

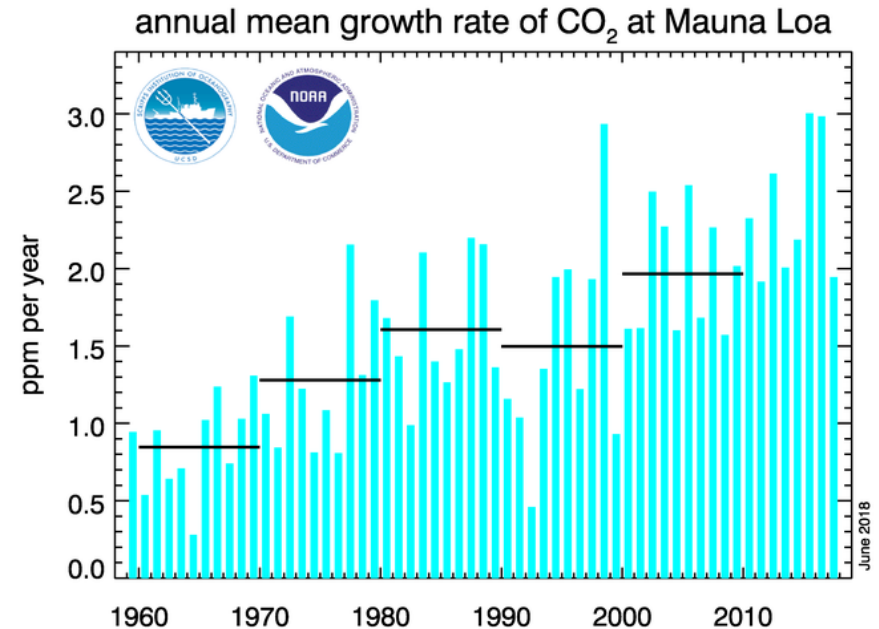
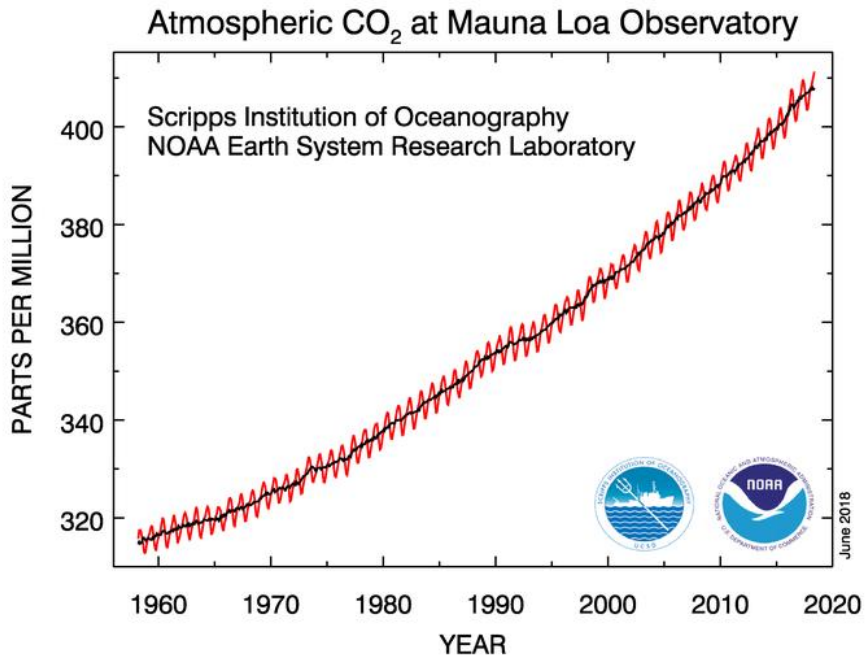
# Climate sensitivity of terrestrial carbon exchange

*Gerbrand Koren, Rolf van der Vleugel, Liesbeth Florentie, Erik van Schaik, Ingrid T. van der Laan-Luijkx and Wouter Peters*

