

# Enhanced terrestrial carbon uptake: global drivers and implications for the growth rate of atmospheric CO<sub>2</sub>.

Trevor F. Keenan

[www.sites.google.com/trevorfkeenan](http://www.sites.google.com/trevorfkeenan)

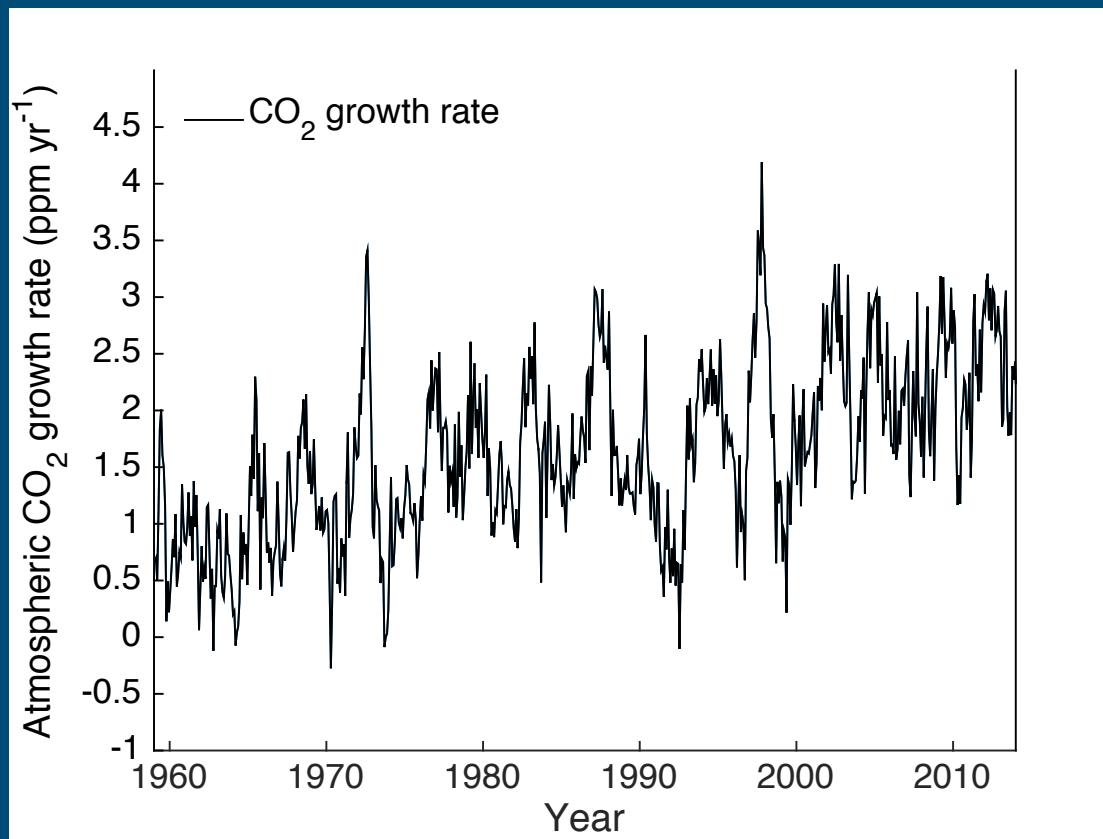


# The growth rate of atmospheric CO<sub>2</sub>

$GR_{CO_2}$  = emissions (fossil fuels, land use change,  
cement production)

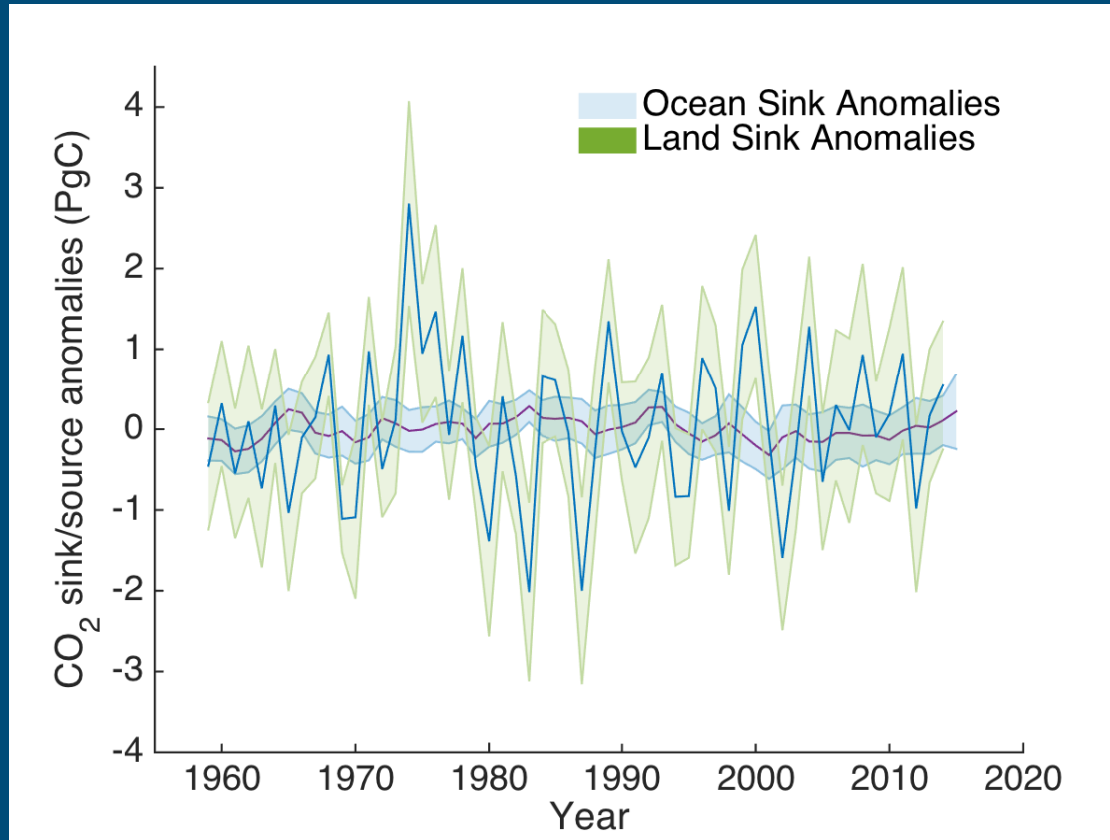
- Terrestrial CO<sub>2</sub> sinks
- Oceanic CO<sub>2</sub> sinks

# The growth rate of atmospheric CO<sub>2</sub>



Data source: Scripps CO<sub>2</sub> program @ Mauna Loa

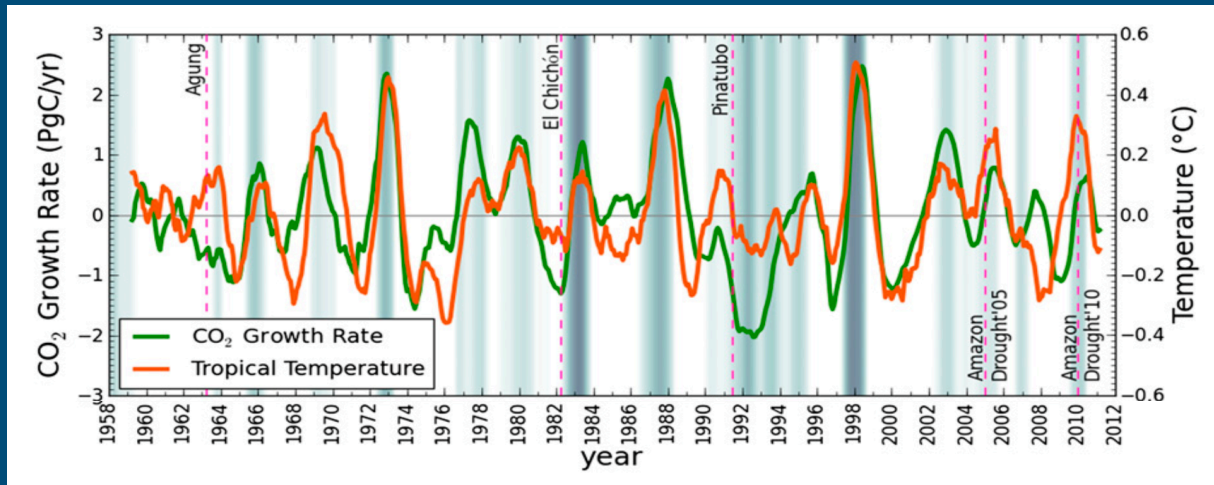
# Land drives variability in the growth rate



Data source: Global Carbon Project



# Linking the growth rate to the land

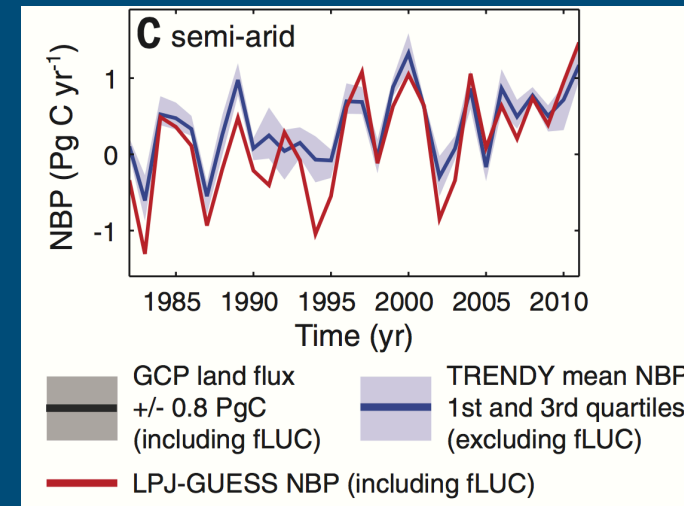


Weile Wang  
et al.  
(2013)

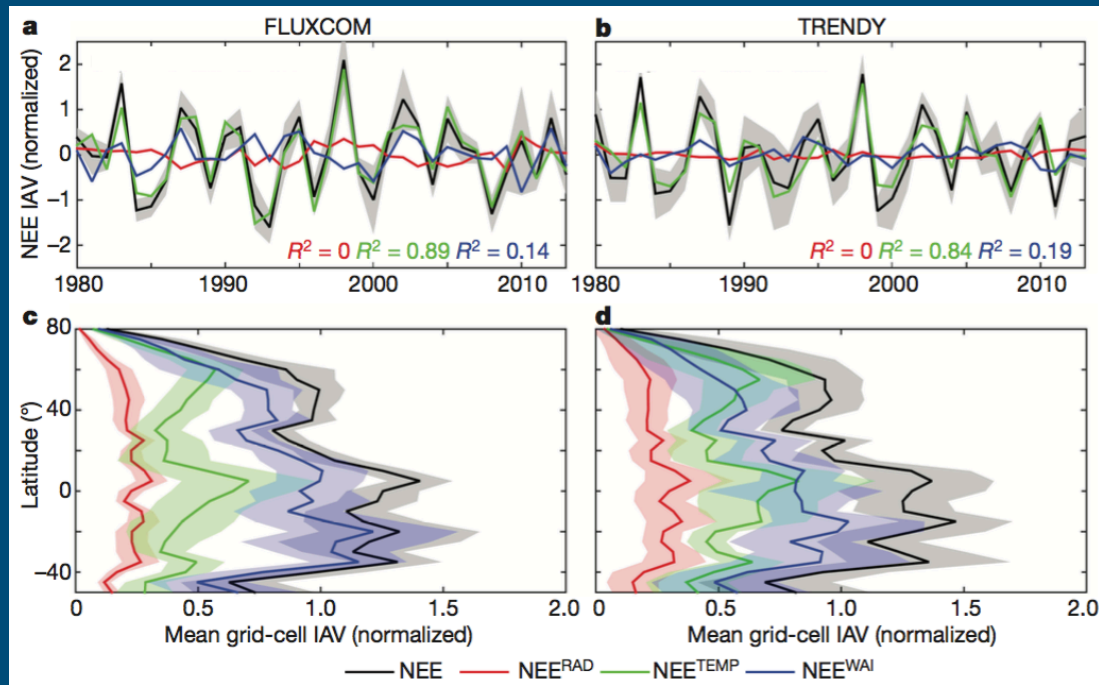
Ahlström et al.  
(2015);  
Poulter et al.  
(2015)

Variation in the growth rate tightly coupled to tropical temperatures.

Semi-arid regions also play an important role.



