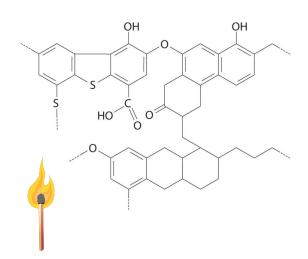


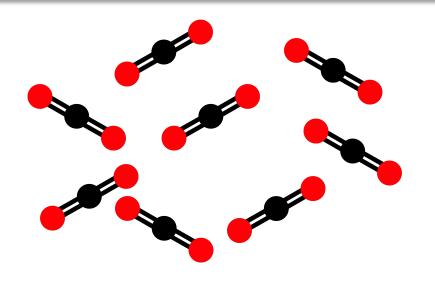
# Fossil fuel burning releases energy and CO<sub>2</sub>

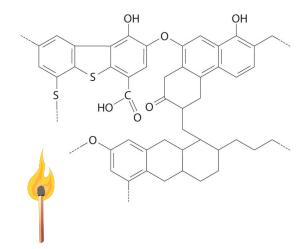






# Fossil fuel burning releases energy and CO<sub>2</sub>







If all the fossil CO<sub>2</sub> stayed in the atmosphere

CO<sub>2</sub> concentration would be ~500 ppm as of 2020



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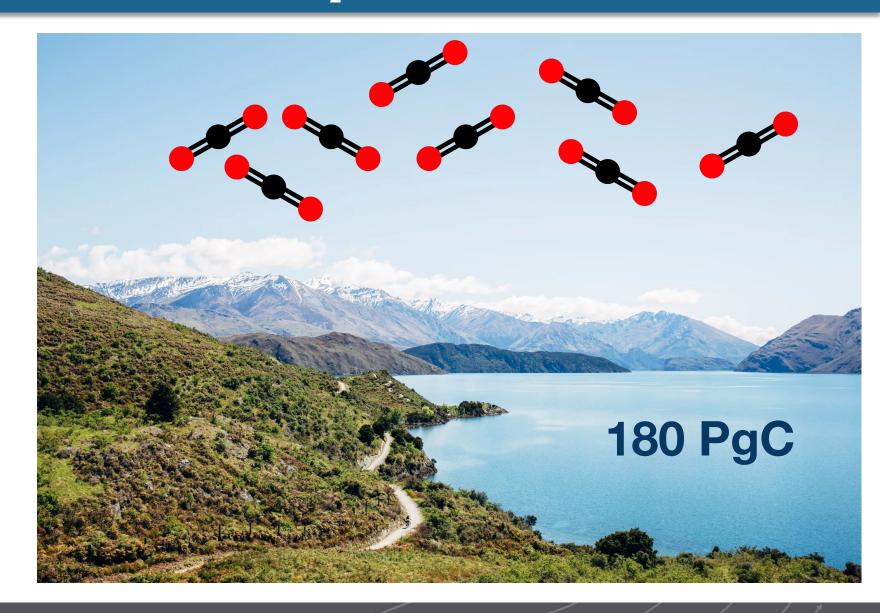
~170 PgC are missing!



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\*global carbon budget does not exactly balance

