



# Evaluating the impact of AIRS mid-troposphere CO<sub>2</sub> on the tropical surface CO<sub>2</sub> flux estimation

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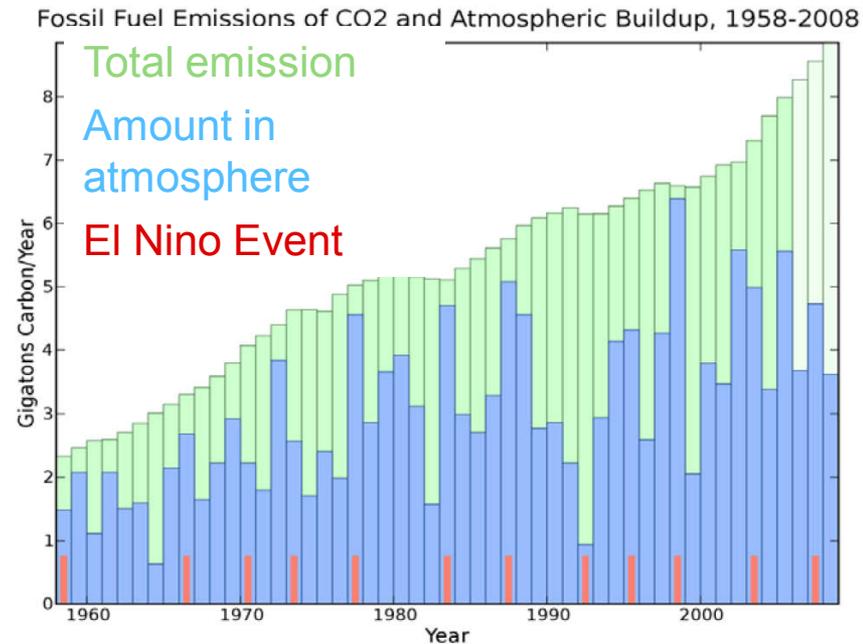
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# Motivation and Objectives

Only about half of the fossil fuel emissions remains in the atmosphere. Where the other half goes?

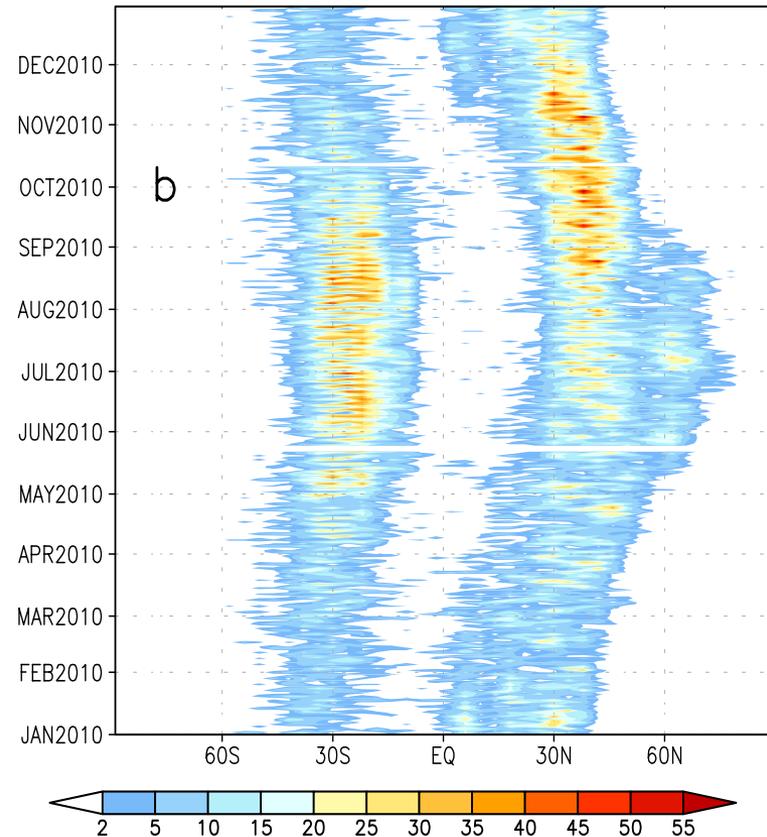
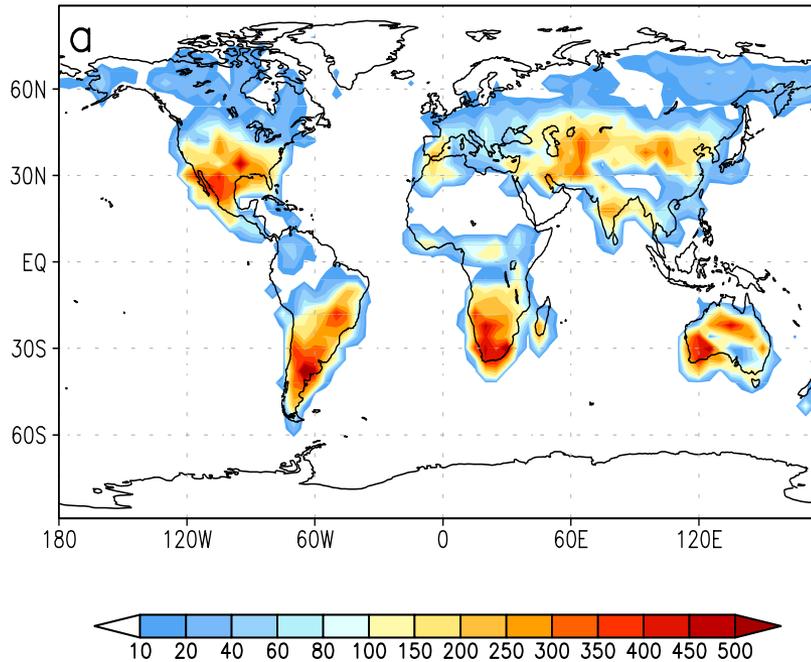
- Could mid-troposphere CO2 help constrain the surface flux forcing in addition to the column CO2 ( $X_{CO_2}$ ) from Greenhouse gases Observing SATellite (GOSAT)?
  - What is the sensitivity of AIRS mid-troposphere CO2 to surface flux forcing?
  - What is the impact of AIRS CO2 on surface flux estimation with OSSEs?



