



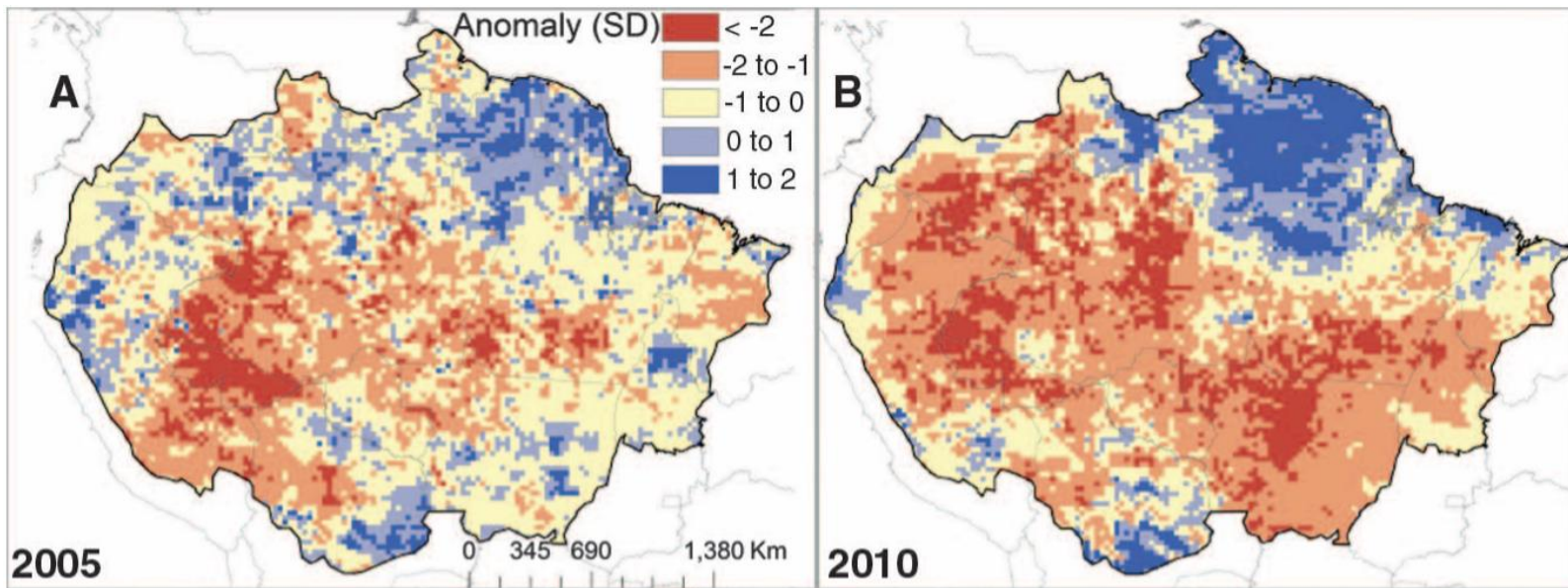
# Interannual variations of CO<sub>2</sub> exchange over the Amazon during 2010-2017

*Gerbrand Koren, Ingrid Luijkx, Stijn Naus, Narcisa Nechita-Banda,  
Maarten Krol, Luciana Gatti, Lucas Domingues, Raiane Neves, Caio  
Correia, Manuel Gloor, John Miller, Wouter Peters*

TM5 meeting  
November, 2019 - Wageningen

# CO<sub>2</sub> exchange over the Amazon

- Tropical land drives inter-annual variability in atm. CO<sub>2</sub> growth rate (Cox et al., Nature, 2013)
- Amazon forest is largest tropical forest: 49% of trop. biomass (Saatchi et al., PNAS, 2011)
- Major droughts occurred in 2005, 2010 and 2015 in the Amazon



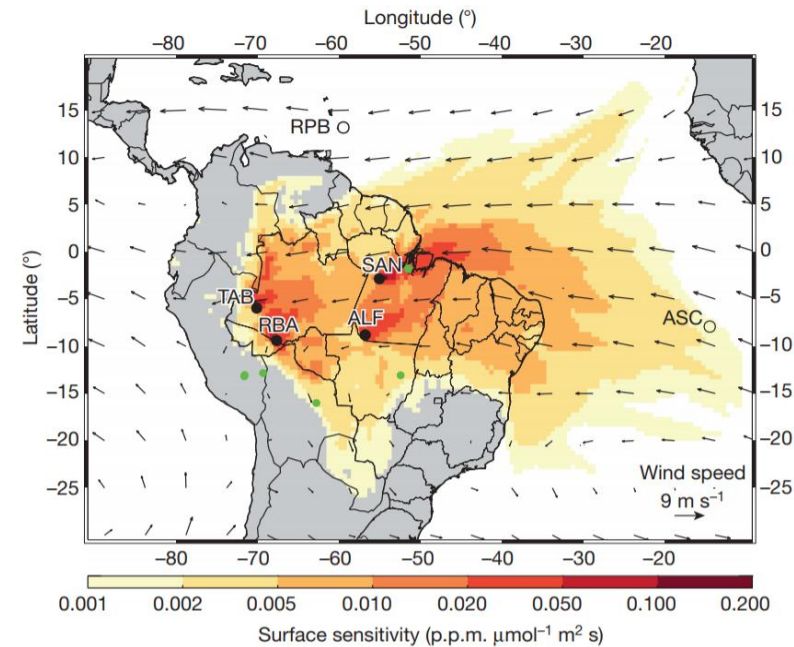
Precipitation anomalies in Amazon region (Lewis et al., Science, 2011)

# 2010 Amazon drought

CO<sub>2</sub> exchange estimated by Gatti et al., (Nature, 2014):

- Aircraft profiles of CO, CO<sub>2</sub> and SF<sub>6</sub> from four different sites in the Amazon
- Background obs. from NOAA stations

	Fires (PgC)	NBE (PgC)
2010	+0.51 ± 0.12	-0.03 ± 0.22
2011	+0.30 ± 0.10	-0.25 ± 0.14

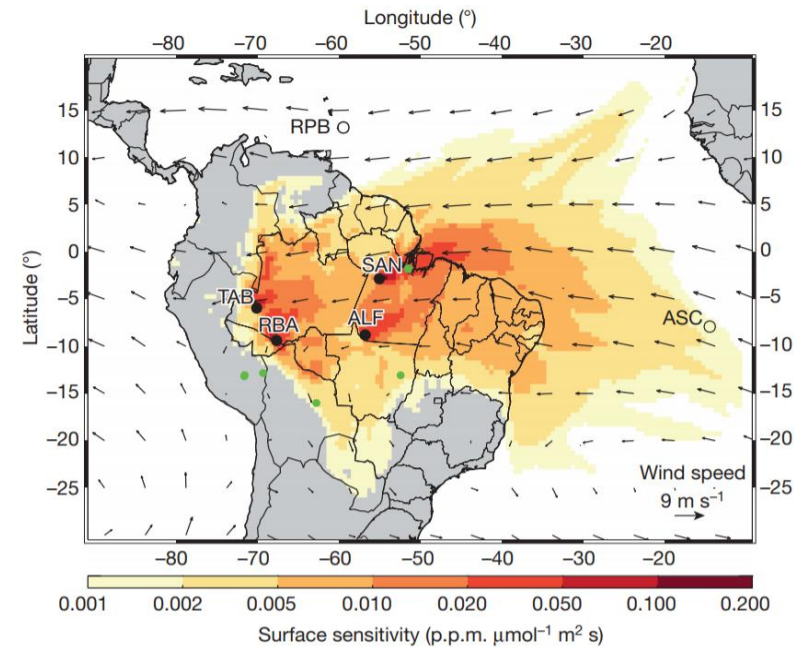


# 2010 Amazon drought

CO<sub>2</sub> exchange estimated by Gatti et al., (Nature, 2014):

- Aircraft profiles of CO, CO<sub>2</sub> and SF<sub>6</sub> from four different sites in the Amazon
- Background obs. from NOAA stations

	Fires (PgC)	NBE (PgC)
2010	+0.51 ± 0.12	-0.03 ± 0.22
2011	+0.30 ± 0.10	-0.25 ± 0.14

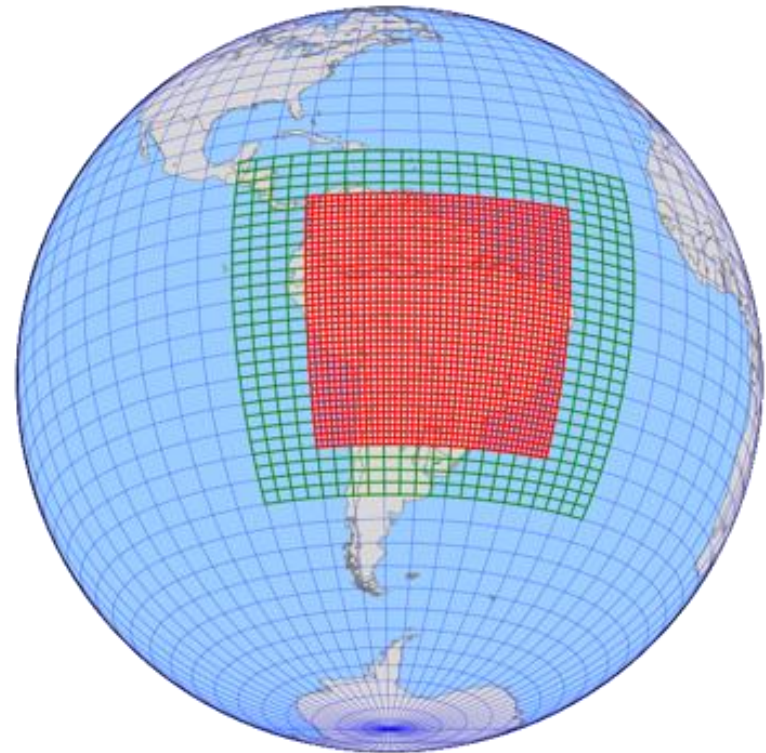


Current study objective:

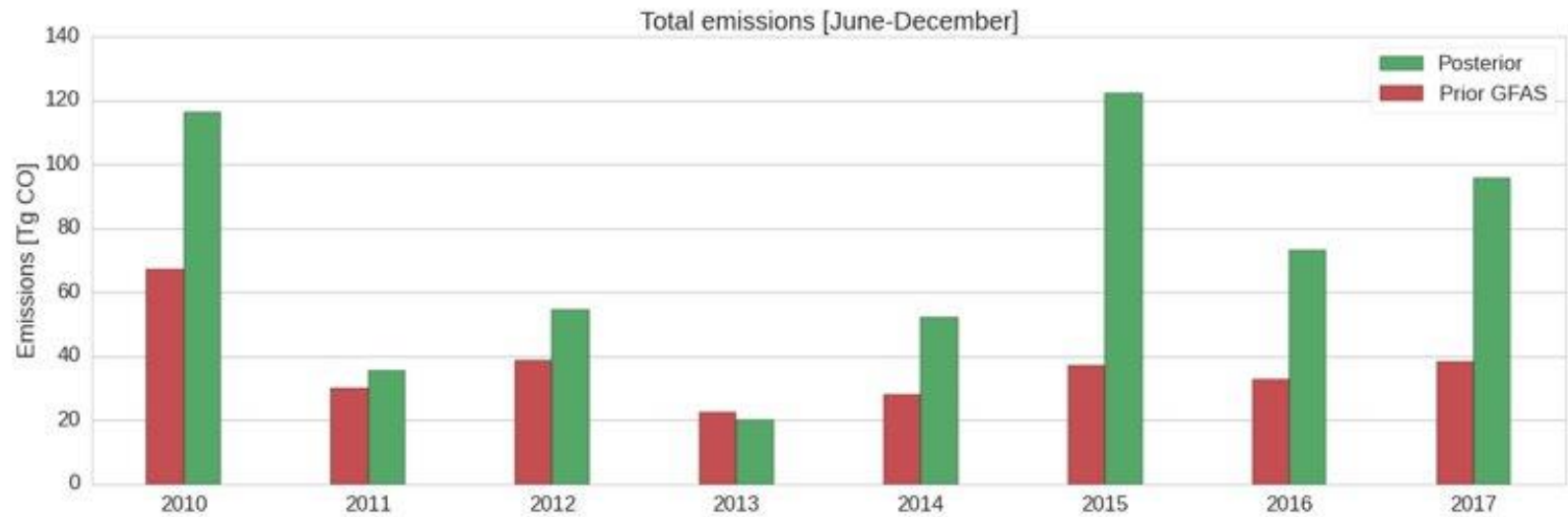
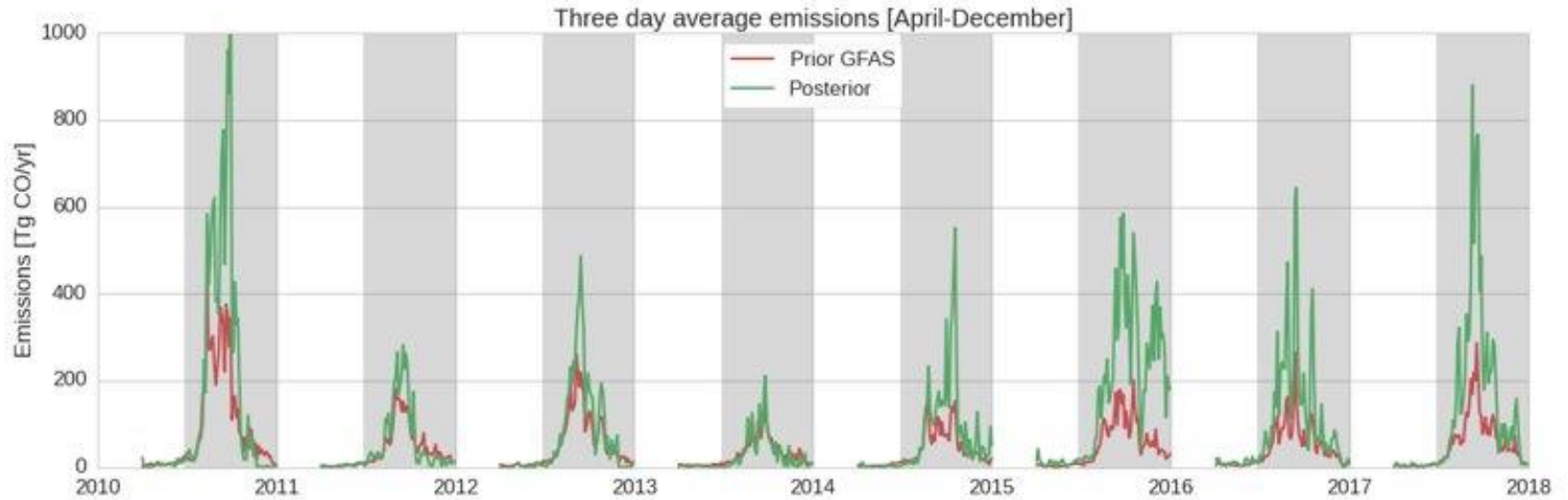
- Extend analysis period to more recent years (including 2015 drought and 2016)
- Assess the changes of fires, photosynthesis (and respiration) separately

# TM5-4DVAR CO inversions

- Zoom version of TM5-4DVAR
- GFAS emissions as prior
- Observations:
  - IASI
  - NOAA surface network
- We optimize:
  - biomass burning over Amazon
  - total emissions globally
- Simulations by Stijn Naus (WUR)

