

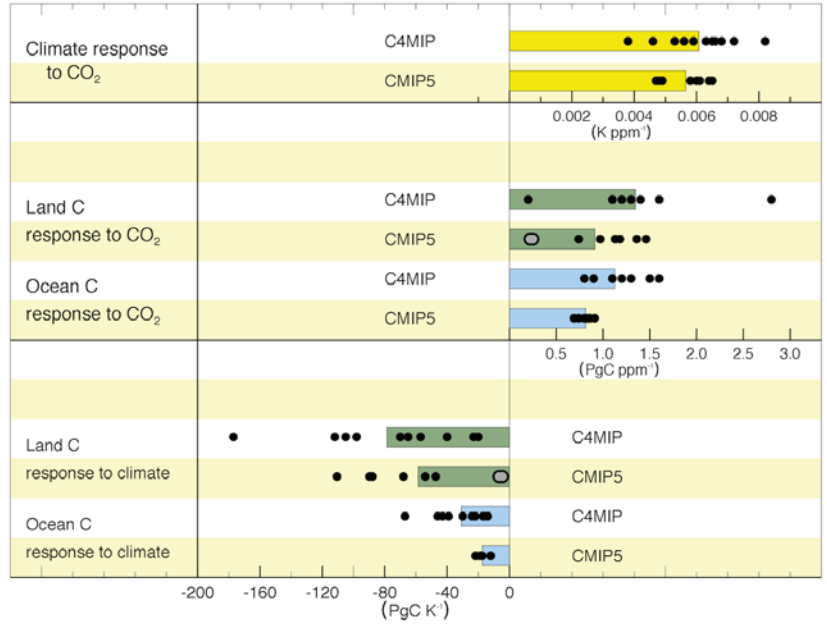
# Productivity and turnover controls on terrestrial carbon feedbacks in the CMIP5 ESMs

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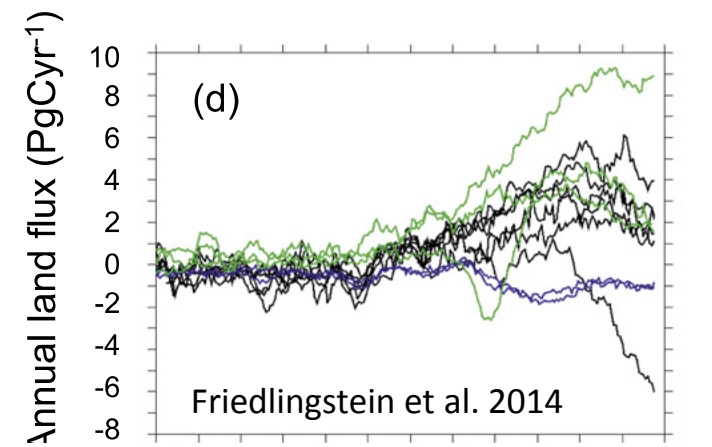
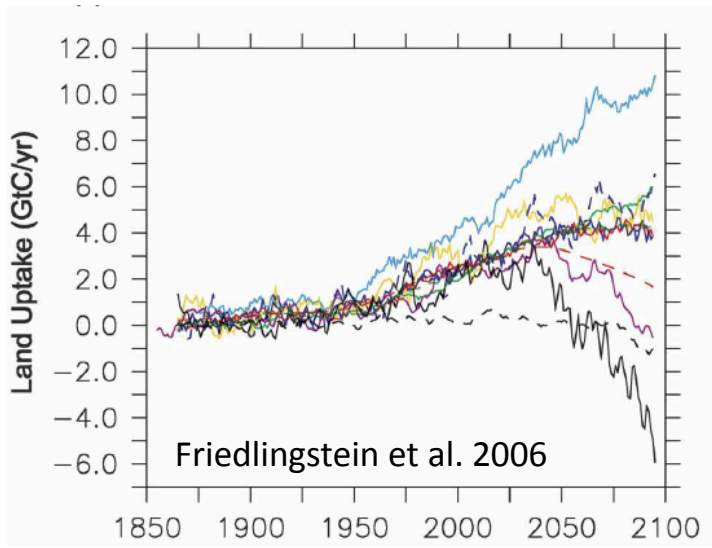
LMWG meeting, Dec. 2015

Acknowledgements: DOE BER RGCM for BGC-Feedbacks SFA, and  
TES for NGEE Tropics

Problems: we know the model uncertainty is awful, but why?  
 And, do we trust the models even when they agree?



IPCC-AR5 (Ciais et al., 2013)



# Approach: disaggregate controls on C changes via a linear analysis of equilibrium C changes

$$C_t = C_l + C_d$$

Live C Pools

$$\frac{dC_l}{dt} = f_{npp} - \frac{C_l}{\tau_l}$$

$$\widehat{C}_l = f_{npp} \tau_l$$

$$\frac{d\widehat{C}_l}{dt} = \frac{df_{npp}}{dt} \tau_l + \frac{d\tau_l}{dt} f_{npp}$$