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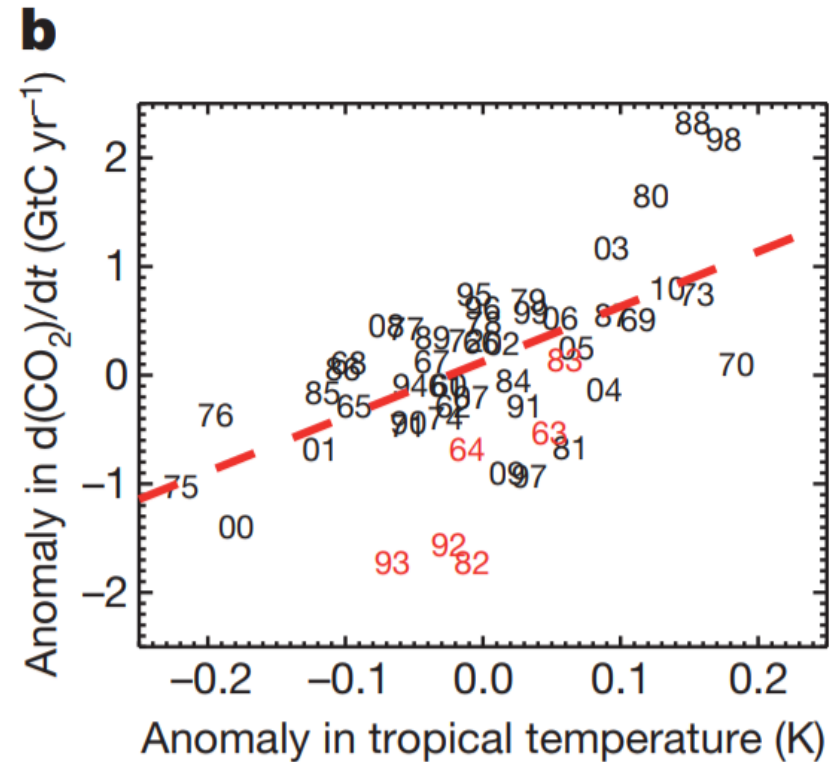
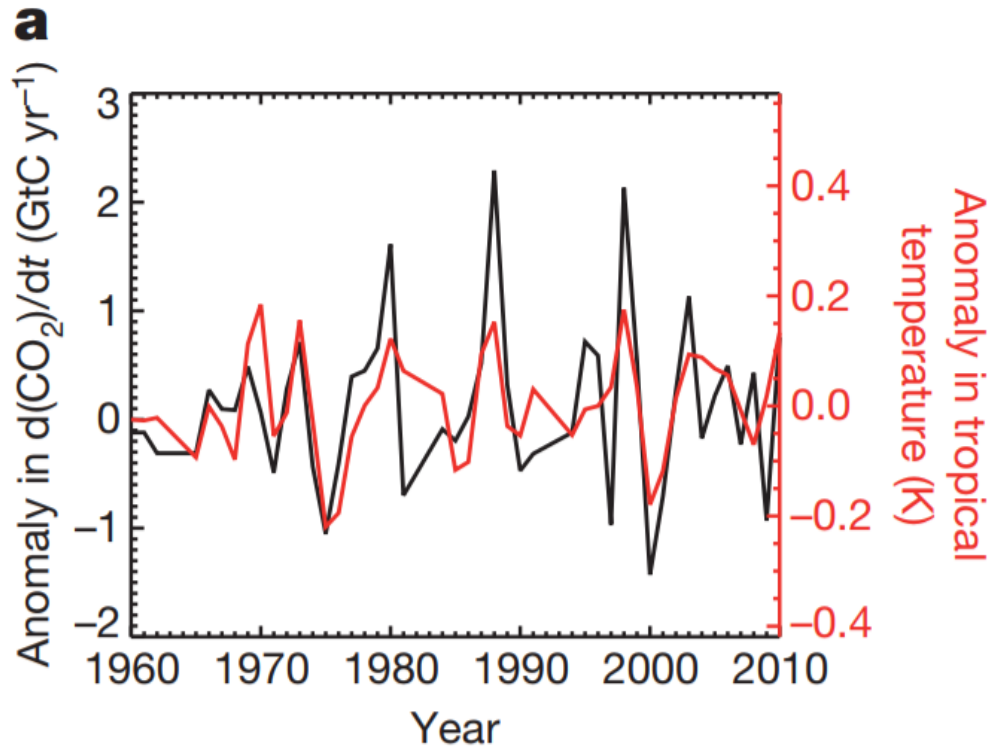


# CO<sub>2</sub> at Mauna Loa



- High growth rate of CO<sub>2</sub> mixing ratios following El Niño events (e.g. 2015/2016) and droughts in the Amazon (2005, 2010)
- Reduced CO<sub>2</sub> growth rate after volcanic eruptions

# Climate sensitivity



- Anomalies in growth rate of  $\text{CO}_2$  correlate with anomalies in tropical temperature (Cox et al., Nature, 2013)