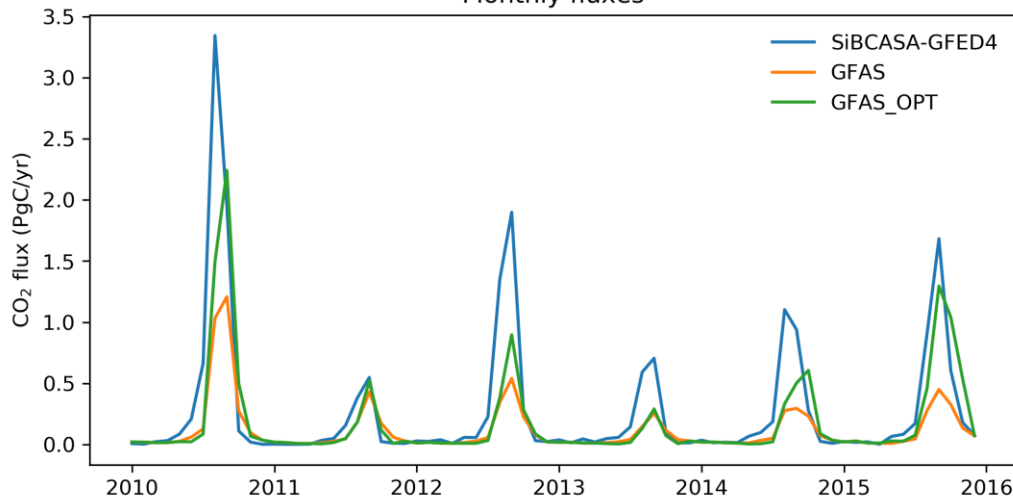


# CO fire emissions

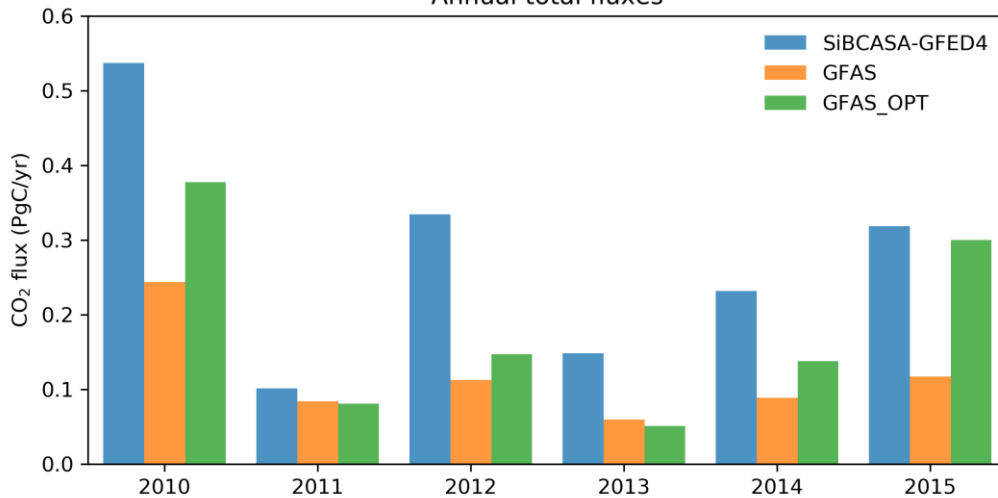


# CO<sub>2</sub> fire emissions

Monthly fluxes



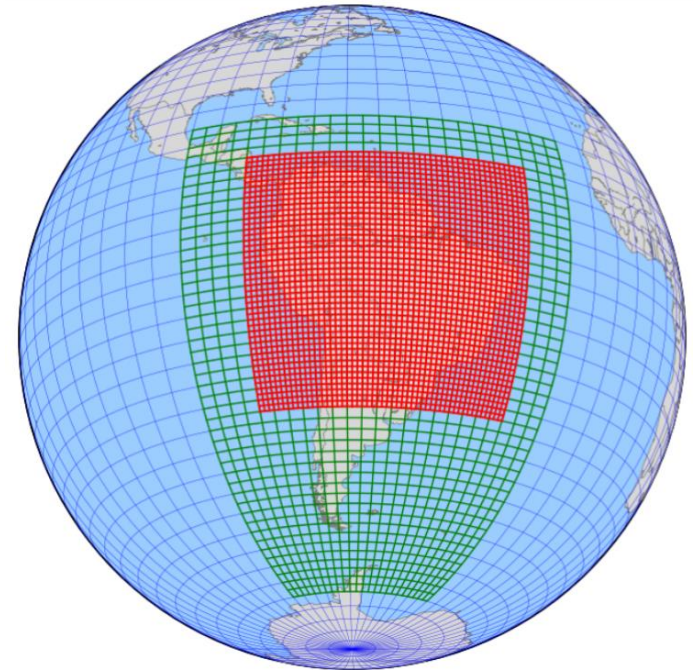
Annual total fluxes



- GFAS prior CO<sub>2</sub> emissions multiplied with ratio of posterior-to-prior CO emissions to obtain 'optimized' GFAS CO<sub>2</sub> emissions
- On average better agreement between optimized GFAS and SiBCASA-GFED4 emissions
- High emissions in drought years 2010 and 2015

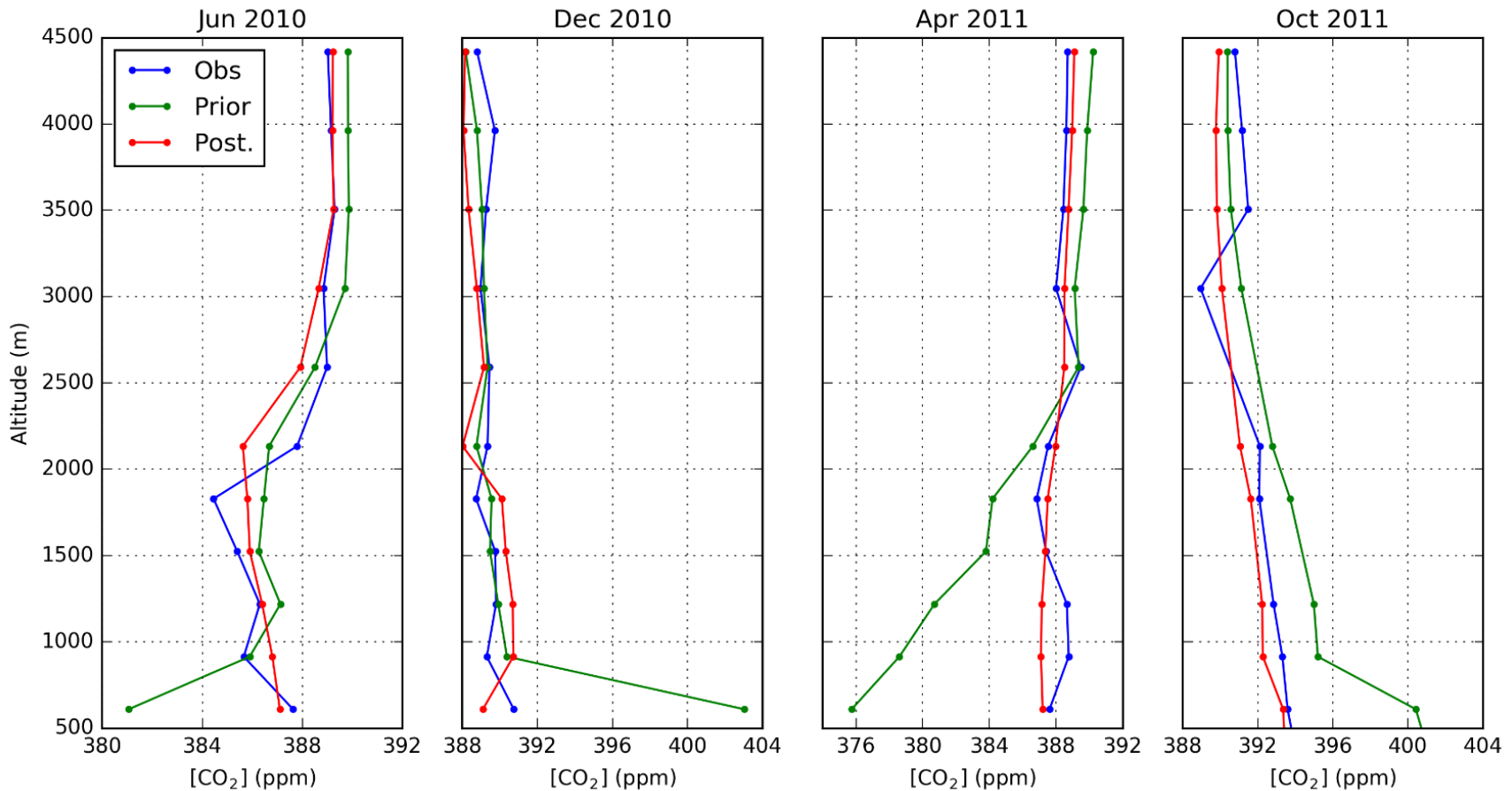
# CarbonTracker South America

- TM5 with  $6^{\circ} \times 4^{\circ}$  global grid and nested  $3^{\circ} \times 2^{\circ}$  and  $1^{\circ} \times 1^{\circ}$  zoom regions over South America (van der Laan-Luijkx et al., 2015)
- Ensemble Kalman Filter (Peters et al., 2005)
- Gridded statevector
- $\text{CO}_2$  profiles from Amazon (Gatti network)



