

# IWGGMS

The 20th International Workshop on Greenhouse  
Gas Measurements from Space



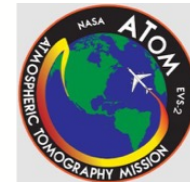
## Neutral Tropical African CO<sub>2</sub> Exchange Estimated From Aircraft and Satellite Observations

Session 5: Regional-to-Global Fluxes

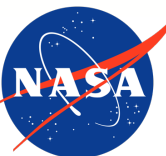
Friday, May 31, 2024



**Benjamin Gaubert, B. B. Stephens,  
NASA OCO-2 MIP team, NASA ATom CO<sub>2</sub> team**



Acknowledged funding from NASA OCO-2 (80NSSC18K1132)



# The African Carbon Budget

## Variability and recent trends in the African terrestrial carbon balance

P. Ciais<sup>1</sup>, S.-L. Piao<sup>2</sup>, P. Cadule<sup>1</sup>, P. Friedlingstein<sup>1</sup>, and A. Chédin<sup>3</sup>

### The carbon balance of Africa: synthesis of recent research studies

BY P. CIAIS<sup>1,\*</sup>, A. BOMBELLI<sup>2</sup>, M. WILLIAMS<sup>3</sup>, S. L. PIAO<sup>4</sup>, J. CHAVE<sup>5</sup>, C. M. RYAN<sup>3</sup>, M. HENRY<sup>2,6</sup>, P. BRENDER<sup>1,6</sup> AND R. VALENTINI<sup>2,7</sup>

<https://doi.org/10.5194/bg-11-381-2014>  
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28 Jan 2014

## A full greenhouse gases budget of Africa: synthesis, uncertainties, and vulnerabilities

R. Valentini, A. Arneeth, A. Bombelli, S. Castaldi, R. Cazzolla Gatti, F. Chevallier, P. Ciais, E. Grieco, J. Hartmann, M. Henry, R. A. Houghton, M. Jung, W. L. Kutsch, Y. Malhi, E. Mayorga, L. Merbold, G. Murray-Tortarolo, D. Papale, P. Peylin, B. Poulter, P. A. Raymond, M. Santini, S. Stith, G. Vaglio Laurin, G. R. van der Werf, C. A. Williams, and R. J. Scholes

Net terrestrial C **sink** of 0.15 PgC yr<sup>-1</sup> in the 1990s (Ciais et al., 2009)

Net carbon balance of African ecosystems [...] is a **sink** of the order of 0.2 PgC yr<sup>-1</sup> with a large uncertainty around this number (Ciais et al., 2011)

**RECCAP-1:** Regional Carbon Cycle Assessment and Processes (Valentini et al., 2014): Africa is a **small sink of CO<sub>2</sub>: 0.61 +/- 0.58 PgC yr<sup>-1</sup>** in the 2000s (Large IAV and uncertainties noted)

### RECCAP-2 (Ernst et al., 2024):

Carbon sink capacity is decreasing, switching from a small **sink** in RECCAP1 to a small source in RECCAP2 at **0.16 PgC yr<sup>-1</sup>**













# Global Biogeochemical Cycles

## RESEARCH ARTICLE

10.1029/2023GB008016

**Special Section:**  
Regional Carbon Cycle  
Assessment and Processes-2

## The African Regional Greenhouse Gases Budget (2010–2019)

Yolandi Ernst<sup>1</sup> , Sally Archibald<sup>2</sup>, Heiko Balzter<sup>3,4</sup> , Frederic Chevallier<sup>5</sup> , Philippe Ciais<sup>5</sup> , Carlos Gonzalez Fischer<sup>6</sup> , Benjamin Gaubert<sup>7</sup> , Thomas Higginbottom<sup>8</sup>, Steven Higgins<sup>9</sup>, Shakirudeen Lawal<sup>10</sup>, Fabrice Lacroix<sup>11,12</sup>, Ronny Lauerwald<sup>13</sup> , Mauro Lourenco<sup>2,14</sup> , Carola Martens<sup>15,16</sup>, Anteneh G. Mengistu<sup>17</sup>, Lutz Merbold<sup>18</sup> , Edward Mitchard<sup>19</sup> , Mthokozisi Moyo<sup>2</sup> , Hannah Nouven<sup>20</sup>, Michael O'Sullivan<sup>21</sup>, Pedro Rodriguez-Veiga<sup>22,23</sup> 

# The unexpected Northern Tropical African (NTA) source

ARTICLE

<https://doi.org/10.1038/s41467-019-11097-w>

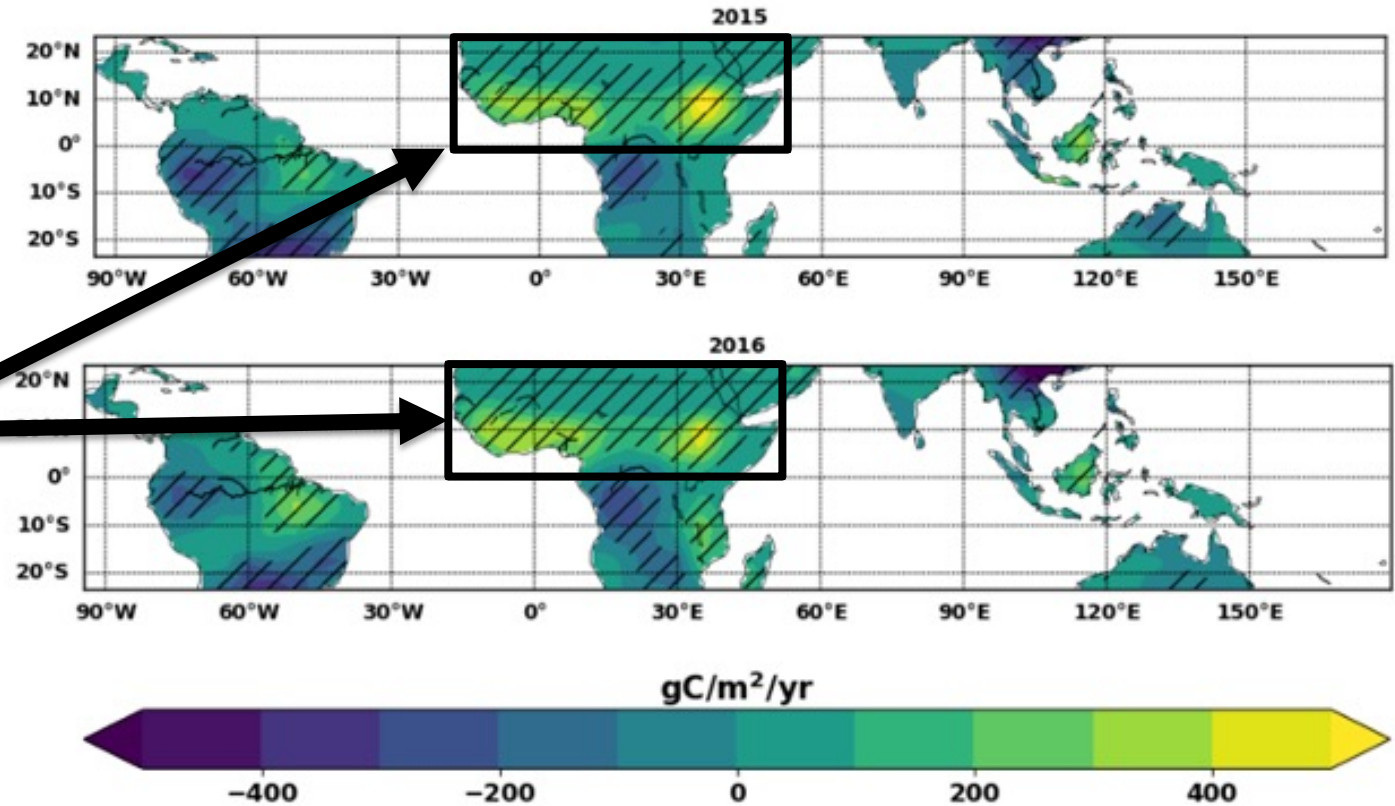
OPEN

Net carbon emissions from African biosphere dominate pan-tropical atmospheric CO<sub>2</sub> signal

Paul I. Palmer<sup>1,2</sup>, Liang Feng<sup>1,2</sup>, David Baker<sup>3</sup>, Frédéric Chevallier<sup>4</sup>, Hartmut Bösch<sup>5,6</sup> & Peter Somkuti<sup>5,6</sup>

“The largest emissions are found over western Ethiopia and western tropical Africa during March and April when it is **hottest and driest**”

Annual land flux is a **source** of around **1.5 PgC yr<sup>-1</sup>** (2015-2016)



Supplementary Figure 9: Annual mean distribution of CO<sub>2</sub> fluxes (gC/m<sup>2</sup>/yr) over tropical continents inferred from OCO-2 XCO<sub>2</sub> data, 2015–2016.