# GOSAT observation coverage for year 2010

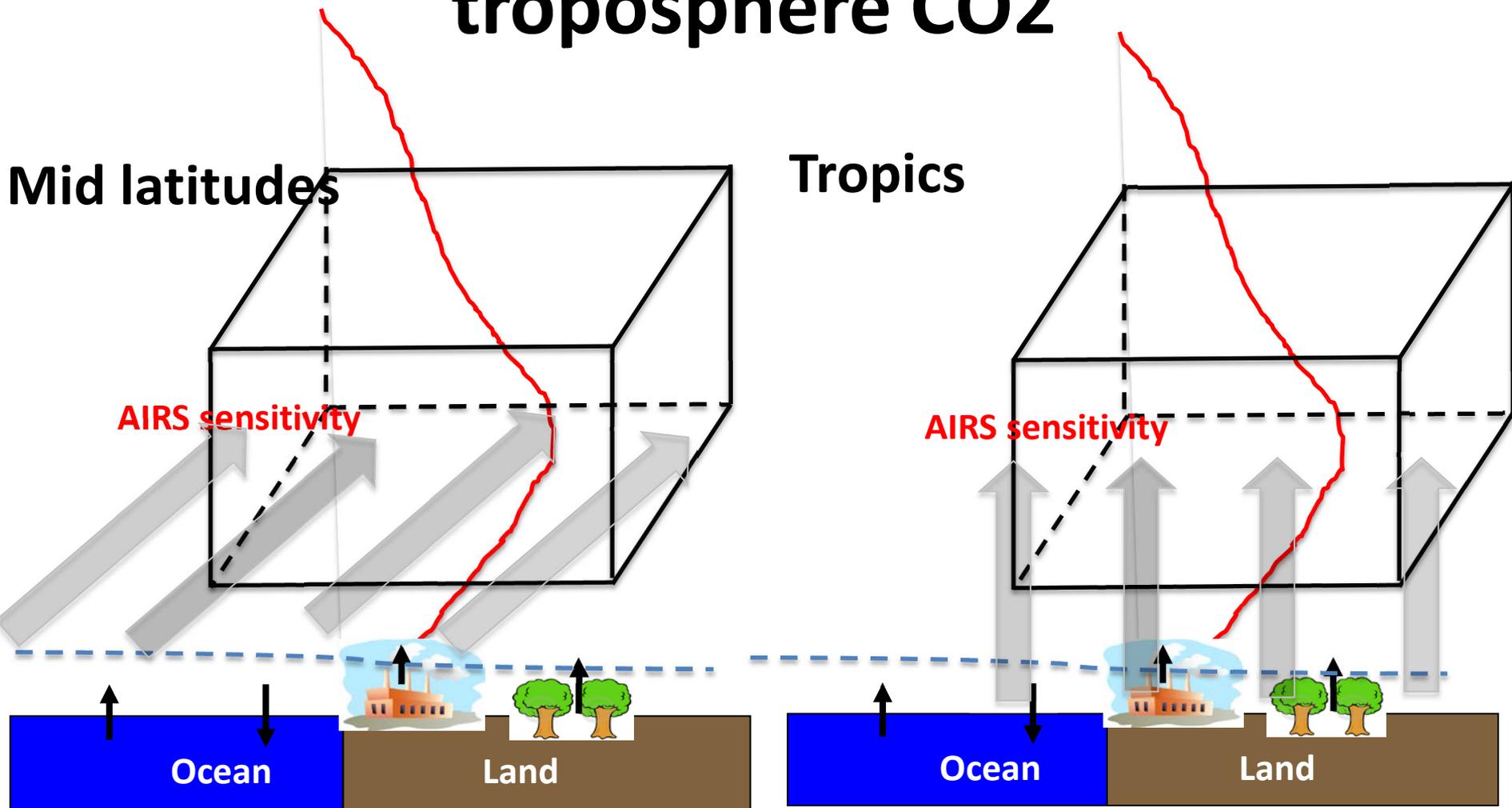
n good GOSAT v2.9 at each latitude

annual total number of good-quality observations



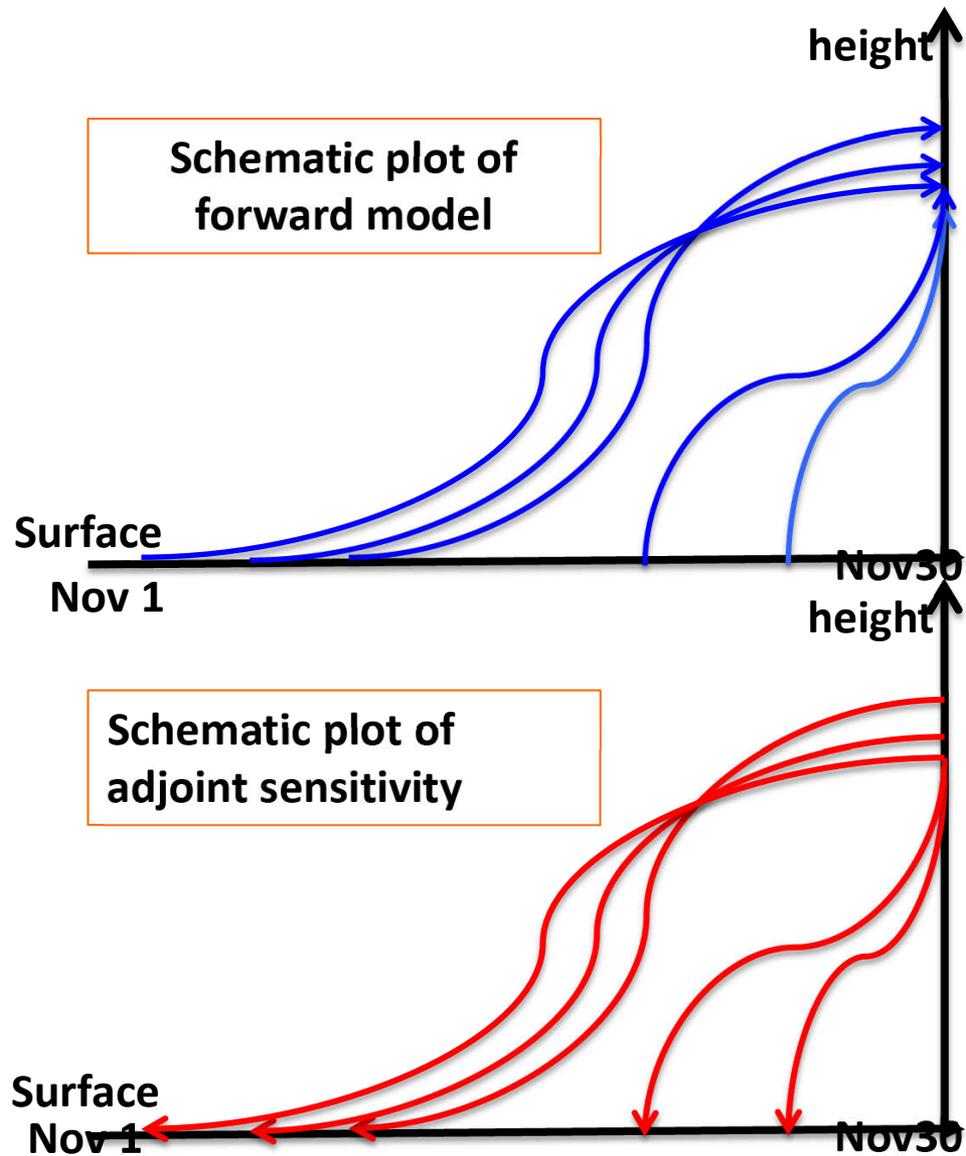
- GOSAT has sparse observation coverage over the tropics and high latitudes.
- Could AIRS CO<sub>2</sub> over the tropics improve the tropics surface flux forcing?

# Processes controlling mid-troposphere CO<sub>2</sub>



- Different dynamical processes control the variability of mid troposphere CO<sub>2</sub> over mid latitudes and the tropics; Connection between mid troposphere CO<sub>2</sub> over the tropics is more direct than the observations over mid latitudes;

# Calculation of the sensitivity of mid troposphere CO<sub>2</sub> to surface flux forcing with GEOS-Chem adjoint model

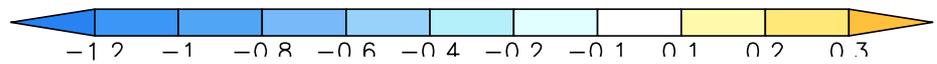
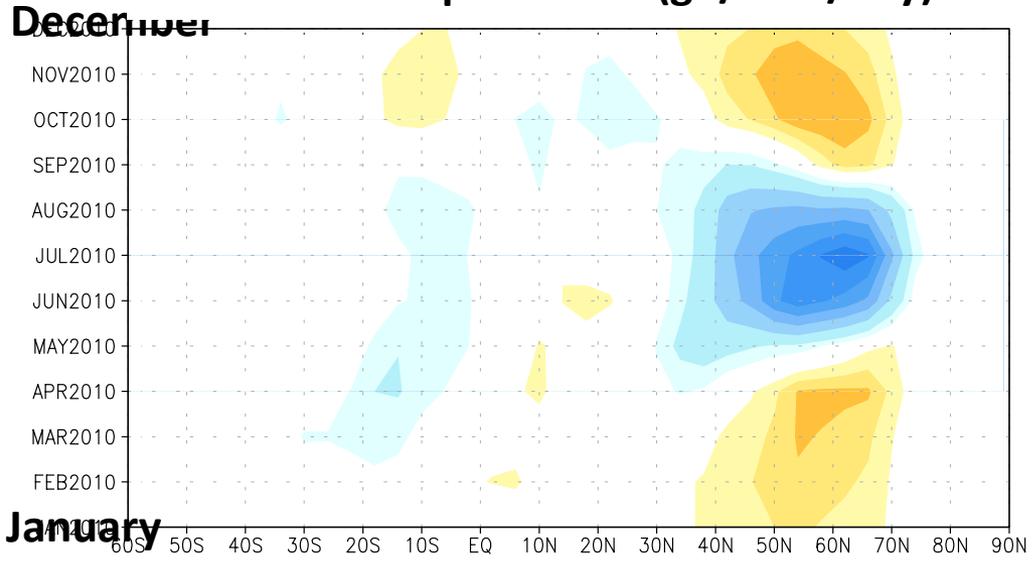


- Adjoint model: integrates model backward.
- Adjoint sensitivity: the sensitivity of a response function to model input parameters (e.g., surface forcing, initial conditions);
- Response function J: normalized AIRS CO<sub>2</sub> concentration over a region over a particular time interval;
- $E \partial J / \partial E$ : change of CO<sub>2</sub> concentration in PPM due to surface forcing E.