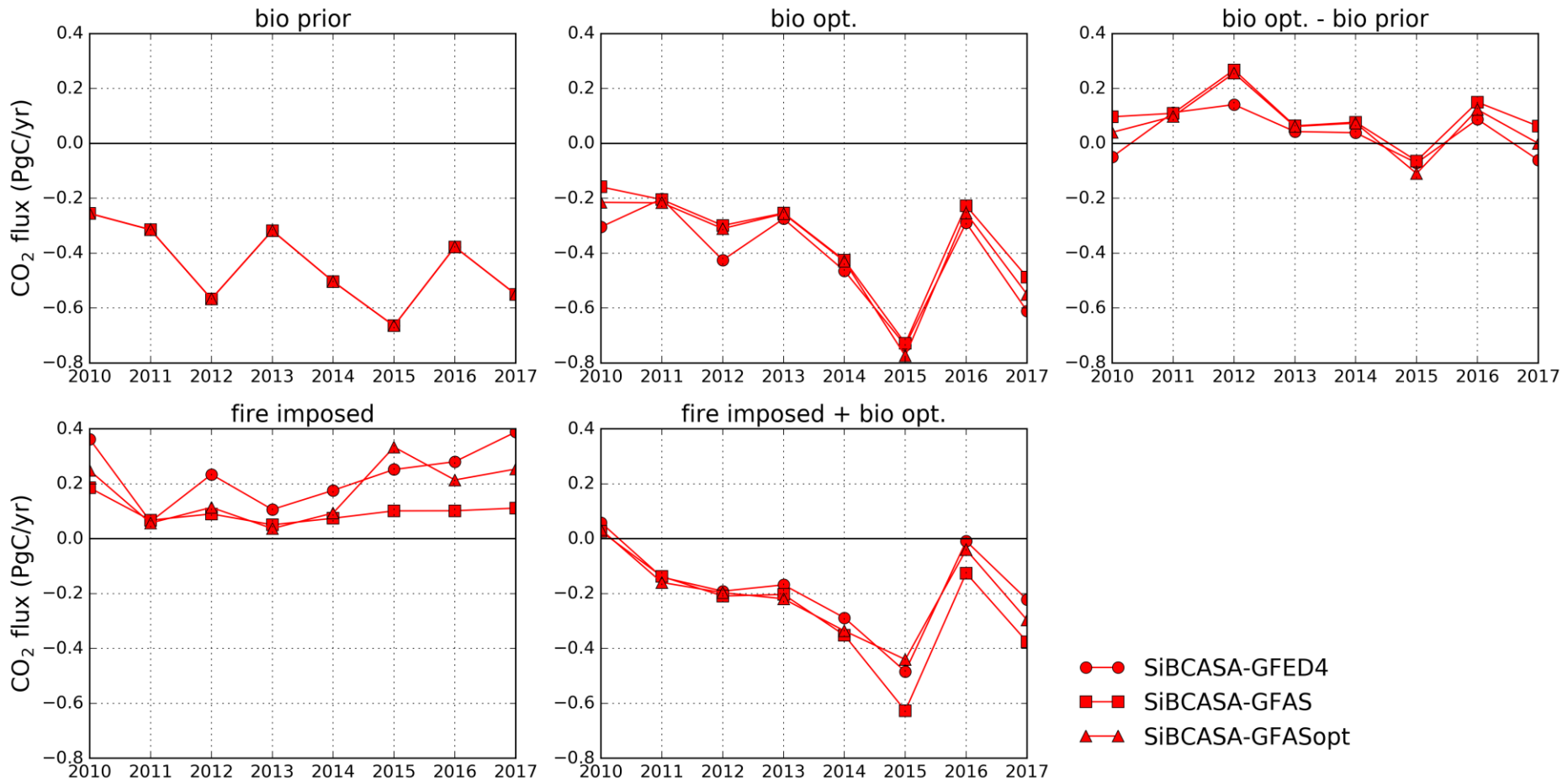


# CarbonTracker-South America CO<sub>2</sub> profiles

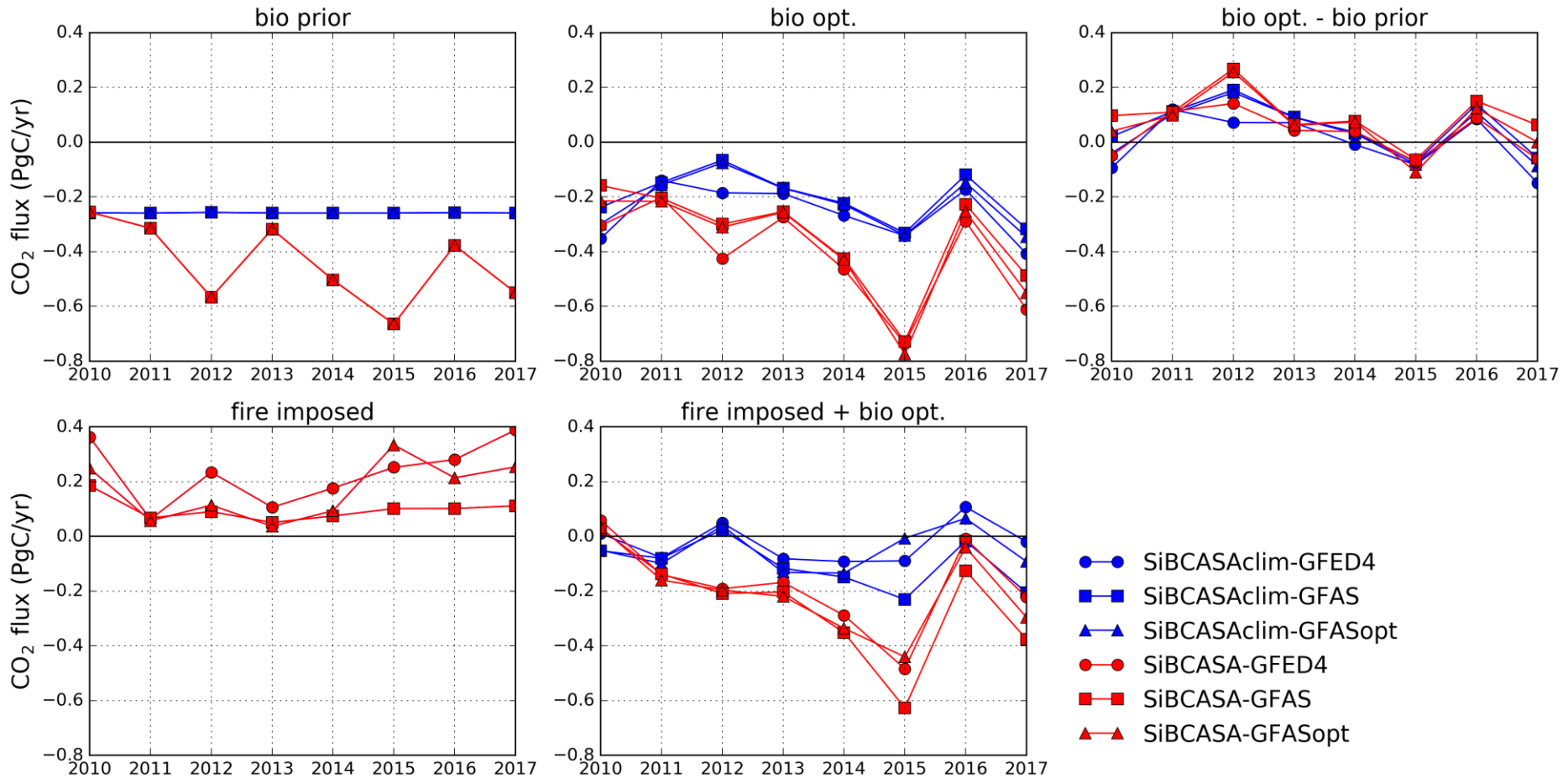


- Examples of CO<sub>2</sub> profiles for Alta Floresta (ALF), obs. data from Luciana Gatti
- Posterior profile matches better with obs. than the prior profile