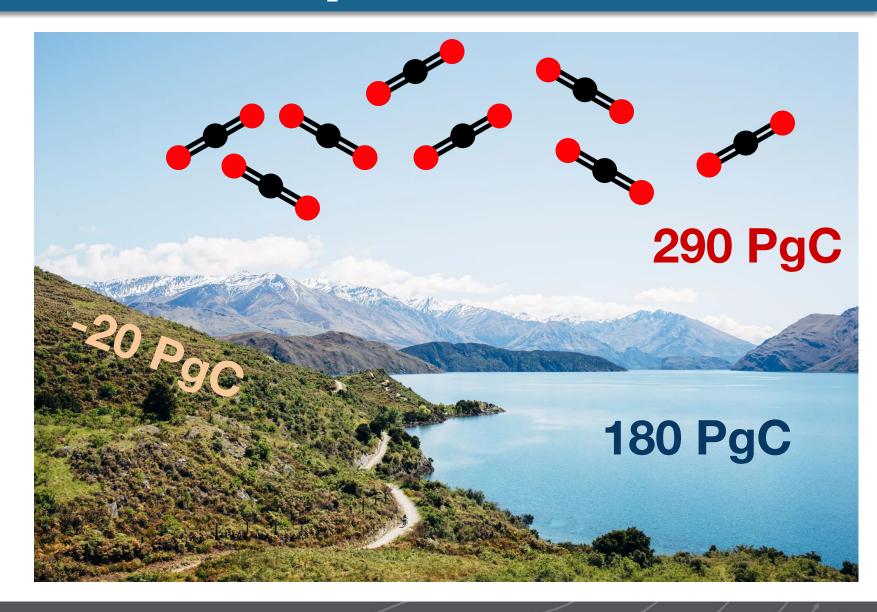


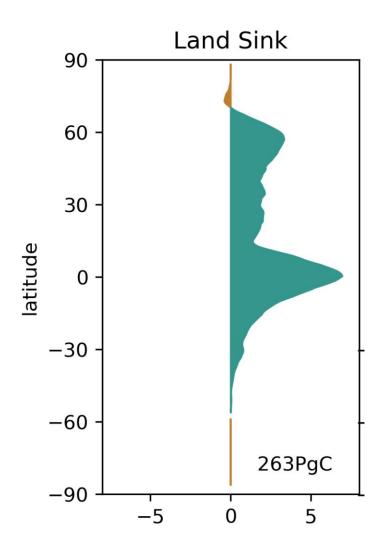
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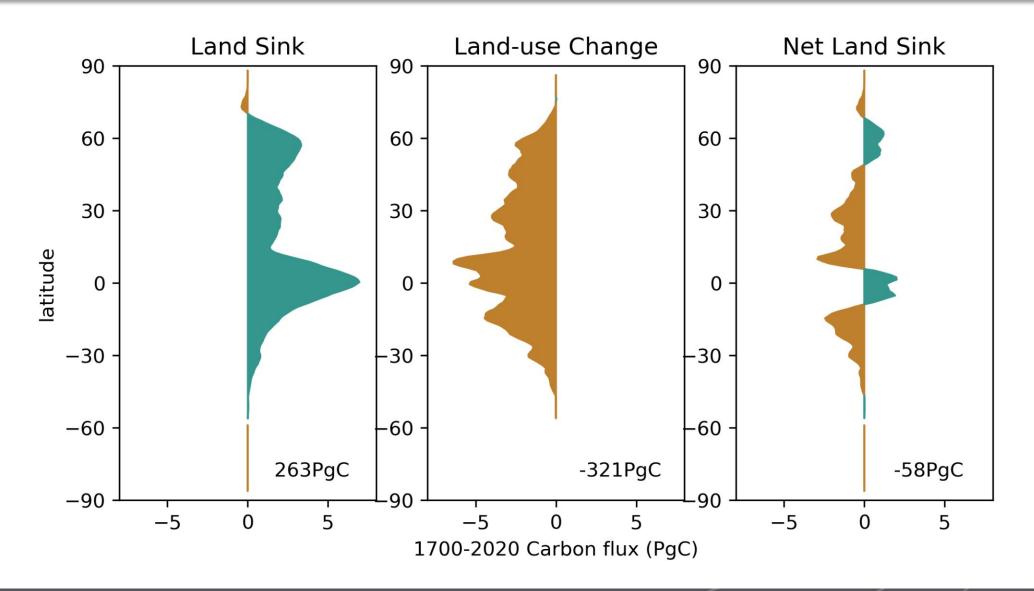
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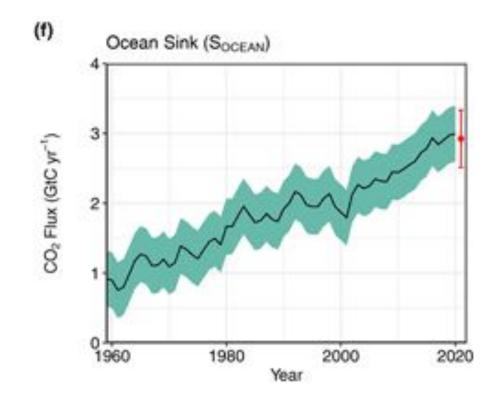