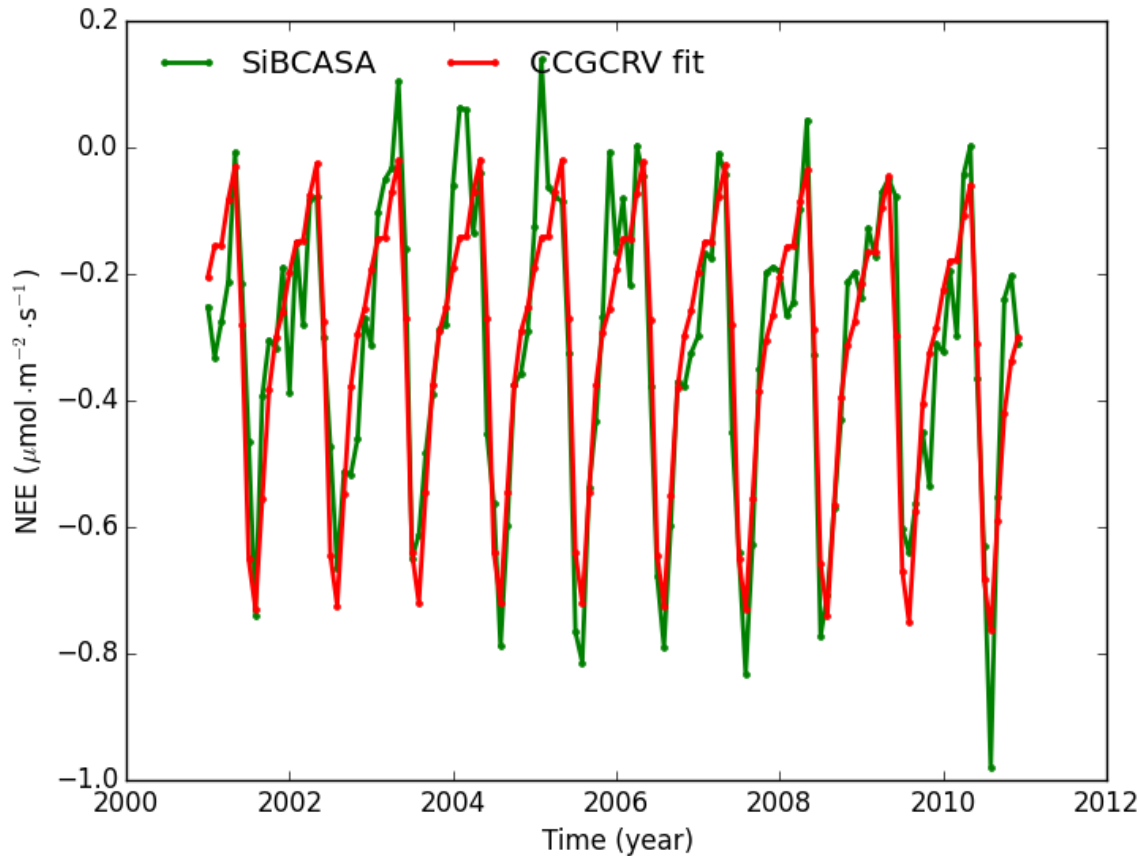
# Aims

- 1** Reduce computational expense of biospheric CO<sub>2</sub> fluxes (input for forward TM5 simulations or prior information for CarbonTracker)
  - SiBCASA runs with 10 minute time step, 0.5° x 0.5° spatial resolution
  - SiBCASA requires NDVI and meteo input
- 2** Estimate climate sensitivity  $\gamma$  for different regions/ecosystems
- 3** Get a better constraint on tropical regions with sparse coverage of CO<sub>2</sub> observations
  - Better attribution of fluxes to tropical America/Africa/Asia

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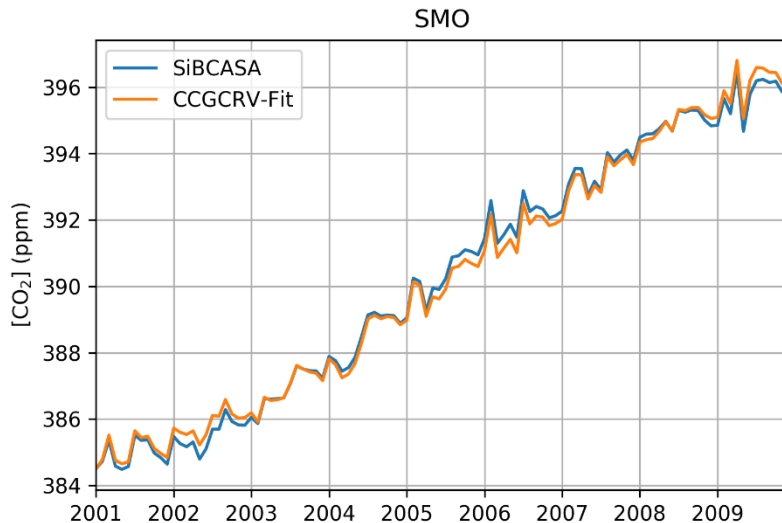
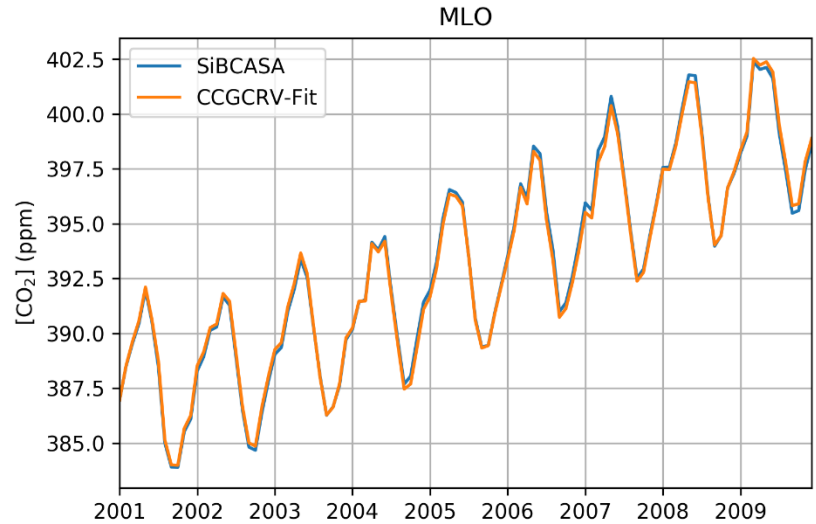
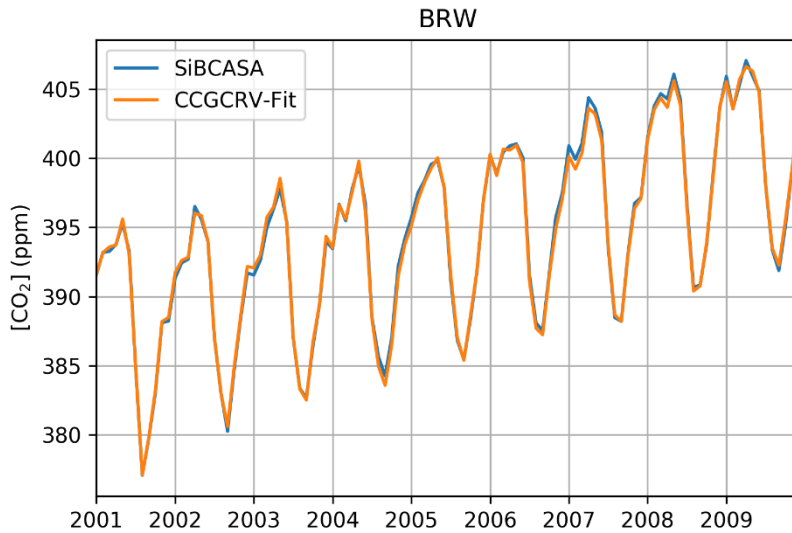
# SiBCASA CCGVRV-fit