# CO<sub>2</sub> fluxes for Amazon

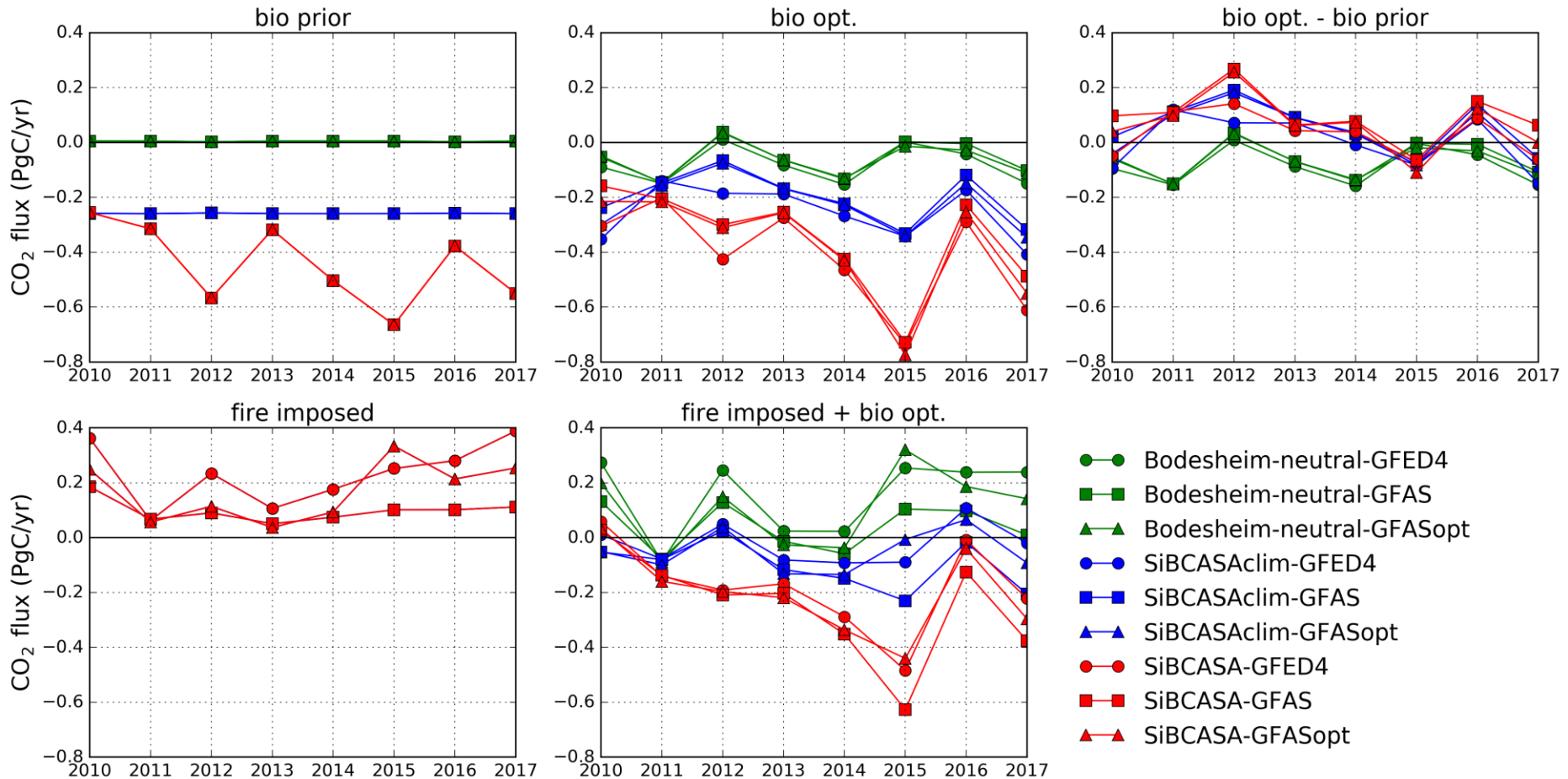


# CO<sub>2</sub> fluxes for Amazon



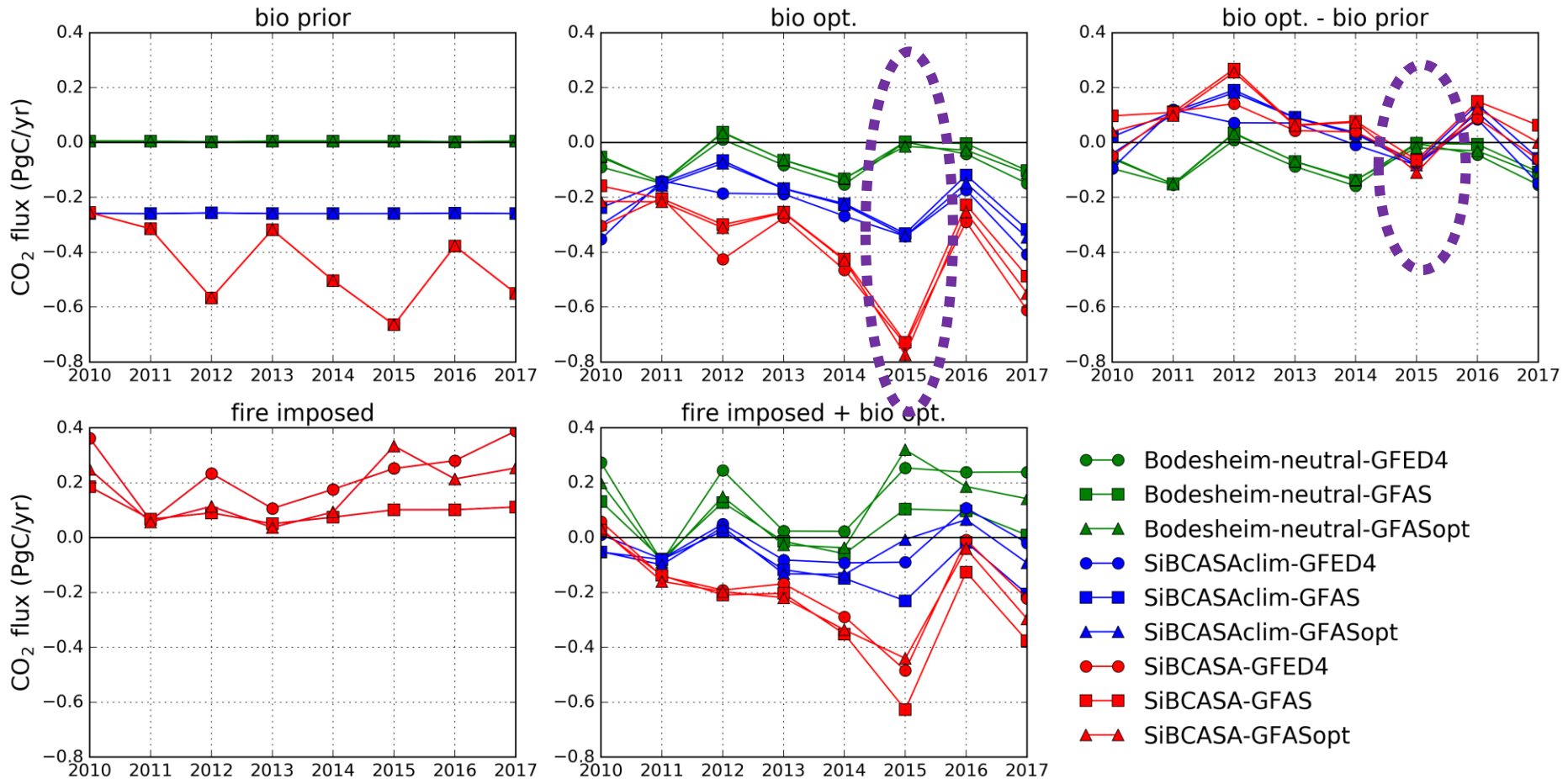
- SiBCASAcLim-GFED4
- SiBCASAcLim-GFAS
- ▲ SiBCASAcLim-GFASopt
- SiBCASA-GFED4
- SiBCASA-GFAS
- ▲ SiBCASA-GFASopt

# CO<sub>2</sub> fluxes for Amazon



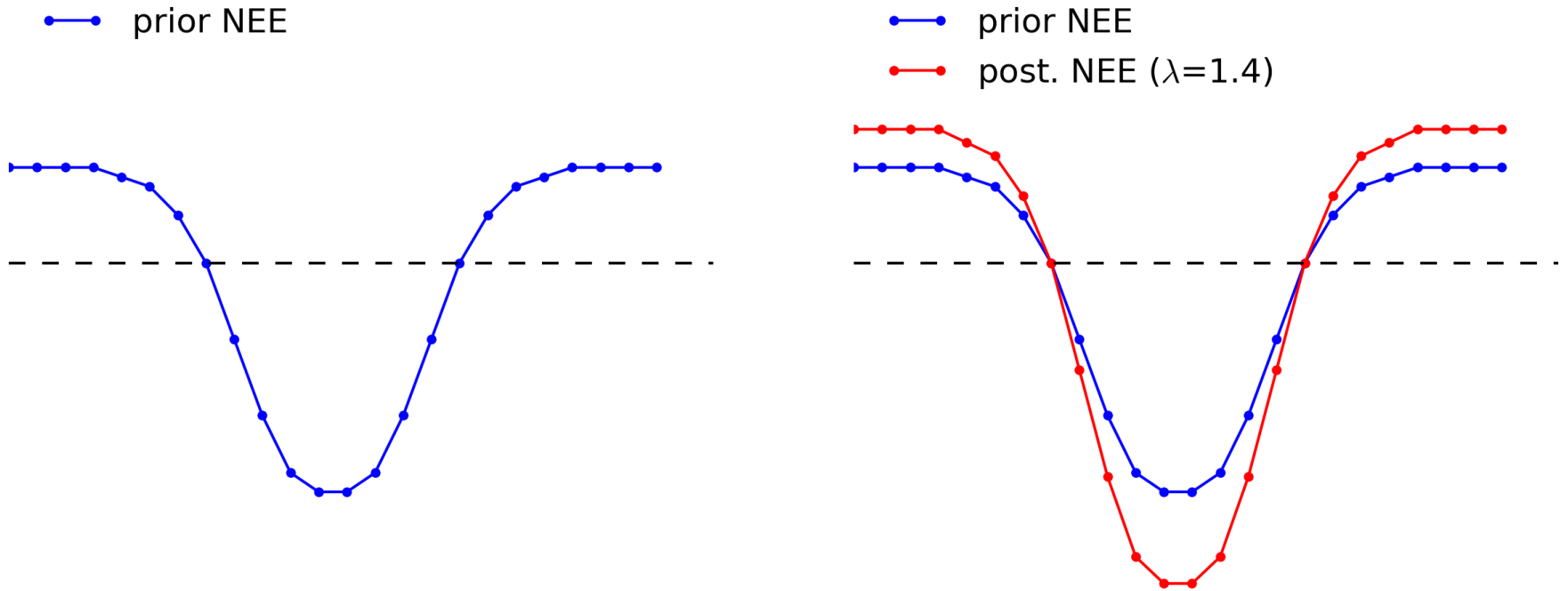
- Biosphere priors have larger effect on optimized total fluxes than the fire products
- Similar IAV in optimized biosphere fluxes except for years with little observations (2015)

# CO<sub>2</sub> fluxes for Amazon



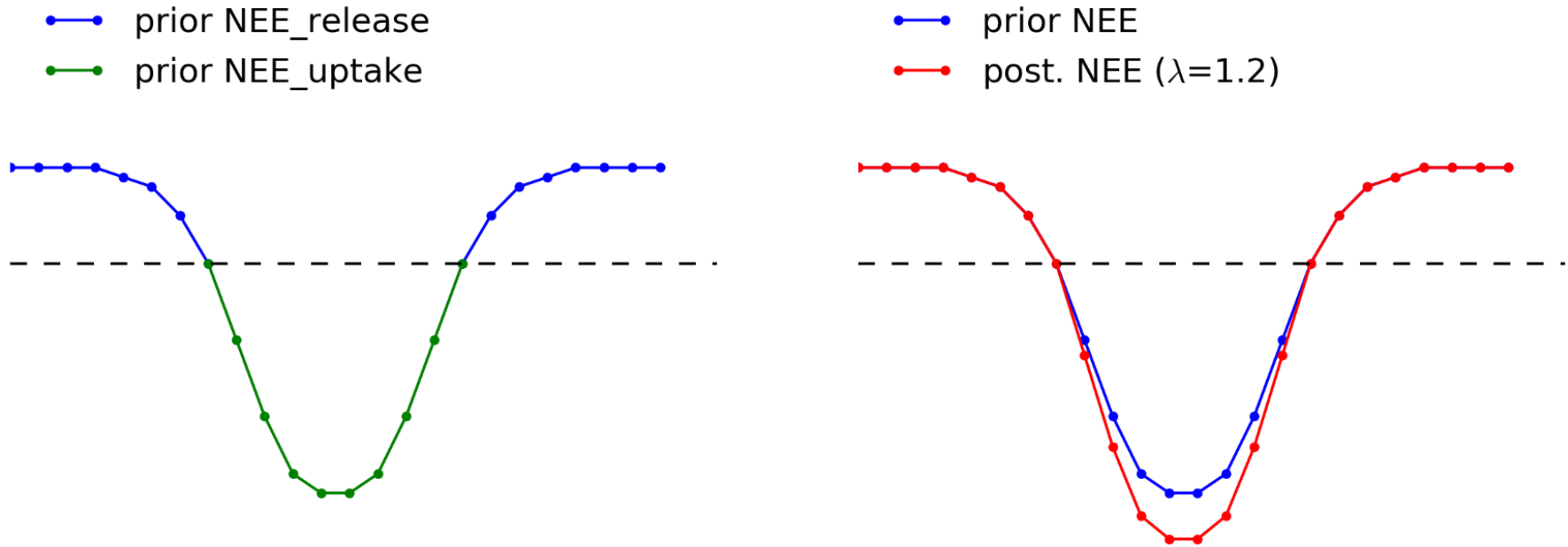
- Biosphere priors have larger effect on optimized total fluxes than the fire products
- Similar IAV in optimized biosphere fluxes except for years with little observations (2015)