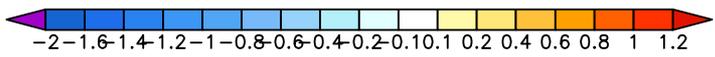
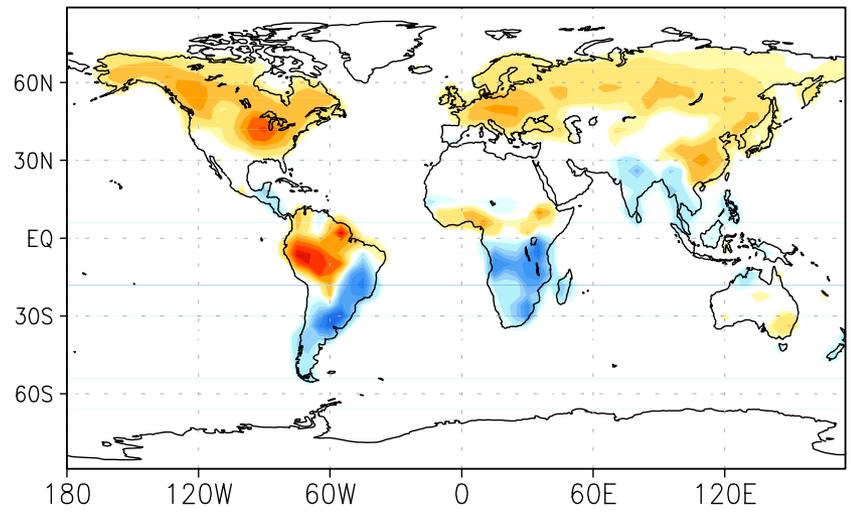
# Surface CO2 flux

- Strong seasonality in NH terrestrial biosphere CO2 flux

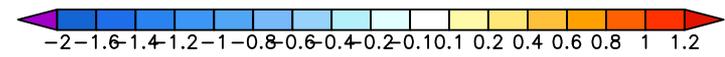
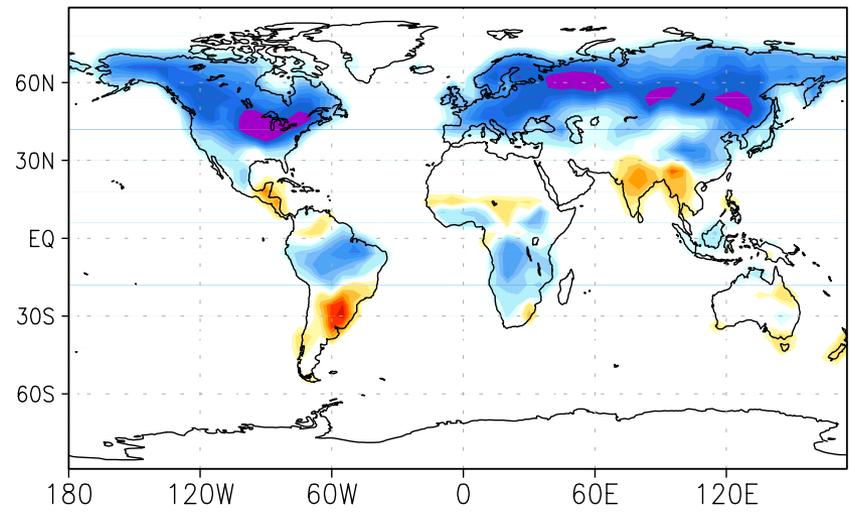
Terrestrial biosphere flux (gC/m<sup>2</sup>/day)



Terrestrial biosphere flux (Jan-March)



Terrestrial biosphere flux (June-August)

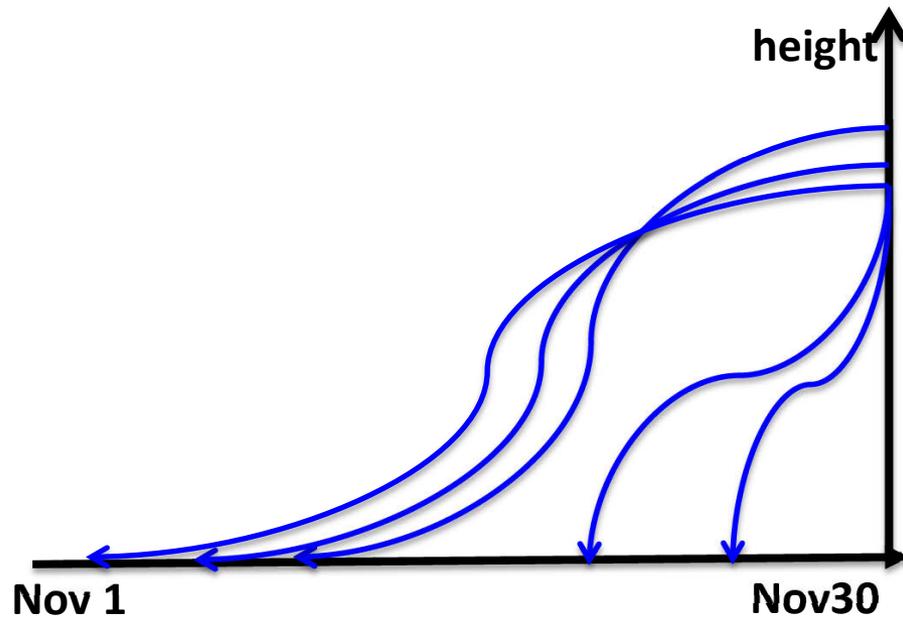


# Adjoint sensitivity cases

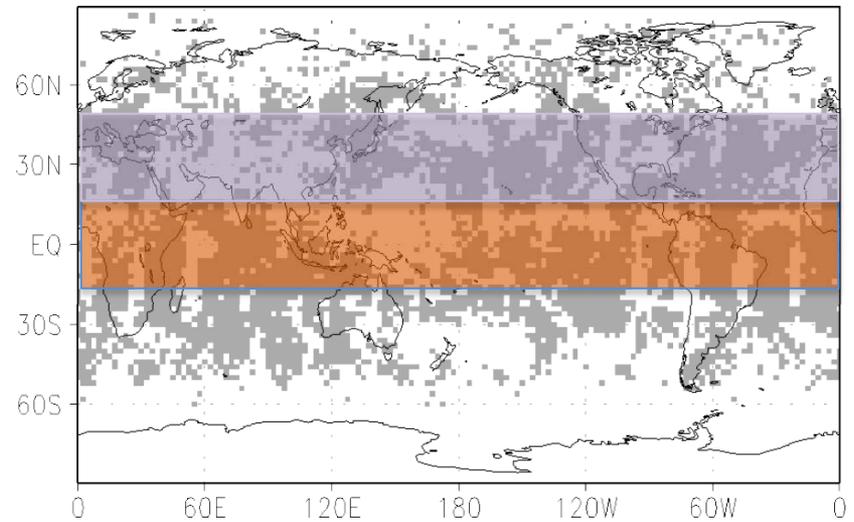
Regions: tropics (orange); 25N-45N (light purple);