	GOSAT/ACOS			GOSAT		OCO-2		
	UoE	UoE	UoE	LSCE	CSU	Mean	Median	Std
2015	0.60	0.69	1.89	1.54	1.91	1.33	1.54	0.64
2016		1.45	2.02	1.34	2.54	1.84	1.74	0.56

NTA (TransCom 5b) annual means flux (PgC yr<sup>-1</sup>), adapted from Table 1 (Palmer et al., 2019)



# Orbiting Carbon Observatory-2 (OCO-2) model intercomparison project (MIP)

12 models x 5 experiments: 54 available inversions

1. In-Situ (IS)
2. Ocean Glint (OG)
3. Land Nadir Land Glint (LNLG)
4. Land Nadir Land Glint In-Situ (LNLGIS)
5. LNLGOGIS

**v7 MIP:** OCO-2 inversions indicate a **source** in northern tropical Africa (TransCom 05b) in (November–March)

**v9 MIP:** Annual land flux is a **source** of around **1.26 +/- 0.58 PgC yr<sup>-1</sup>** (2015-2018, v9 MIP)

**v10 MIP:** Annual land flux (LNLG) is a **source** of around **0.89 +/- 0.88 PgC yr<sup>-1</sup>** (2015-2020, v10 MIP)

## The 2015–2016 carbon cycle as seen from OCO-2 and the global in situ network

Sean Crowell<sup>1</sup>, David Baker<sup>2</sup>, Andrew Schuh<sup>2</sup>, Sourish Basu<sup>3,4</sup>, Andrew R. Jacobson<sup>3,4</sup>, Frederic Chevallier<sup>5</sup>, Junjie Liu<sup>6</sup>, Feng Deng<sup>7</sup>, Liang Feng<sup>8,9</sup>, Kathryn McKain<sup>3,4</sup>, Abhishek Chatterjee<sup>10,11</sup>, John B. Miller<sup>4</sup>, Britton B. Stephens<sup>13</sup>, Annmarie Eldering<sup>6</sup>, David Crisp<sup>6</sup>, David Schimel<sup>6</sup>, Ray Nassar<sup>12</sup>, Christopher W. O'Dell<sup>2</sup>, Tomohiro Oda<sup>10,11</sup>, Colm Sweeney<sup>4</sup>, Paul I. Palmer<sup>8,9</sup>, and Dylan B. A. Jones<sup>7</sup>

v7 MIP: Crowell et al., 2019

## Four years of global carbon cycle observed from the Orbiting Carbon Observatory 2 (OCO-2) version 9 and in situ data and comparison to OCO-2 version 7

Hélène Peiro<sup>1</sup>, Sean Crowell<sup>1</sup>, Andrew Schuh<sup>2</sup>, David F. Baker<sup>2</sup>, Chris O'Dell<sup>2</sup>, Andrew R. Jacobson<sup>3,4</sup>, Frédéric Chevallier<sup>5</sup>, Junjie Liu<sup>6</sup>, Annmarie Eldering<sup>6</sup>, David Crisp<sup>6</sup>, Feng Deng<sup>7</sup>, Brad Weir<sup>8,9</sup>, Sourish Basu<sup>10,11</sup>, Matthew S. Johnson<sup>12</sup>, Sajeev Philip<sup>13,a</sup>, and Ian Baker<sup>14</sup>

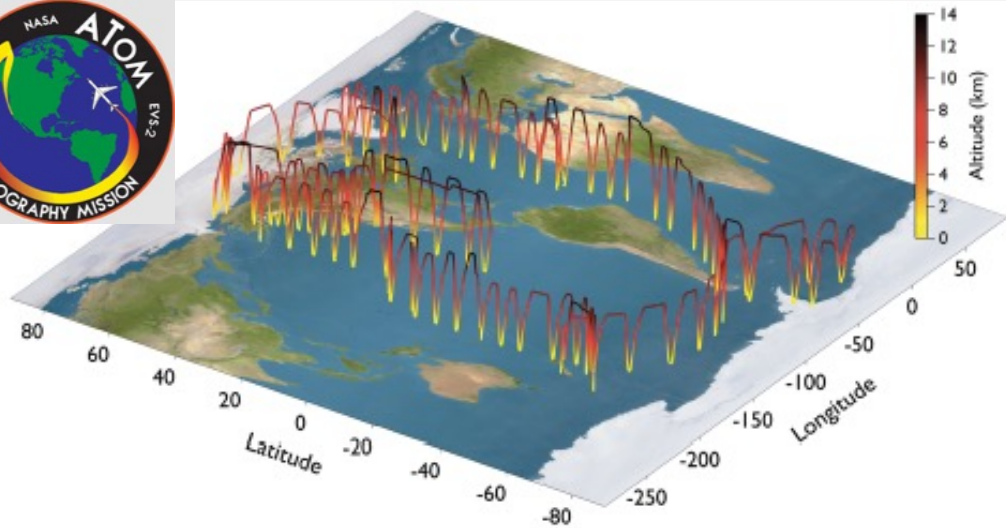
v9 MIP: Peiro et al., 2022

## National CO<sub>2</sub> budgets (2015–2020) inferred from atmospheric CO<sub>2</sub> observations in support of the Global Stocktake

Brendan Byrne<sup>1</sup>, David F. Baker<sup>2</sup>, Sourish Basu<sup>3,4</sup>, Michael Bertolacci<sup>5</sup>, Kevin W. Bowman<sup>1,6</sup>, Dustin Carroll<sup>7,1</sup>, Abhishek Chatterjee<sup>1</sup>, Frédéric Chevallier<sup>8</sup>, Philippe Ciais<sup>8</sup>, Noel Cressie<sup>5,1</sup>, David Crisp<sup>1</sup>, Sean Crowell<sup>9</sup>, Feng Deng<sup>10</sup>, Zhu Deng<sup>11</sup>, Nicholas M. Deutscher<sup>12</sup>, Manvendra K. Dubey<sup>13</sup>, Sha Feng<sup>14</sup>, Omaira E. Garcia<sup>15</sup>, David W. T. Griffith<sup>12</sup>, Benedikt Herkommer<sup>16</sup>, Lei Hu<sup>17,18</sup>, Andrew R. Jacobson<sup>17,18</sup>, Rajesh Janardanan<sup>19</sup>, Sujong Jeong<sup>20</sup>, Matthew S. Johnson<sup>21</sup>, Dylan B. A. Jones<sup>10</sup>, Rigel Kivi<sup>22</sup>, Junjie Liu<sup>1,23</sup>, Zhiqiang Liu<sup>24</sup>, Shamil Maksyutov<sup>19</sup>, John B. Miller<sup>17</sup>, Scot M. Miller<sup>25</sup>, Isamu Morino<sup>19</sup>, Justus Notholt<sup>26</sup>, Tomohiro Oda<sup>27,28</sup>, Christopher W. O'Dell<sup>2</sup>, Young-Suk Oh<sup>29</sup>, Hirofumi Ohyama<sup>19</sup>, Prabir K. Patra<sup>30</sup>, Hélène Peiro<sup>9</sup>, Christof Petri<sup>26</sup>, Sajeev Philip<sup>31</sup>, David F. Pollard<sup>32</sup>, Benjamin Poulter<sup>3</sup>, Marine Remaud<sup>8</sup>, Andrew Schuh<sup>2</sup>, Mahesh K. Sha<sup>33</sup>, Kei Shiomi<sup>34</sup>, Kimberly Strong<sup>10</sup>, Colm Sweeney<sup>17</sup>, Yao Te<sup>35</sup>, Hanqin Tian<sup>36,37</sup>, Voltaire A. Velasco<sup>12,38</sup>, Mihalis Vrekoussis<sup>39,26</sup>, Thorsten Warneke<sup>26</sup>, John R. Worden<sup>1</sup>, Debra Wunch<sup>10</sup>, Yuanzhi Yao<sup>36</sup>, Jeongmin Yun<sup>20</sup>, Andrew Zammit-Mangion<sup>5</sup>, and Ning Zeng<sup>28,4</sup>