Productivity-driven live C change      Turnover-driven live C change

Dead C Pools

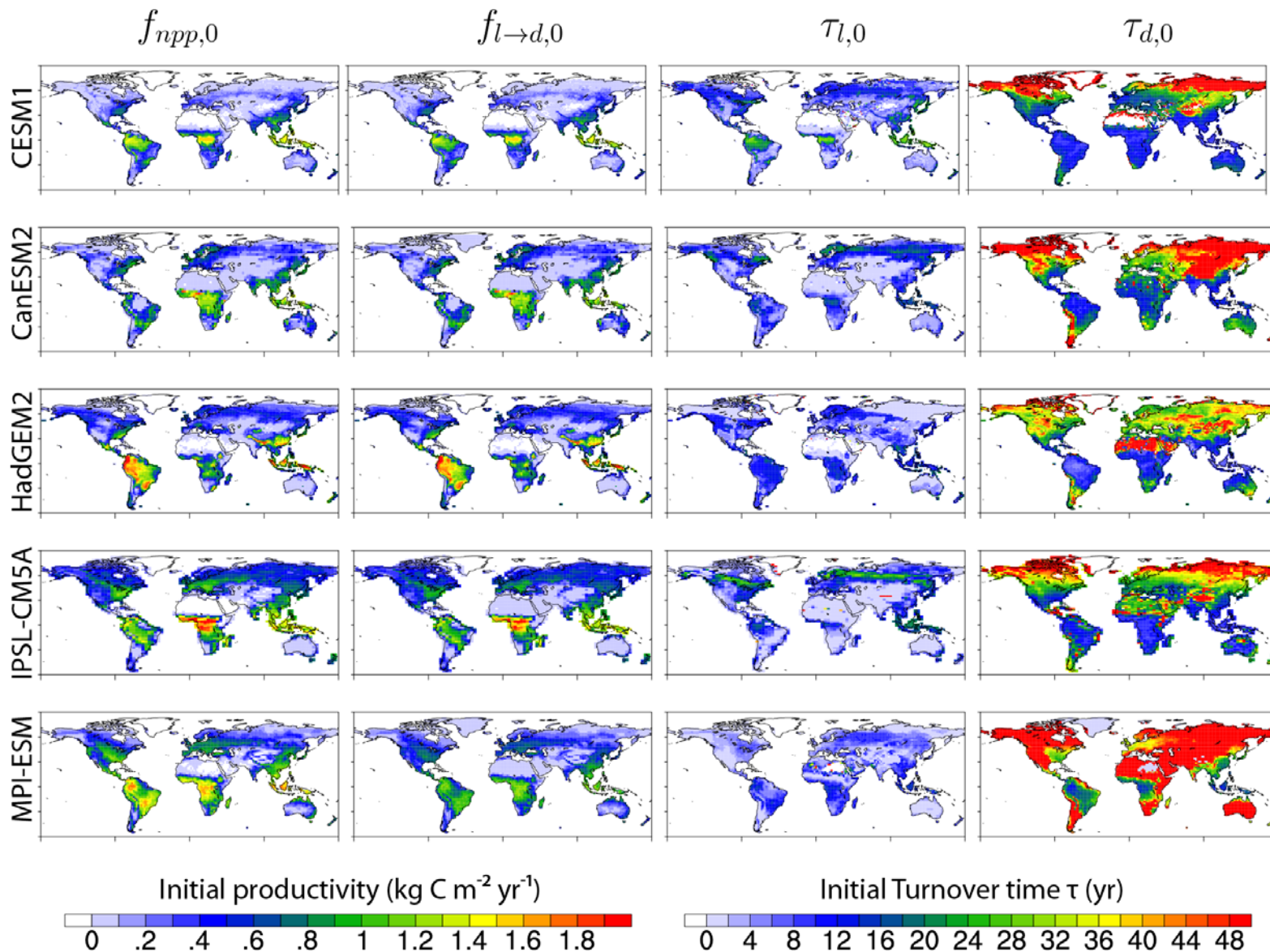
$$\frac{dC_d}{dt} = f_{l \rightarrow d} - \frac{C_d}{\tau_d}$$

