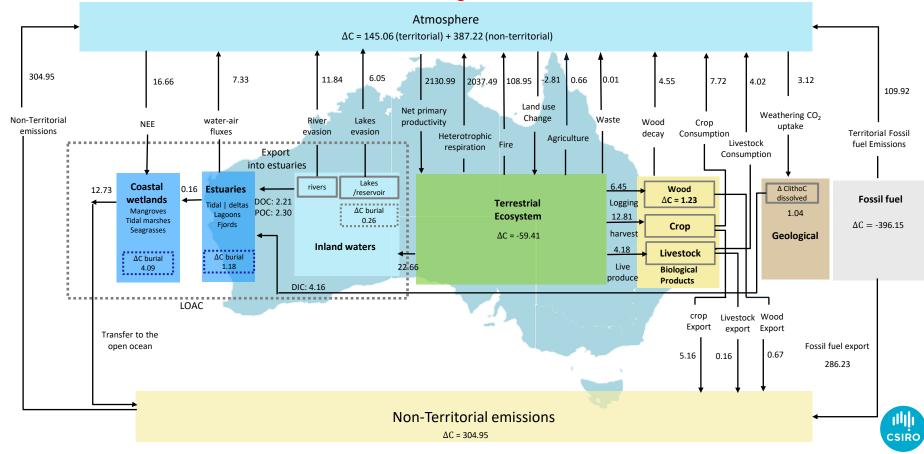
Australia carbon integrated system

National/Regional application of Biospheric Modeling

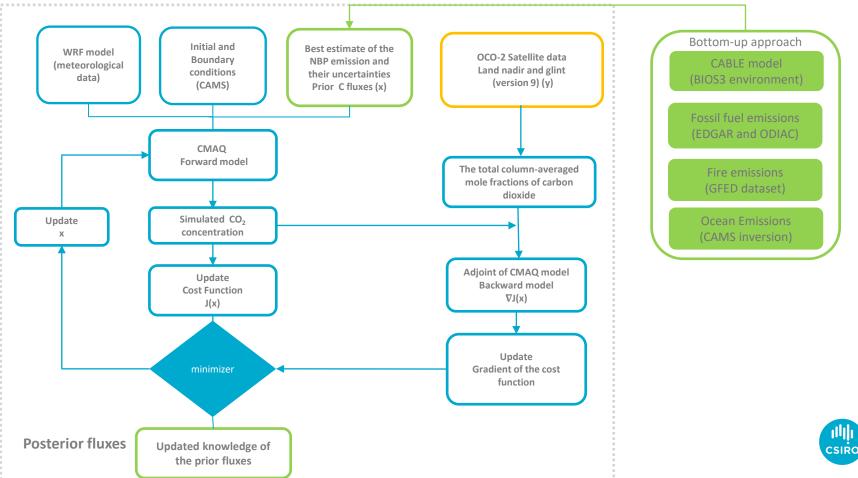
Parameterized and benchmarked with data from the C budget (w/NGHGI), and other fluxes and observations

Regional Australia carbon Budget (2010-2019) (Units Tg C yr⁻¹)

- Work in Progress -



Australia regional inversion (2015-2019)