v10 MIP: Byrne et al., 2023

# NASA Atmospheric Tomography Mission (ATom)



## 4 aircraft campaigns:

**ATom-1: August 2016**

**ATom-2: February 2017**

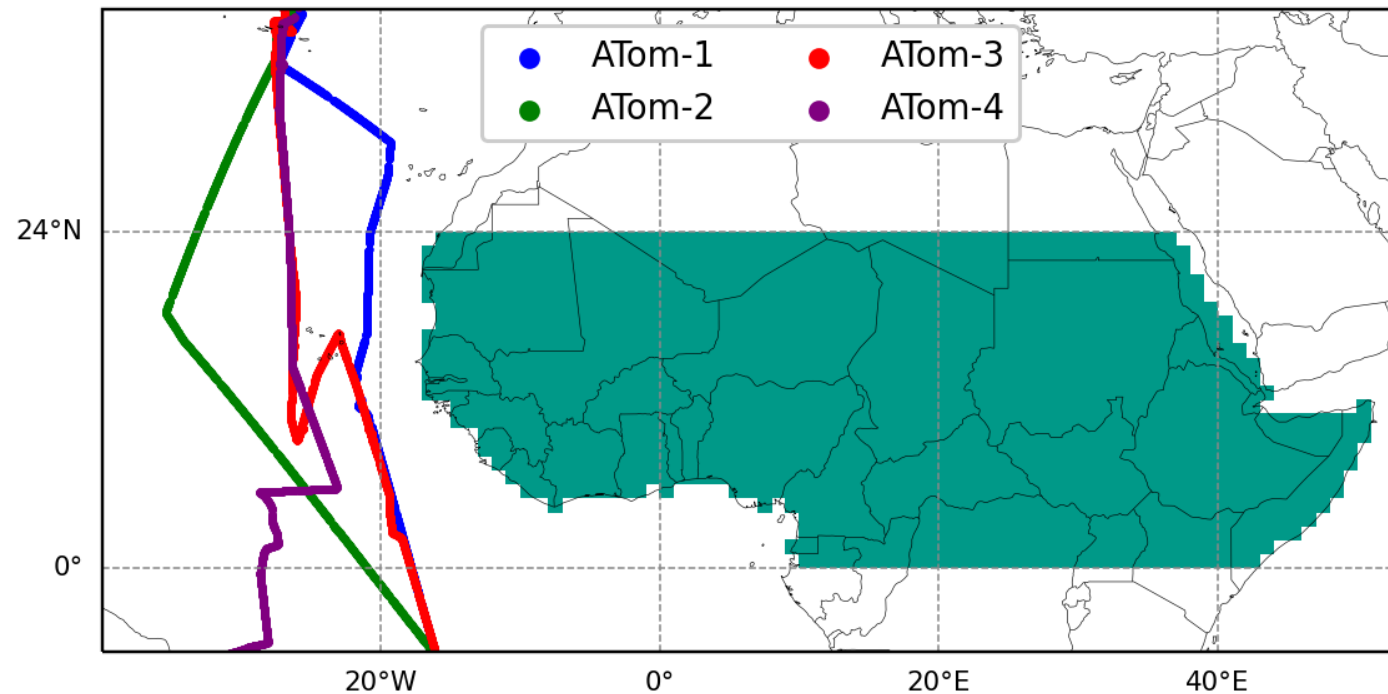
**ATom-3: October 2017**

**ATom-4: May 2018**

Thompson et al. BAMS, 2022

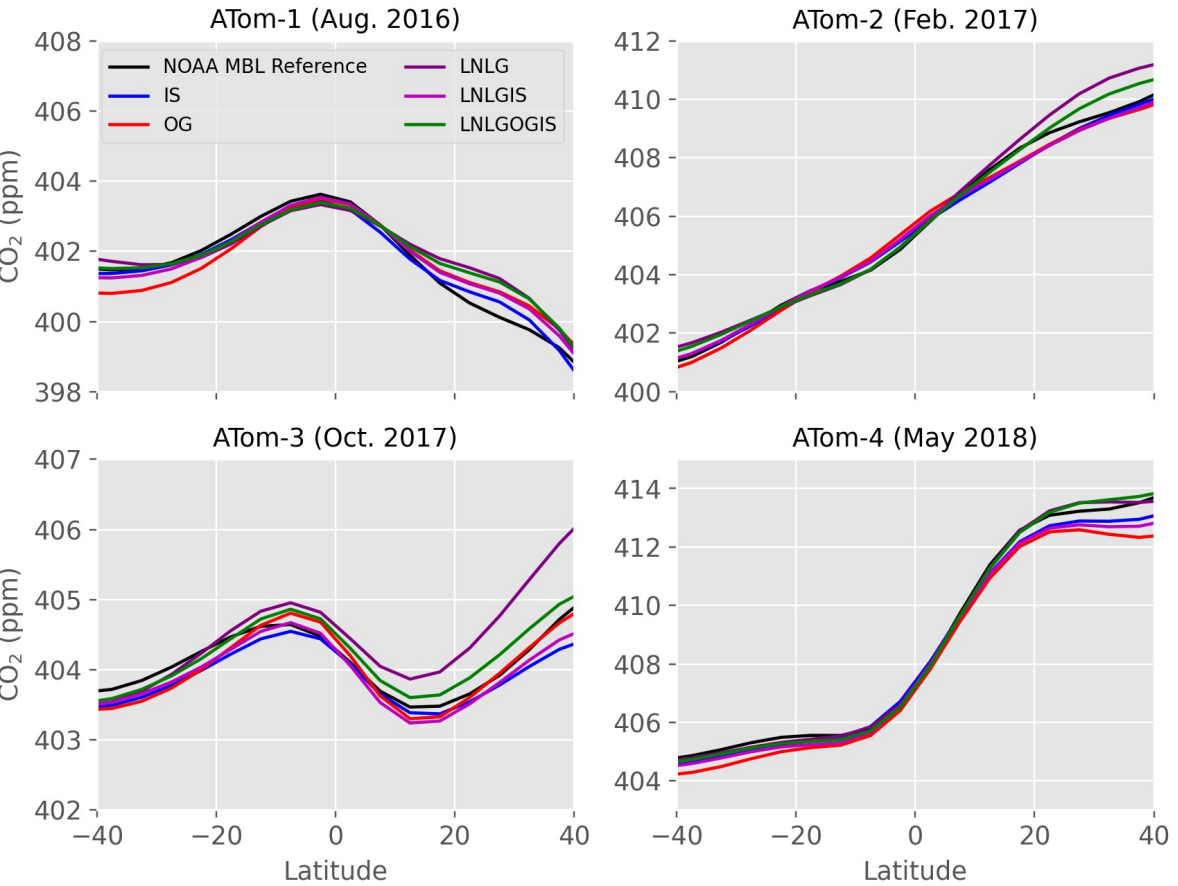
**ATom surveyed downwind  
of Tropical Africa in 4  
seasons**

NTA (TransCom 05b)



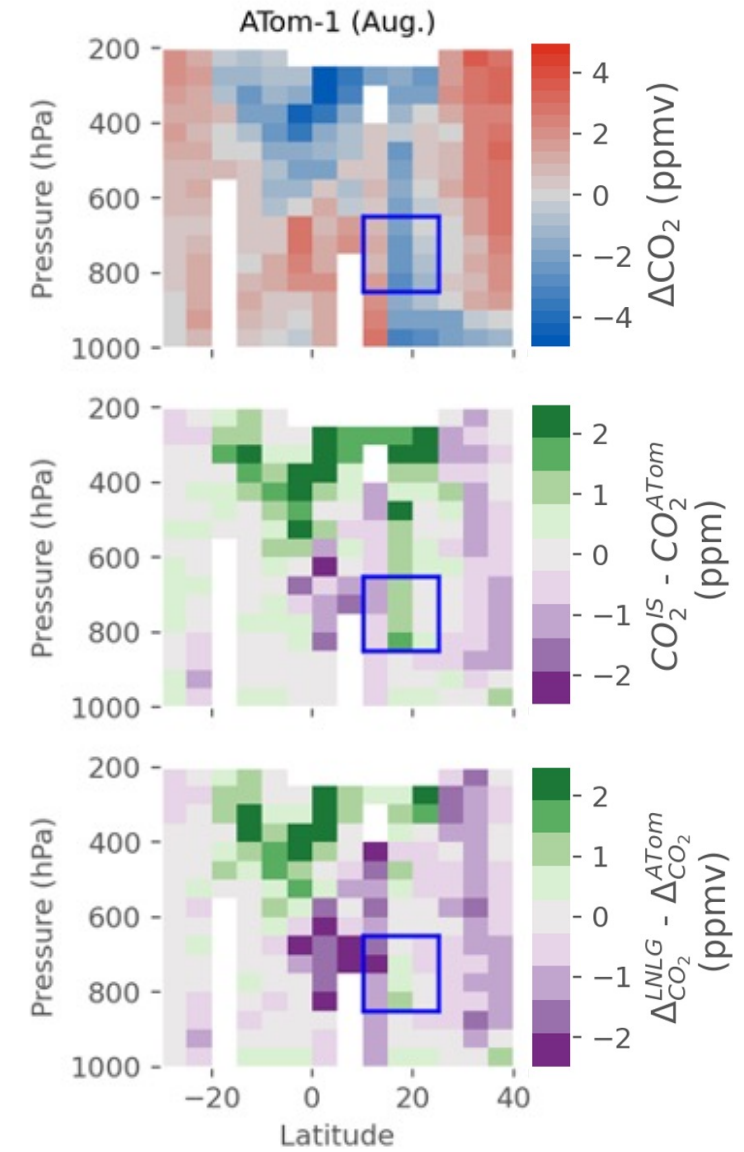
# NOAA Marine Boundary Layer reference

Metric to look at ATom signals: subtract the latitudinal gradient of CO<sub>2</sub>