- NEE fluxes from SiBCASA for Amazon region over 10 year period
- Negative NEE means uptake of  $\text{CO}_2$  by the biosphere
- CCGCRV function for NEE (originally developed for  $\text{CO}_2$ , Thoning et al., 1989) with polynomial part and harmonics

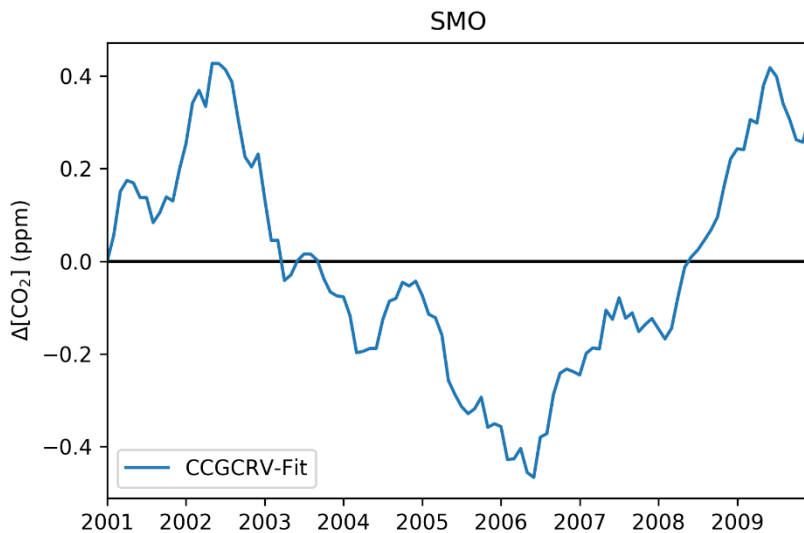
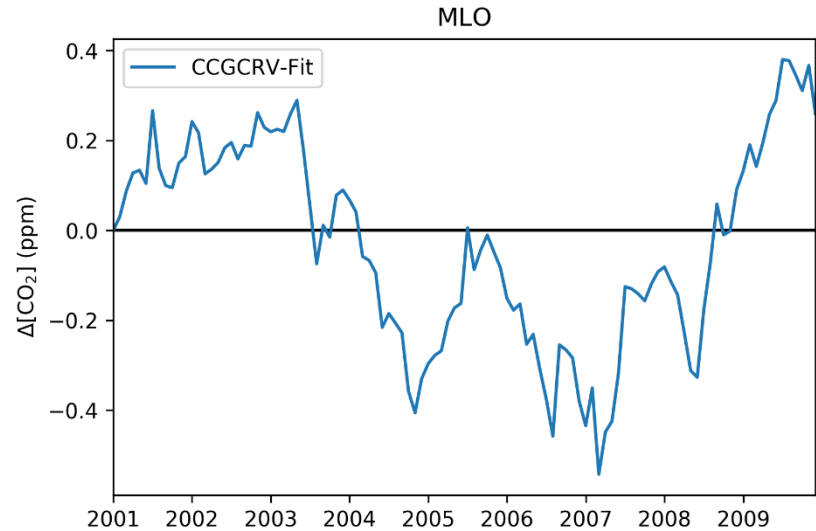
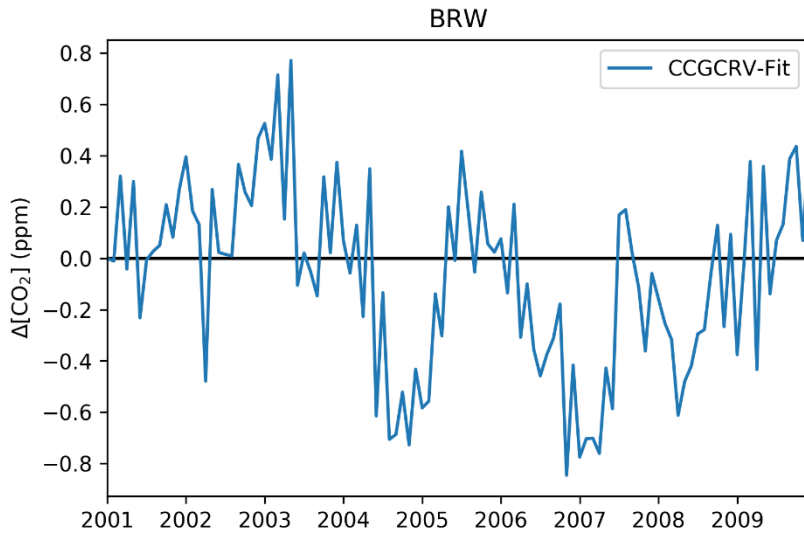
$$NEE(t) = a_0 + a_1 \cdot t + a_2 \cdot t^2 + \sum_{k=0}^n A_n \sin(2\pi \cdot nt + \varphi_n)$$