The importance of prior fluxes in the regional inversion

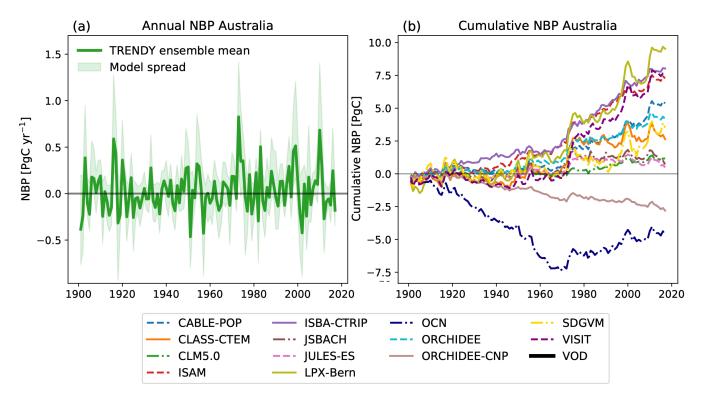
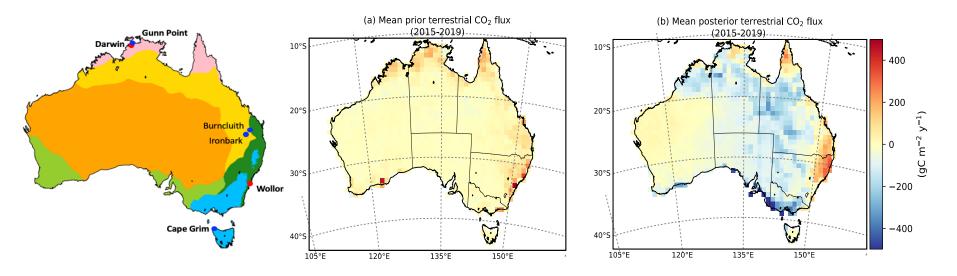


Figure 1. Net Biome Production (NBP). Positive indicates a terrestrial carbon sink (Teckentrup et al., 2021).



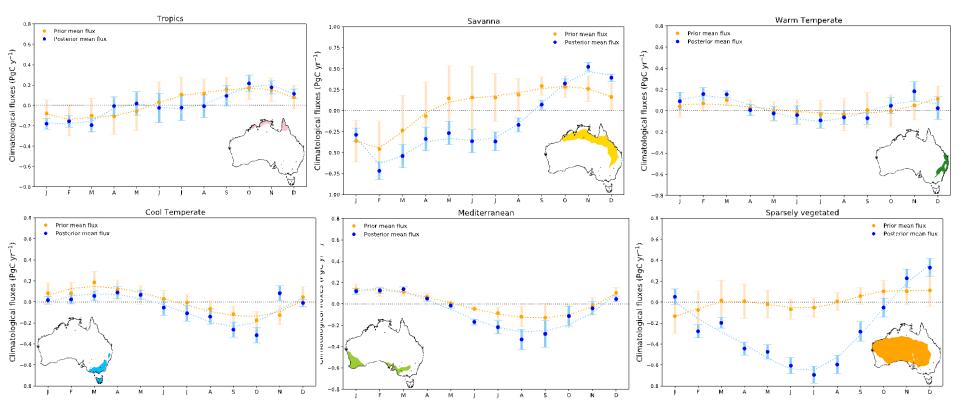
Long-term mean 2015-2019



The long-term mean of our posterior terrestrial CO_2 flux indicate that Australia was a carbon sink of -0.46 +- 0.08 PgC y⁻¹ compared to the prior flux estimate which was 0.11 +- 0.20 PgC y⁻¹ (excluding fossil fuel emissions). (Villalobos et al., 2022)



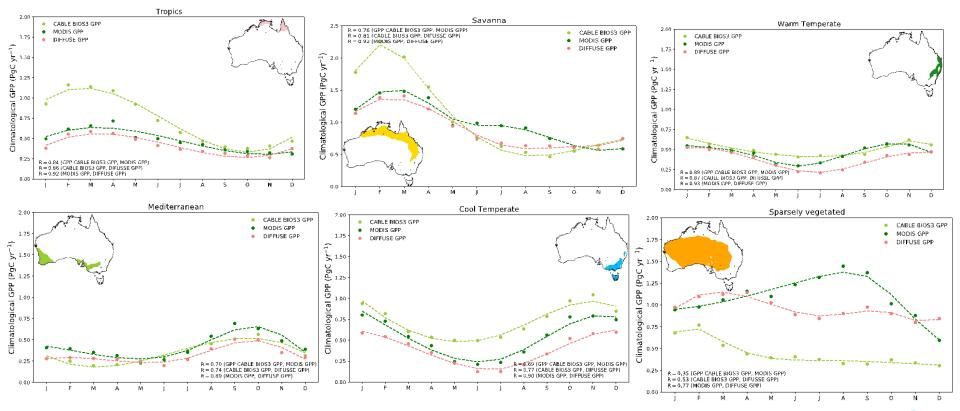
Climatological seasonal carbon cycle 2015-2019



Climatological seasonal cycle of prior (orange points) and posterior (blue points) terrestrial carbon fluxes (2015–2019). The dashed orange and blue lines represent a smooth line for the prior and posterior fluxes respectively.