$$\widehat{C}_d = f_{l \rightarrow d} \tau_d$$

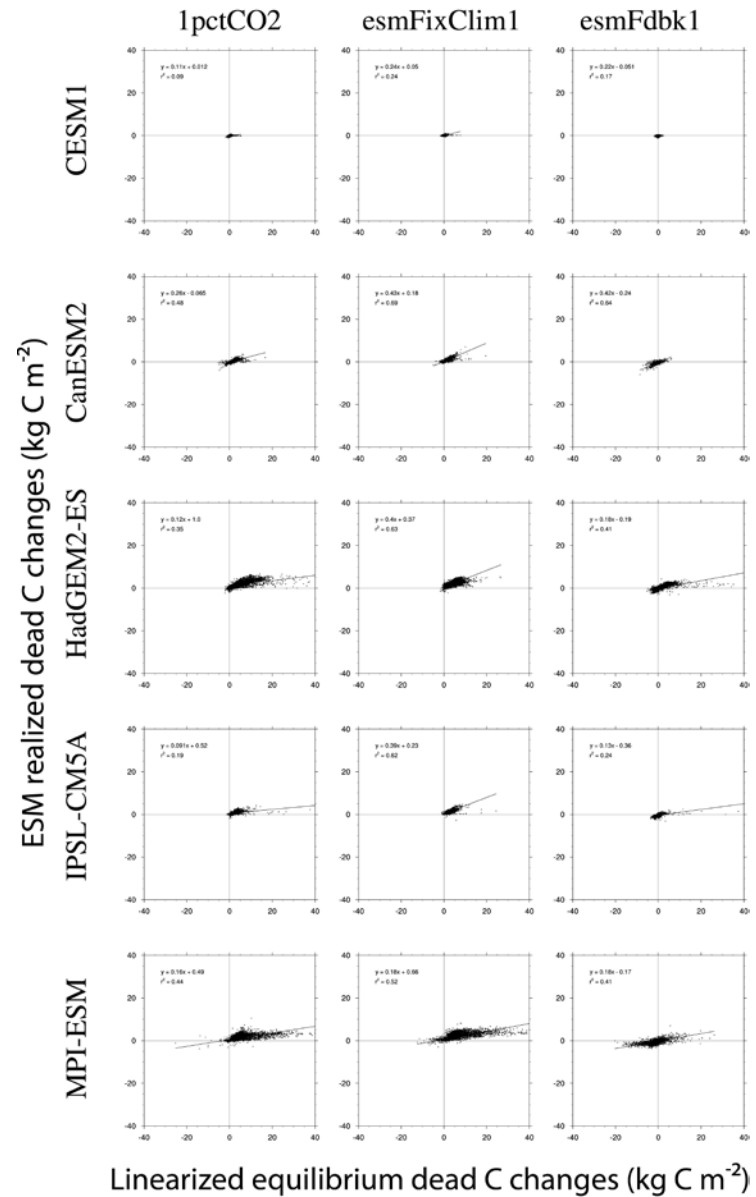
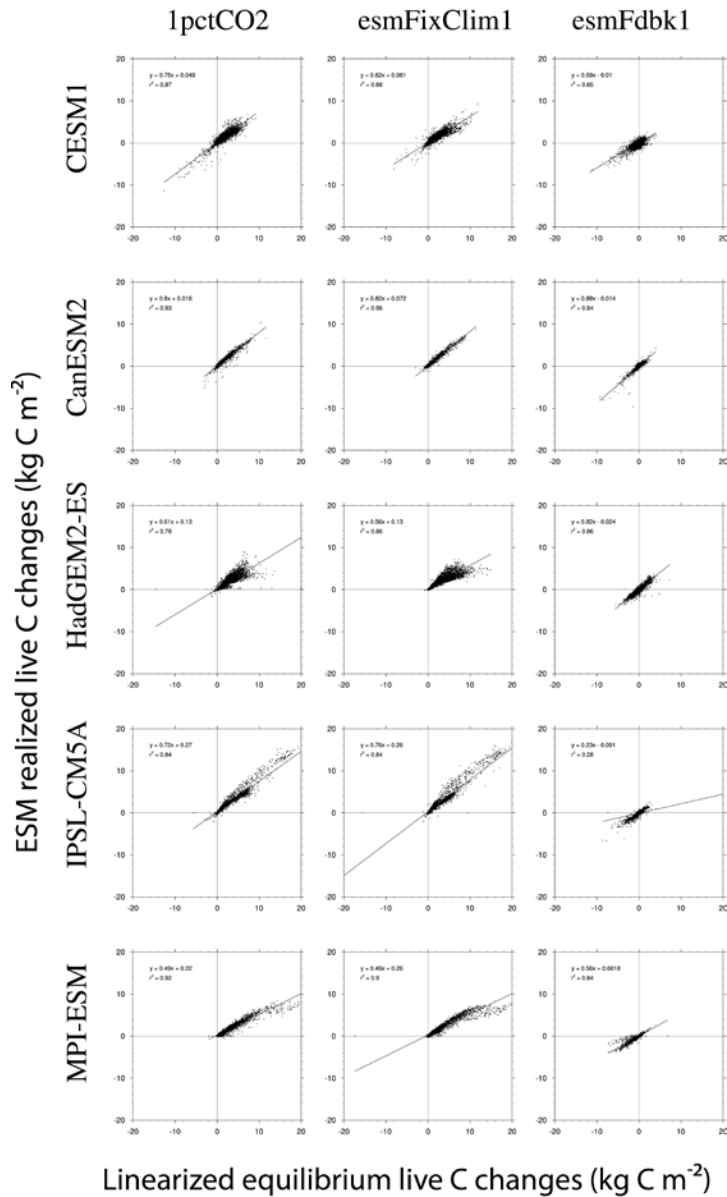
$$\frac{d\widehat{C}_d}{dt} = \frac{df_{l \rightarrow d}}{dt} \tau_d + \frac{d\tau_d}{dt} f_{l \rightarrow d}$$