Date: July30, Nov30, March30

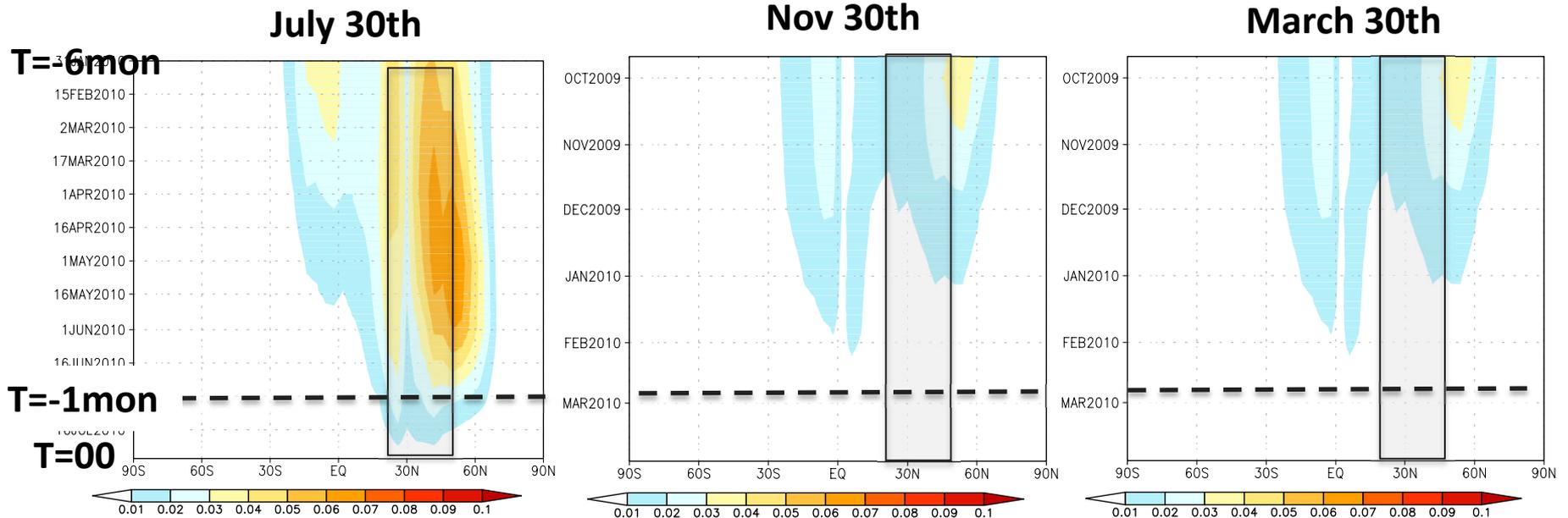
Schematic plot of adjoint sensitivity case



observation coverage for July30

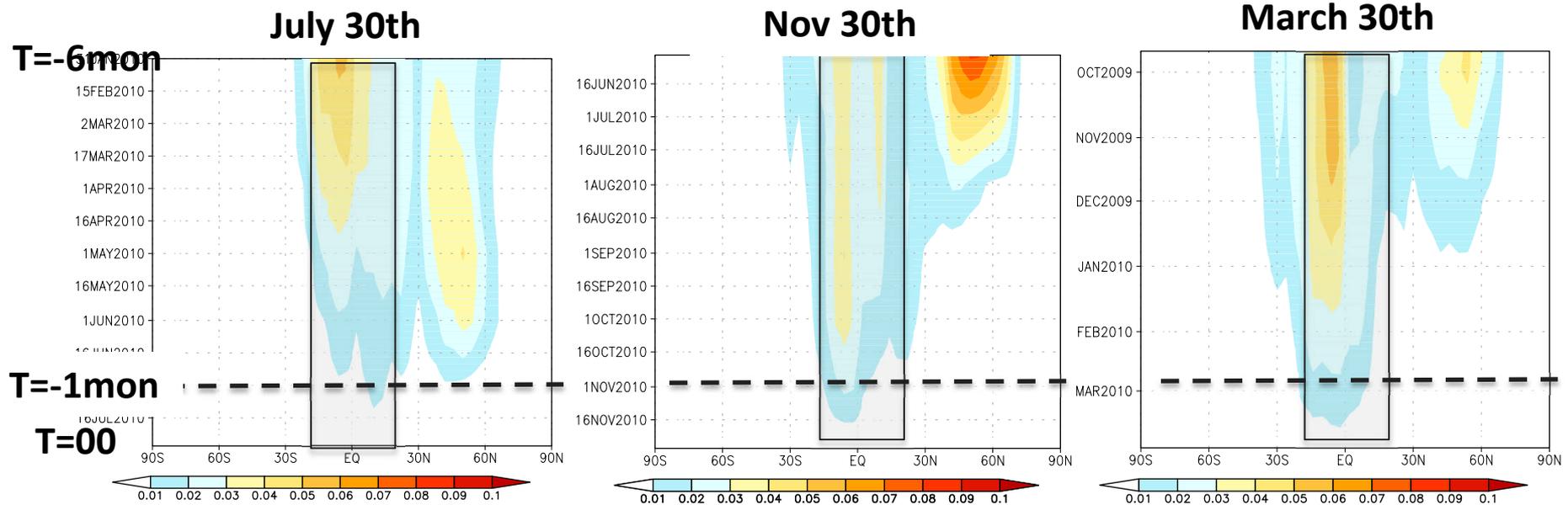


# Sensitivity of AIRS CO<sub>2</sub> over 25°N-45°N to biosphere flux forcing



- The sensitivity of AIRS CO<sub>2</sub> to surface flux forcing is strongest during summer **when GOSAT has dense observation coverage;**
- Smaller sensitivity during winter and spring is due to both **the weaker vertical mixing and the weaker surface flux forcing;**
- Smaller sensitivity during winter and spring when **when GOSAT has sparse observation coverage;**