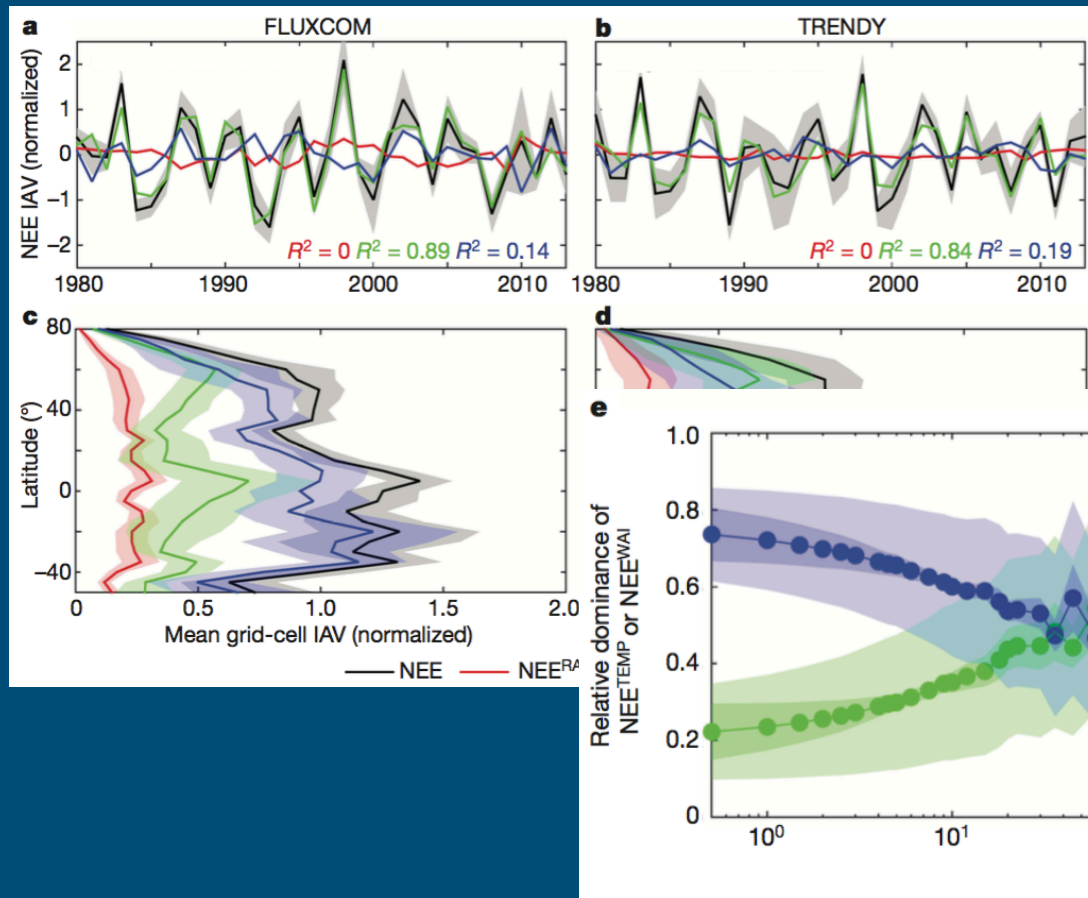
# Linking the growth rate to the land



Jung et al.  
2017

Water  
matters!

# Linking the growth rate to the land

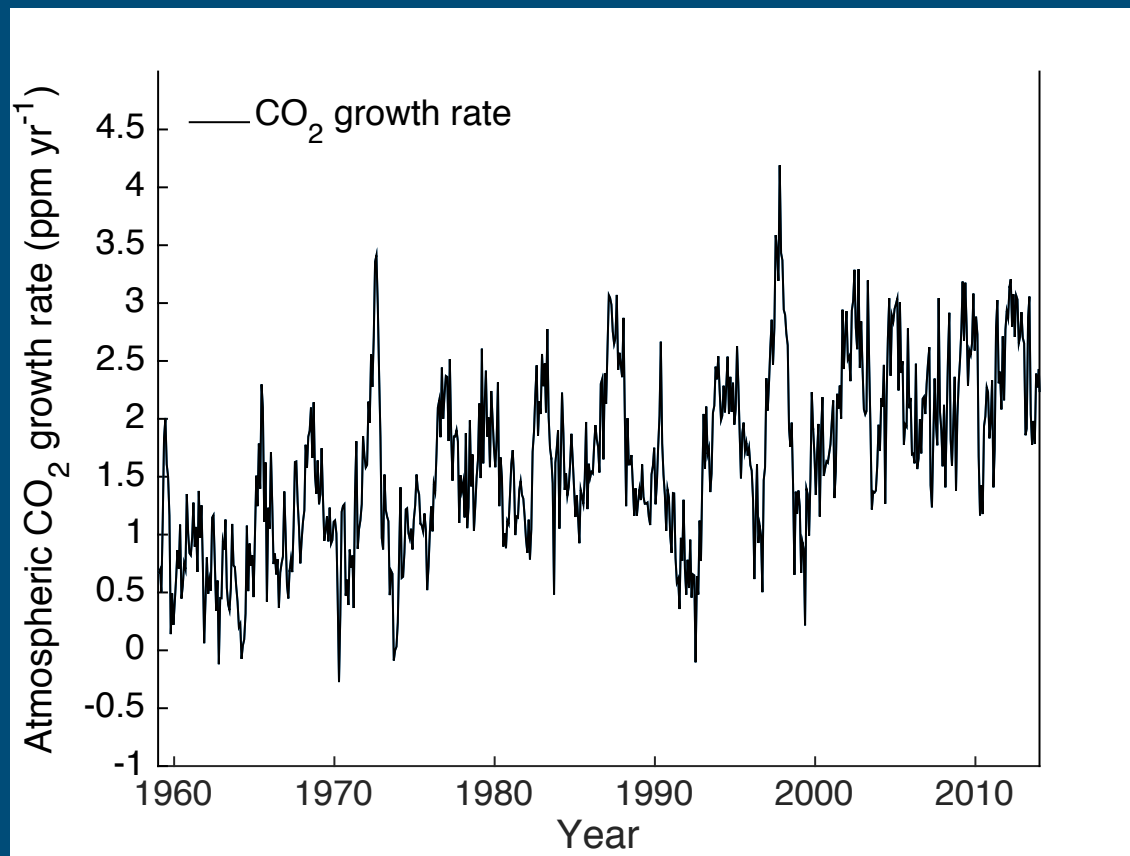


Jung et al.  
2017

Water  
matters!

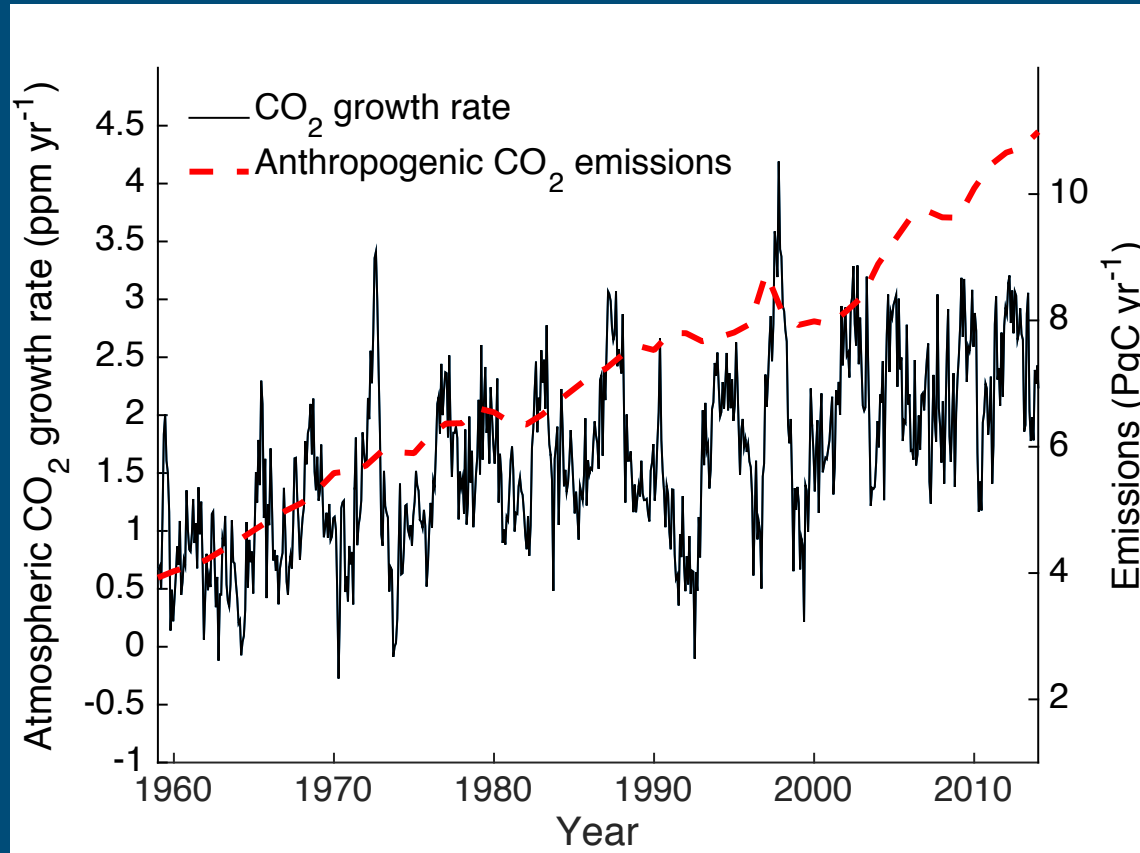
... at almost all scales but the globe!

# The growth rate of atmospheric CO<sub>2</sub>



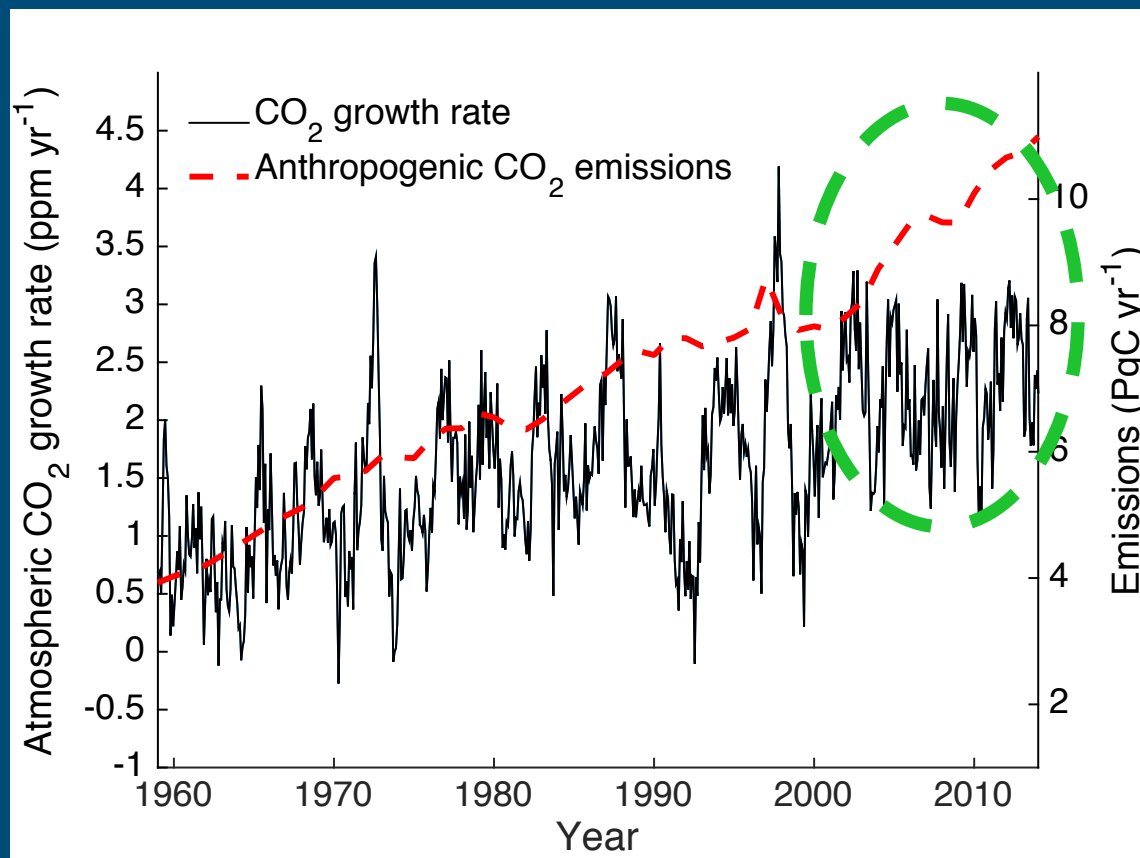
Data source: Scripps CO<sub>2</sub> program @ Mauna Loa

# The growth rate of atmospheric CO<sub>2</sub>



Data source: Scripps CO<sub>2</sub> program & GCP

# The growth rate of atmospheric CO<sub>2</sub>



Data source: Scripps CO<sub>2</sub> program & GCP

# First-order diagnostics of the growth rate

Construct a linear model by assuming that the sink is a linear function of atmospheric CO<sub>2</sub> concentration:

$$F_{\text{sink}} = M + F_0$$

where  $\beta$  is the inverse residence time for excess carbon against the processes of land and ocean uptake.

$$GR_{\text{CO}_2} = F_{\text{fossil}} + F_{\text{LUC}} - F_{\text{SINK}}$$

# First-order diagnostics of the growth rate

- Predict the growth rate using the linear model
- Examine dynamics of the residuals over time
- Any change in the residuals suggests a deviation of global sinks from the assumption of linearity.