Productivity-driven Dead C change      Turnover-driven Dead C change

# Initial NPP and turnover times

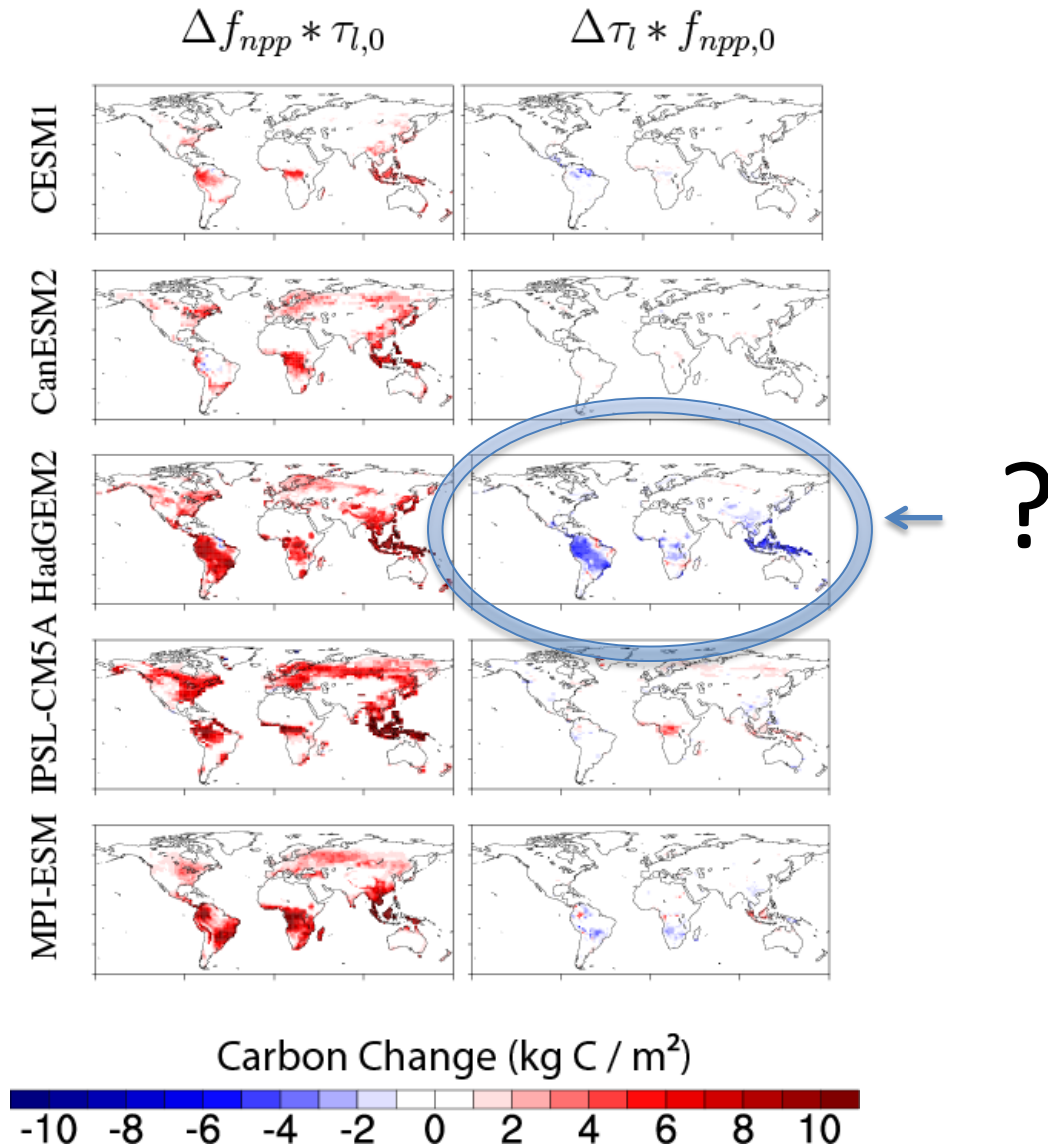


# Does this approach work?



Answer: Yes, but better for live than dead C pools

# C response in veg pools: mostly driven by NPP, with one exception



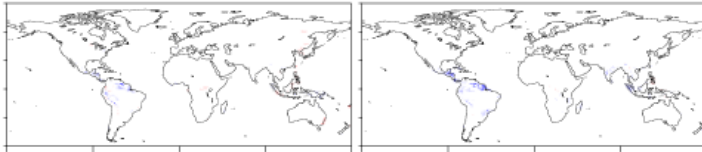
# What is driving changes: climate or CO<sub>2</sub>?

Response to climate change

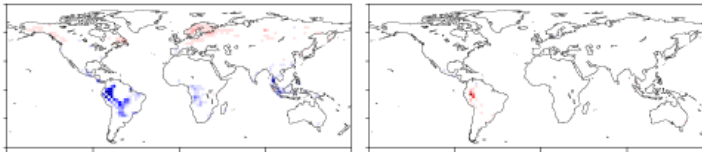
$$\Delta f_{npp} * \tau_{l,0}$$

$$\Delta \tau_l * f_{npp,0}$$

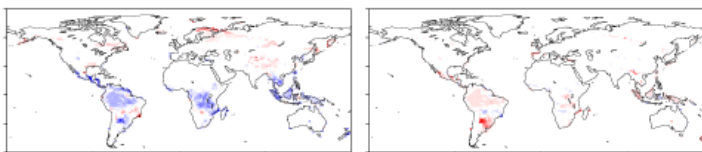
CESM1



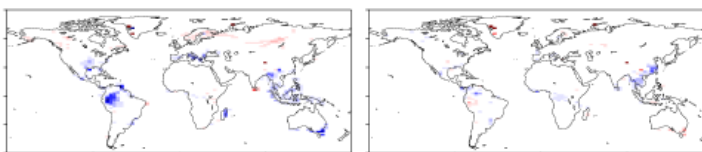
CanESM2



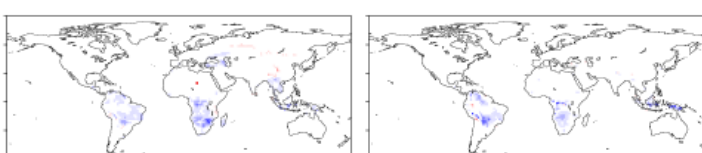
HadGEM2



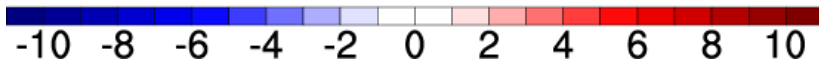
IPSL-CM5A



MPI-ESM



Carbon Change (kg C / m<sup>2</sup>)