# Sensitivity of AIRS CO<sub>2</sub> over tropics to surface flux forcing

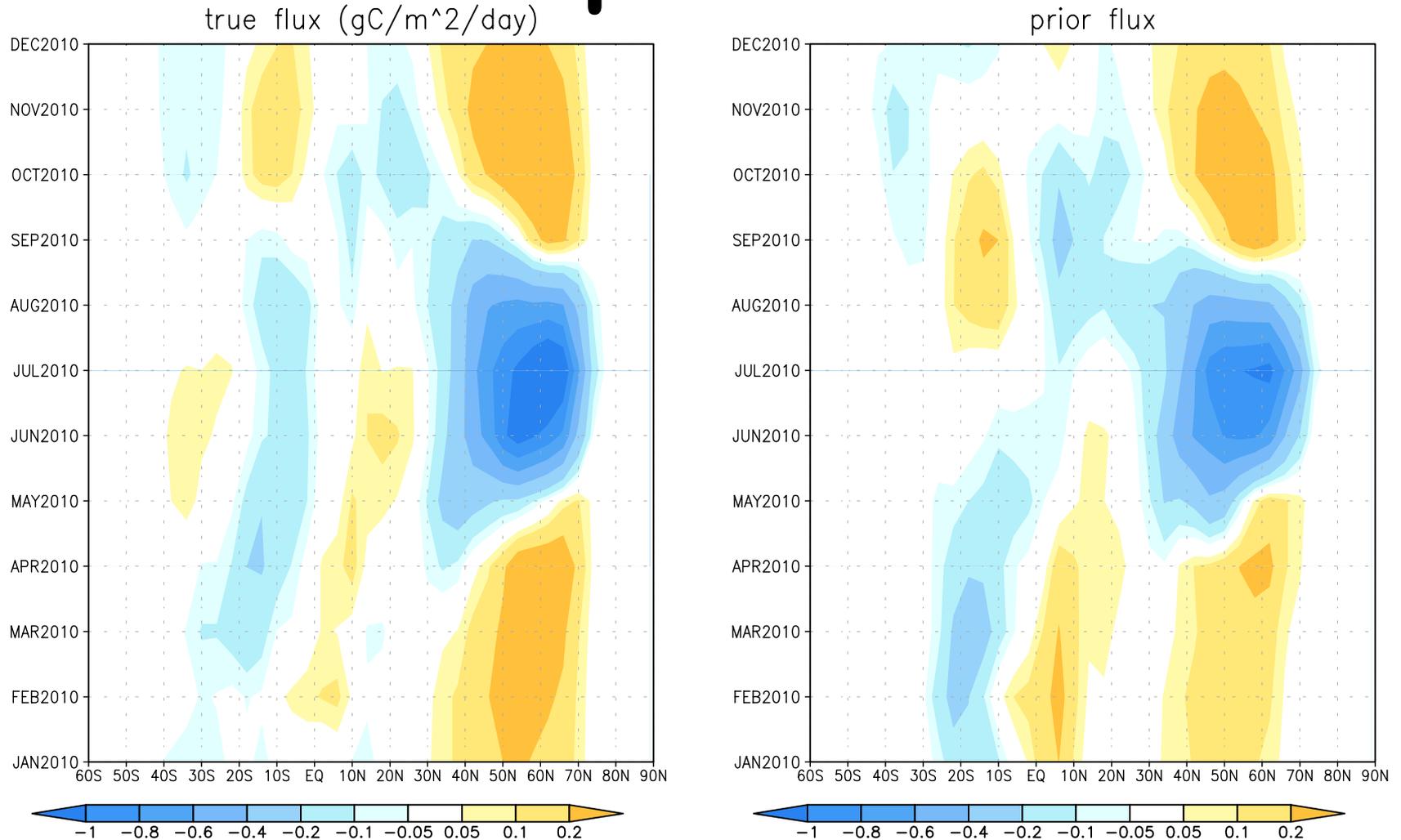


- AIRS CO<sub>2</sub> over the tropics has **strong sensitivity** to surface flux forcing **over the whole year**;

# CO2 flux estimation with OSSE

- **4D-Var flux inversion with GEOS-Chem adjoint model**
- **Control run: CO2 flux estimation with GOSAT observations**
- **AIRS impact runs:**
  - **Assimilate AIRS observations over the tropics (exp1);**
  - **Assimilate AIRS observations over the tropics where the number of annual GOSAT observations are less than 10 (exp2).**

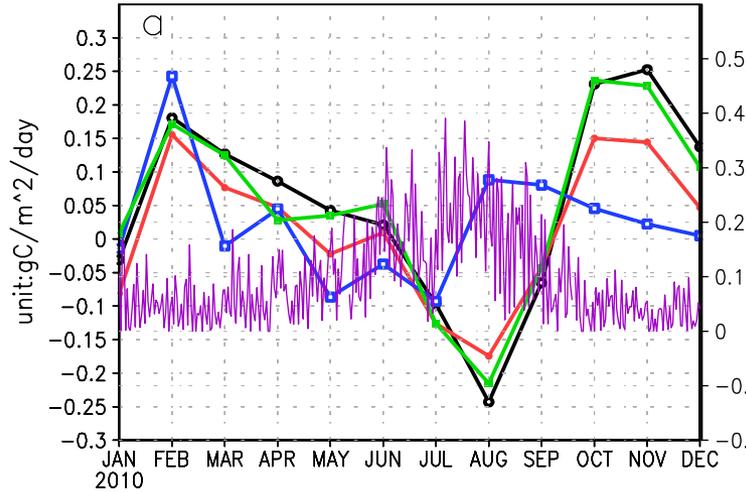
# The prior and true terrestrial biosphere flux



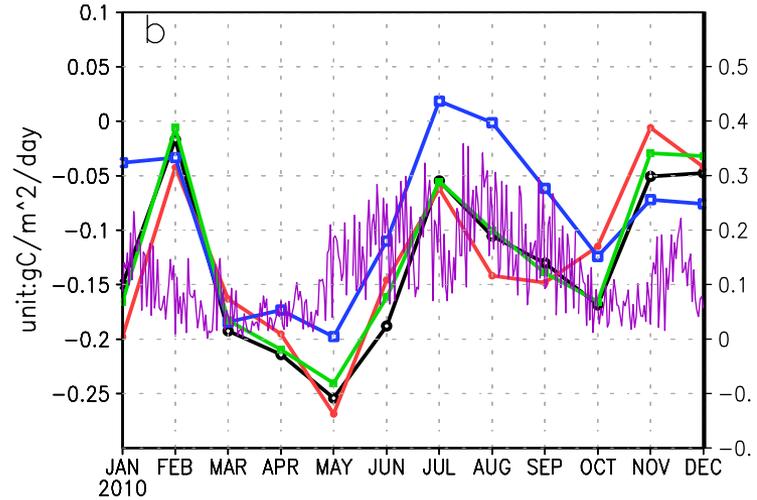
- Both has ~5.1 GtC sink, but with different seasonal cycle and spatial distribution;

# Positive impact of mid-troposphere CO<sub>2</sub> on tropical flux estimation

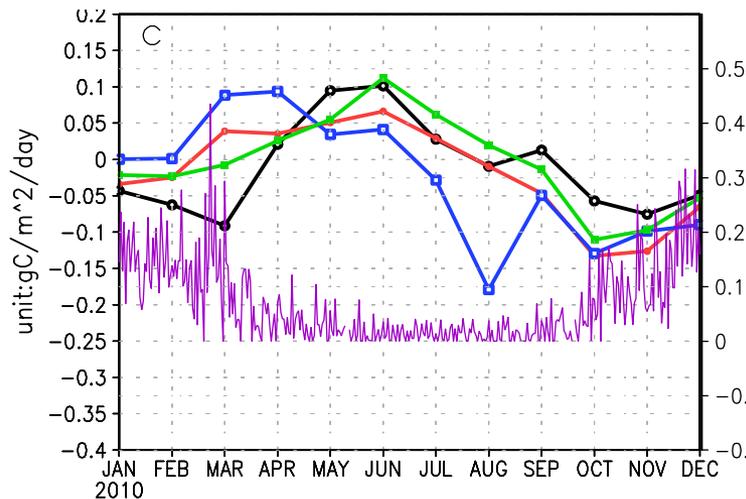
## Amazon (25°S-25°N, 90°W-30°W)