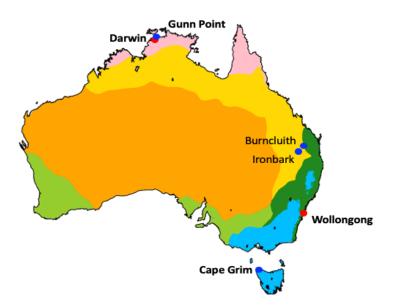
Climatological GPP 2015-2019



Climatological seasonal cycle of prior (orange points) and posterior (blue points) terrestrial carbon fluxes (2015–2019). The dashed orange and blue lines represent a smooth line for the prior and posterior fluxes respectively. (Villalobos et al., (2022).

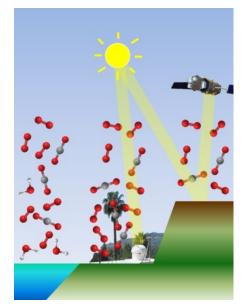
CSIRO

Validation with independent data



In-situ measurements (blue dots)

• The Total Carbon Column Observing Network (TCCON) records direct solar spectra in the near-infrared spectral region (red dots).

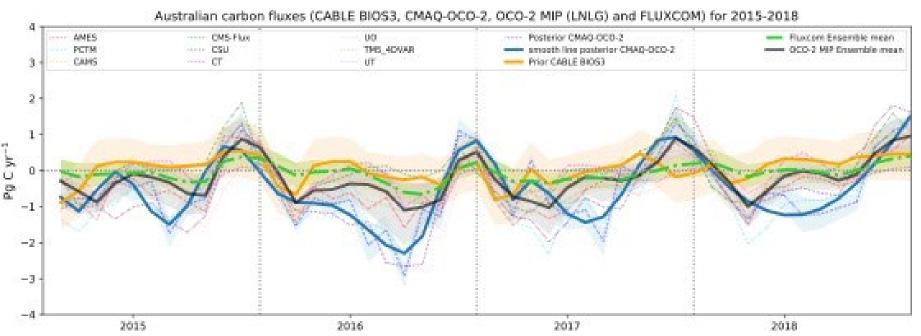




Validation **TCCON** observations in-situ observations (b) Gunn Point (a) Darwin 412.5 415 CMAQ prior simulated CMAQ prior simulated <mark>0</mark>0 808 CMAQ posterior simulated CMAQ posterior simulated 0 0 410.0 TCCON Darwin Gunn Point (m 407.5 405.0 402.5 400.0 410 Concentration (ppm) 0 000 Gunn Point Darwin 395 397.5 R = 0.991 (TCCON vs prior) 0 0000 R = 0.776 (Gunn Point vs prior) R = 0.730 (Gunn Point vs posterior) R = 0.987 (TCCON vs posterior) 390 395.0 2015 2016 2017 2018 2019 2015 2016 2017 2018 2019 (c) Wollongong (d) Cape Grim Burncluith 412 410 CMAQ prior simulated CMAQ prior simulated Ironbark CMAQ posterior simulated CMAQ posterior simulated 0 0 410 408 ng TCCON Wollongong TCCON Cape Grim (udd) 406 Concentration (ppm) °0 Wollongong 0 Concentration (8000 Tropic Mediterranean 0 Savanna Sparsely vegetated Cape Gr Warm Temperate Cool Temperate 396 398 R = 0.974 (TCCON vs prior) R = 0.826 (TCCON vs prior) R = 0.787 (TCCON vs posterior) 394 0 R = 0.975 (TCCON vs posterior) 396 2015 2016 2017 2018 2019 2015 2016 2017 2018 2019