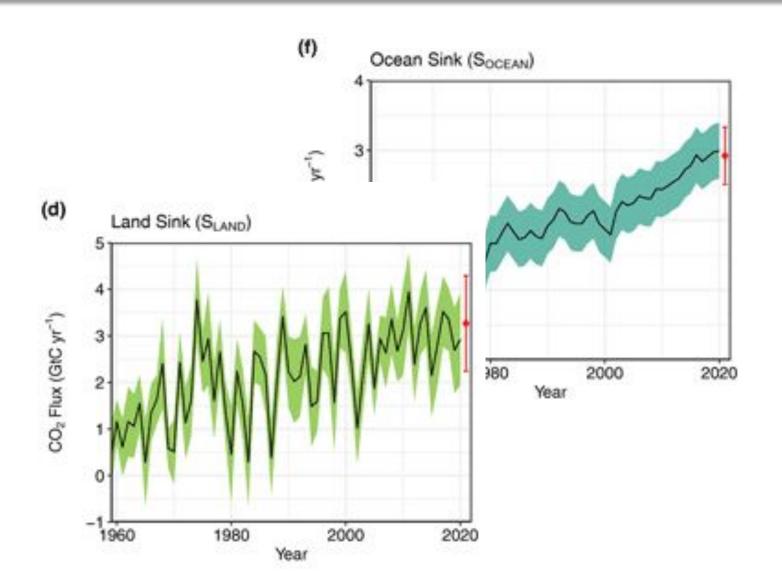


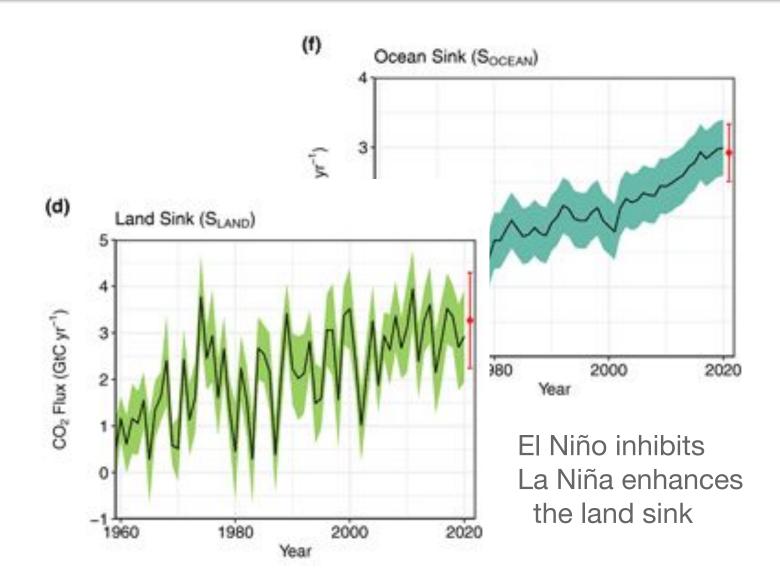






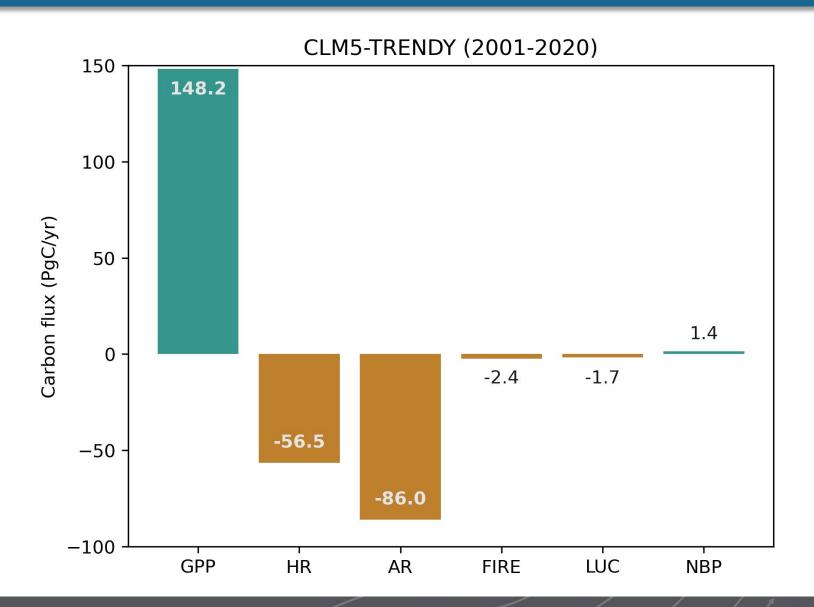




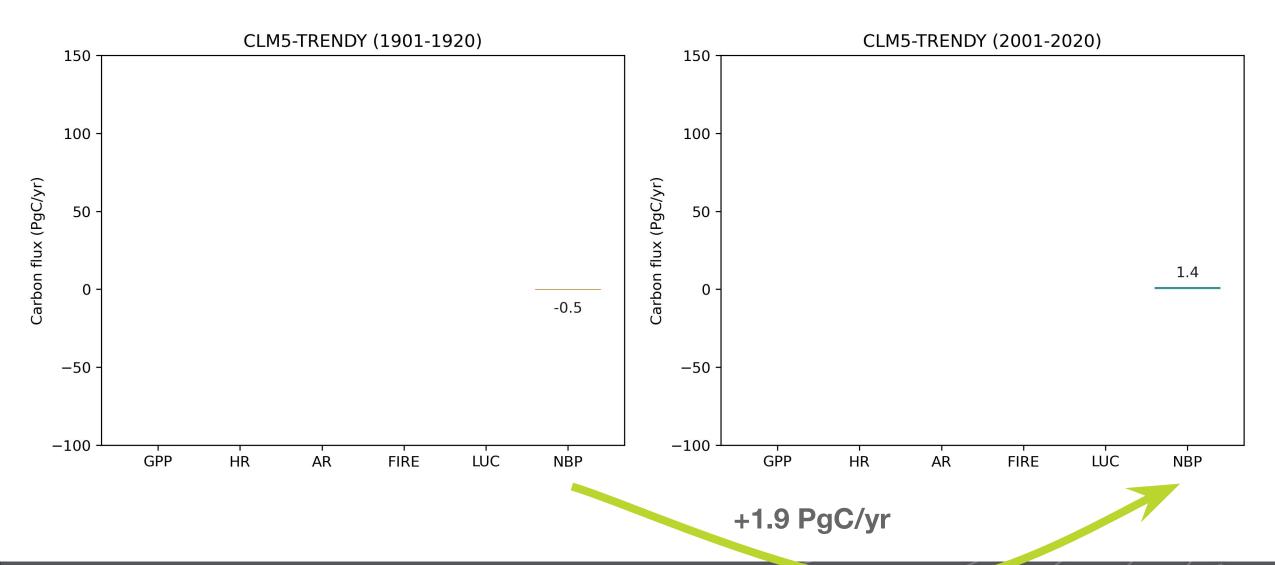


## Why is NBP so hard to project?

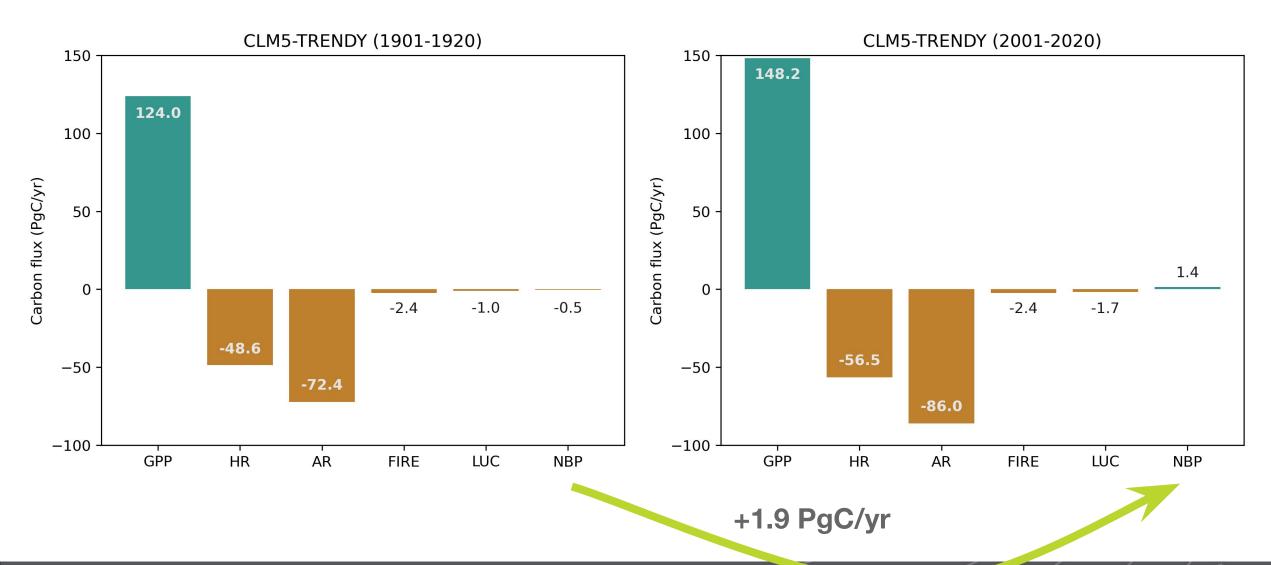