## Africa (25°S-25°N, 10°W-60°E)



## South East Asia (25°S-25°N, 80°E-120°E)



**Black: true flux**

**Red: posterior flux assimilating GOSAT observations**

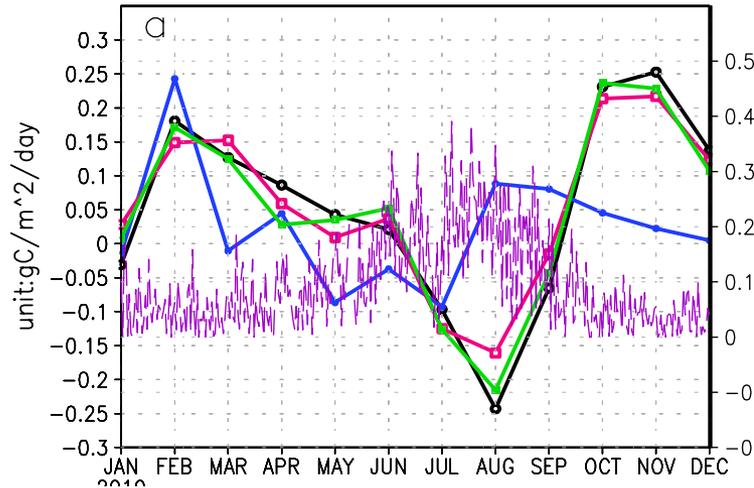
**Blue: prior**

**Green: posterior flux assimilating both GOSAT and AIRS observations (exp2)**

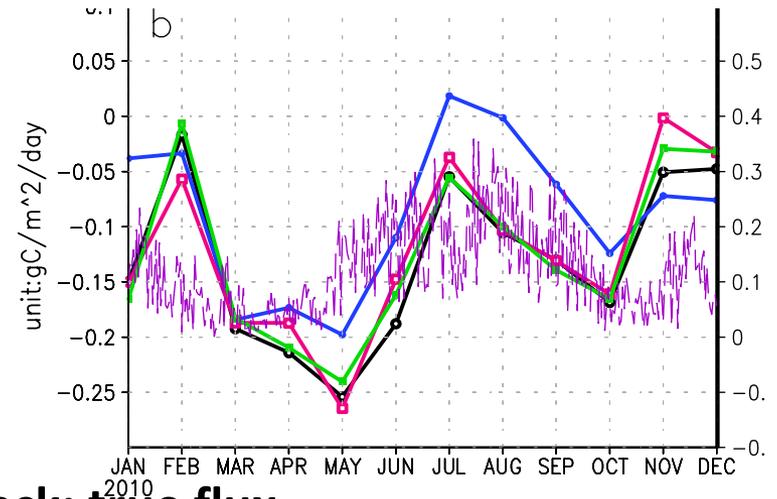
**Purple: area-averaged GOSAT CO<sub>2</sub> observations at each region over land**

# Data masking has improved the results

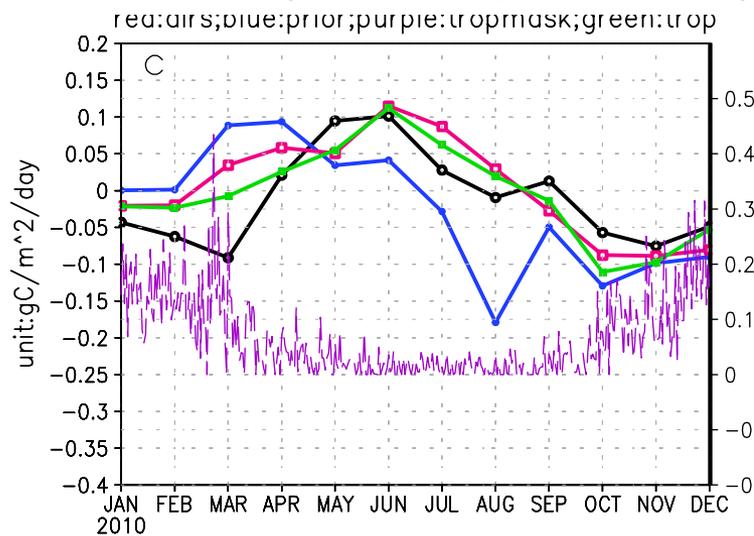
Amazon (25°S-25°N, 90°W-30°W) <sup>h</sup>



Africa (25°S-25°N, 10°W-60°E)



South East Asia (25°S-25°N, 80°E-120°E)



**Black: true flux**

**Red: posterior flux assimilating GOSAT observations**

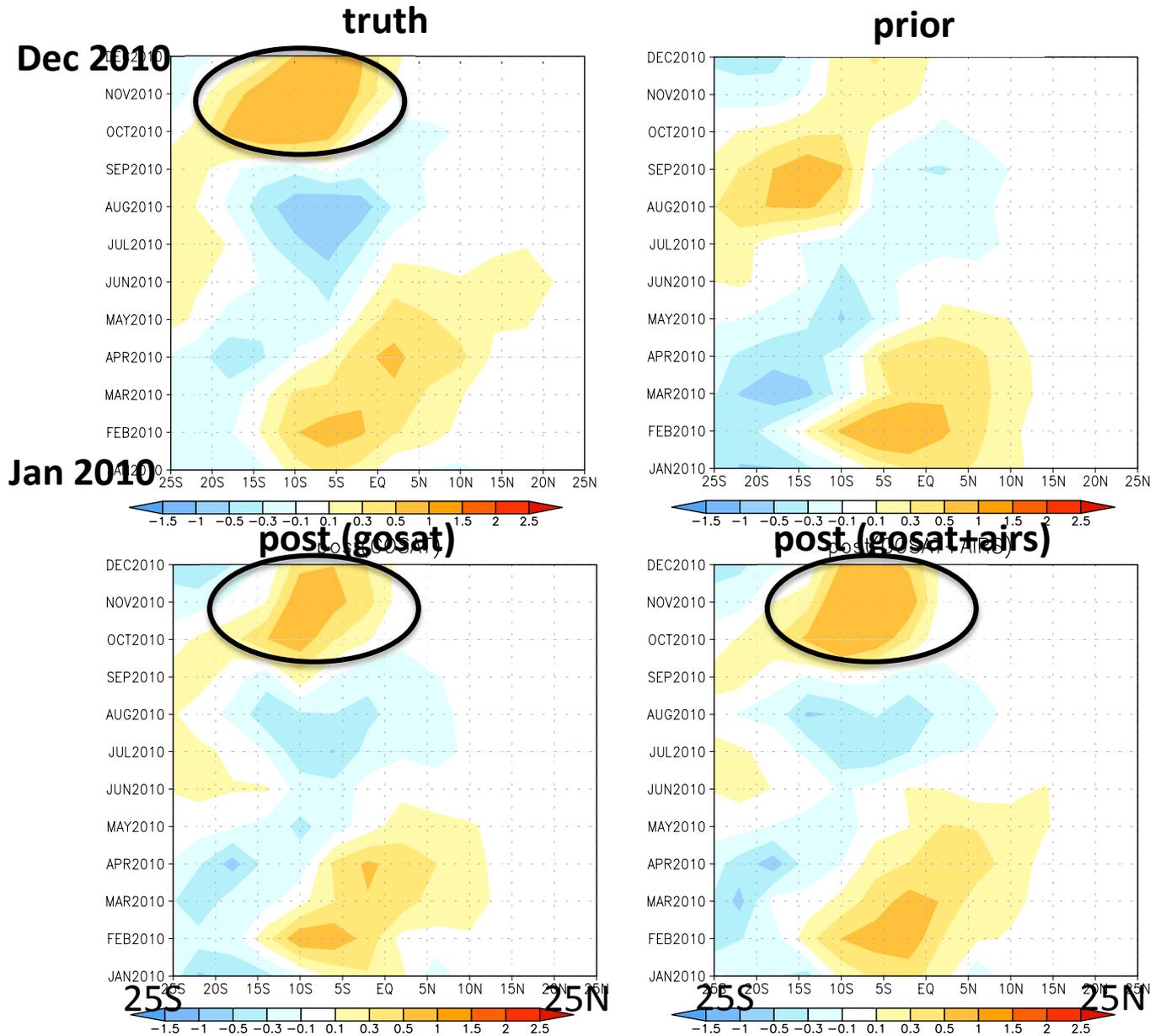
**Blue: prior flux**

**Pink: posterior flux assimilating both GOSAT and AIRS (exp1)**

**Green: posterior flux assimilating both GOSAT and AIRS (exp2)**

**Purple: area-averaged GOSAT CO2 observations at each region over land**

# Zonal mean flux over Amazon (gC/m<sup>2</sup>/day)

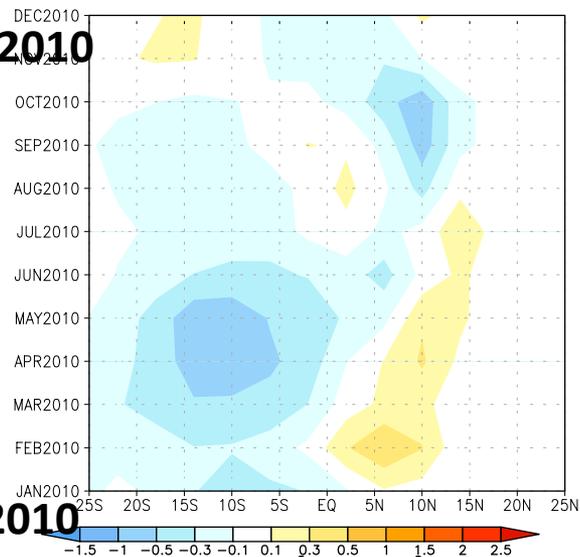


- Different seasonality between prior and the true flux;
- Assimilating GOSAT observations has recovered the seasonality of true flux;
- Assimilating AIRS over the tropics further improved the flux;