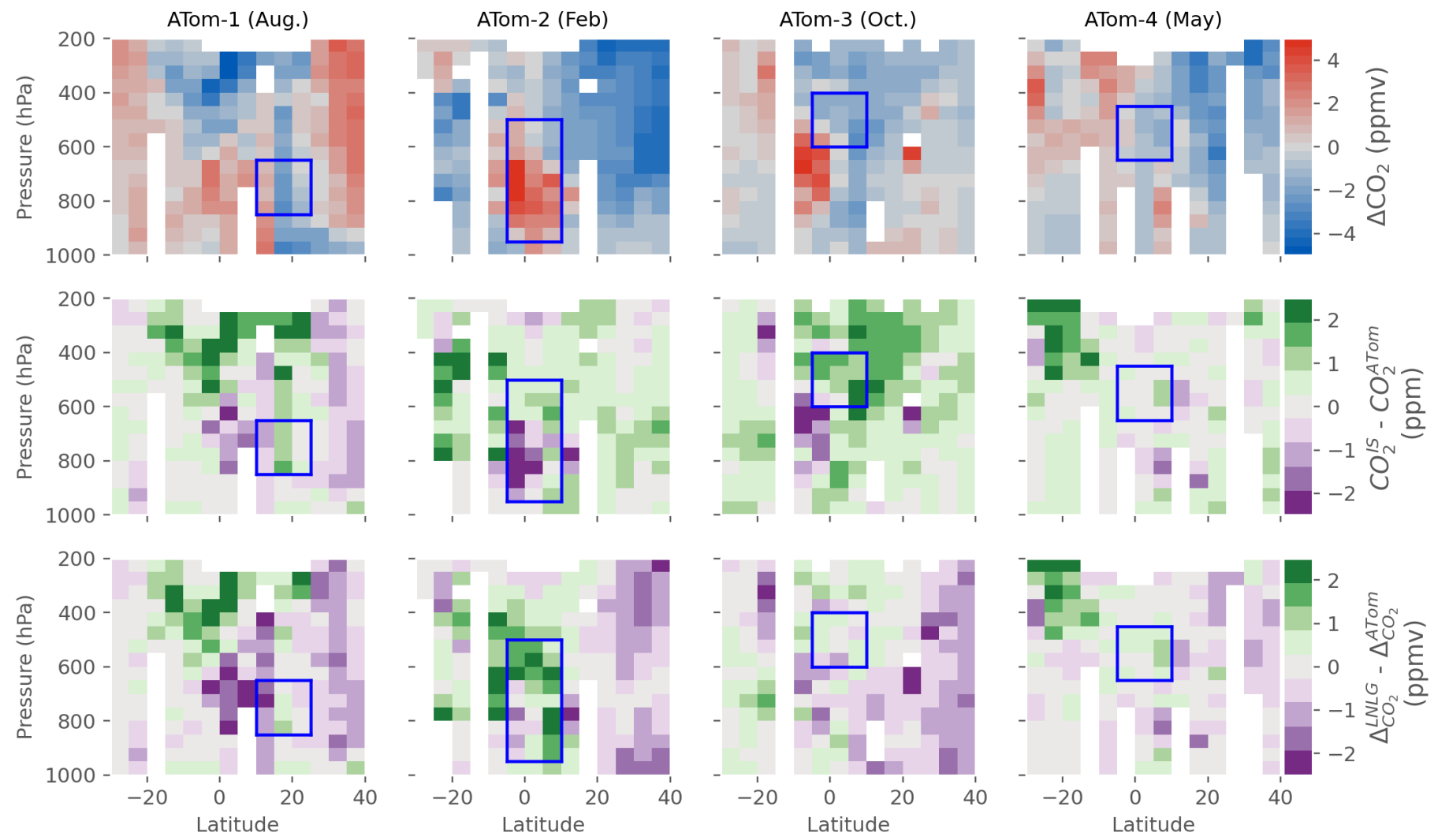


Surface in-situ: Weekly NOAA MBL / 5° Latitude

$$\Delta CO_2 = CO_2 (\text{ATom}) - CO_2 (\text{NOAA-MBL})$$



# ATom vs. v10 MIP



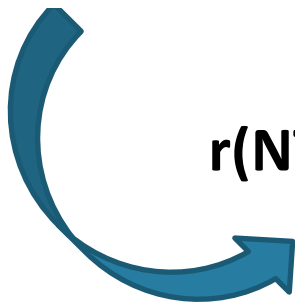
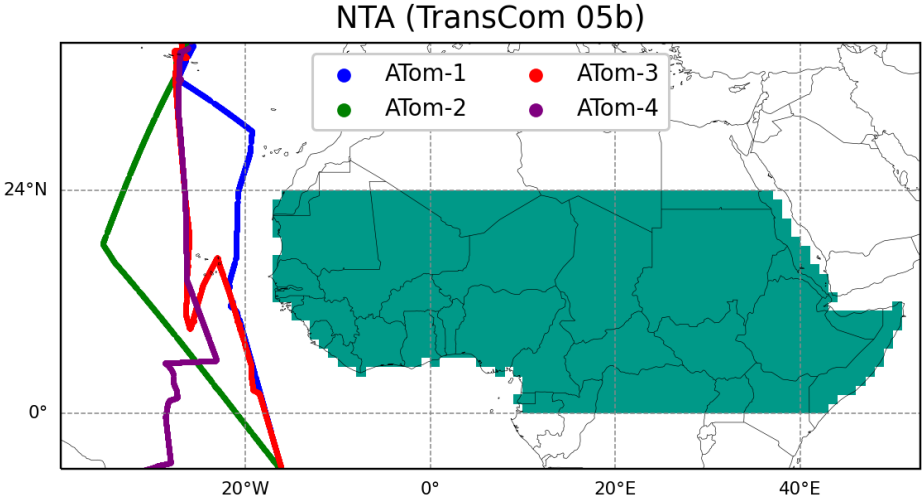
ATom data average in  $5^\circ$  Latitude and 100 hPa pressure bin.

$\Delta\text{CO}_2$  is calculated for ATom and MBL obs. or ATom and MBL inverse models

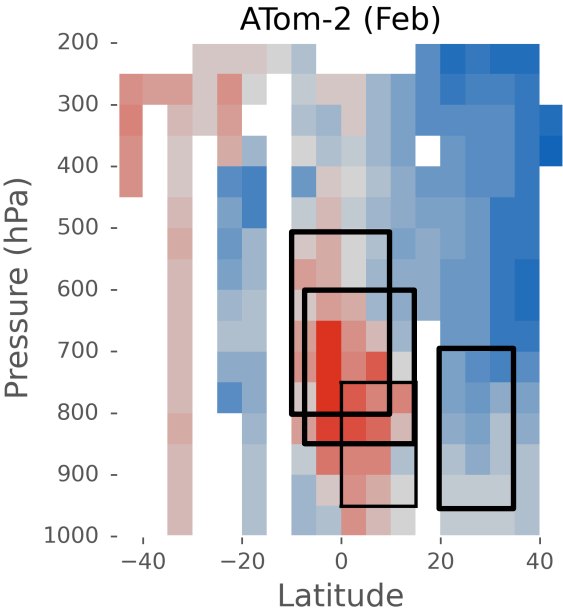
# Atom emergent constraint: NTA flux monthly mean vs. Posterior $\Delta\text{CO}_2$

ATom-2 example (February 2017)

NTA flux monthly mean



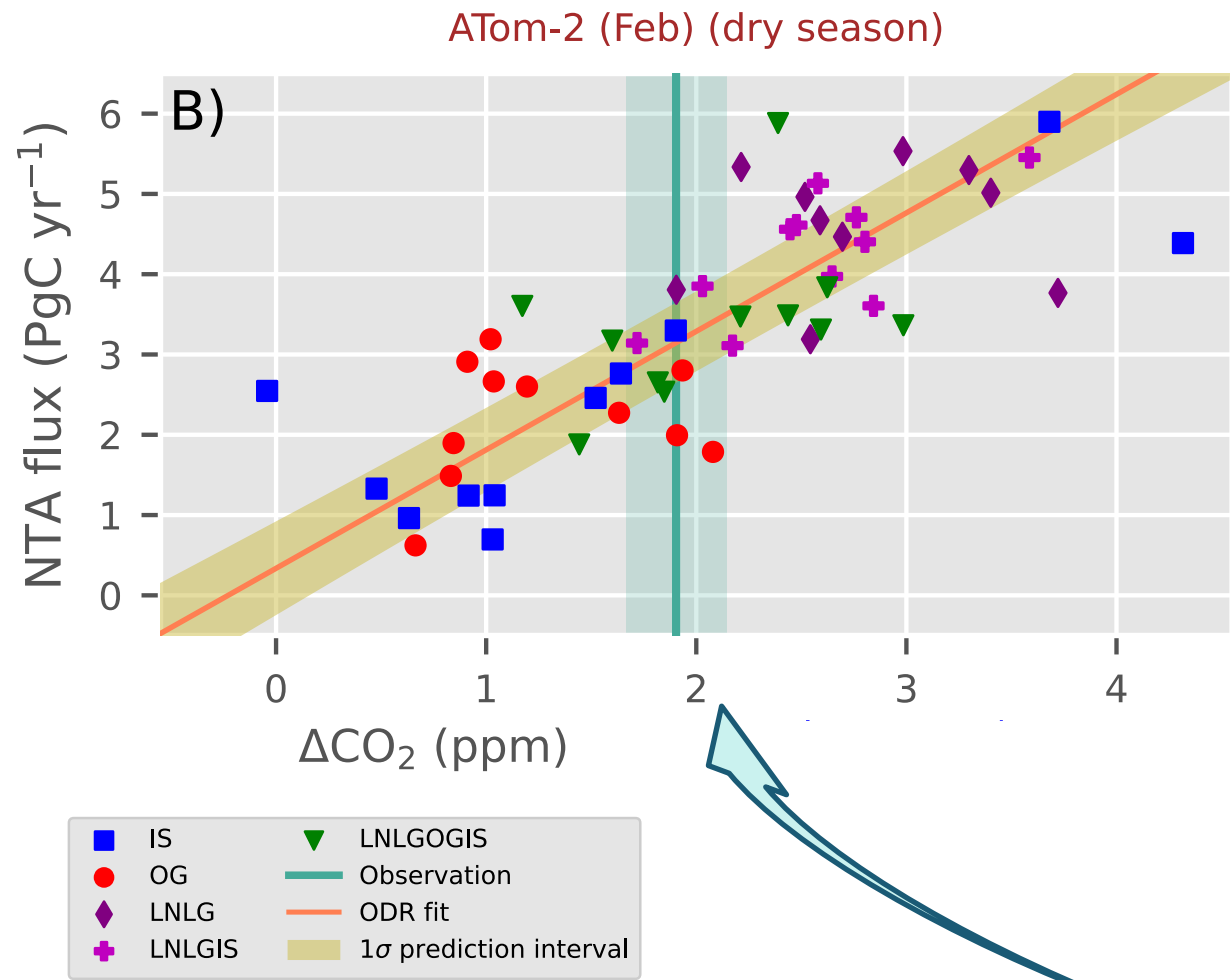
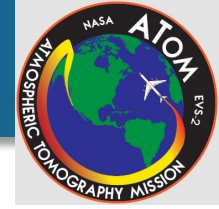
**Calculate correlation**  
 **$r(\text{NTA NBE, Posterior model } \Delta\text{CO}_2)$**