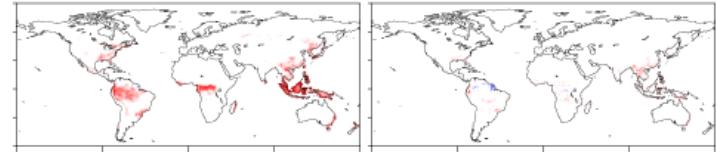


Response to CO<sub>2</sub> fertilization

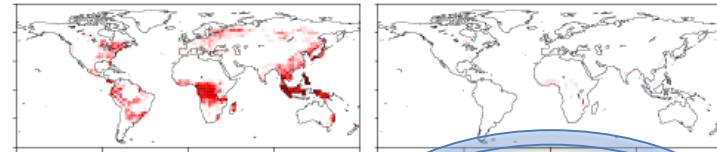
$$\Delta f_{npp} * \tau_{l,0}$$

$$\Delta \tau_l * f_{npp,0}$$

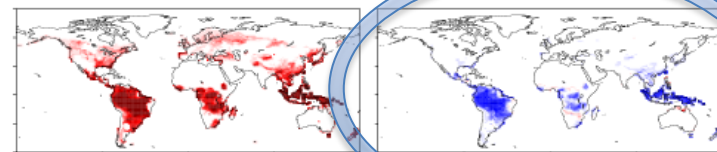
CESM1



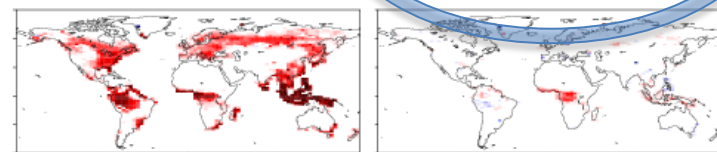
CanESM2



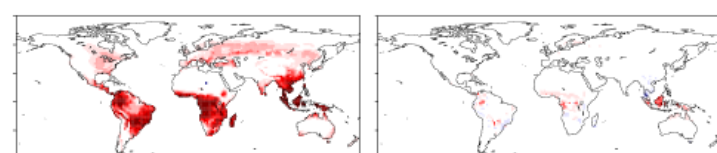
HadGEM2



IPSL-CM5A

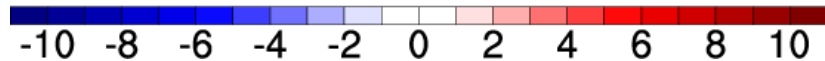


MPI-ESM



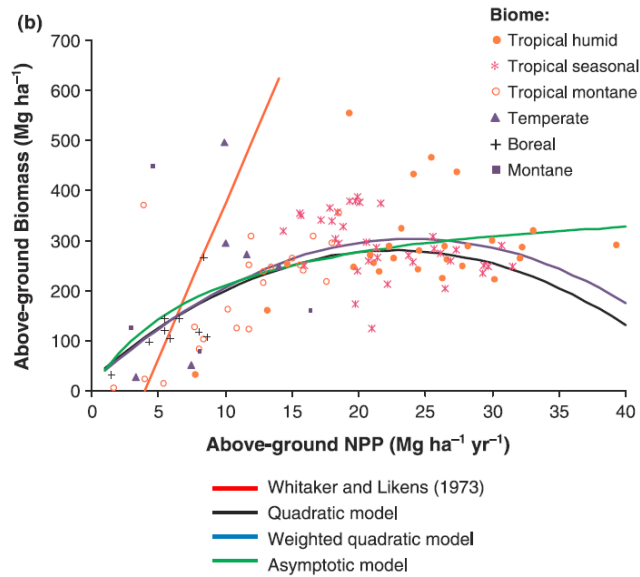
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Carbon Change (kg C / m<sup>2</sup>)



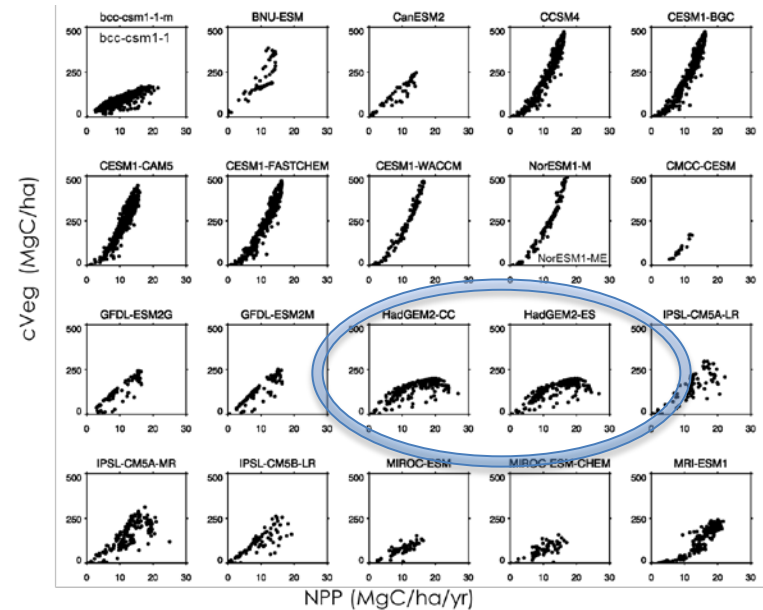
Note that HadGEM is the only one to get the right shape to the tau-productivity relationship as seen in observations