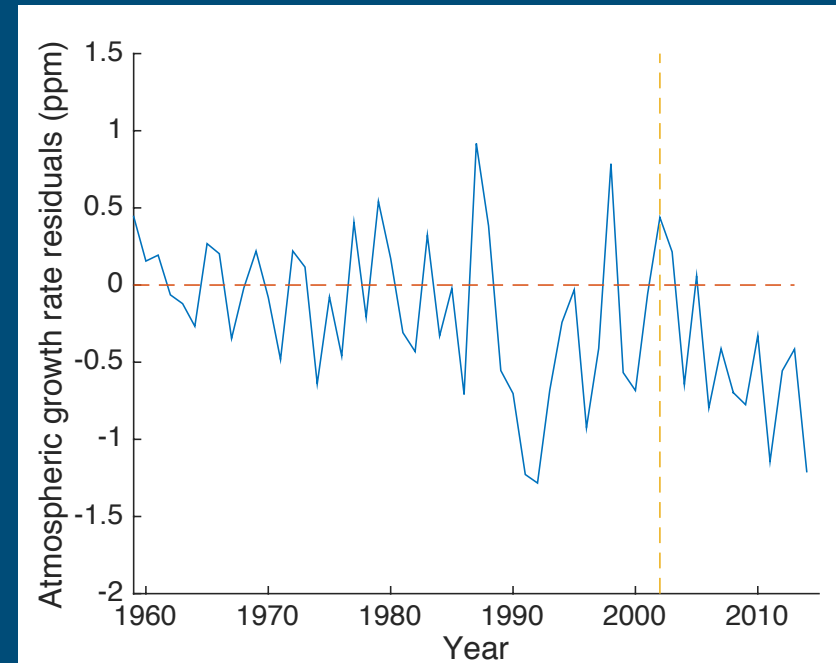
Keenan et al. (2016)



# First-order diagnostics of the growth rate

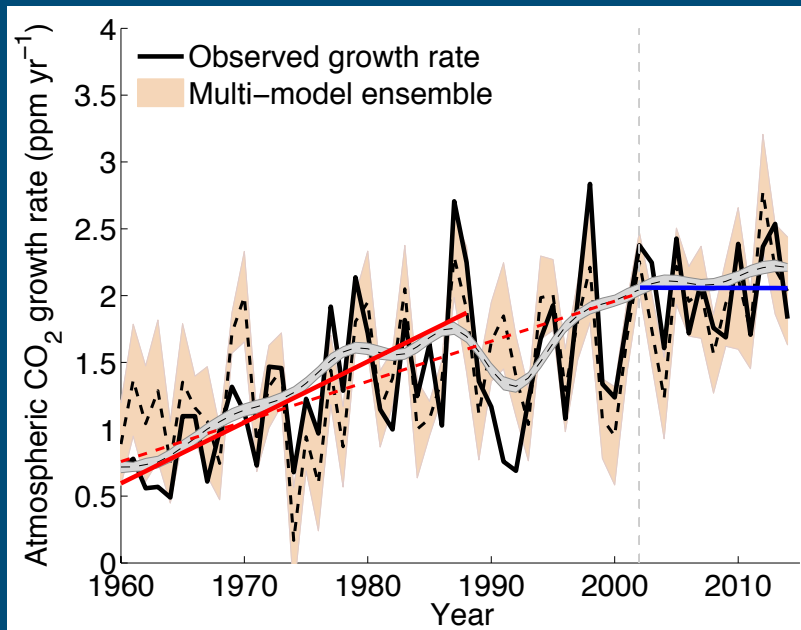
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## Residuals



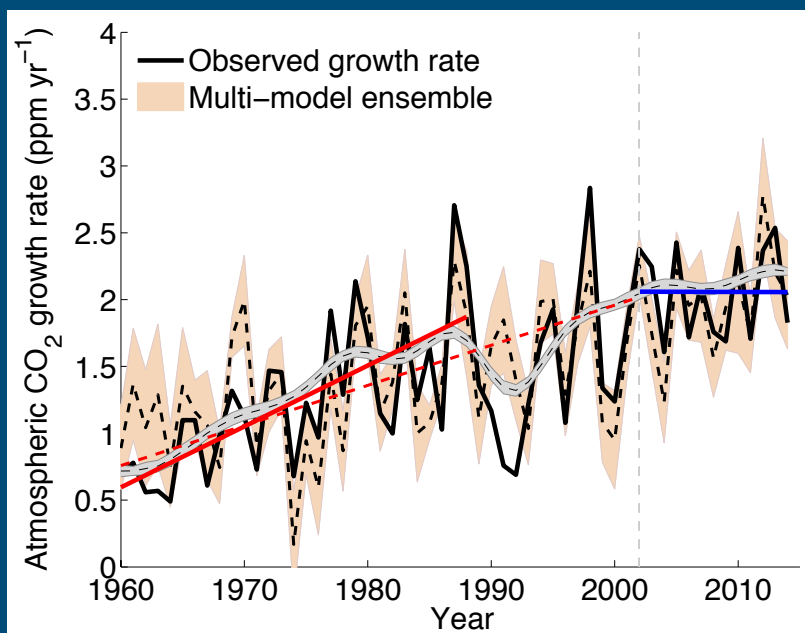
Keenan et al. (2016)

# Growth Rate pause

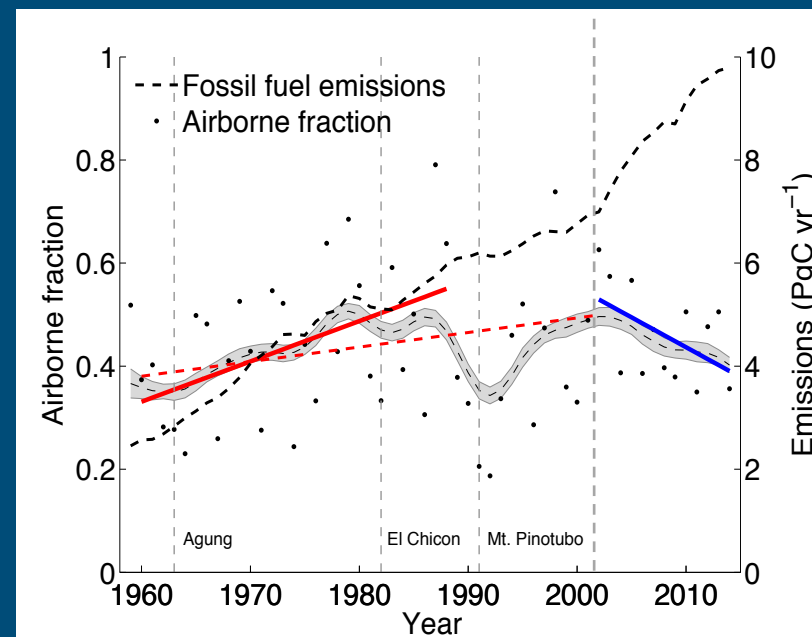


Keenan et al. (2016)

# Growth Rate pause



# Airborne Fraction decline

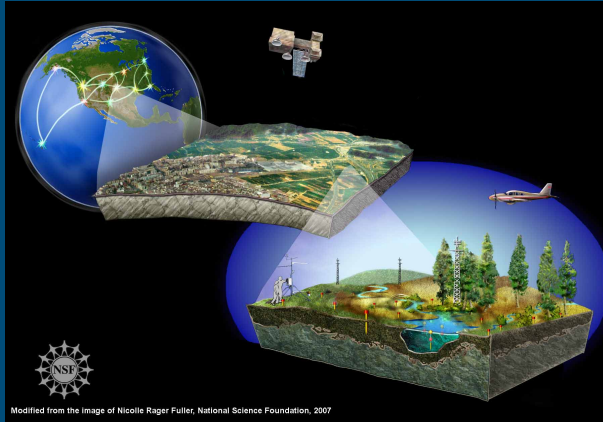


Keenan et al. (2016)

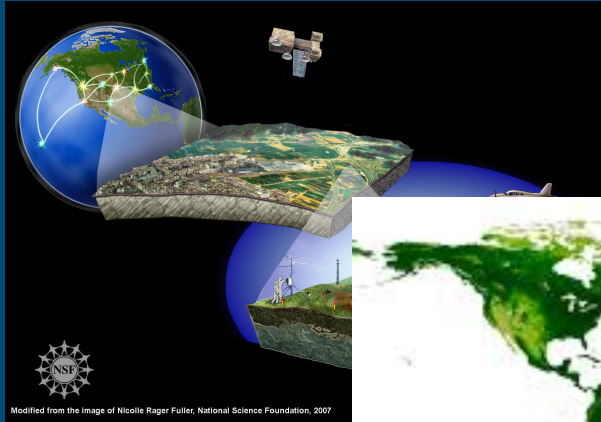
# Examining long-term changes in the Global Carbon Cycle

- Global Carbon Project data (Le Quere et al., 2015)
- Dynamic global vegetation models (Sitch et al., 2015)
- A diagnostic model of the global carbon cycle
- Validation: FLUXNET, NOAA, Jena GPP, DGVMs, NOAA atmospheric CO<sub>2</sub> concentrations

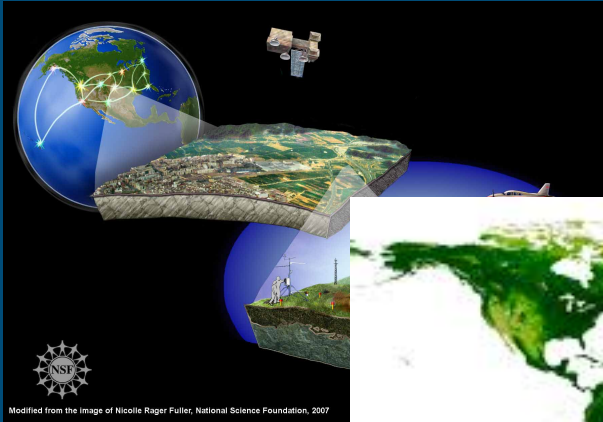
# Design of a global diagnostic model



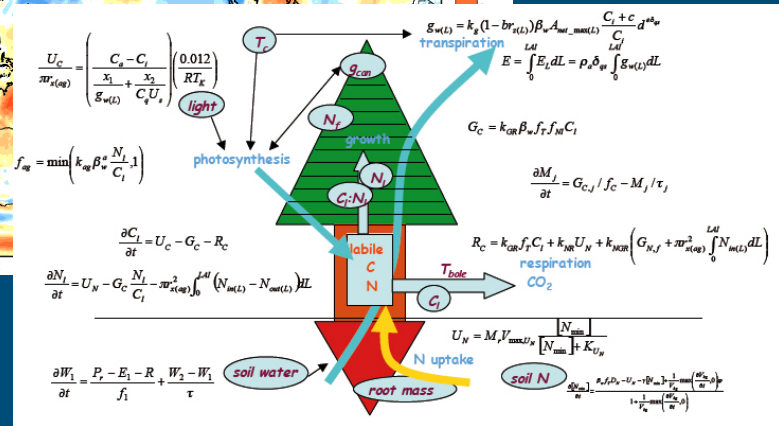
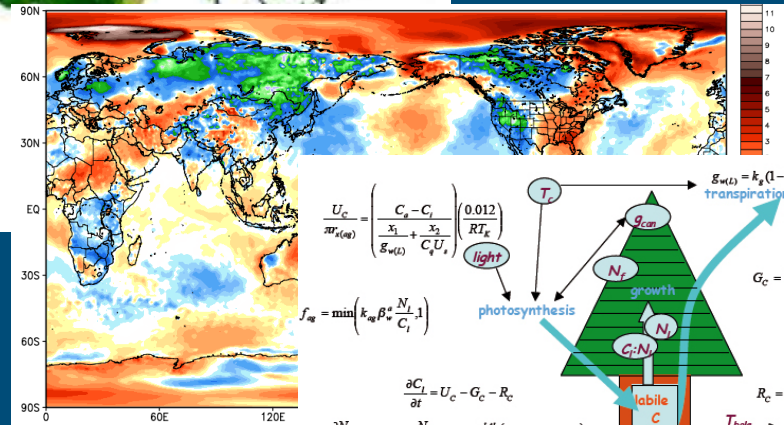
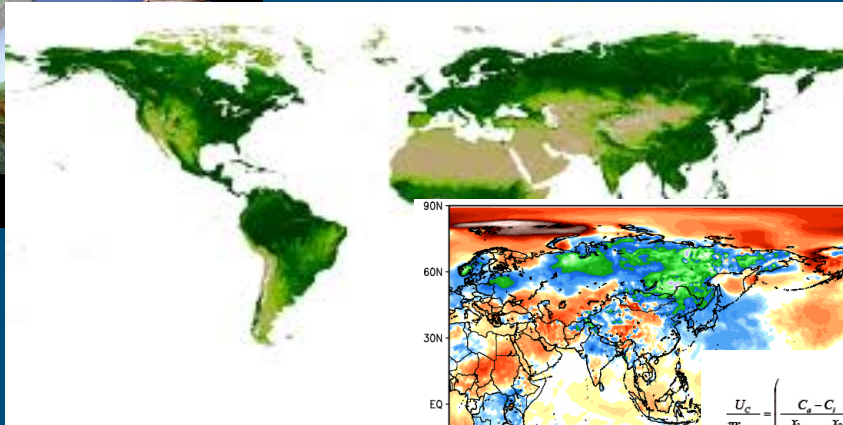
# Design of a global diagnostic model