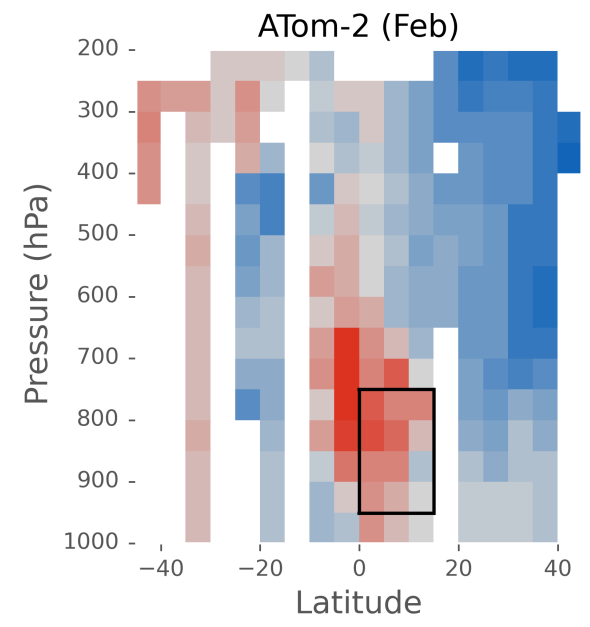
**Posterior  $\Delta\text{CO}_2$  for each inversions**  
Boxes: minimum width of 15 degrees and minimum height of 300 hPa



# Atom emergent constraint: NTA flux monthly mean vs. Posterior $\Delta\text{CO}_2$

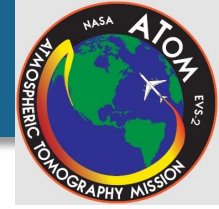


## 1 box (Highest correlation)



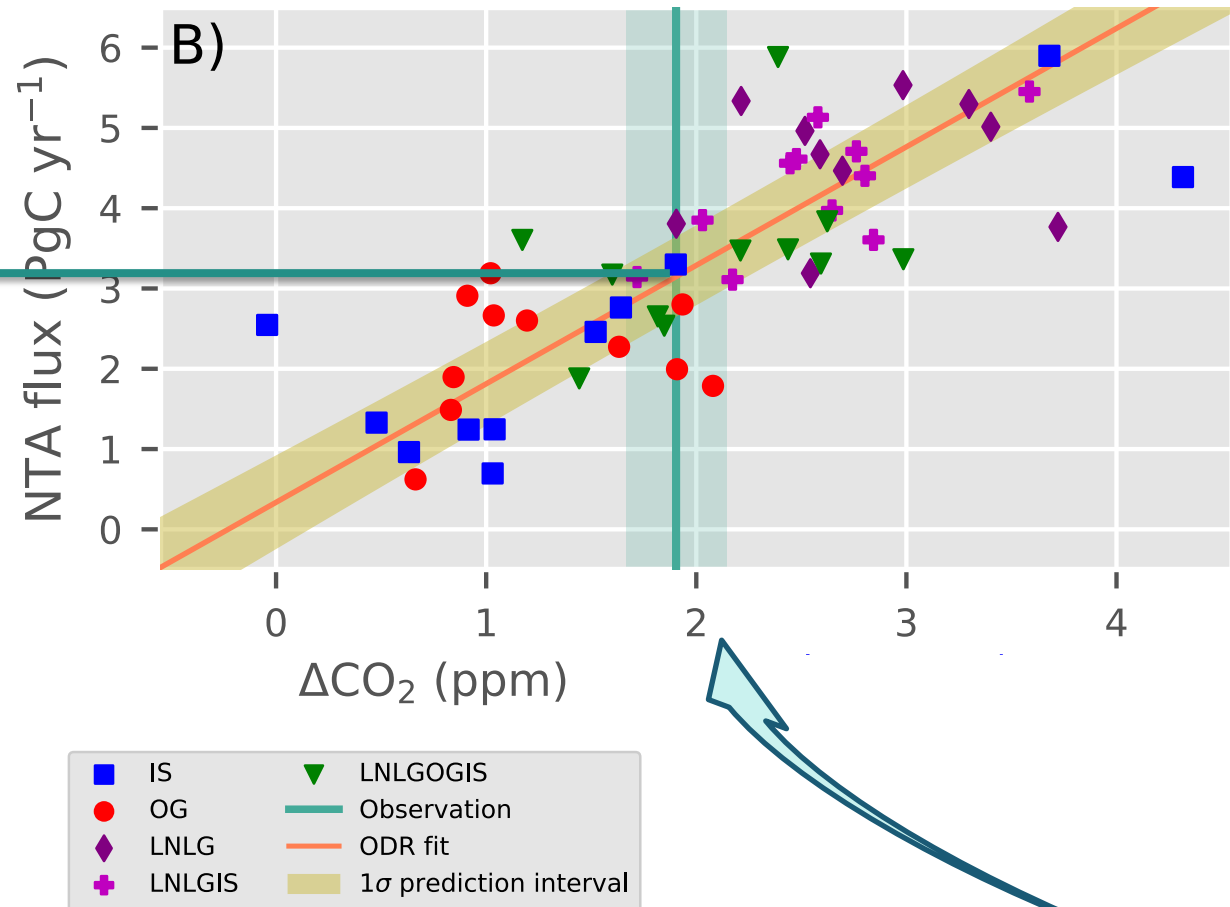
Posterior  $\Delta\text{CO}_2$  for each inversions  
+ Observed  $\Delta\text{CO}_2$

# Atom emergent constraint: NTA flux monthly mean vs. Posterior $\Delta\text{CO}_2$

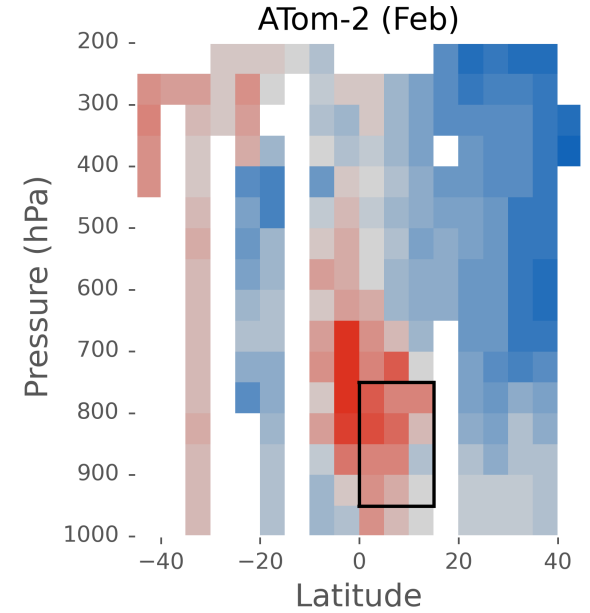


ATom-2 (Feb) (dry season)