# Default CarbonTracker scaling



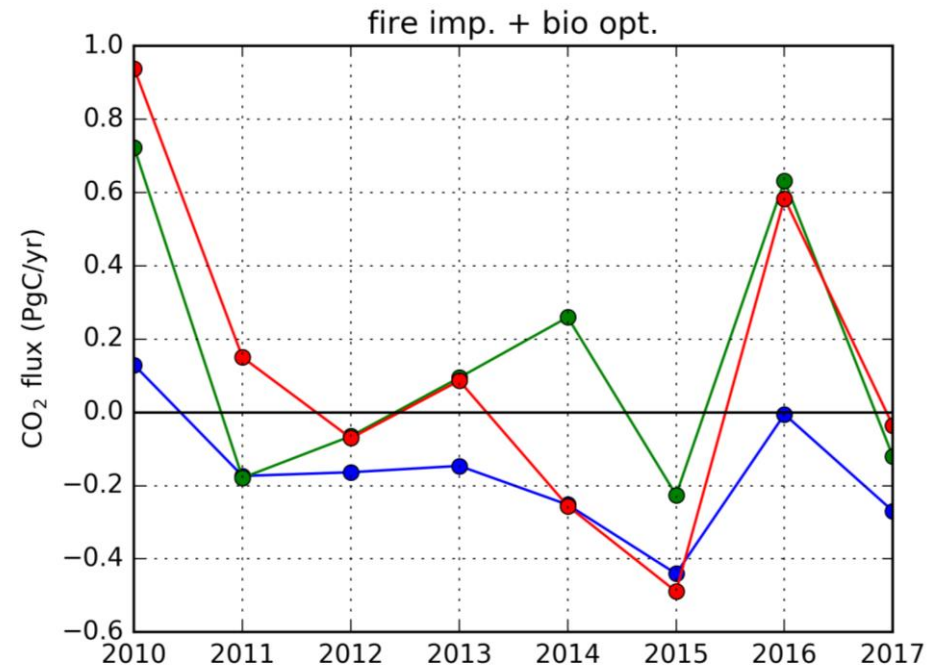
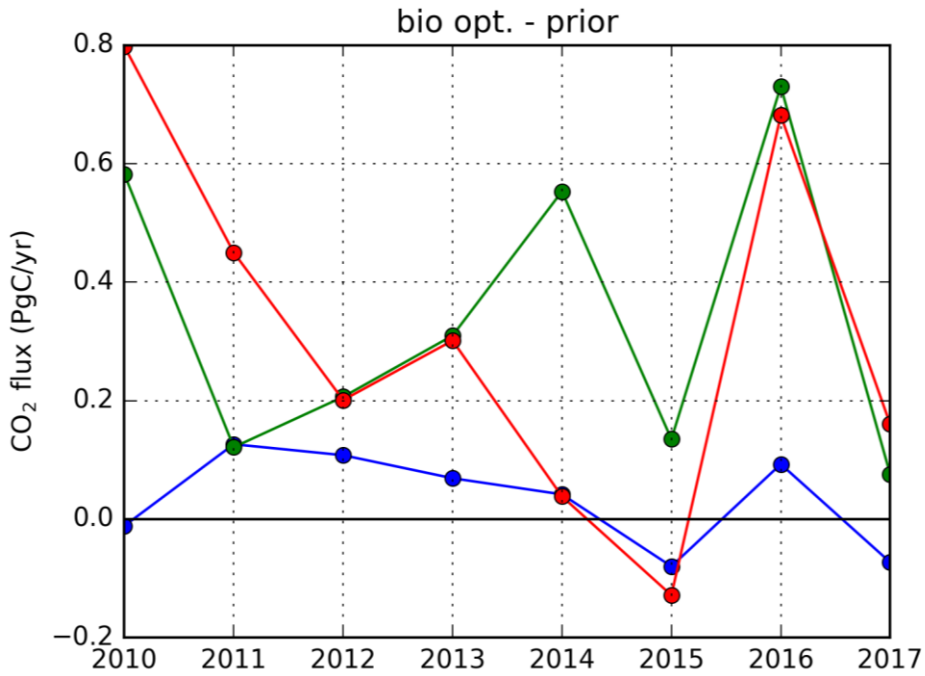
- In default setup, CarbonTracker scales both positive and negative NEE with same factor
- Averaged over the diurnal cycle NEE is relatively small
- Large scaling factors ( $\lambda \gg 1$  or  $\lambda \ll 1$ ) needed to substantially modify net emissions

# Alternative scaling methods



- In alternative setup, scaling factor is applied only to negative NEE (“uptake scaling”)
- Smaller scaling factors are sufficient to substantially modify net emissions
- Zero-crossings of NEE remain in place
- Same principle can be applied to positive NEE (“release scaling”)