Comparison: Regional OCO-2, Global OCO-2 MIP, TBM (prior, CABLE) and FluxCom

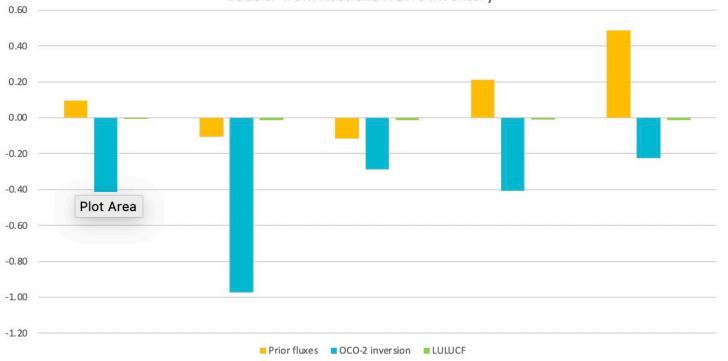


Comparison between monthly mean posterior (blue line), prior (orange line), FLUXCOM ensemble mean (green line), OCO-2 MIP ensemble (black line) carbon fluxes, and the monthly carbon fluxes from the nine models that participate in OCO-2 MIP: AMES, PCTM, CAMS, CMS-Flux, CSU, CT, OU, TM5-4DVAR, and UT (in PgC yr-1).



OCO-2 inversion results against what is reported in the LULUCF From Australian NGHGI (2015-2019)

Comparison between prior fluxes (CABLE BIOS3), CMAQ CO₂ inversion and LULUCF from Australia NGHG inventory





Reconciling OCO-2 inversion results with LULUCF From Australian NGHGI

- 1. Sort out any definitional inconsistencies and system boundaries on what is included and not in each of the two approaches, and identify any clear missing fluxes, particularly natural fluxes which might not be included in the NGHGI.
- 2. Assess how sinks and sources are created from the strong inter-annual climate variability in Australia, and therefore not part of the long-term trend driven by direct human activities.
- 3. Implications from using static empirical growth models, yield curves, and biomass maps in the NGHGI versus processes modeling or forest inventory approaches that include the indirect effects of a changing climate and atmospheric CO₂ (the CO₂ fertilization effect).
- 4. As the NGHGI focuses primarily on anthropogenic forest-to-no-forest (and back again) conversions, carbon sinks/sources from arid and semi-arid ecosystems could be missing in the inventory.
- 5. What do we learn from any remaining gaps once the above has been sort out? Have we identified new sources or sinks, key processes, hot spots, etc?

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RECCAP2-Australasia contributions

- Atmospheric Inversions & land surface modelling in Australia
 - Yohanna Villalobos, CSIRO, coordinating lead author
 - Peter Rayner, University of Melbourne.
 - Peter Briggs, land surface modeling, data analysis
 - Ian Harman, land surface modeling
 - Juergen Knauer, CSIRO, land-surface modeling
 - Ben Smith, WSU, CABLE-BIOS
 - Pabrir Patra (CO₂, NO₂ and CH₄)
 - Hanqin Tian, and Naiqing Pan (N₂O),
- Atmospheric Inversions & land surface modelling in NZ
 - Liz Keller, GNS, New Zealand
 - Timothy W. Hilton, GNS New Zealand
 - Beata Bukosa, NIWA
 - Sara Mikaloff-Fletcher, NIWA

LOAC (Land to ocean aquatic continuum)

- inland waters:
 - Ronny lauerwald
- Coastal ecosystem:
 - Judith Rosentreter, Yale University
 - Thomas Wernberg, UWA: blue carbon, kelp forest
 - Oscar Serrano, ECU: blue carbon, seagrass
- Shelf fluxes
 - Laure Resplandy, Princeton University
- Flux Inventories:
 - DAWE, DISER (Australian LUC, Agriculture, Fossil fuel)
 - Yohanna Villalobos, CSIRO, coordinating lead author
 - Pep Canadell, CSIRO, coordinating lead author
- Future projections:
 - Tilo Ziehn, CSIRO: CMIP6, Earth System modelling
 - Liz Keller, GNS, New Zealand