## Observations



Keeling and Phillips, 2007

## CMIP5 ESMs

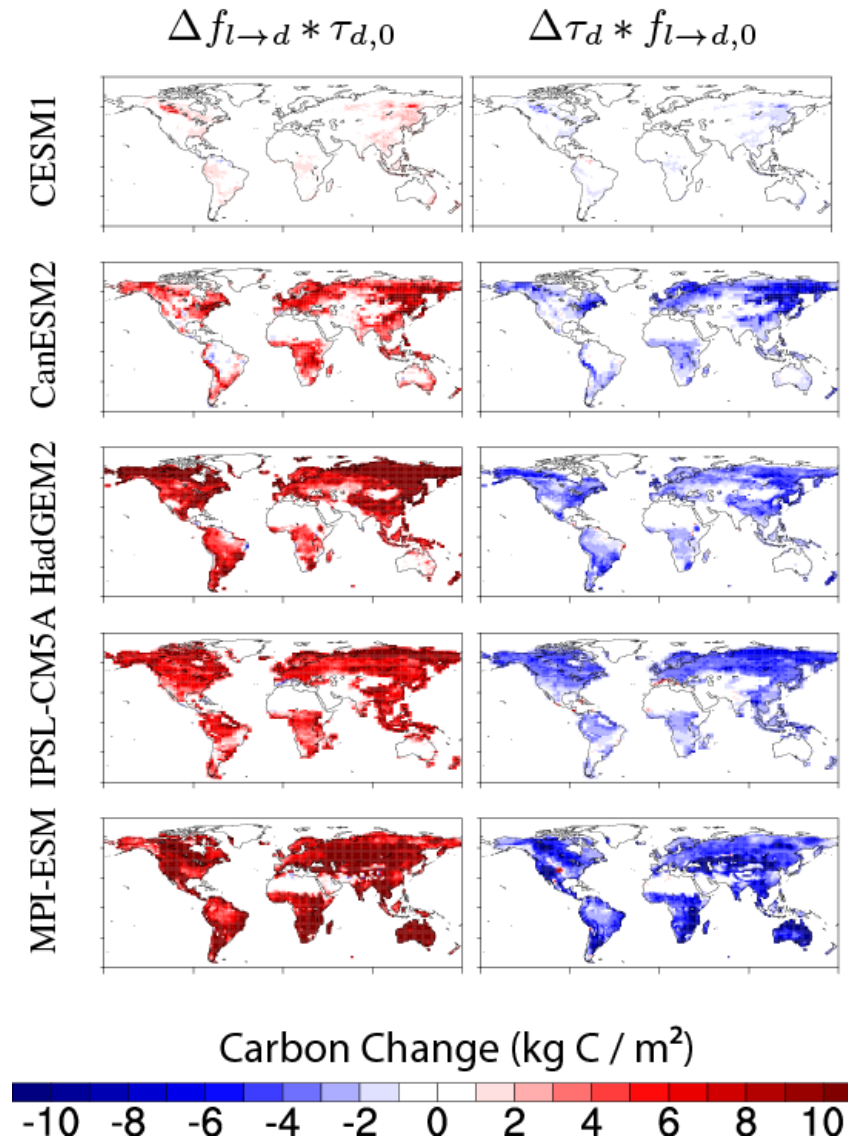


Negron-Juarez et al., *submitted*

So the real question, which none of these models address, is: do the mechanisms that cause turnover times to be anti-correlated with productivity across spatial gradients also hold for the change in time, particularly for the case of elevated  $\text{CO}_2$ ?



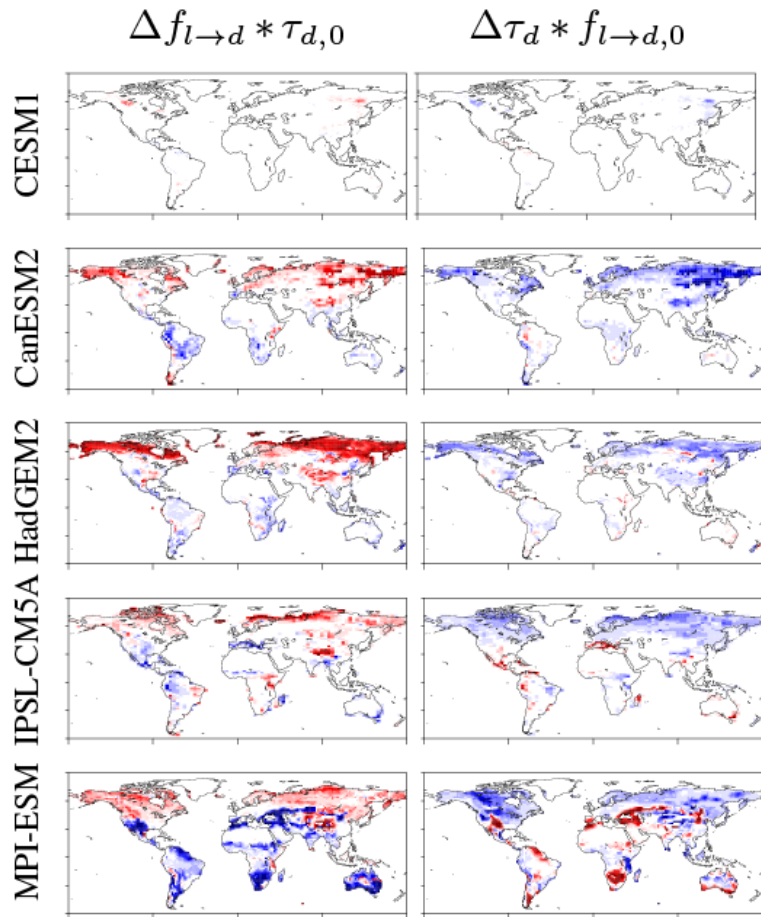
C response in dead pools: productivity increases, turnover times decrease. Makes sense, right? But wait... why are the (anti-)correlations so strong?