# Alternative scaling methods

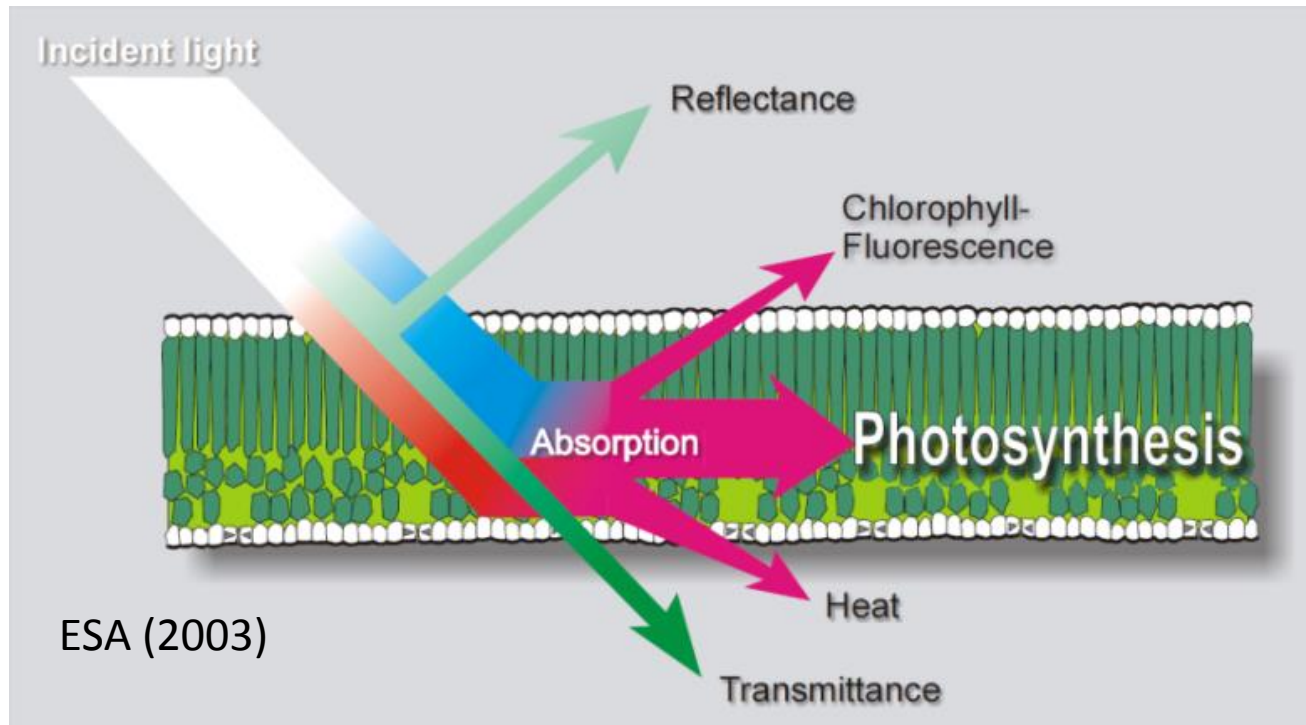


- default scaling
- uptake scaling
- release scaling

- Large emissions during drought year 2010 and post-drought year 2016

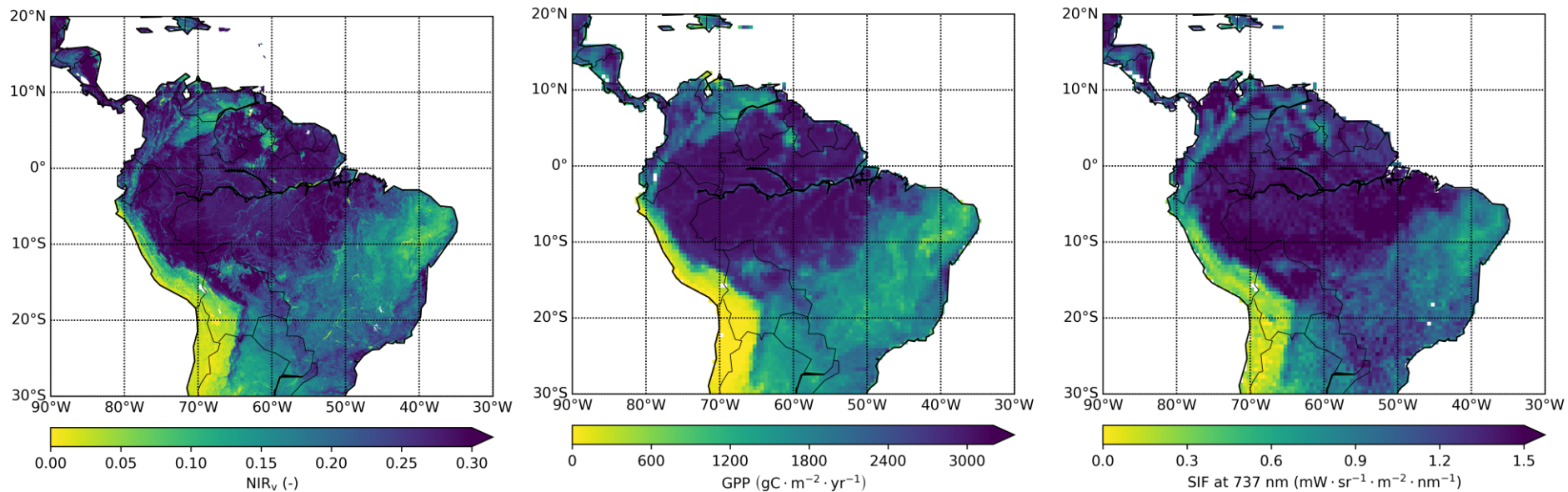


# Proxies for photosynthesis: SIF and NIRv



- SIF is a small fraction of light ( $\sim 1\%$ ) that is re-emitted from chloroplast at higher wavelengths
- NIRv reflects amount of vegetation in cell and structure of the canopy (Badgley et al, 2017)

# Annual mean NIRv, MPI-GPP and SIF

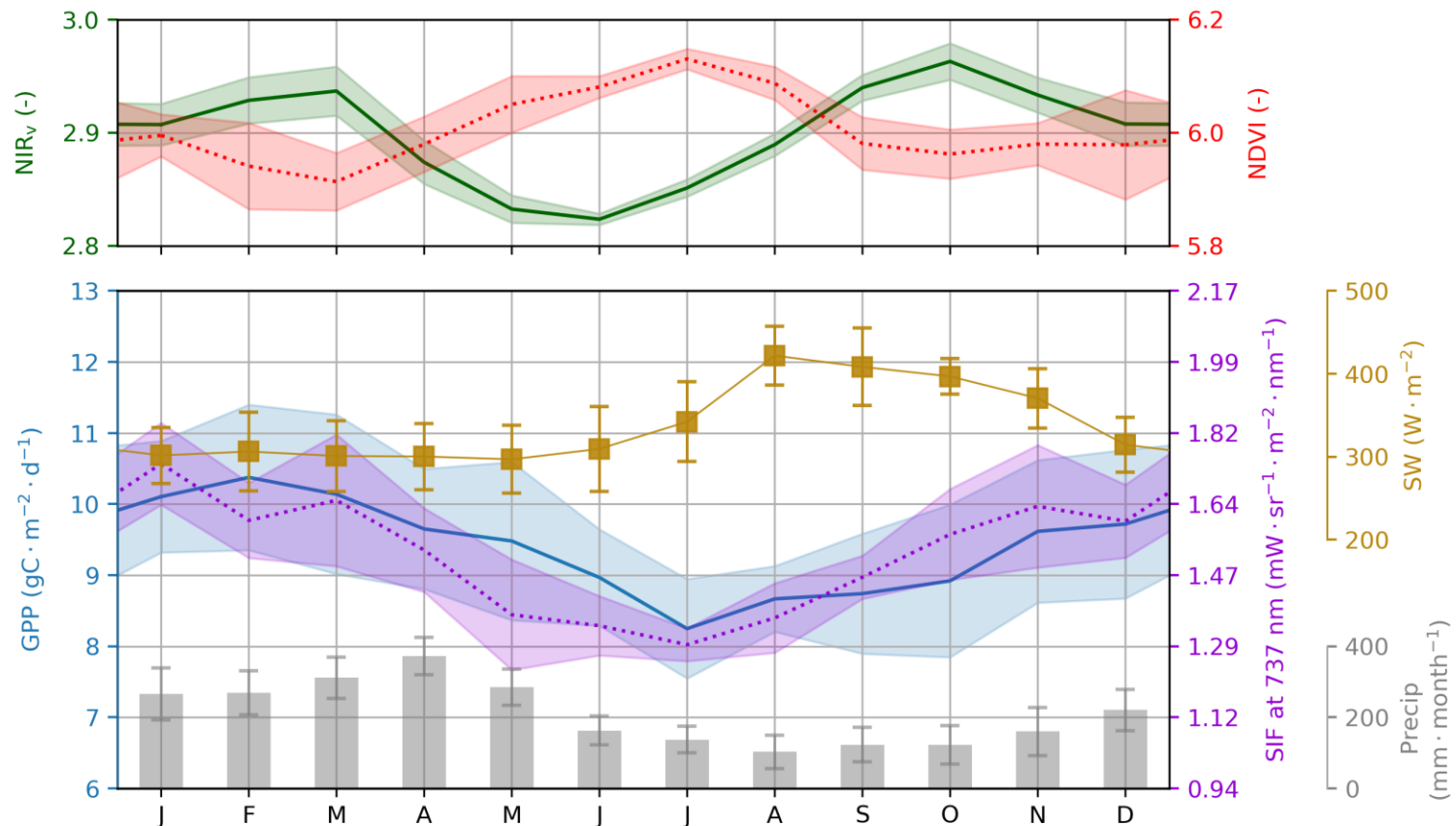


Similar spatial patterns in (from left to right):

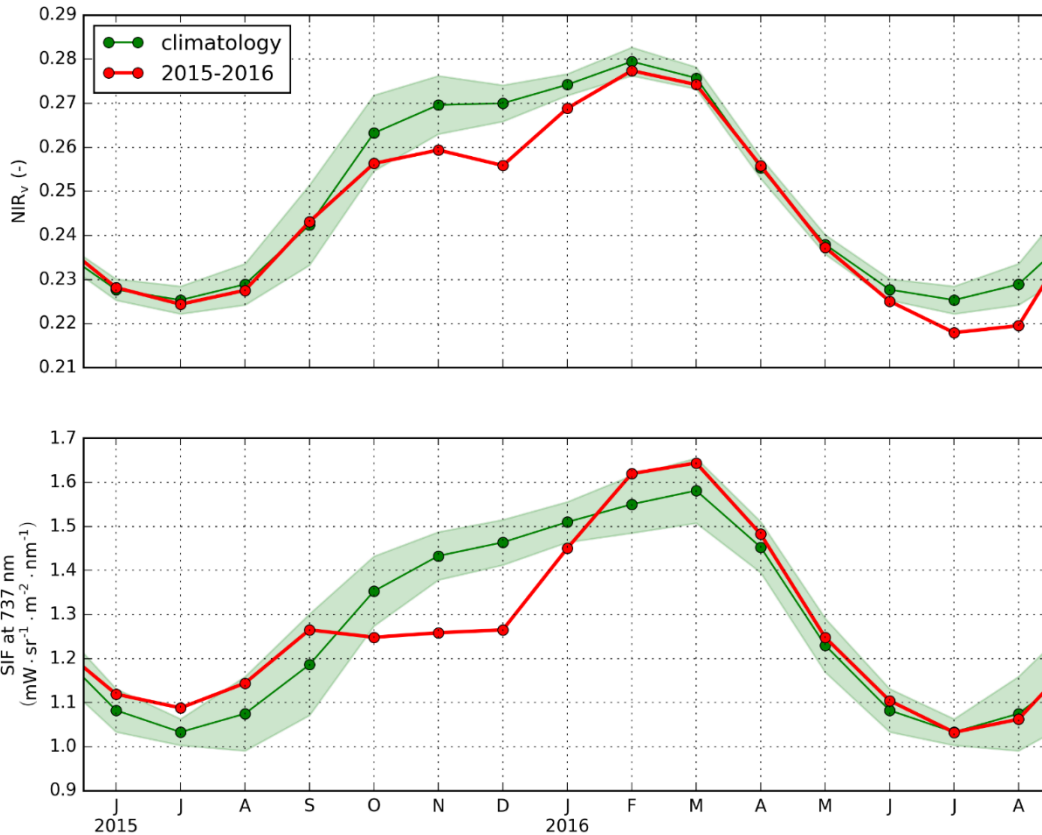
- NIRv derived from MODIS surface reflectance
- GPP product based on machine learning of EC data (Beer et al., Science, 2010)
- Remotely sensed SIFTER product developed by KNMI/WUR for tropical conditions

# Manaus K34 flux tower

- Data from K34 tower (2000-2009) and SIF/NIRv (2007-2014)
- GPP LUE models show increase of GPP during dry period, SIF and NIRv follow GPP
- Opposite seasonal cycle of NDVI and NIRv



# 2015/2016 Amazon drought



Widespread reduction in sun-induced fluorescence from the Amazon during the 2015/2016 El Niño

Gerbrand Koren<sup>1</sup>, Erik van Schaik<sup>1</sup>, Alessandro C. Araújo<sup>2</sup>, K. Folkert Boersma<sup>1,3</sup>, Antje Gärtner<sup>1</sup>, Lars Killaars<sup>4</sup>, Maurits L. Kooreman<sup>3</sup>, Bart Kruijt<sup>1</sup>, Ingrid T. van der Laan-Luijkx<sup>1</sup>, Celso von Randow<sup>5</sup>, Naomi E. Smith<sup>1</sup> and Wouter Peters<sup>1,4</sup>