# Design of a global diagnostic model



Modified from the image of Nicole Rager Fuller, National Science Foundation, 2007



# Design of a global diagnostic model

## The co-limitation hypothesis:

“Plants allocate nitrogen to maintain a balance between two processes ... each of which potentially limits photosynthesis”

Chen et al. 1993

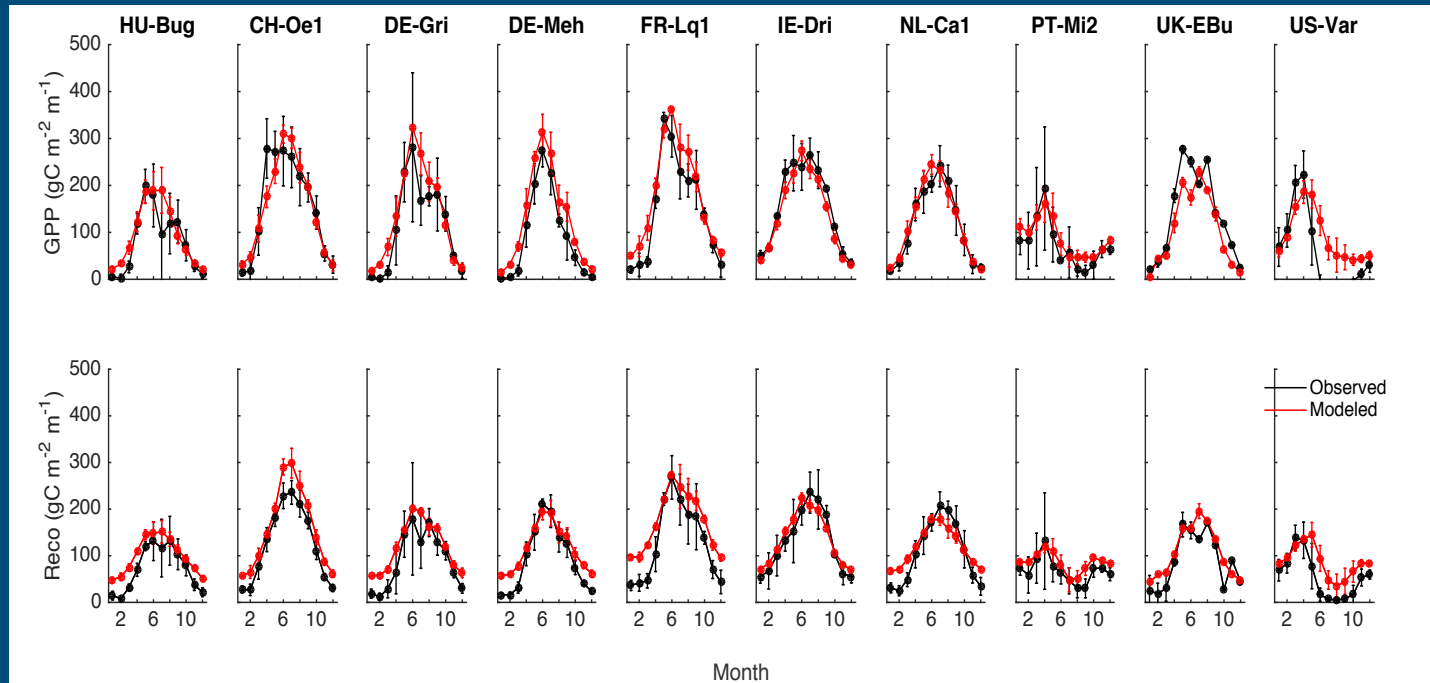
## The least cost hypothesis:

“the ratio of leaf-internal to ambient CO<sub>2</sub> partial pressure should minimize the combined costs of maintaining the capacities for carboxylation and transpiration.”