NBP is a small residual of five component fluxes, each with lots of complexity



## Why did NBP switch from negative to positive over the 20th century?



## Why did NBP switch from negative to positive over the 20th century?



### Will human activity enhance or inhibit the land sink?

#### Pros:

- CO<sub>2</sub> fertilizationNitrogen deposition

#### Cons:

Deforestation / disturbance

### Will human activity enhance or inhibit the land sink?

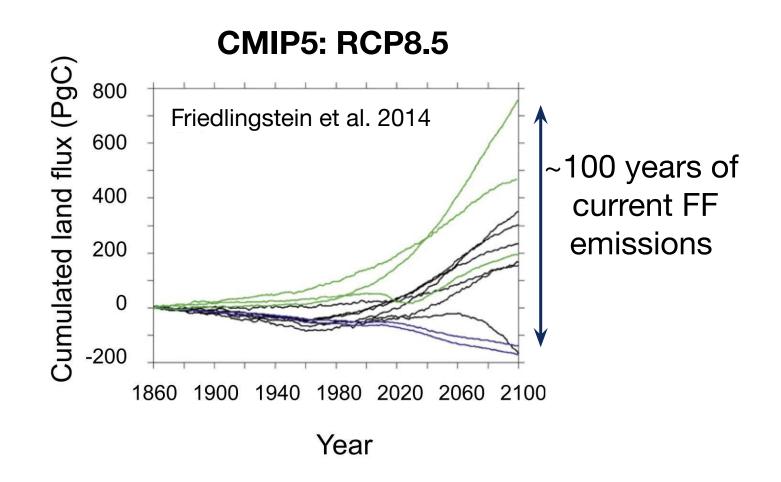
#### Pros:

- CO<sub>2</sub> fertilization
- Nitrogen deposition
- Extend growing seasons
- ...