# Zonal mean Flux estimation over tropical Africa

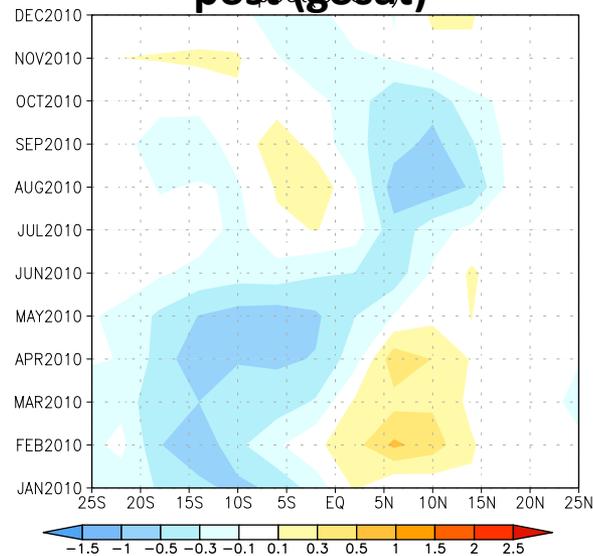
truth

Dec 2010

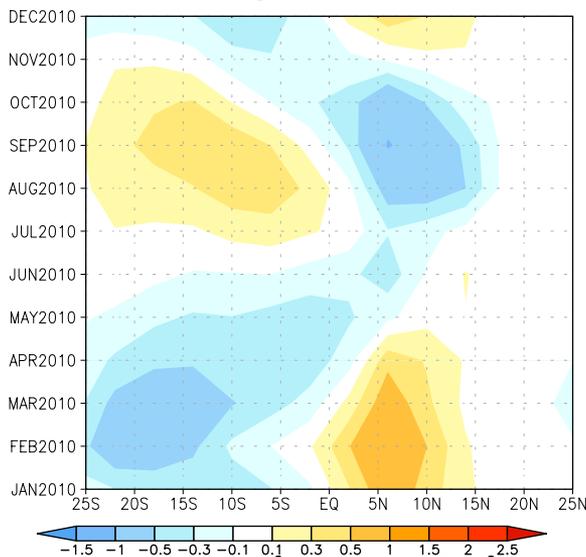


Jan 2010

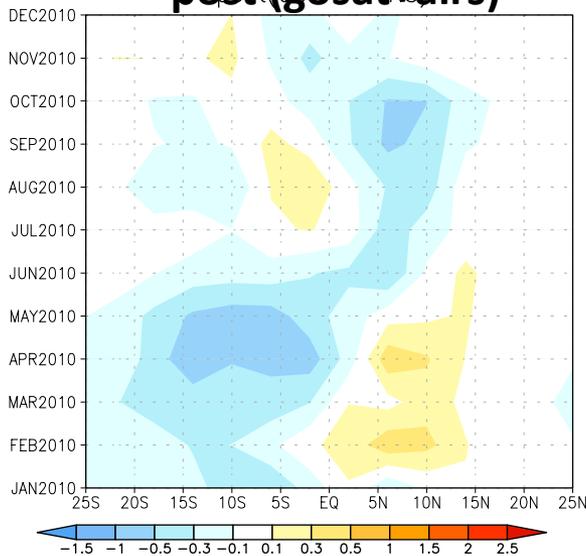
post (gosat)



prior



post (gosat+airs)



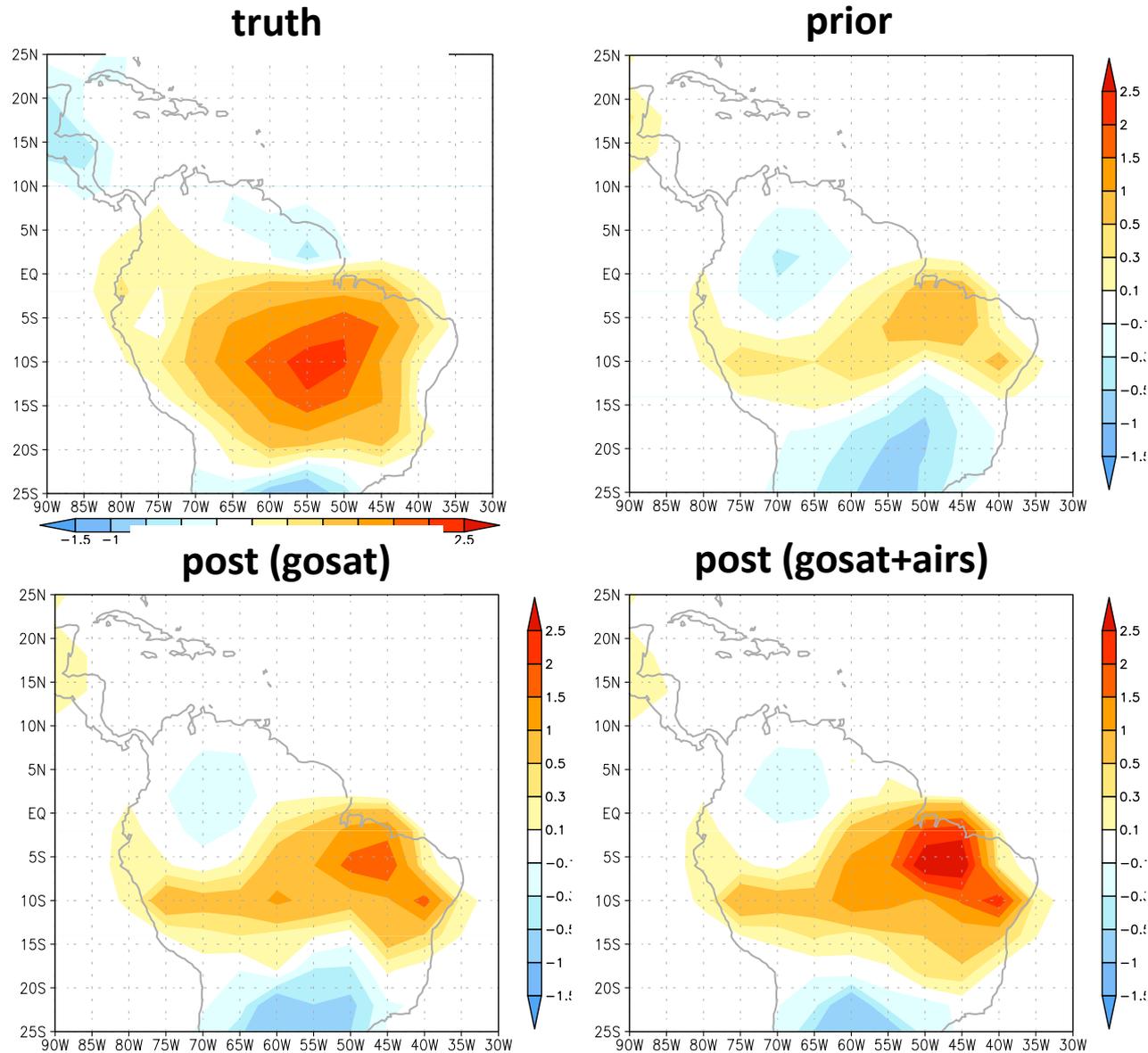
- Different seasonality between prior and the true flux;
- Assimilating GOSAT observations has recovered the seasonality of true flux;
- Assimilating AIRS over the tropics further improved the flux;