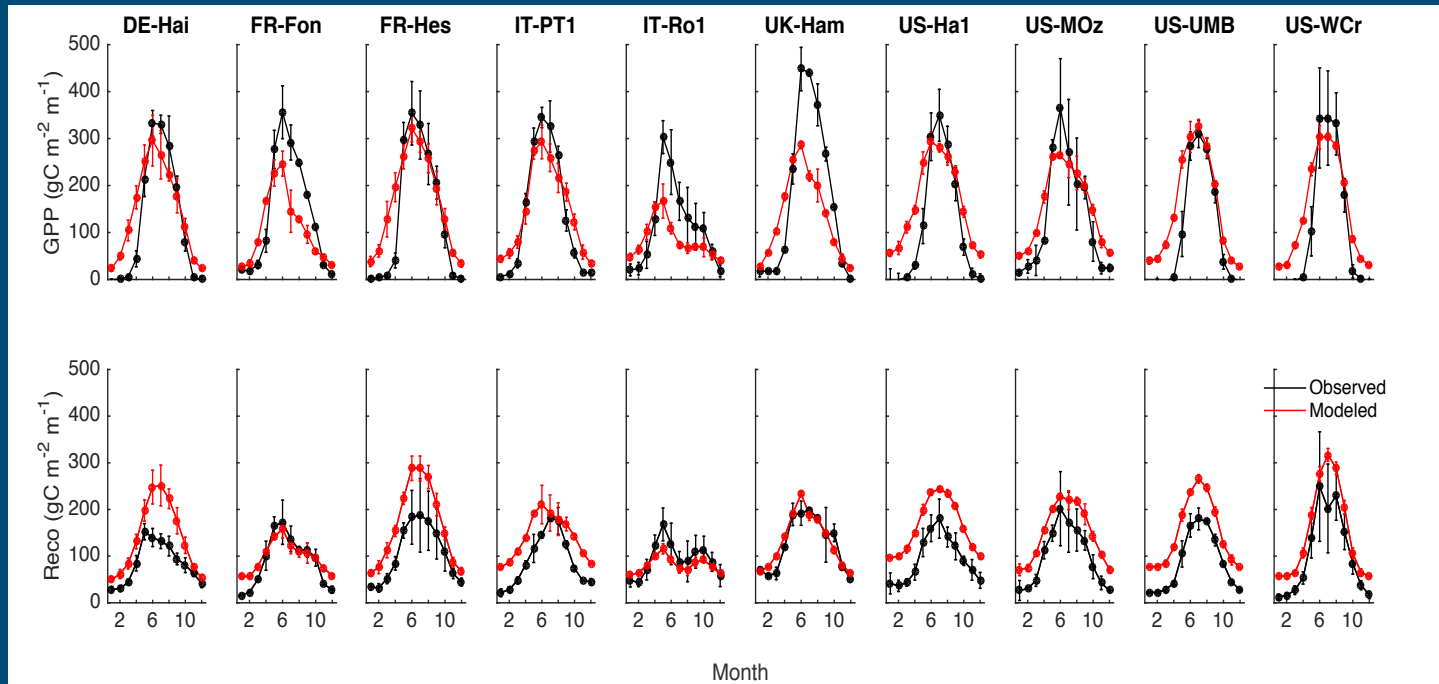
Prentice et al. 2014



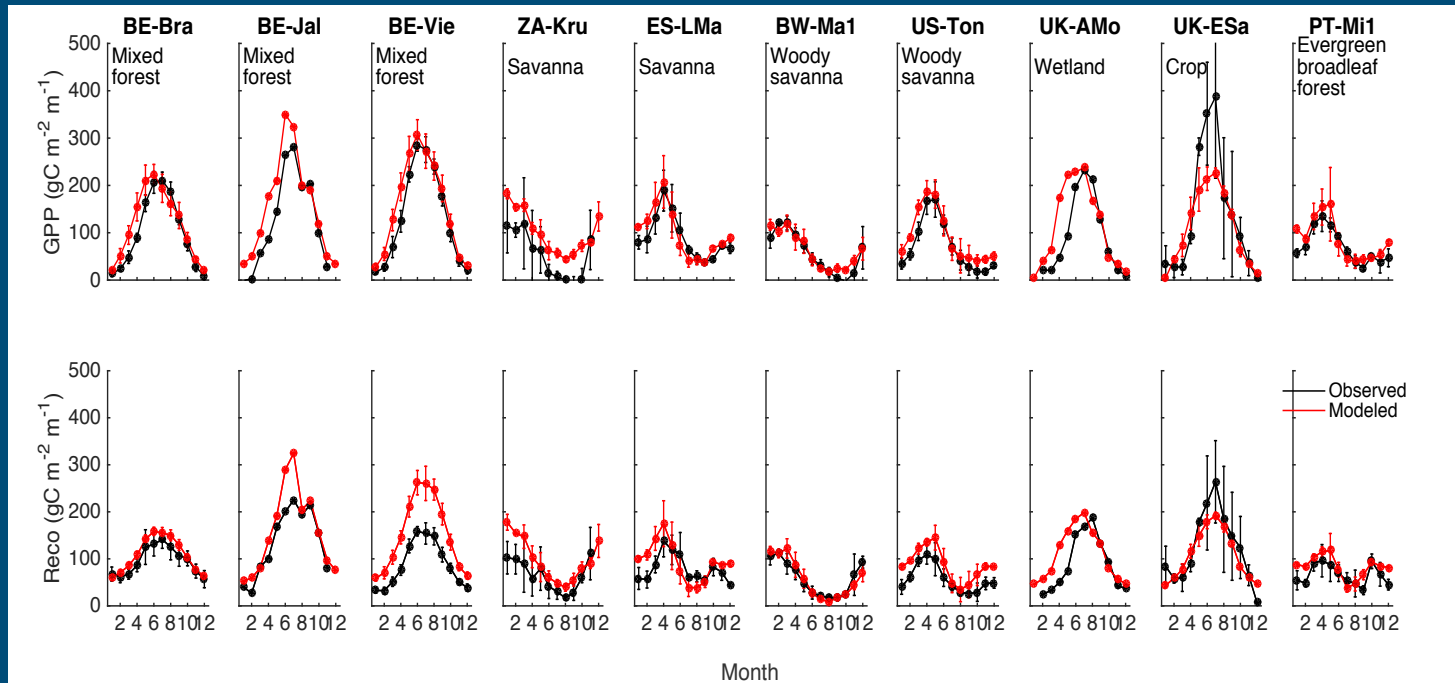
# Testing at global grassland sites



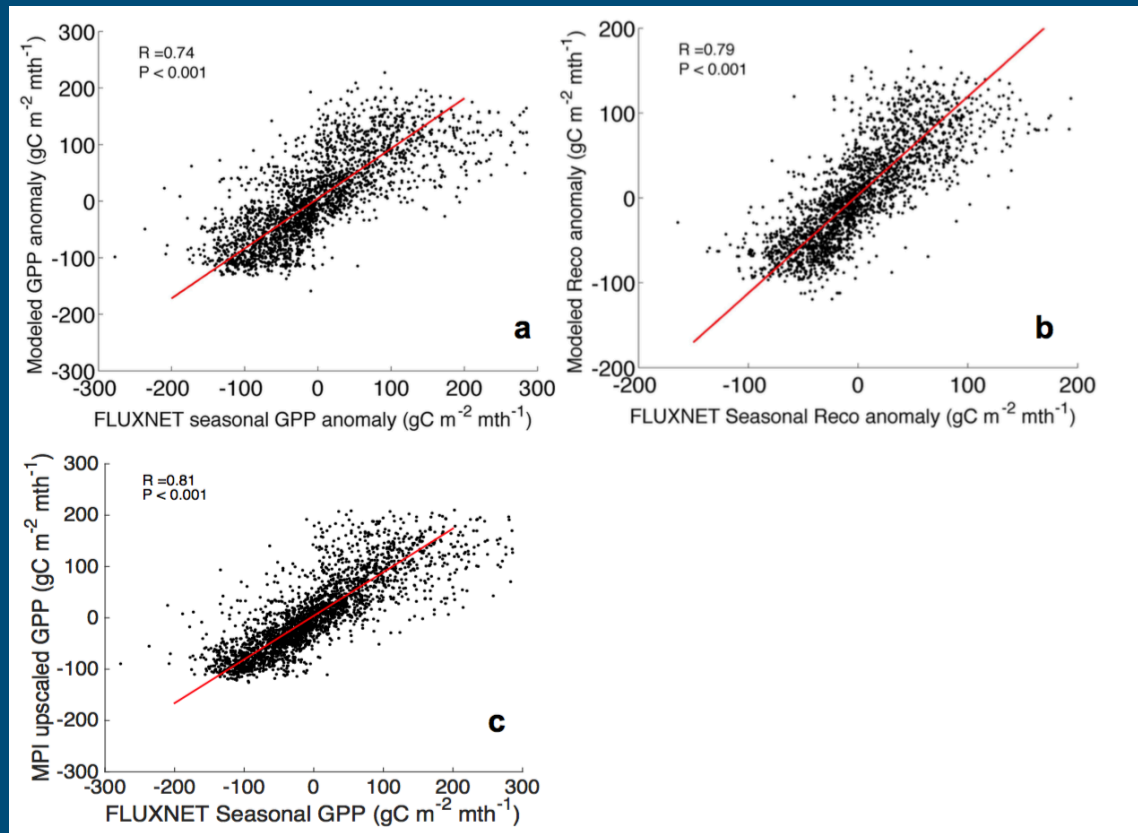
# Testing at global DBF sites



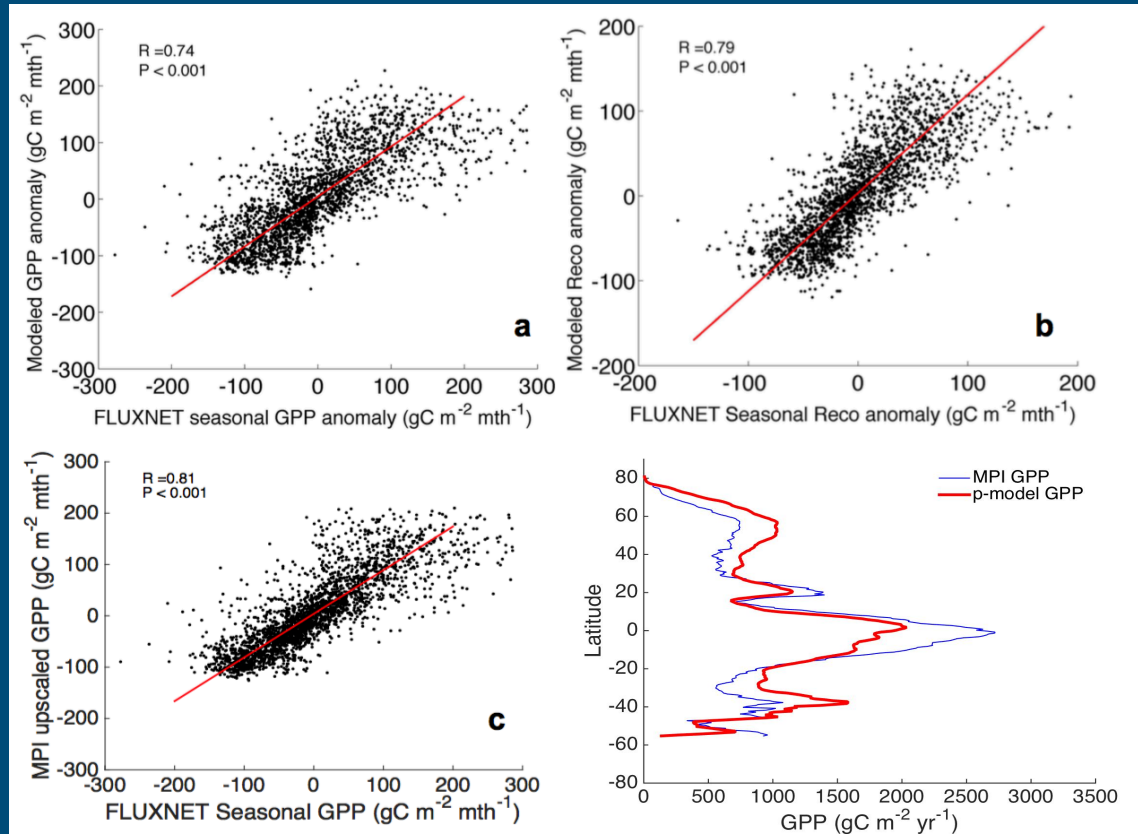
# Testing at global varied PFTs



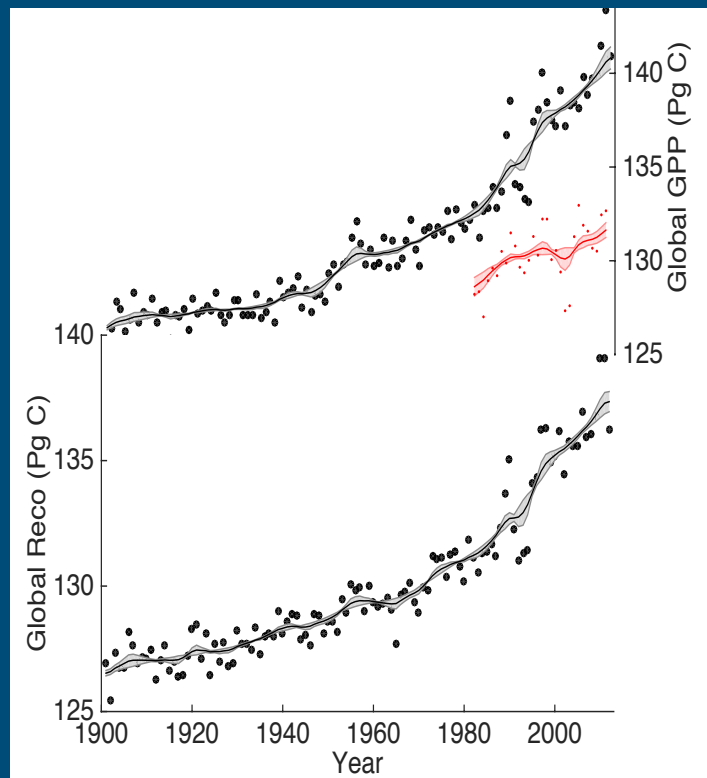
# Comparing to the MPI Fluxnet upscaling product



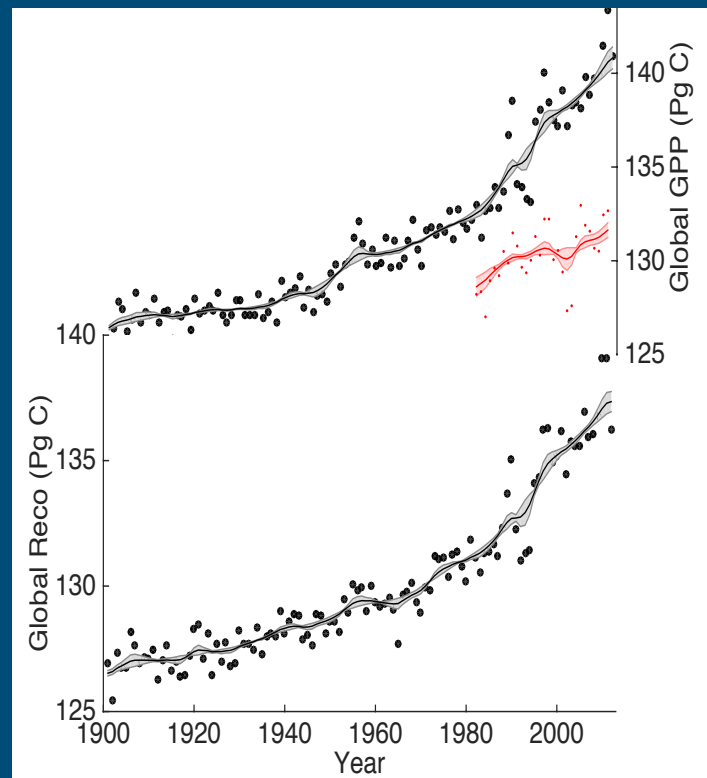
# Comparing to the MPI Fluxnet upscaling product



# Comparing to the MPI Fluxnet upscaling product

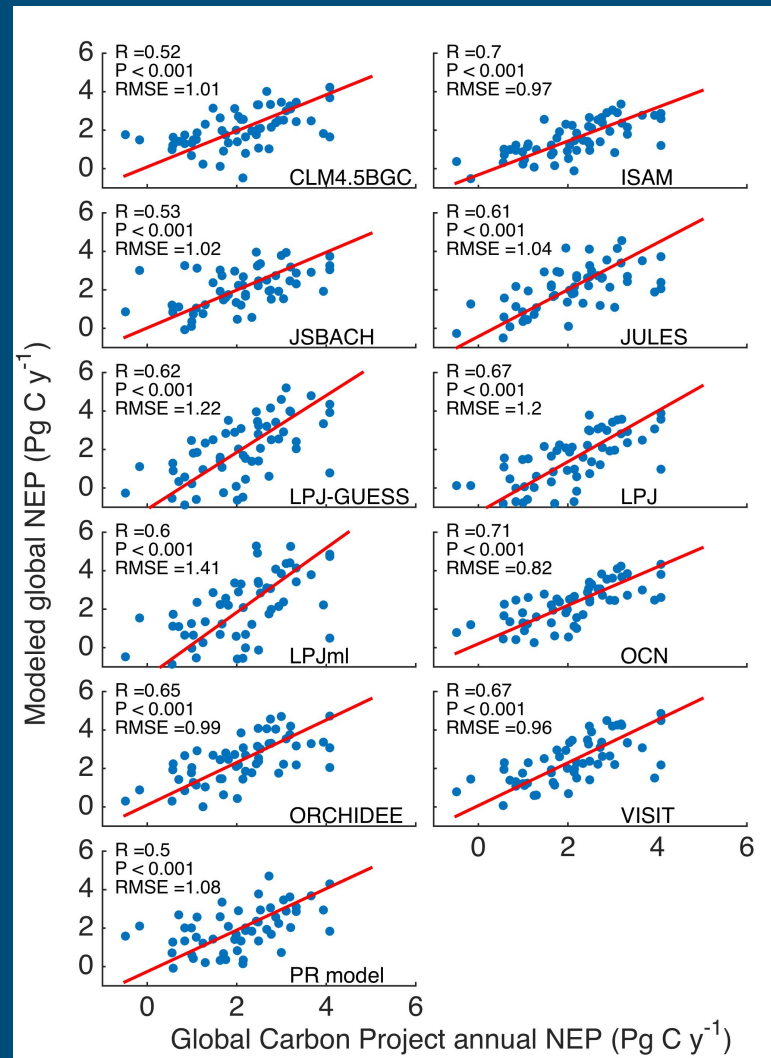


# Comparing to the MPI Fluxnet upscaling product



Difference between empirical Jung et al. approach and physiologically based approach?

# Comparing to Global Dynamic Vegetation Models

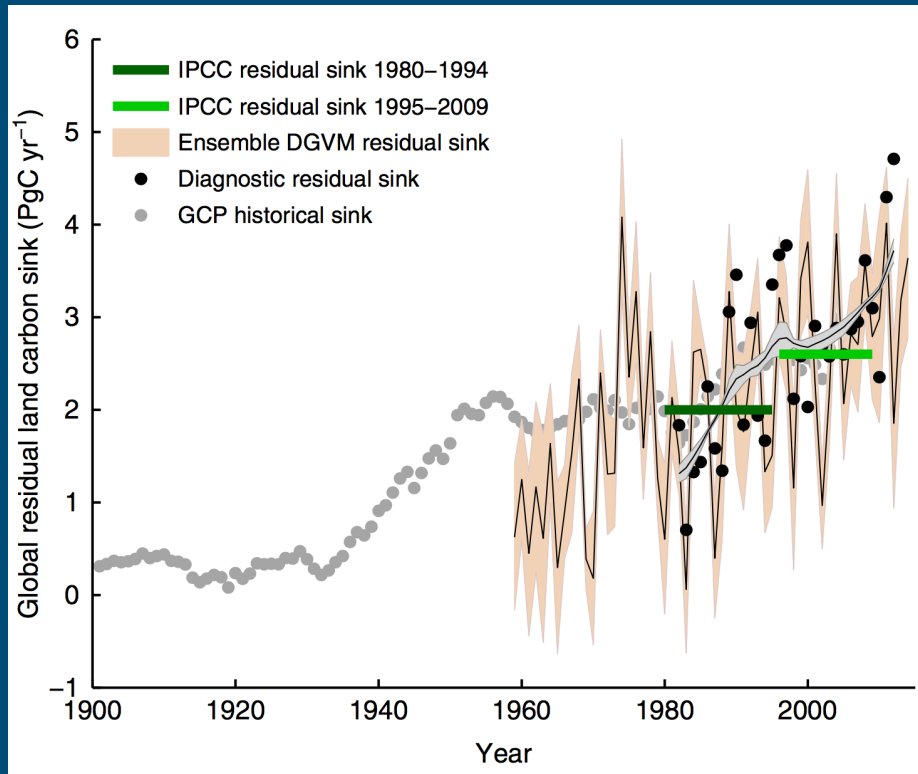




# Examining long-term dynamics of the global carbon cycle

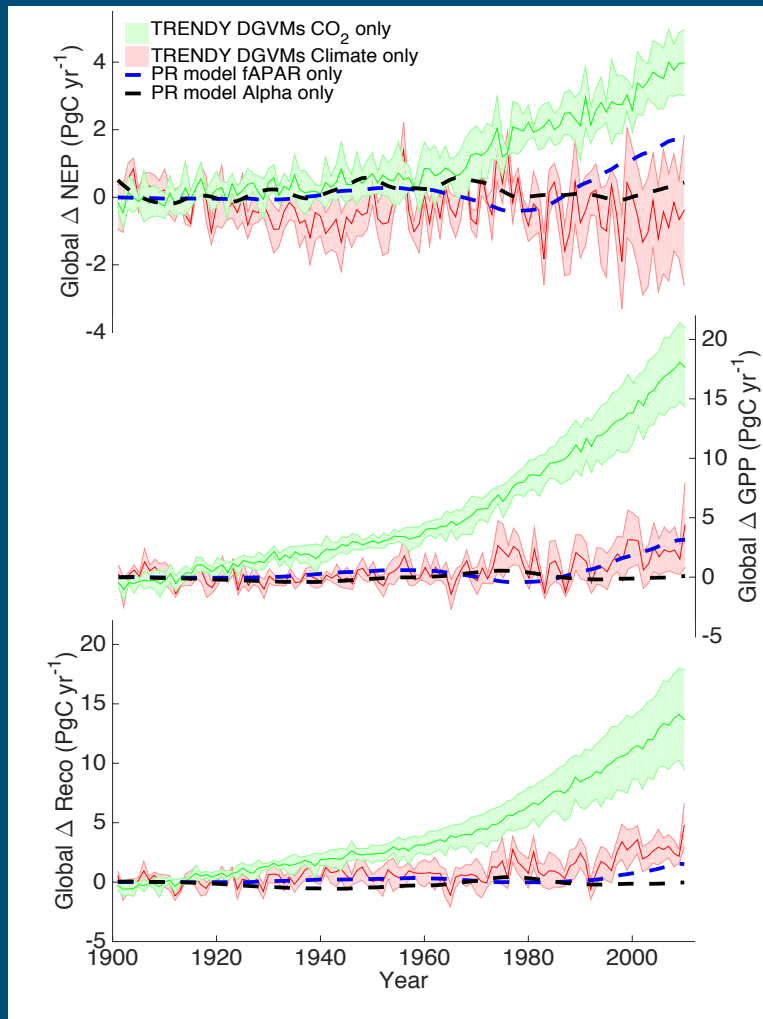
- Use 9 Dynamic Global Vegetation Models from the TRENDY project
  - CO<sub>2</sub> transient, other drivers fixed
  - Climate transient, other drivers fixed
- Use a diagnostic satellite-based model of global photosynthesis and respiration
  - Vegetation cover dynamic or fixed
  - Water availability dynamic or fixed