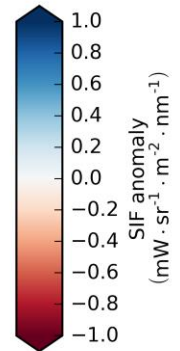
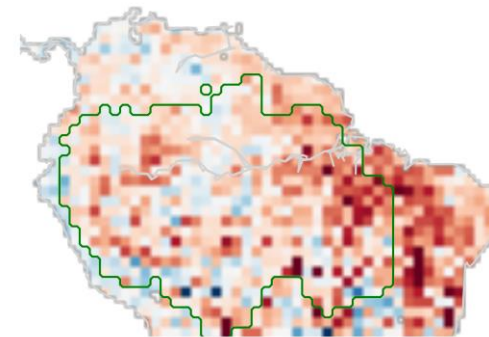
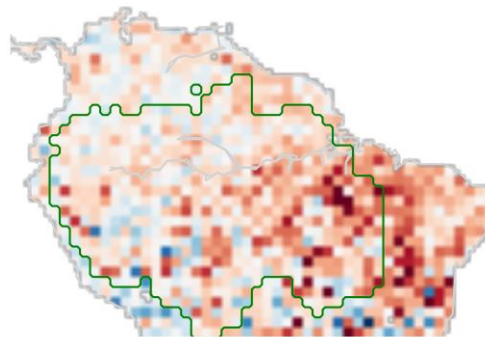
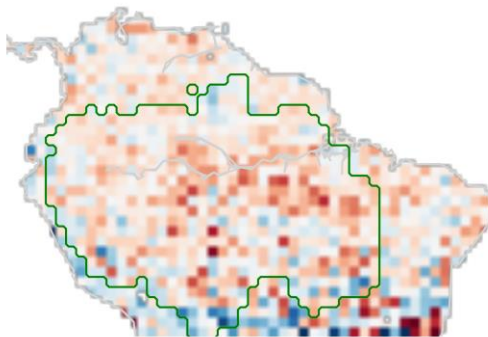
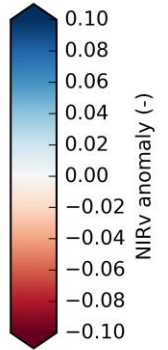
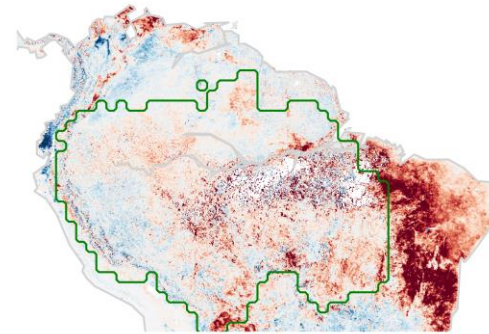
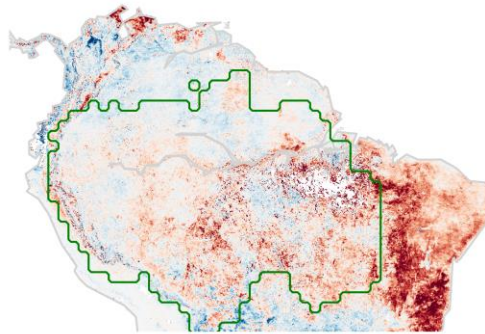
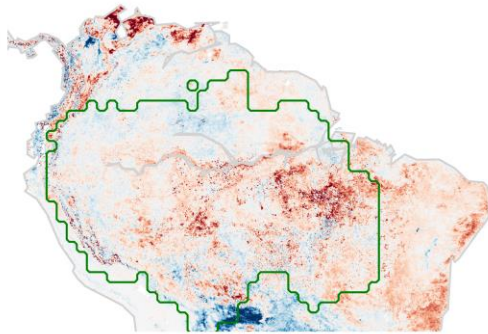
- 'Extended' dry season
- Onset of drought and recovery occurs earlier in SIF

# 2015/2016 Amazon drought

October 2015

November 2015

December 2015



- Green contour indicates Amazon forest region
- Large reduction of NIRv and SIF in Cerrado region (east of Amazon forest)

# Conclusions

## Fires:

- CO inversion with TM5-4DVAR based on IASI and NOAA data
- High fire emissions during drought years (2010, 2015)

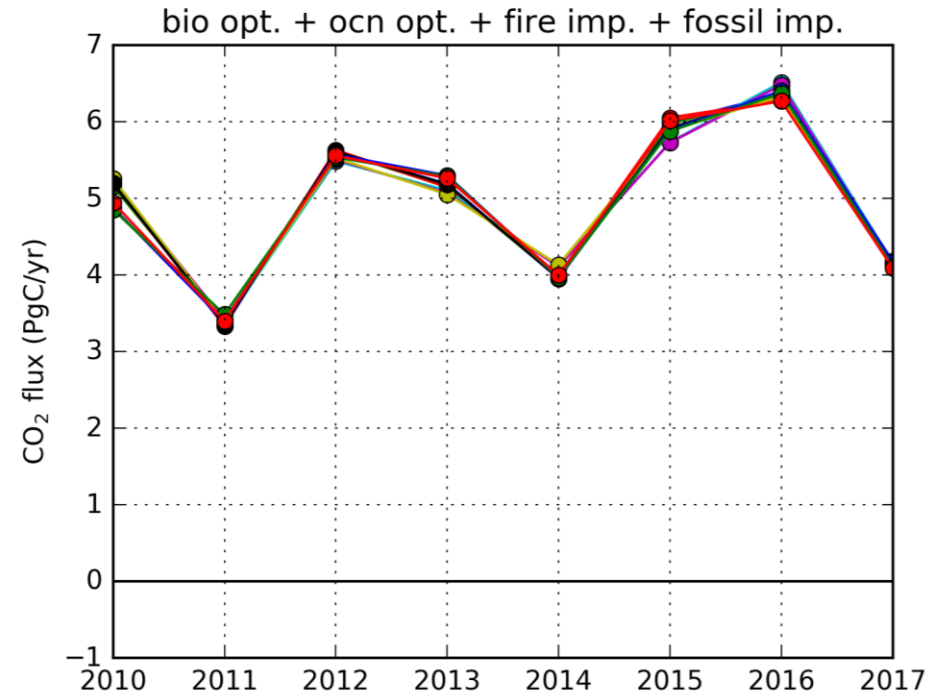
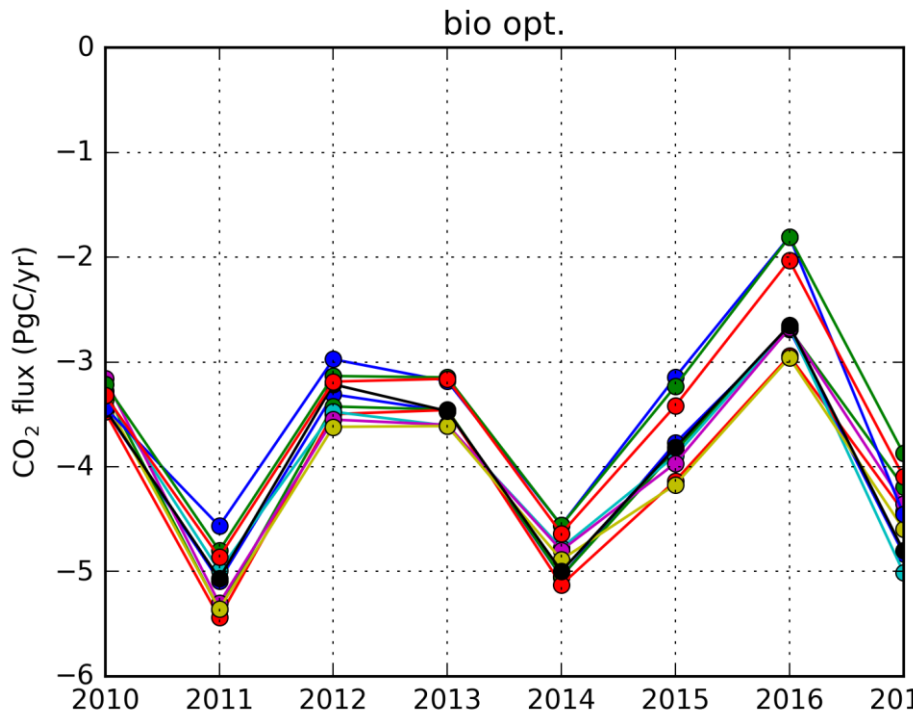
## NEE:

- CarbonTracker South America inversions with Amazon aircraft data
- IAV in biosphere fluxes can be retrieved from atmospheric data

## GPP:

- Custom developed SIFTER retrieval for tropical conditions and NIRv calculated from MODIS surf. reflectance
- Reduction of SIF and NIRv during the 2015 drought suggest a reduction of GPP

# Global fluxes



- SiBCASA-GFED4
- SiBCASA-GFAS
- SiBCASA-GFASopt
- SiBCASAclim-GFED4
- SiBCASAclim-GFAS
- SiBCASAclim-GFASopt
- SiBCASA-GFED4 with ATTO
- Bodesheim-neutral-GFED4
- Bodesheim-neutral-GFAS
- Bodesheim-neutral-GFASopt