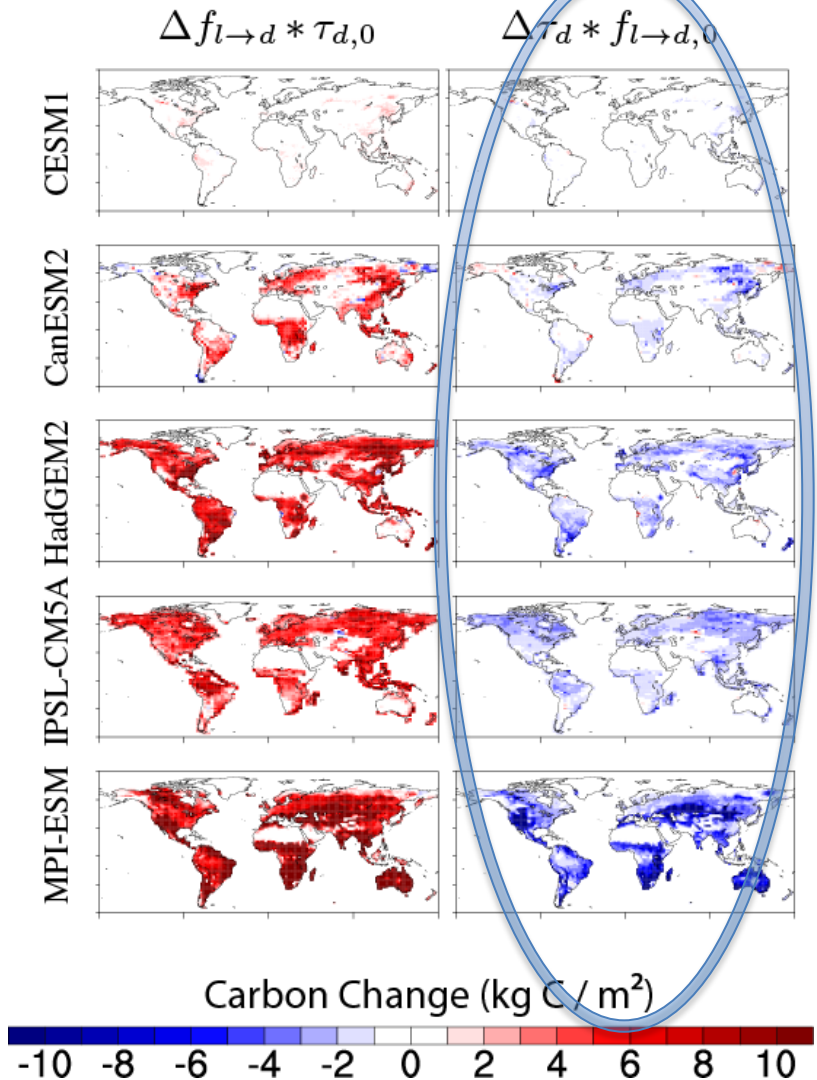
?

# OK, need to look at the singly-coupled runs again

## Response to climate change

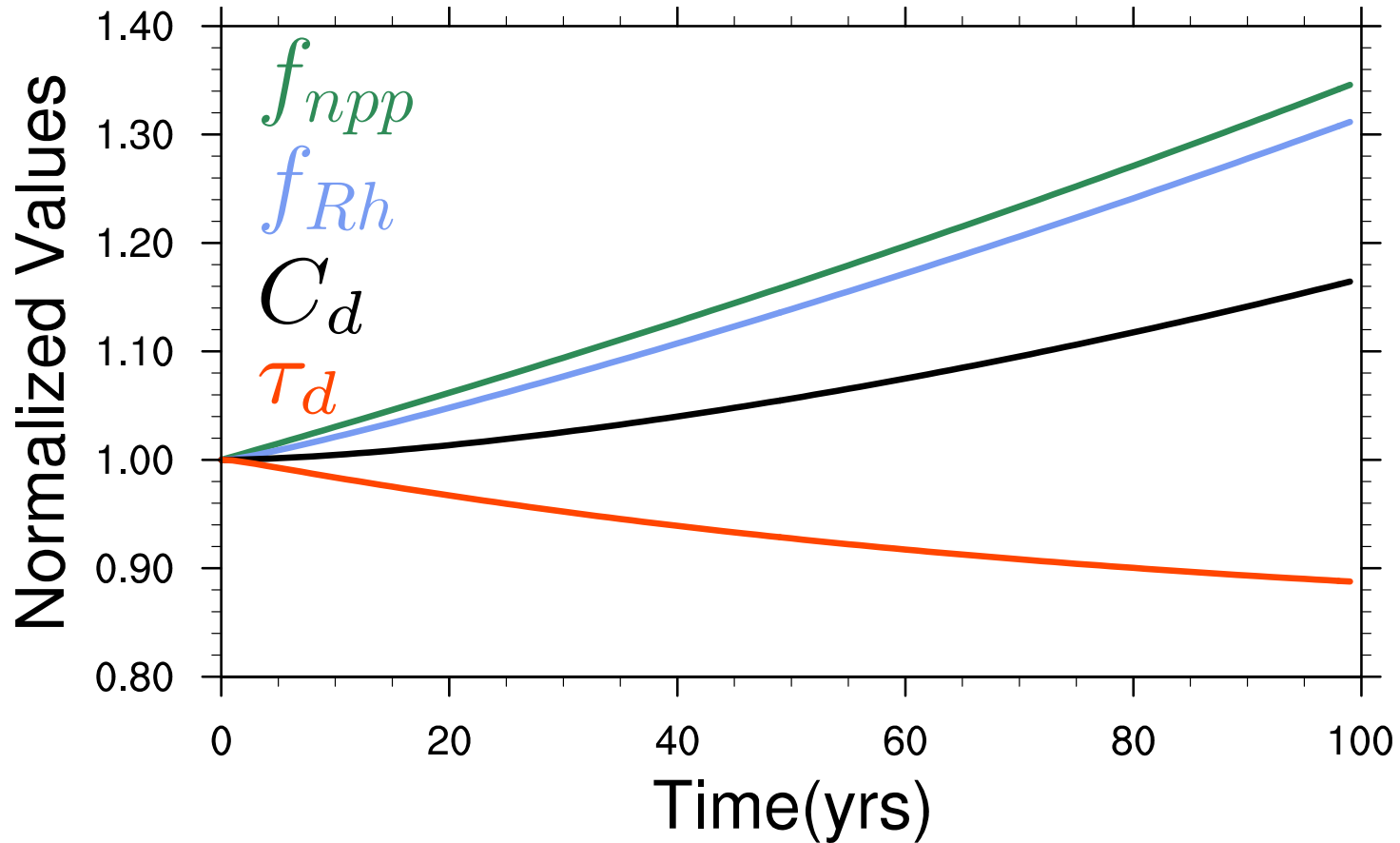


## Response to CO<sub>2</sub> fertilization



!