# Simulated CO<sub>2</sub> at NOAA baseline stations



- Forward TM5 simulations at 6° x 4° with 25 vertical layers
- Biosphere fluxes from SiBCASA or CCGCRV fit from SiBCASA fluxes
- Also including fossil fuel emissions, biomass burning and ocean fluxes

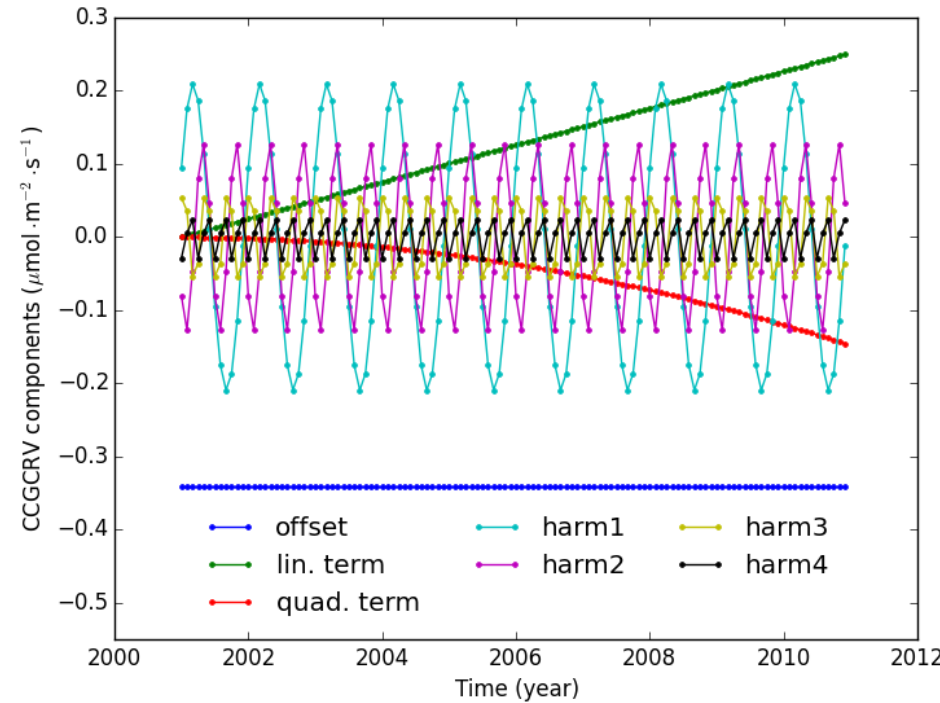
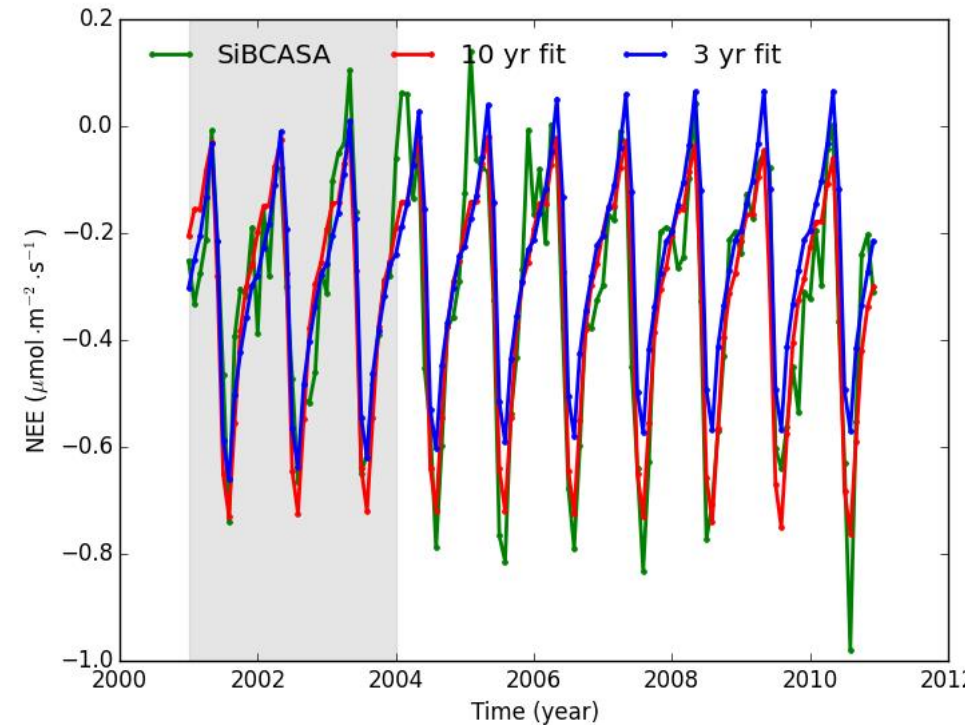
# Simulated CO<sub>2</sub> at NOAA baseline stations