# Enhanced land surface CO<sub>2</sub> uptake



Keenan et al. (2016)

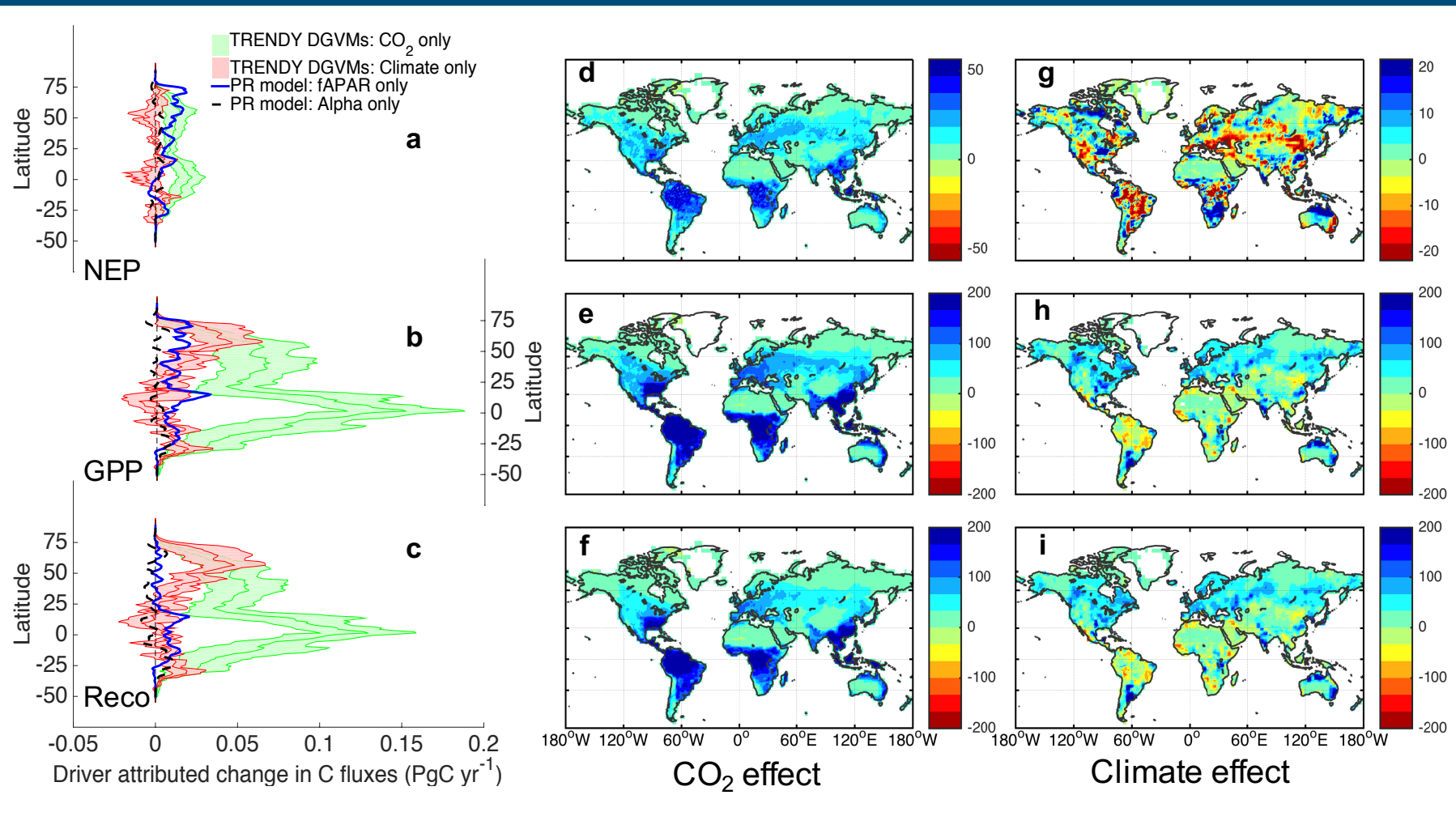
# CO<sub>2</sub> Fertilization and Temperature



- CO<sub>2</sub> markedly increasing the net sink, photosynthesis and respiration.
- Vegetation greening a distant second.
- Warming increased both GPP and Respiration.
- No evidence for an increase in global water stress.

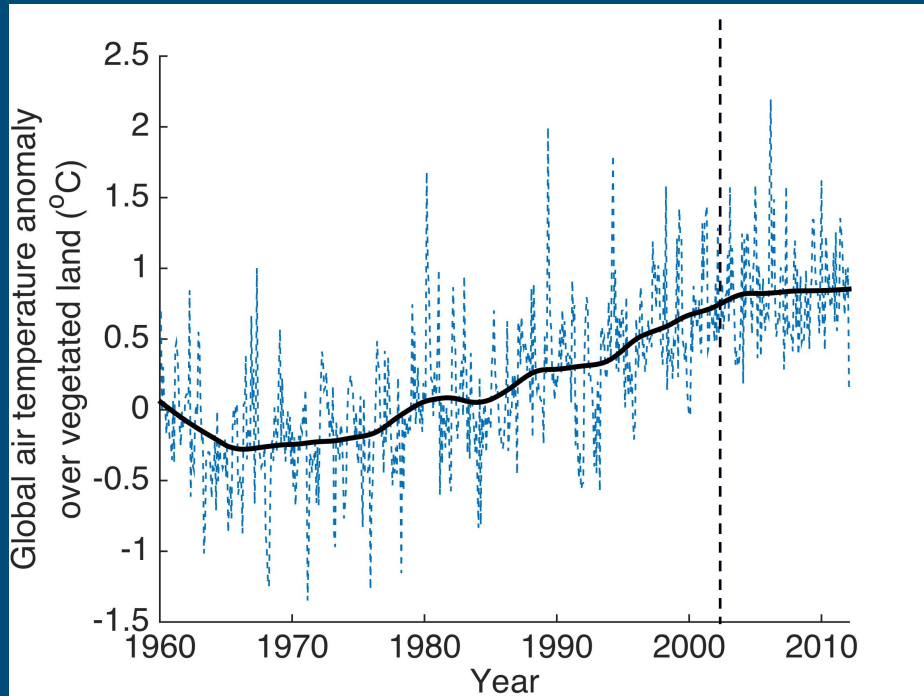
Keenan et al. (2016)

# CO<sub>2</sub> Fertilization and Temperature



Keenan et al. (2016)

# CO<sub>2</sub> Fertilization and Temperature

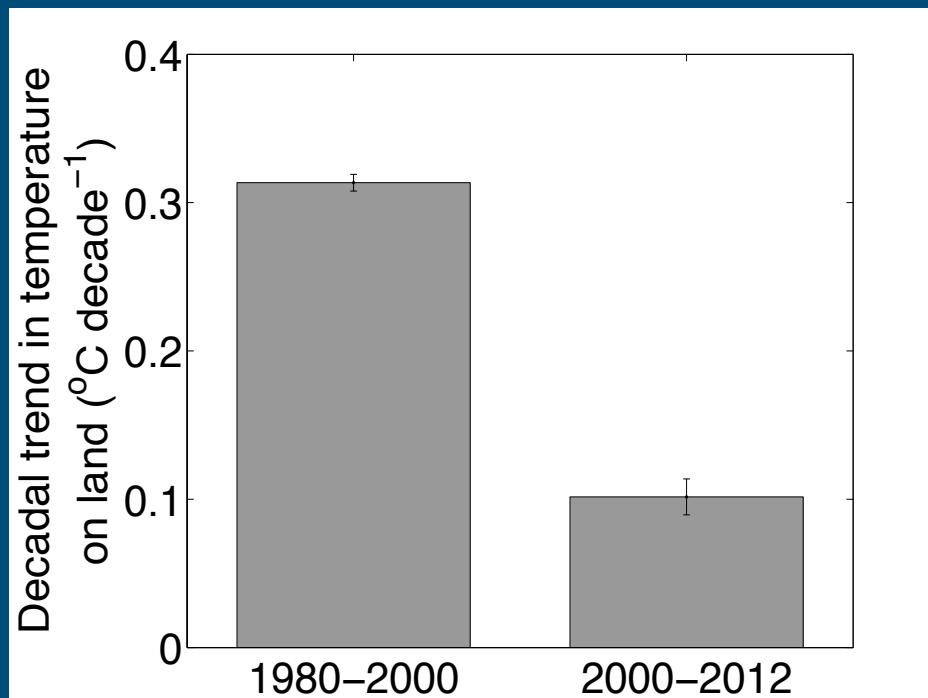


2002-2014 was a period of relatively slow growth in global temperatures over land.

Data source: CRU monthly temperature data

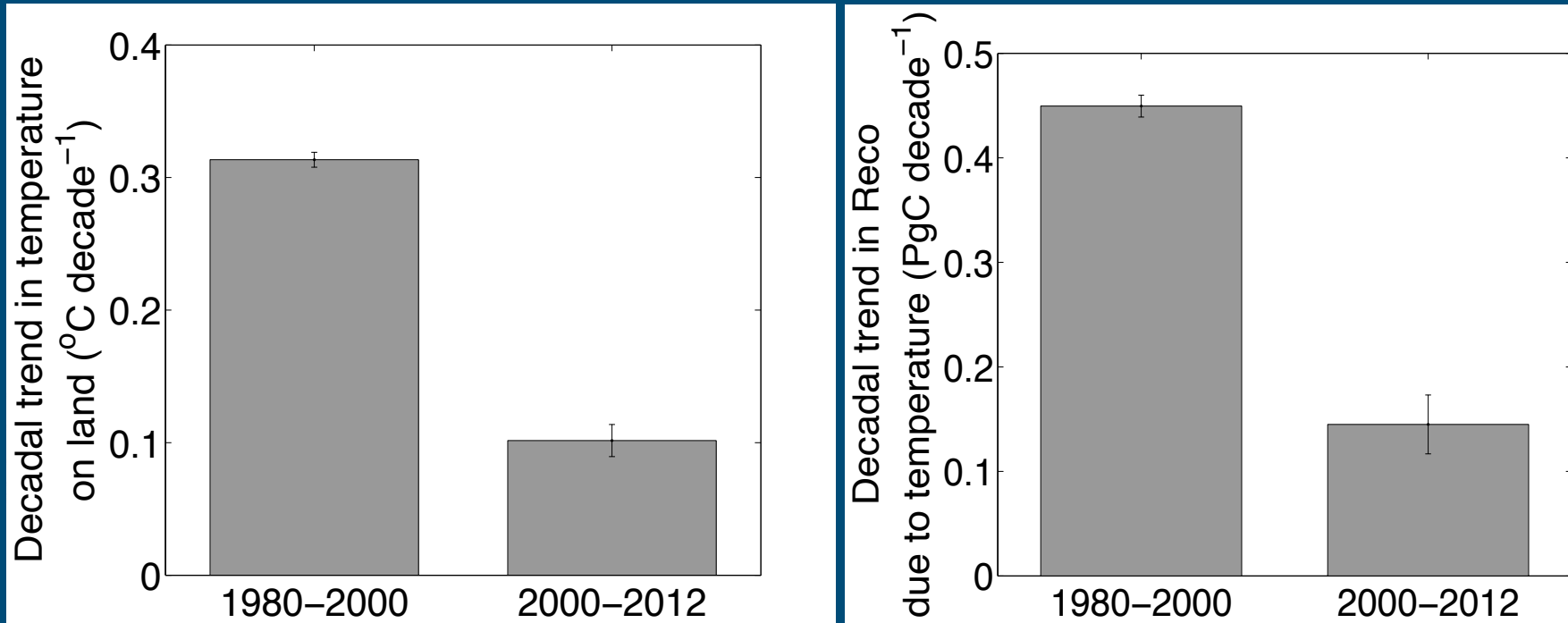
Keenan et al. (2016)