**Emergent Constraints**  
 NTA NBE  
 land flux:  
 ATom-2:  
 3.15 +/- 0.6  
 PgC/yr

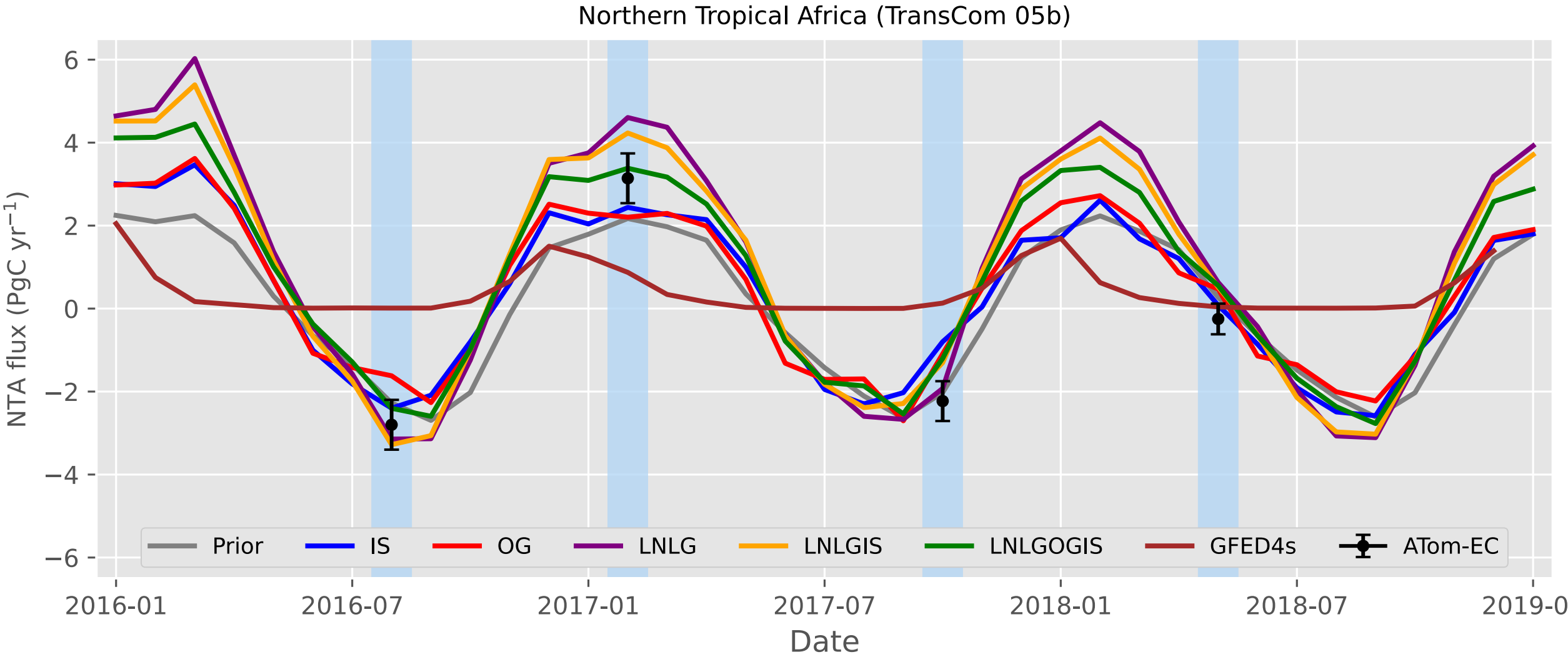


## 1 box (Highest correlation)



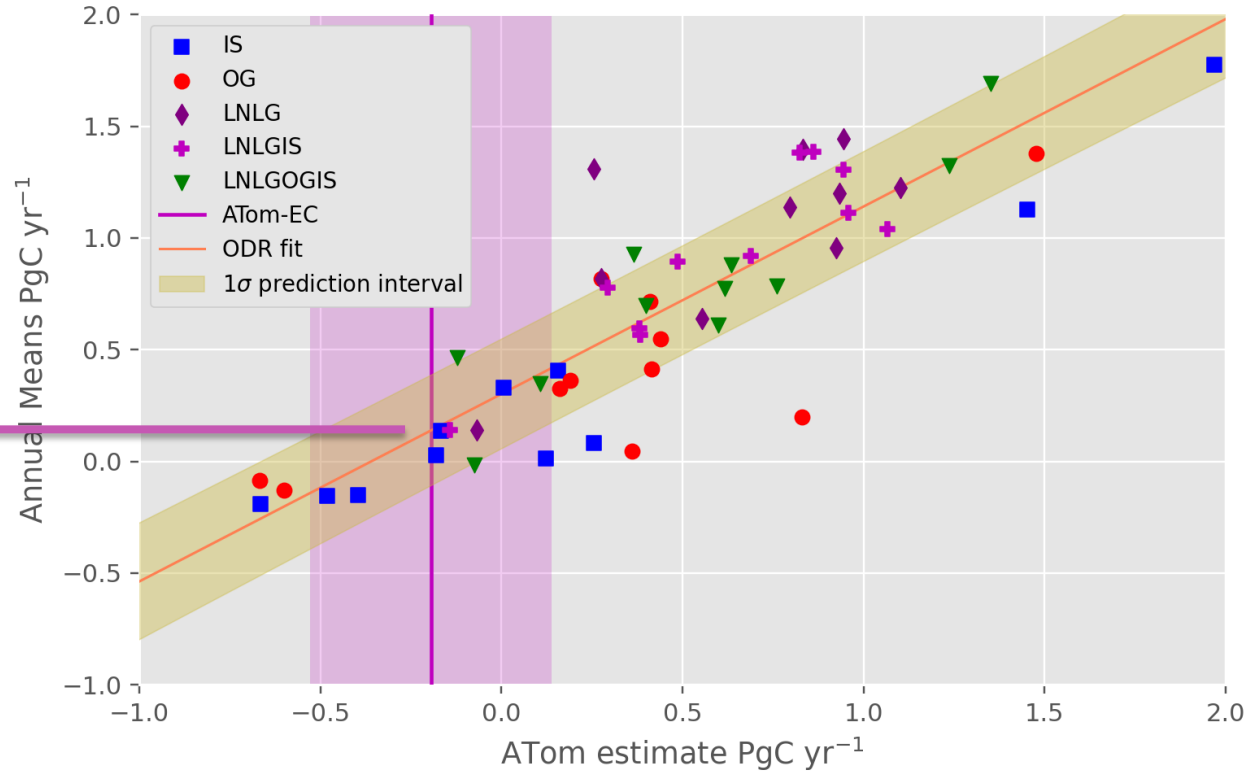
Posterior  $\Delta\text{CO}_2$  for each inversions  
 + Observed  $\Delta\text{CO}_2$