- Difference of simulated CO<sub>2</sub> using CCGCRV fit relative to CO<sub>2</sub> simulated from SiBCASA fluxes
- Difference is in the order of 0.5 ppm (This is the 'best we can get', using the full SiBCASA fluxes to 'train' CCGCRV)



# Extrapolated fluxes

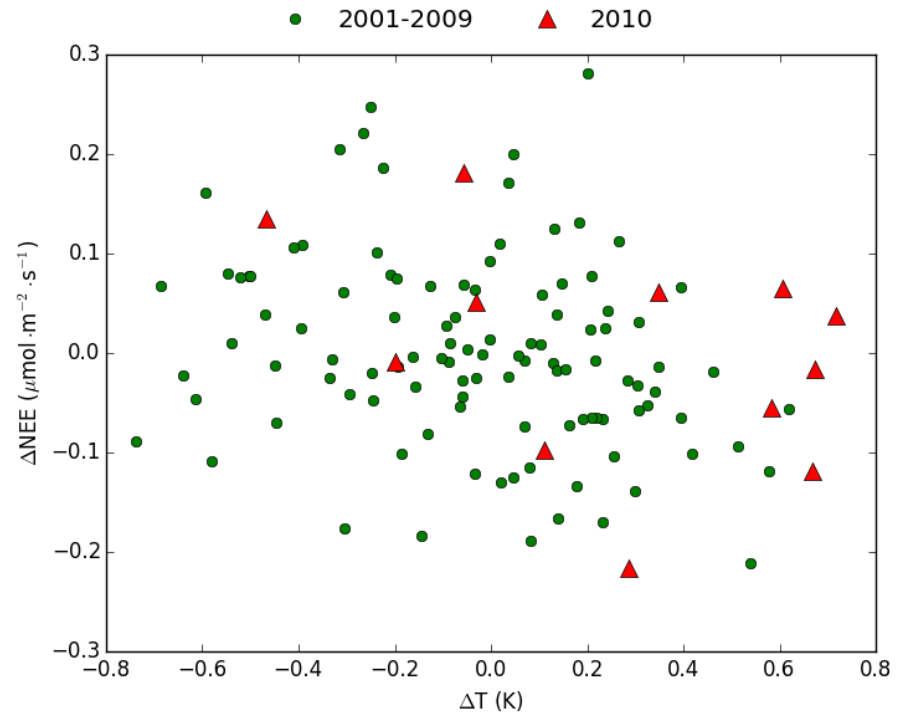
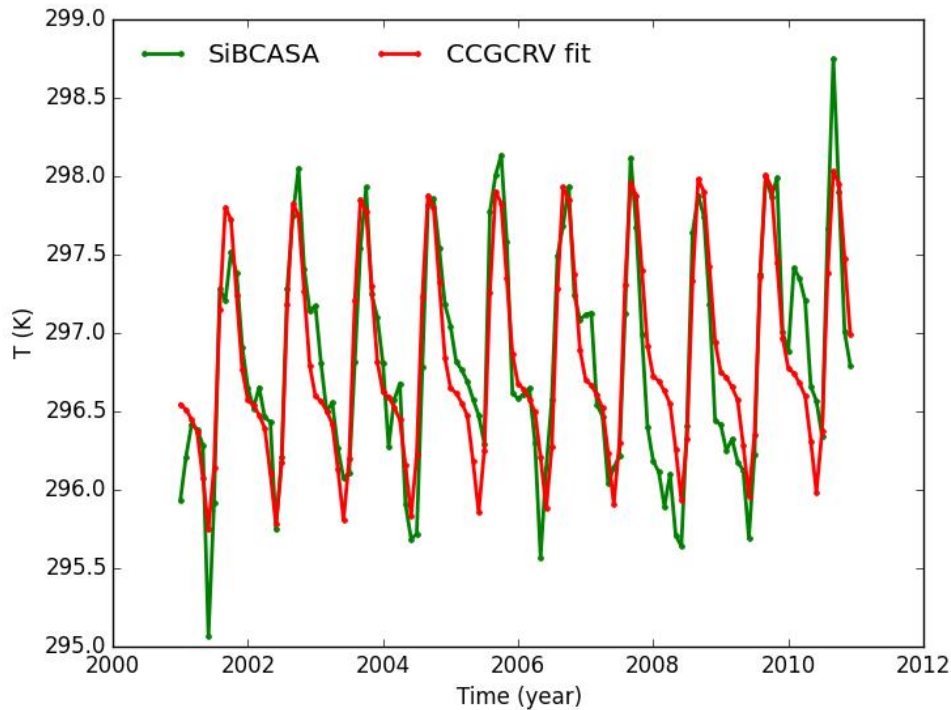


- Quadratic term will ultimately limit realistic extrapolation window
- Interpolation in space and time can also reduce computational expense