# CO<sub>2</sub> Fertilization and Temperature



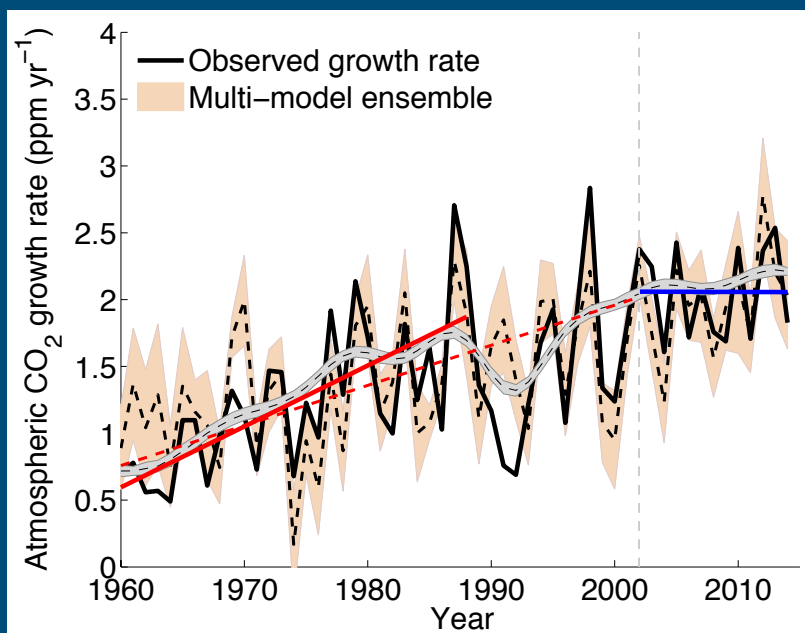
Keenan et al. (2016)

# CO<sub>2</sub> Fertilization and Temperature

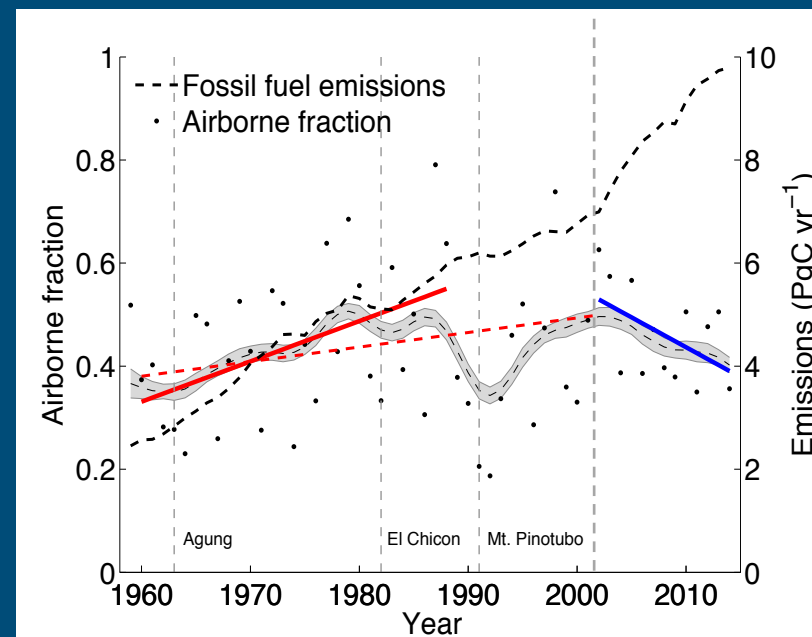


Keenan et al. (2016)

# Growth Rate pause



# Airborne Fraction decline



Keenan et al. (2016)



**All good climate change stories must come to an end...**

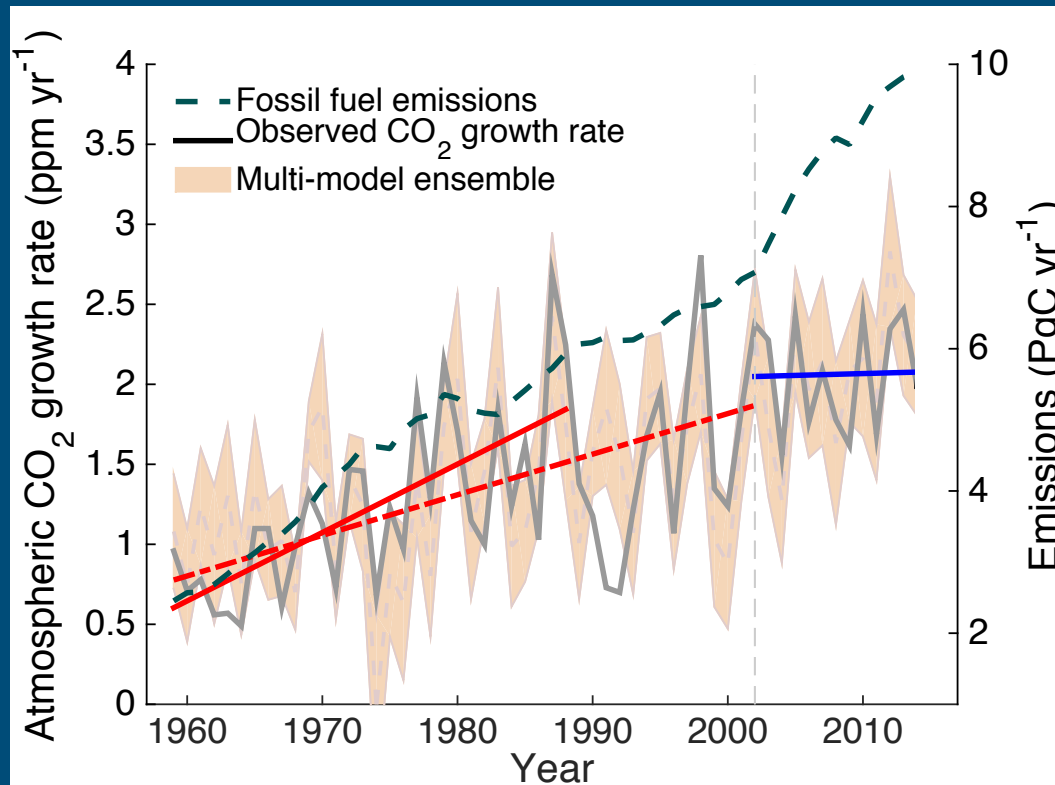
**All good climate change stories must come to an end...**

**El Niño 2015**



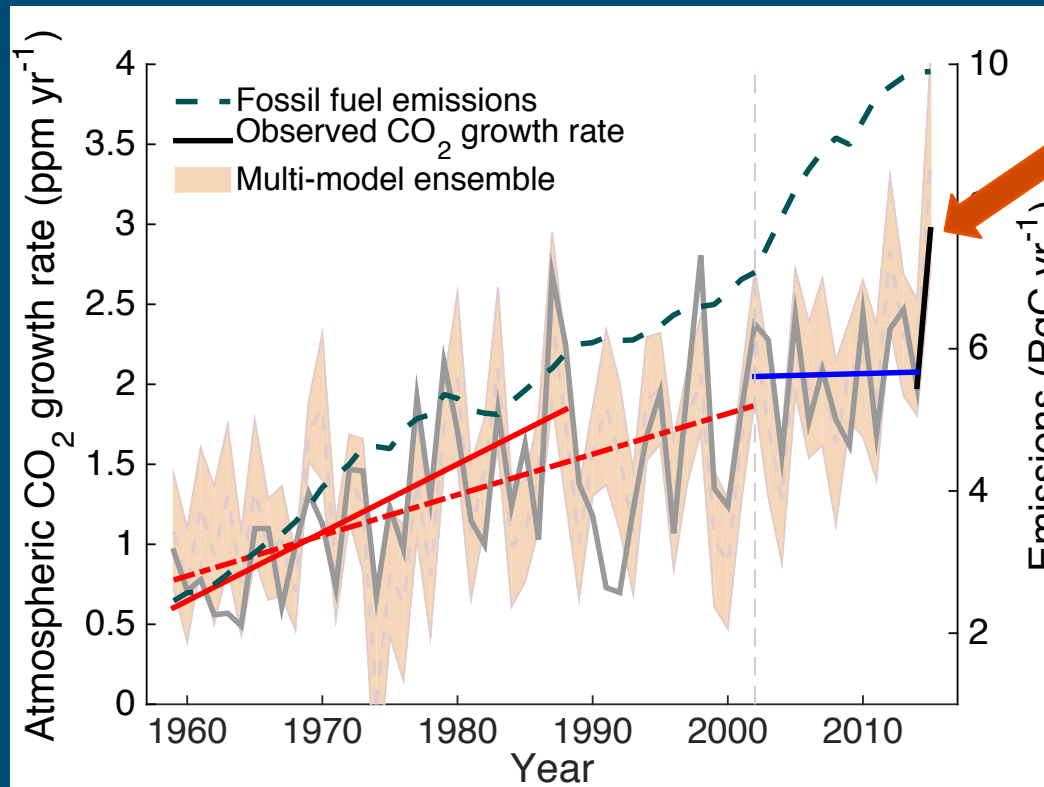
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## El Niño 2015

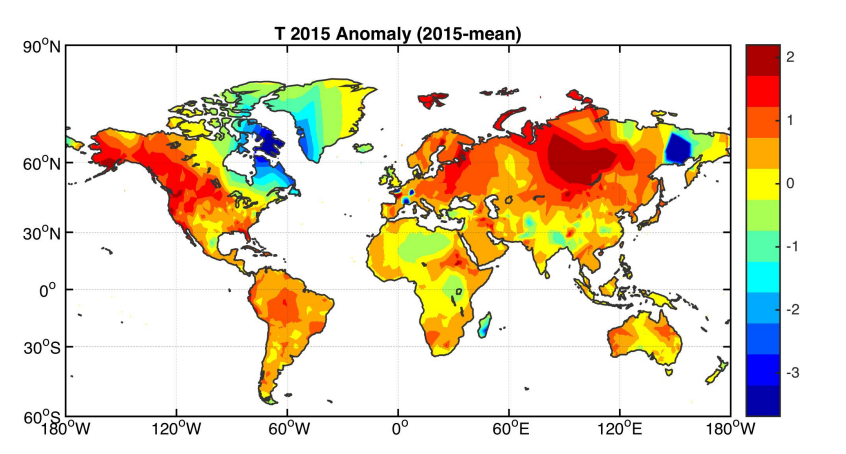
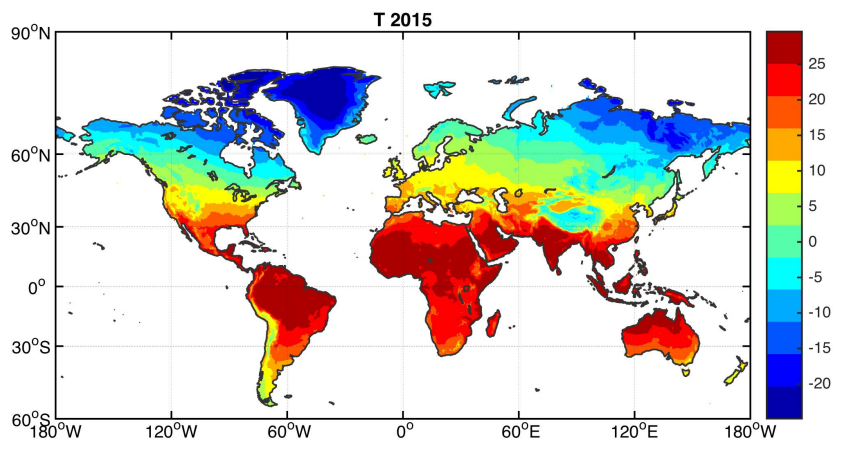
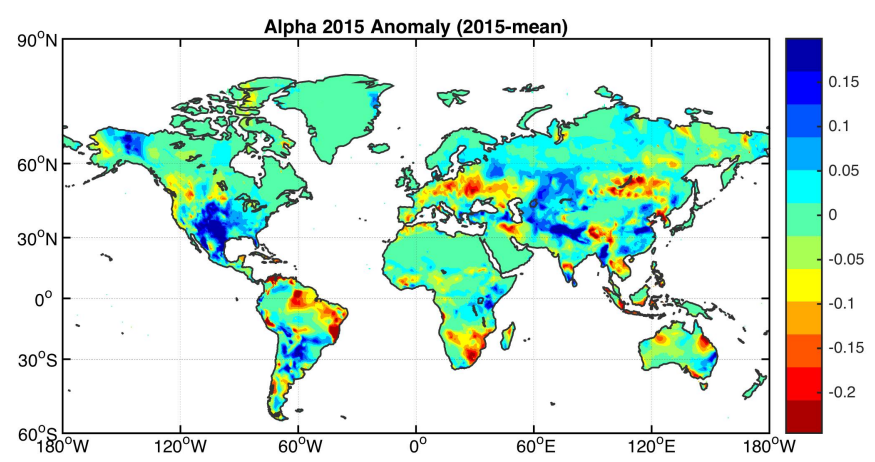
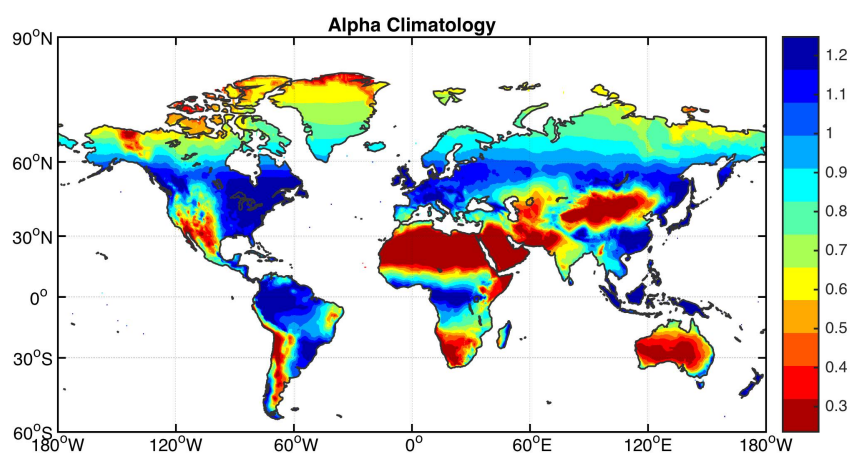
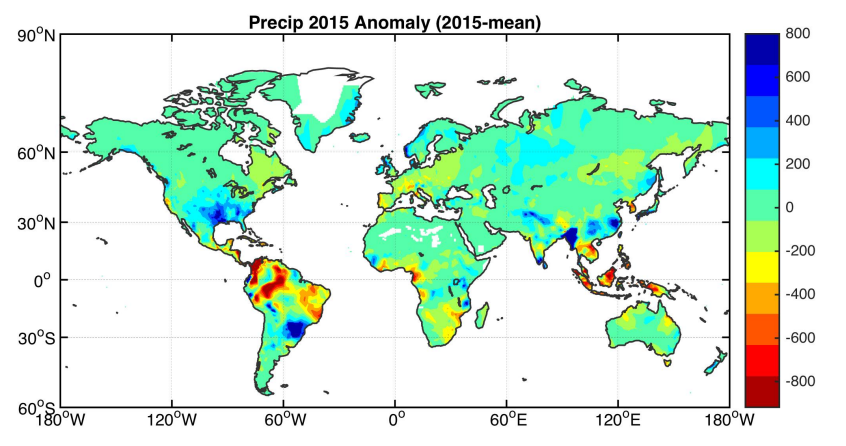
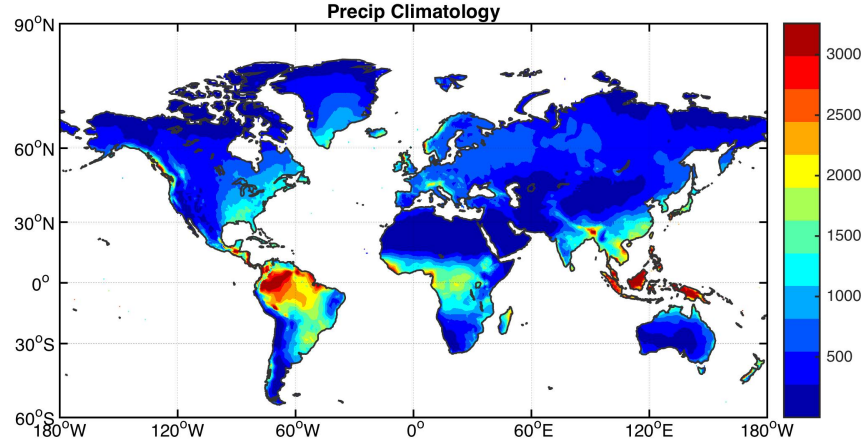