# Atom emergent constraint: monthly time series

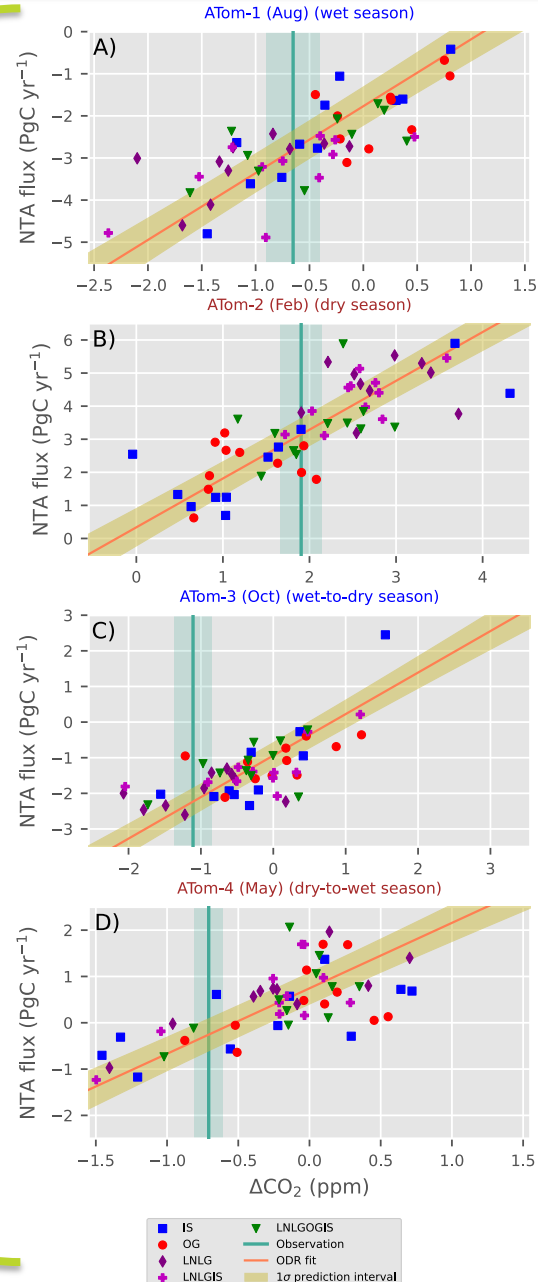


# 2016–2018 Mean Flux Estimates

**0.14 +/- 0.39  
PgC yr<sup>-1</sup>  
(2016-2018)**

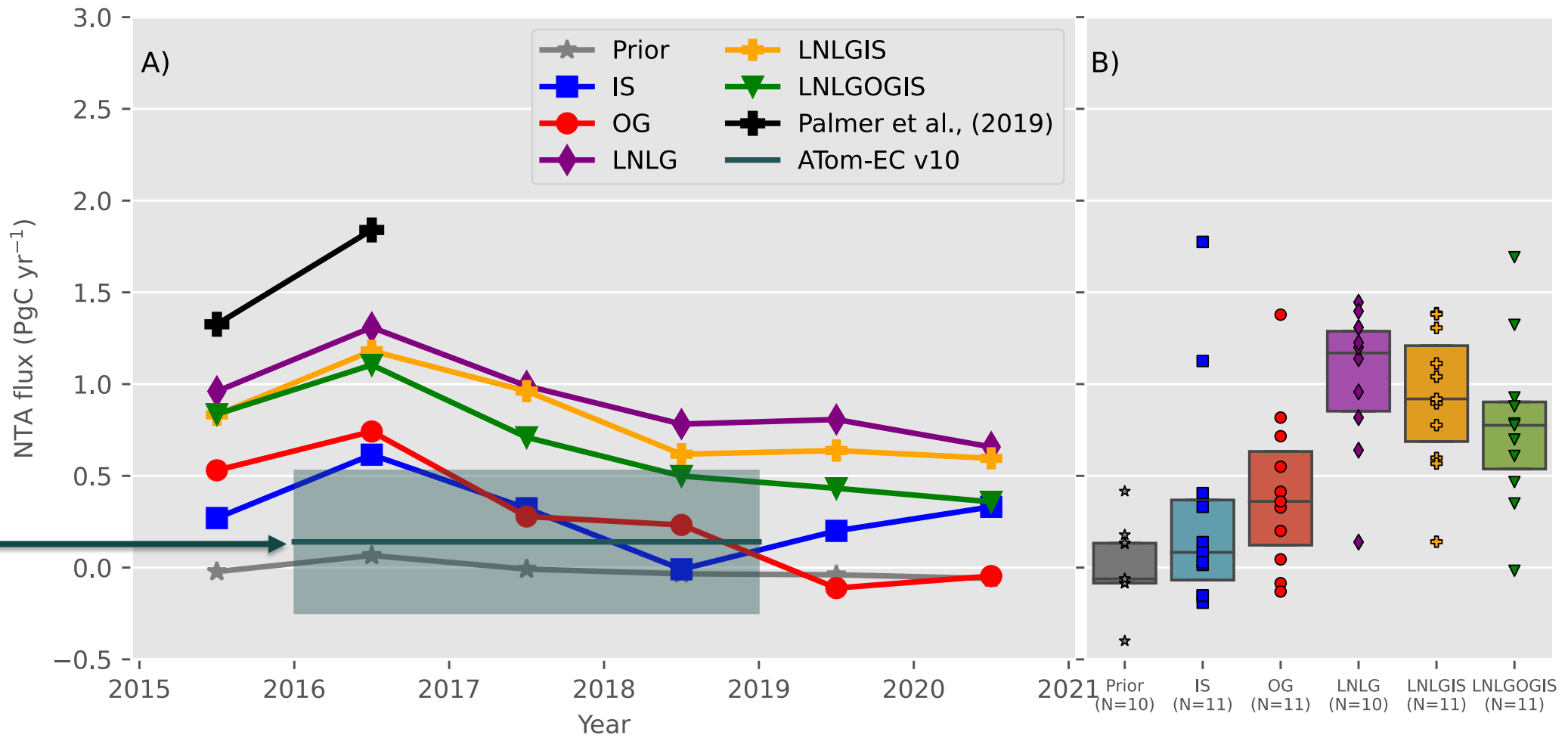


4-ATom estimates



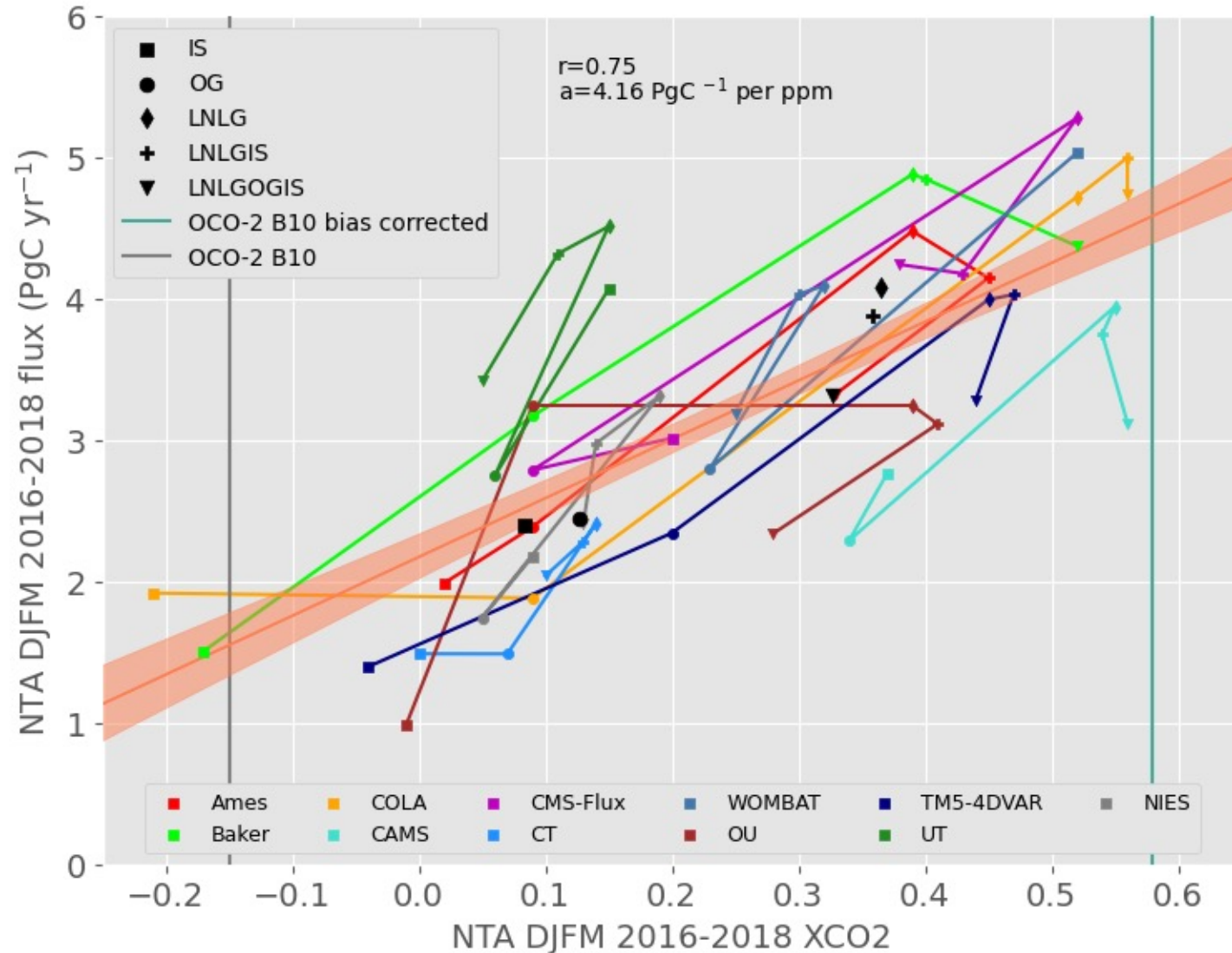
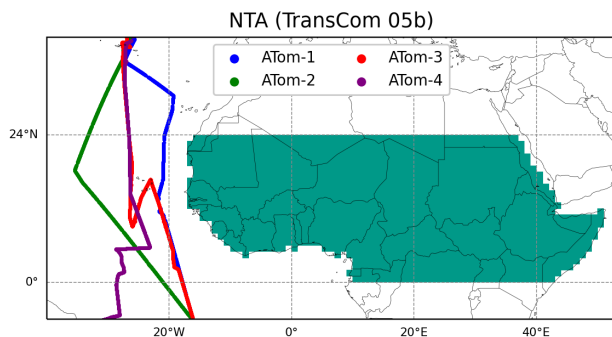
# 2016-2018 Mean Flux Estimates

**0.14 +/- 0.39  
PgC yr<sup>-1</sup>  
(2016-2018)**



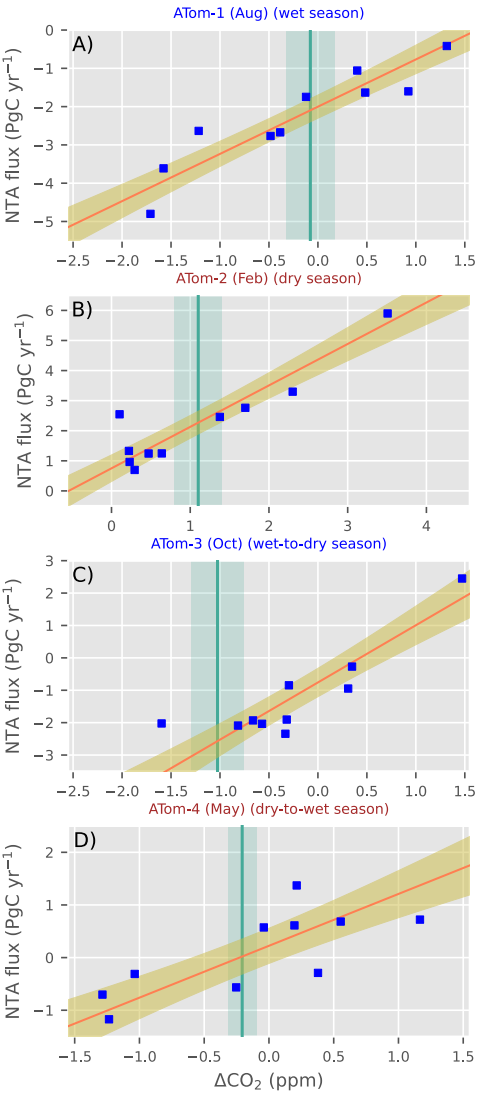
# OCO-2 biases impact on flux inversions

- ❖ Linear relationship with higher posterior XCO<sub>2</sub> resulting from higher fluxes (DJFM).
- ❖ The linear regression has an  $r^2$  of 0.56 and a slope of  $4.16 \text{ PgC yr}^{-1}$  per ppm.
- ❖ This slope implies that a flux error of  $1 \text{ PgC yr}^{-1}$  could result from an XCO<sub>2</sub> bias of  $+0.72 \text{ ppm}$  if entirely within DJFM, or  $+0.24 \text{ ppm}$  if the bias persisted all year.