# Aims

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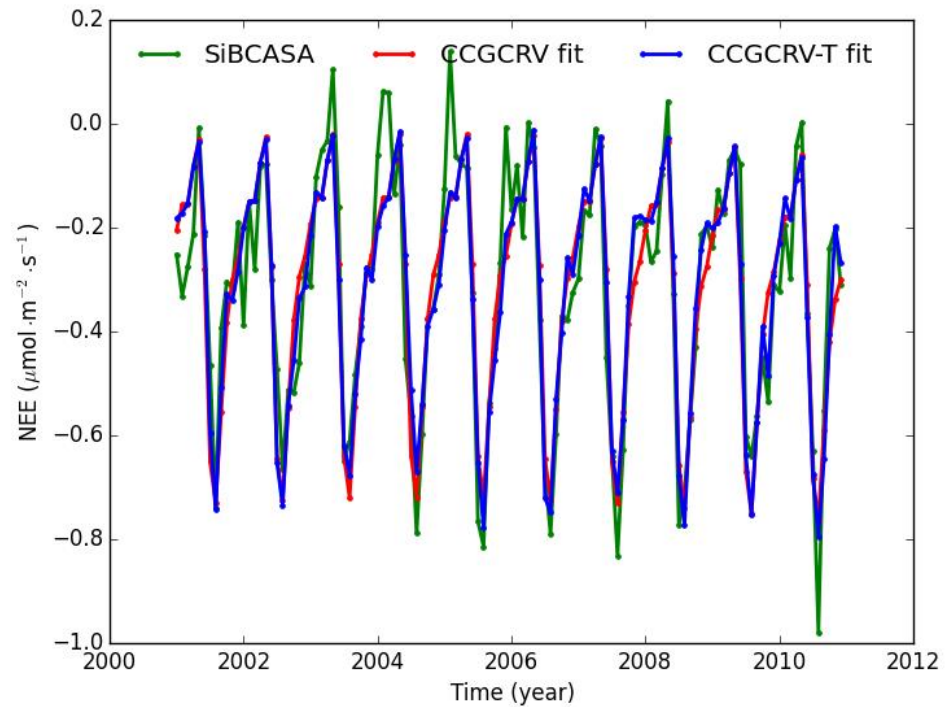
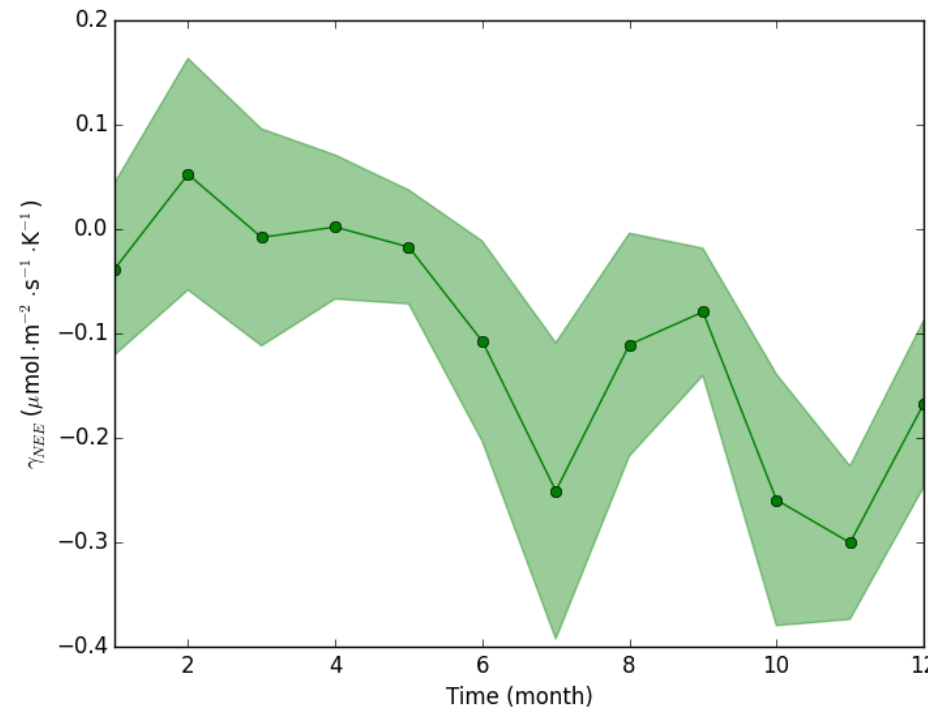
# Climate sensitivity



- Applying the CCGCRV routine to temperature data for the Amazon region to get a temperature fit (and hence also temperature residuals)
- Include climate sensitivity term for NEE (similar to Rödenbeck et al., 2018)