# Conclusions and Discussions

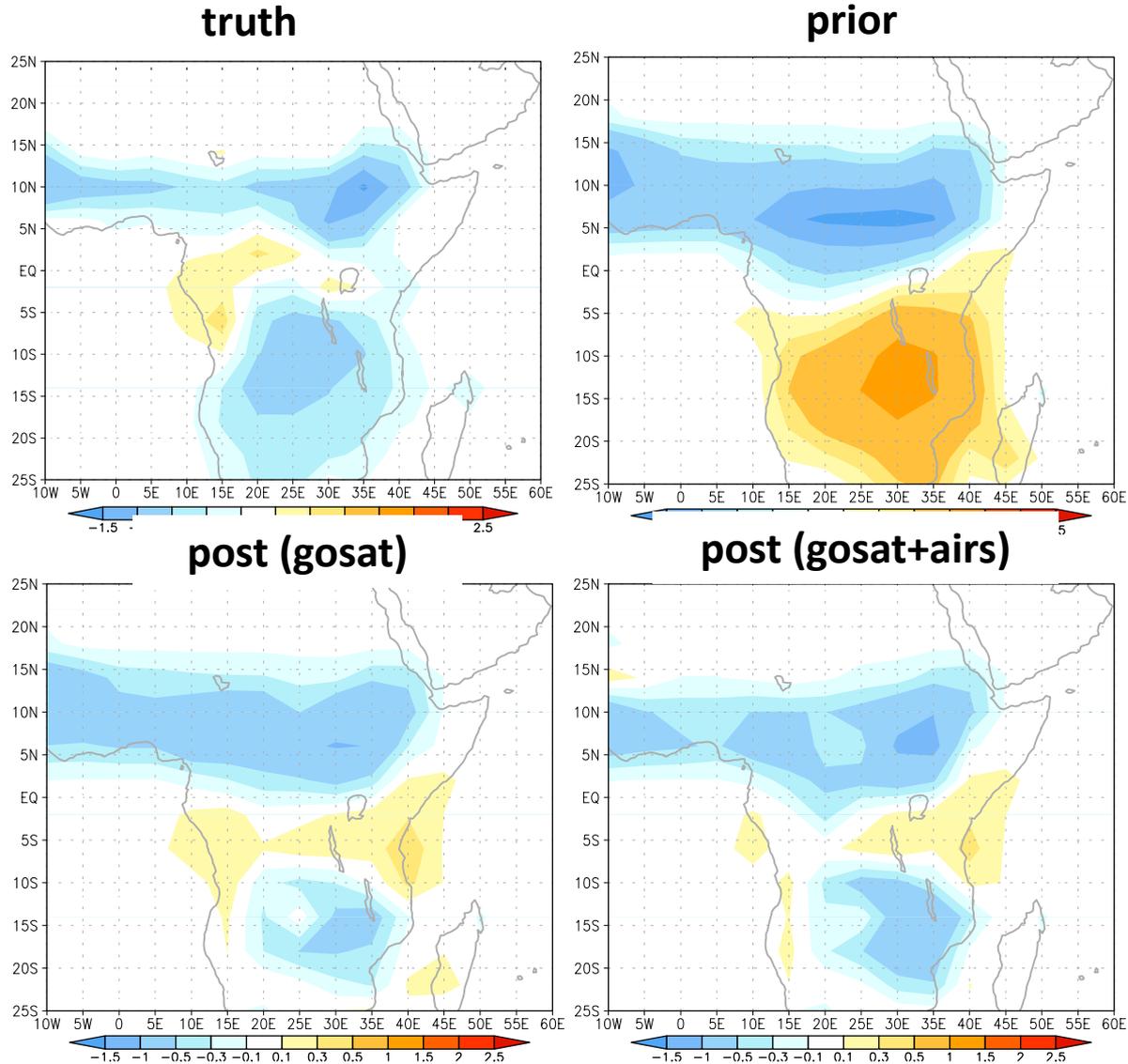
**We tested the impact of AIRS CO<sub>2</sub> over the tropics where GOSAT has sparse observation coverage on surface CO<sub>2</sub> flux estimation with OSSEs.**

- **AIRS CO<sub>2</sub> has strong sensitivity to surface CO<sub>2</sub> flux forcing during the whole year;**
- **Assimilating AIRS CO<sub>2</sub> over the tropics in addition to the GOSAT observations has improved the surface CO<sub>2</sub> flux forcing over the tropics, where the current understanding of carbon cycle is most uncertain;**
- **Assimilating AIRS only over the locations where the GOSAT has sparse coverage further improves the results;**
- **Surface CO<sub>2</sub> flux estimation is sensitive to observation biases. It needs strict validation of the data before using the real in surface flux estimation.**

# Flux estimation over Amazon region averaged between Oct and Dec



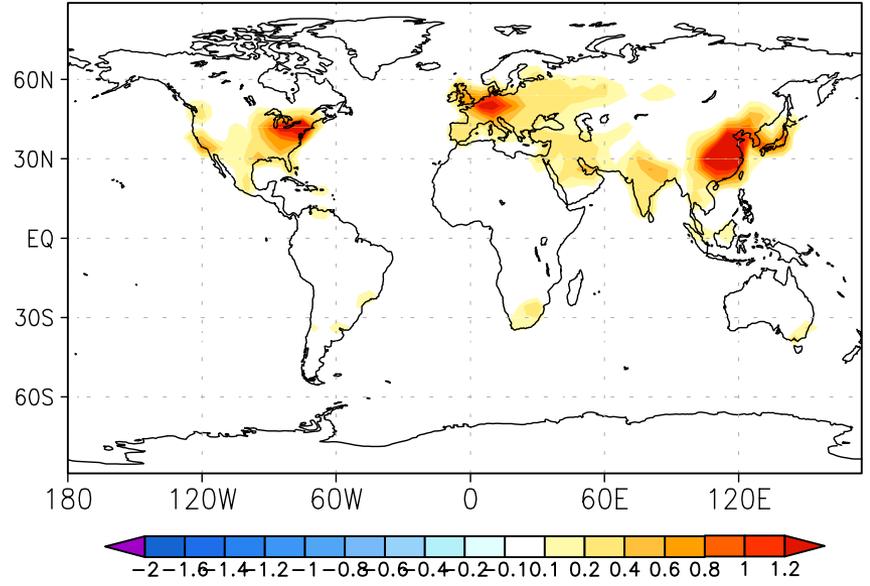
# Flux over Africa averaged over Aug-Oct



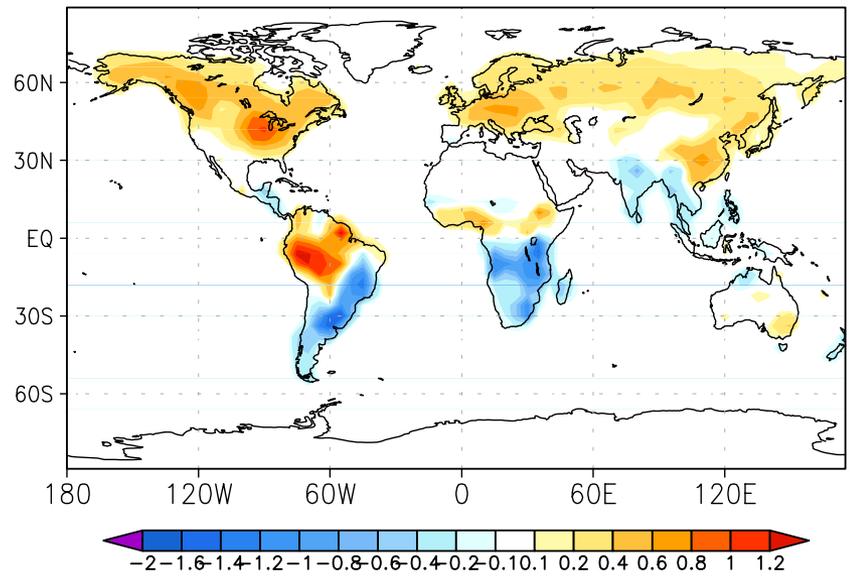
# Surface CO2 flux

- Concentrated fossil fuel emissions upon biosphere flux;

annual mean fossil fuel emission



Terrestrial biosphere flux (Jan-March)



Terrestrial biosphere flux (June-August)