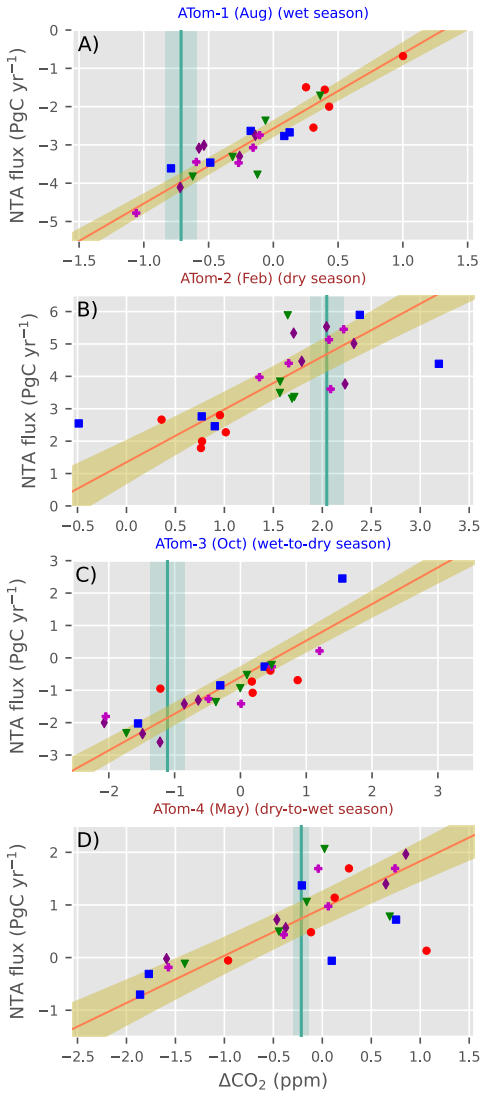


# Atom emergent constraint:

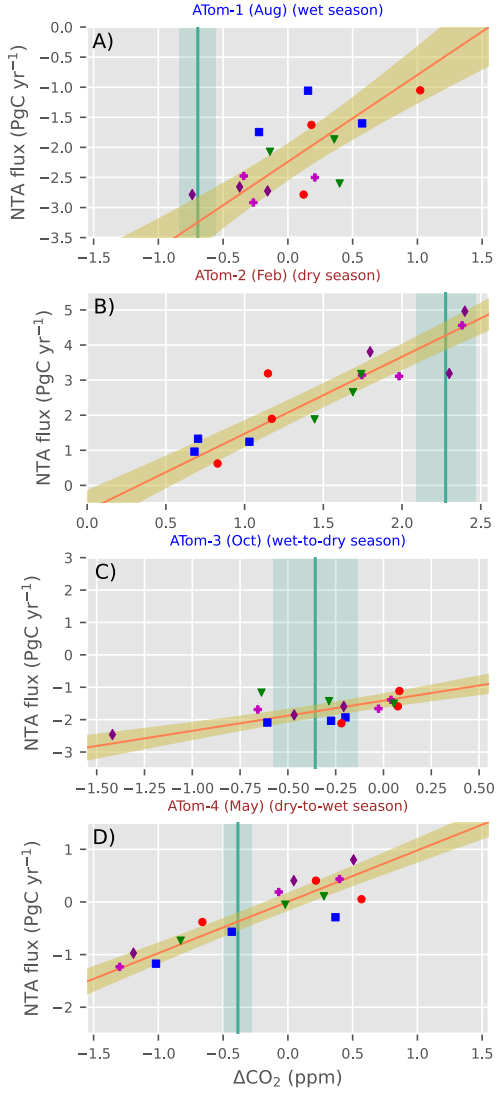
## IS only



## GEOS-chem only



## TM5 only



Northern Tropical Africa (NTA) annual means (2016-2018)

- ✓  $0.14 \pm 0.39 \text{ PgC yr}^{-1}$  (N=54)
- ✓  $0.08 \pm 0.33 \text{ PgC yr}^{-1}$  (N=10, IS)
- ✓  $0.27 \pm 0.36 \text{ PgC yr}^{-1}$  (N=3x5, TM5 only)
- ✓  $0.8 \pm 0.43 \text{ PgC yr}^{-1}$  (N=5x5, GEOS-chem only)

— Observation — ODR fit  
■ IS

■ IS ■ LNLGOGIS  
● OG ● Observation  
◆ LNLG — ODR fit  
◆ LNLGIS — 1σ prediction interval

■ IS ■ LNLGOGIS  
● OG ● Observation  
◆ LNLG — ODR fit  
◆ LNLGIS — 1σ prediction interval

# Conclusions

- ❖ We evaluated inverse model calculations of northern tropical African CO<sub>2</sub> fluxes with aircraft measurements over the Atlantic Ocean.
  - ✓ During the dry season (DJFM): NTA land fluxes are **overestimated** by the **LNLG experiment**, and **underestimated** by the **IS** and **OG** experiments.
  - ✓ In other seasons (ATom 1, 3 and 4) clearly demonstrate the improved fluxes following **OCO-2 assimilation w.r.t IS only inversions**.
  - ✓ Despite cloud coverage, OCO-2 based inversions do have a stronger sink during the wet season, in agreement with ATom emergent constraints
- ❖ We derived the **three-year annual mean flux estimate of 0.14 +/- 0.39 PgC yr<sup>-1</sup> (2016-2018)**
  - ✓ XCO<sub>2</sub> bias of +0.72 ppm (DJFM), or +0.24 ppm if the bias persisted all year.
  - ✓ The ATom emergent constraint is driven by aircraft in-situ observation

## References:

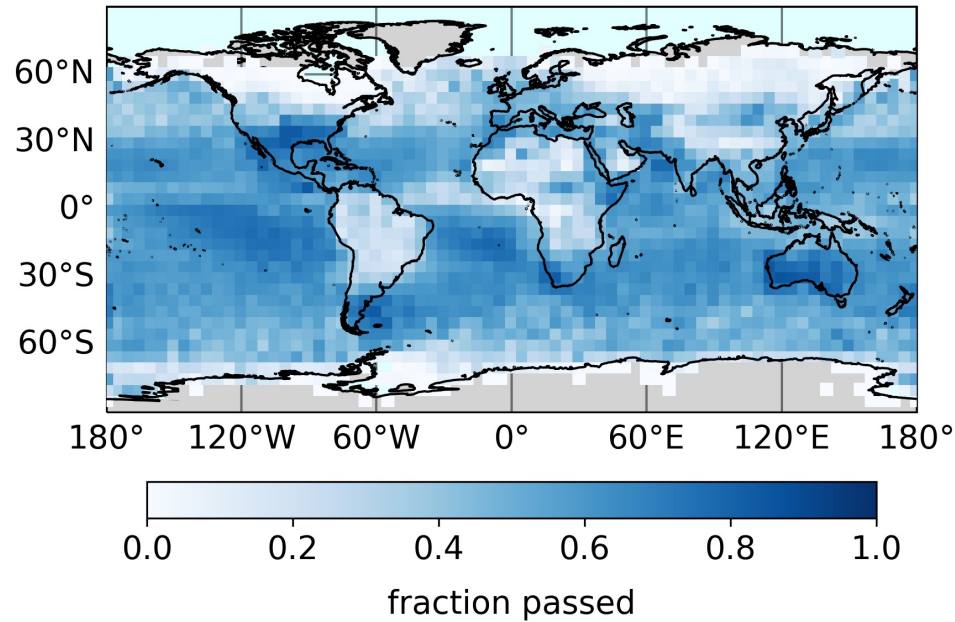
[Ernst et al.: The African Regional Greenhouse Gases Budget \(2010–2019\)](#)

[Gaubert et al.: Neutral Tropical African CO<sub>2</sub> Exchange Estimated From Aircraft and Satellite Observations](#)

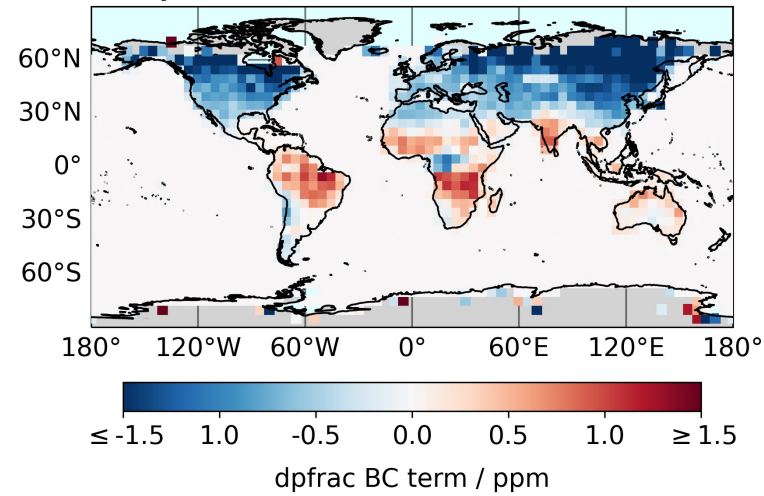


# OCO-2 bias correction

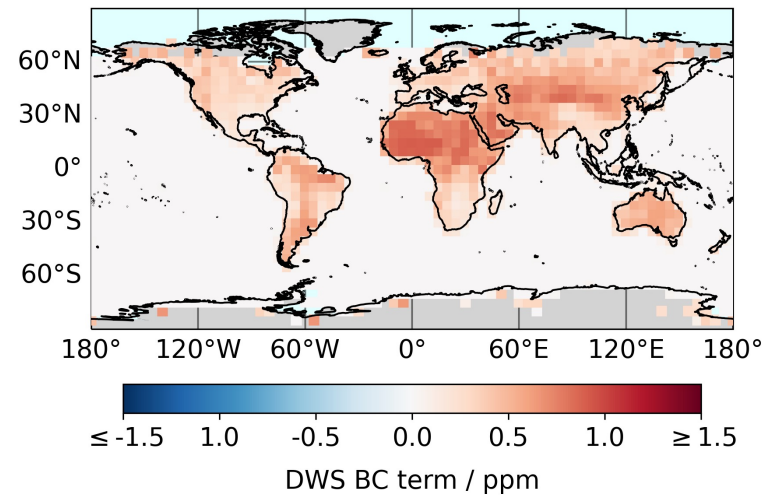
(b) Fraction in lite files passing quality filters



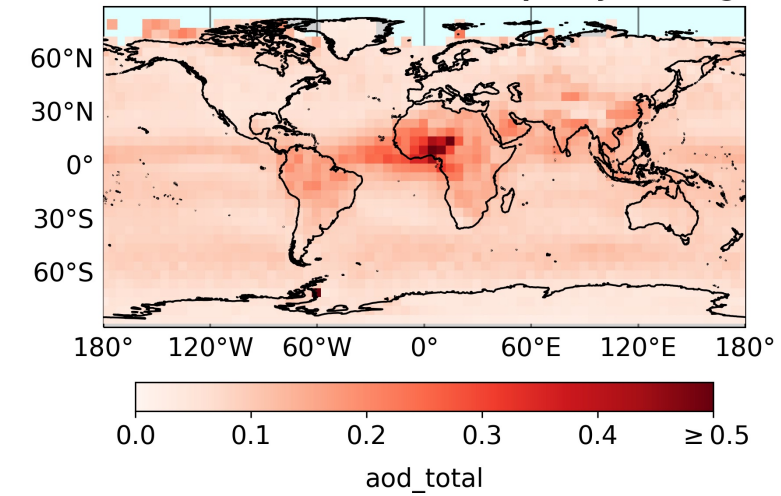
(c) dpfrac contribution to bias correction



(e) DWS contribution to bias correction



(d) Retrieved total AOD before quality filtering



(f) Retrieved total AOD after quality filtering