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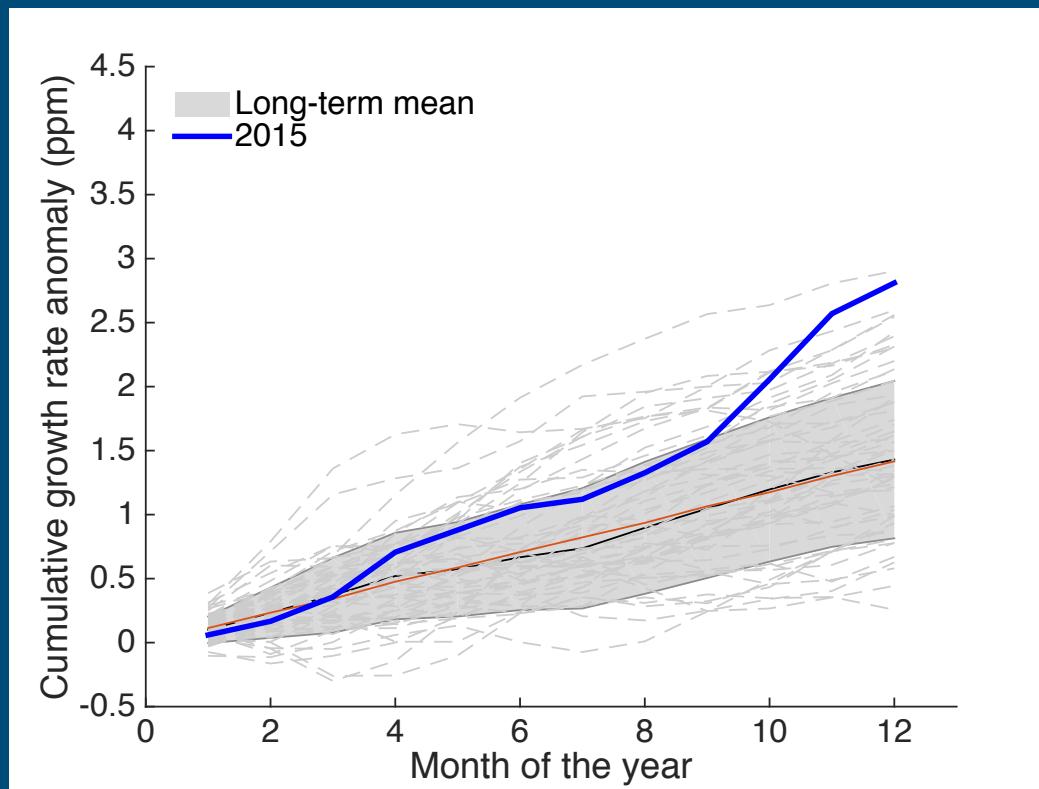
## El Niño 2015



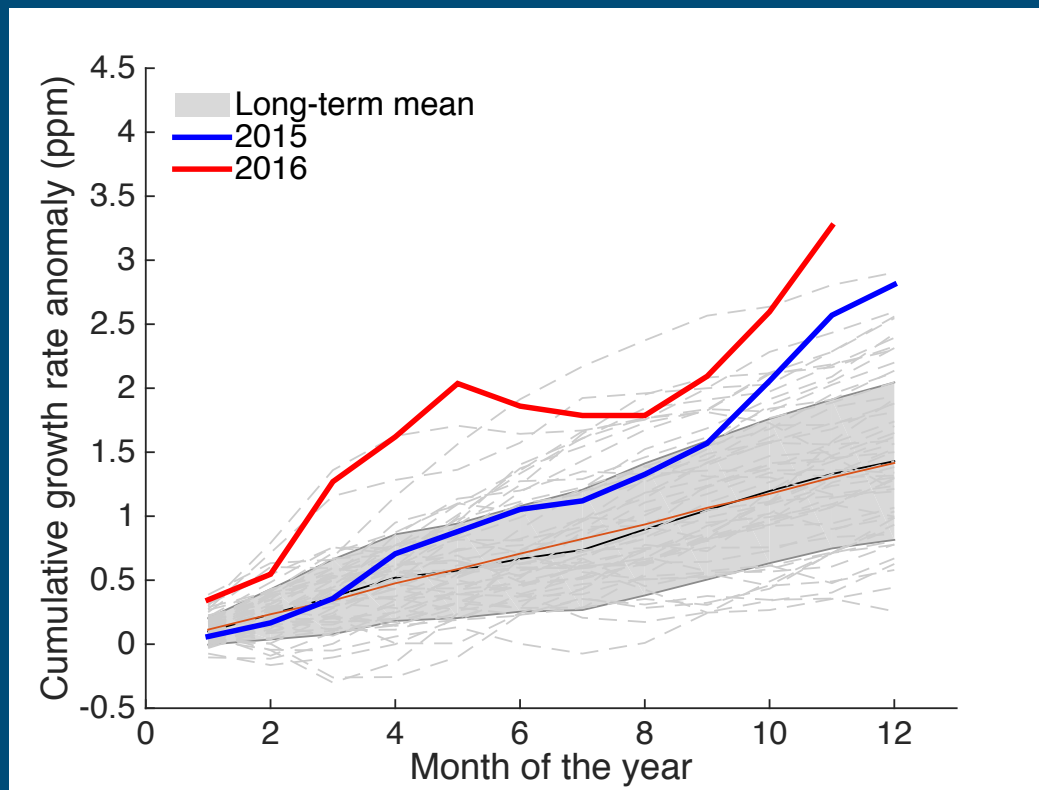
Largest growth recorded



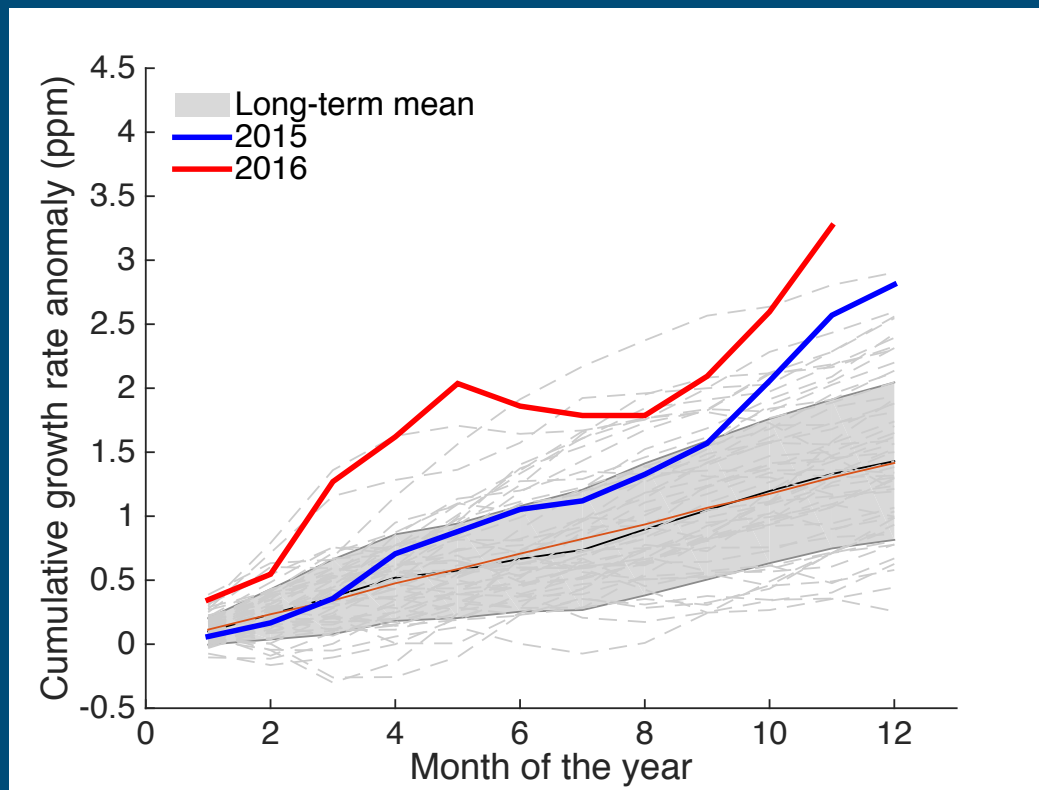
# Growth rate of atmospheric CO<sub>2</sub>



# Growth rate of atmospheric CO<sub>2</sub>



# Growth rate of atmospheric CO<sub>2</sub>



2016: Likely the largest atmospheric CO<sub>2</sub> growth in the modern record



## Take home messages:

1. Elevated CO<sub>2</sub> is stimulating increased plant C uptake
2. Warmer temperatures are leading to increased CO<sub>2</sub> release from ecosystems
3. The net effect is a large increase in terrestrial C uptake

## Implications:

1. Recent enhancement sufficiently large to result in a temporary pause in the growth rate of atmospheric CO<sub>2</sub>
2. El Niño in 2015 caused a large increase in the growth rate
3. 2016 possibly by far the largest increase in the modern record

## Plan going forward:

Examining El Nino 2015/2016 impacts using:

1. ACME global runs
2. BESS diagnostic model simulations
3. NGEE tropics data

*fin*

...

Thank you!

DOE, NOAA,  
FLUXNET PIs, TRENDY modeling teams

Keenan, T. F. et al. 2016 Recent pause in the growth rate of atmospheric CO<sub>2</sub> due to enhanced terrestrial carbon uptake. Nat. Comm. 7, 13428.