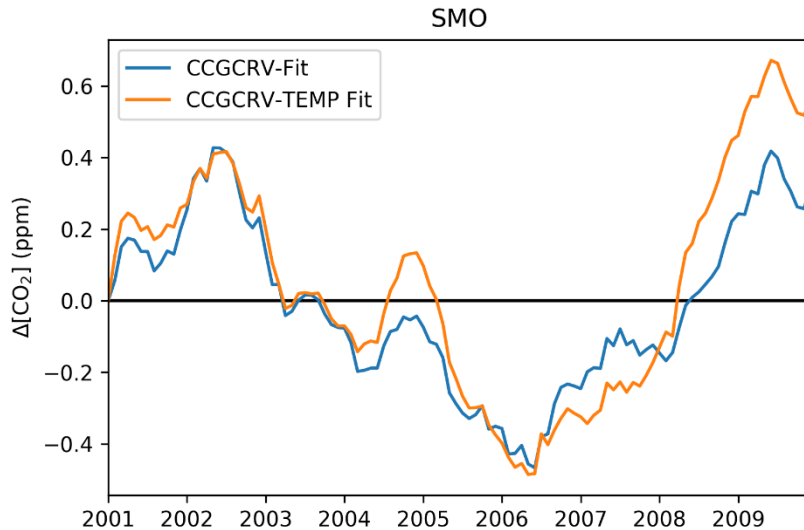
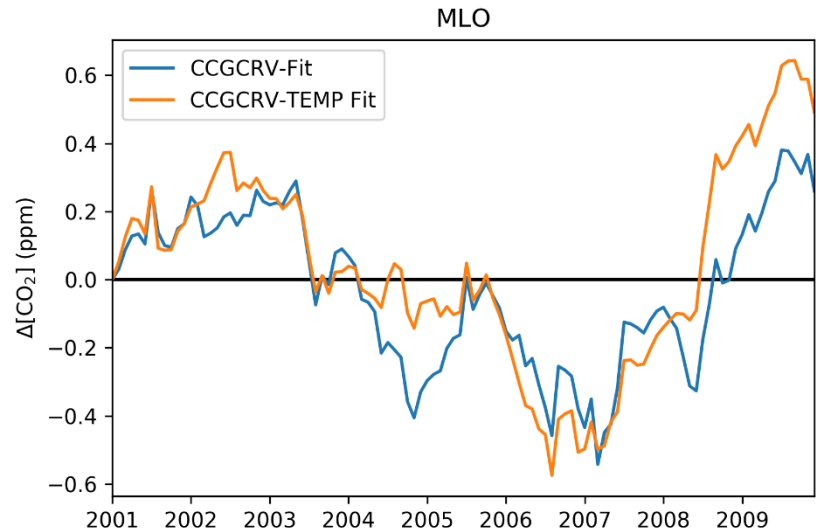
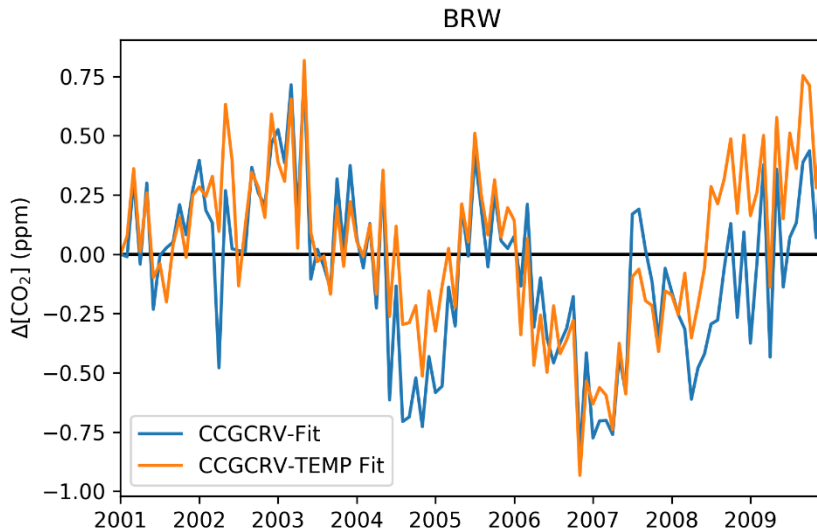
$$NEE(t, T) = NEE(t) + \gamma \cdot T_{IAV}$$

# Climate sensitivity



- Seasonal variation of climate sensitivity (e.g. increased temperature in summer has different effect than higher temperature in winter)
- According to SiBCASA higher temperatures in the Amazon lead almost always to more uptake (contrary to e.g. Cox et al., 2013)
- Temperature fit has lower RMSE w.r.t. SiBCASA than CCGCRV fit

# Simulated CO<sub>2</sub> at NOAA baseline stations



- Difference of simulated CO<sub>2</sub> relative to CO<sub>2</sub> simulated from SiBCASA fluxes
- Although the TEMP-fit fluxes are closer to SiBCASA for each cell (lower RMSE), the resulting CO<sub>2</sub> mixing ratios are worse than CCGCRV-fit (high bias)

# Conclusions

- 1** Reduce computational expense using CCGCRV
  - CCGCRV can be used to partially replace SiBCASA
  - Effect on simulated CO<sub>2</sub> mixing ratios is approx. 0.5 ppm
  - Interpolation/extrapolation is possible but higher differences w.r.t. SiBCASA are expected
  
- 2** Estimate climate sensitivity  $\gamma$  for different regions/ecosystems
  - Climate sensitivity in SiBCASA appears to 'go in wrong direction'
  - CCGCRV might not be suited for determining anomalies
  - CO<sub>2</sub> inversions can be used to estimate climate sensitivity from observations
  
- 3** Better attribution of CO<sub>2</sub> fluxes for tropical regions
  - Still to be done, likely using sun-induced fluorescence (SIF)