# “False Priming”



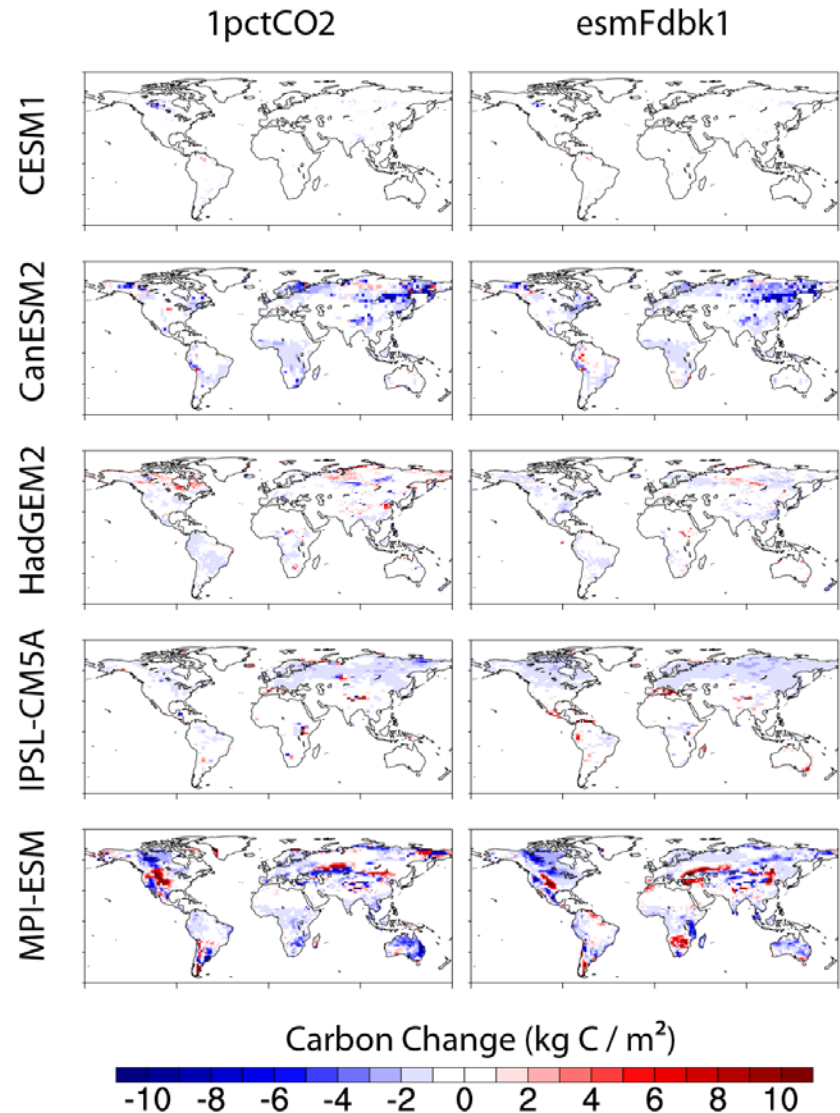
**Toy model experiment:** take a multi-pool model (here 3 pool) with fixed turnover times for each pool. Start from steady-state and increase the inputs. What happens to the bulk turnover time?

# Subtract false priming to get “real” turnover-driven dead C changes

- Define False Priming constant as ratio of changes to turnover over changes in productivity

$$c_{fp} = \frac{\Delta\tau_d f_{l \rightarrow d,0}}{\Delta f_{l \rightarrow d} \tau_{d,0}} = \frac{\Delta\tau_d / \tau_{d,0}}{\Delta f_{l \rightarrow d} / f_{l \rightarrow d,0}}$$

- Diagnose False Priming constant in BGC-coupled runs.
- Use to identify climate control in fully-coupled and radiatively-coupled runs
- Result:  $\Delta$  turnover from climate smaller than it originally looked



**Last step:** separate contributions to uncertainty from initial conditions versus proportional change

- Define initial and change terms:

$$f_{NPP,0}, \tau_{l,0}, \frac{\Delta f_{NPP}}{f_{NPP,0}}, \frac{\Delta \tau_l}{\tau_{l,0}}, f_{l \rightarrow d,0}, \tau_{d,0}, \frac{\Delta f_{l \rightarrow d}}{f_{l \rightarrow d,0}}, \frac{\Delta \tau_d}{\tau_{d,0}}$$

- For each of these, use each model for that term only, and multi-model ensemble mean for all other terms; spread in results is therefore due to the ensemble uncertainty in that spread

# Overall process contributions to uncertainty

- Initial condition uncertainty is large and dominated by model disagreement on turnover times
- Transient uncertainty is dominated by model disagreement on changes to productivity
- Holds for both response to warming and CO<sub>2</sub> fertilization
- Holds for both live and dead C pools

Equilibrium Terrestrial C Change (Pg C)

$$f_{pp,0} \tau_{l,0} \frac{\Delta \tau_d}{\tau_{d,0}}$$

# Conclusions

- Real uncertainty due changes in productivity, both under climate change and CO<sub>2</sub> fertilization. Nutrients, optimal temperature for photosynthesis, etc. are really unknown.
- False uncertainty due to initial productivity and turnover times. These are measurable. Benchmark!
- False certainty that the change in live C turnover times is small. Models need to include dynamics of mortality and allocation to assess their role in governing C changes. *In particular for changing CO<sub>2</sub> effects!*
- Soil C is a bit of a mess. We strongly suspect that priming effects, mineral surface limitation, etc. are real; none of the models include them and they need to. But there are confounding issues we need to deal with, as evidenced by the false priming effect.
- That said, these models also don't include the permafrost C dynamics, so are missing the most vulnerable turnover-driven soil pool. Will change for CMIP6.