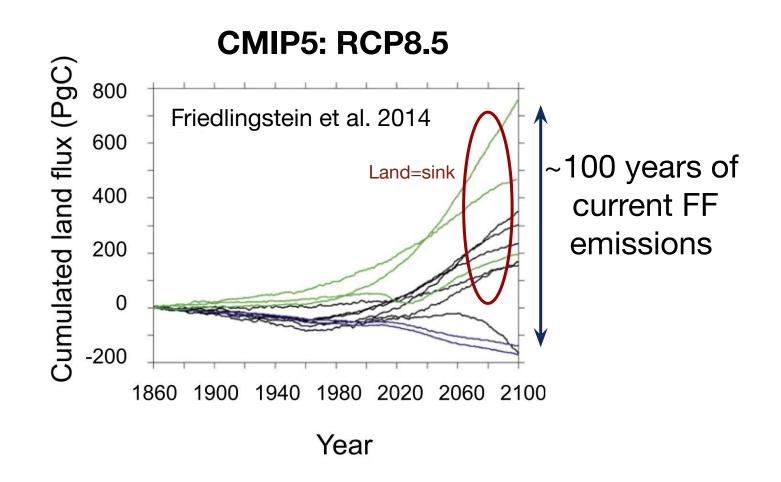
#### Cons:

- Deforestation / disturbance
- Increased aridity / water stress
- Increased soil respiration
- Increased fire
- ...

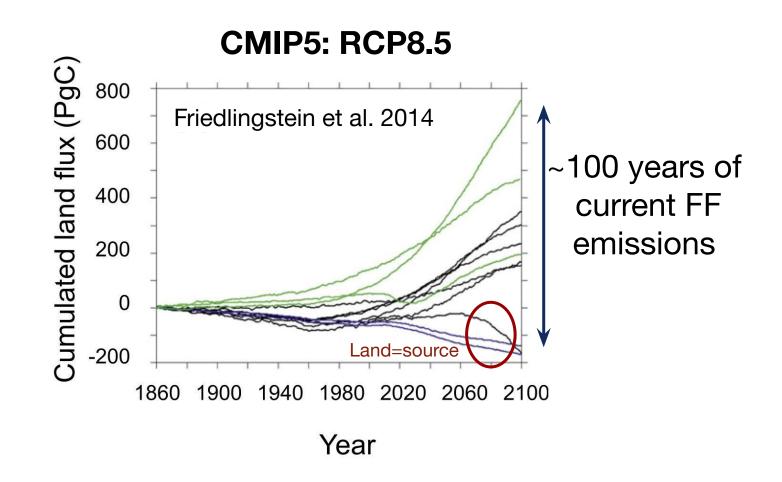
### Multi-model ensembles show wide range in the land carbon sink



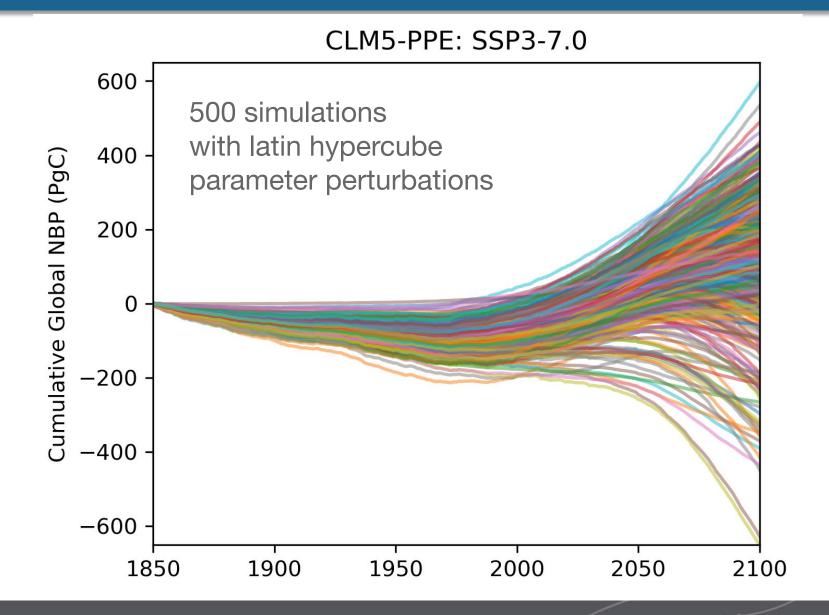
### Multi-model ensembles show wide range in the land carbon sink



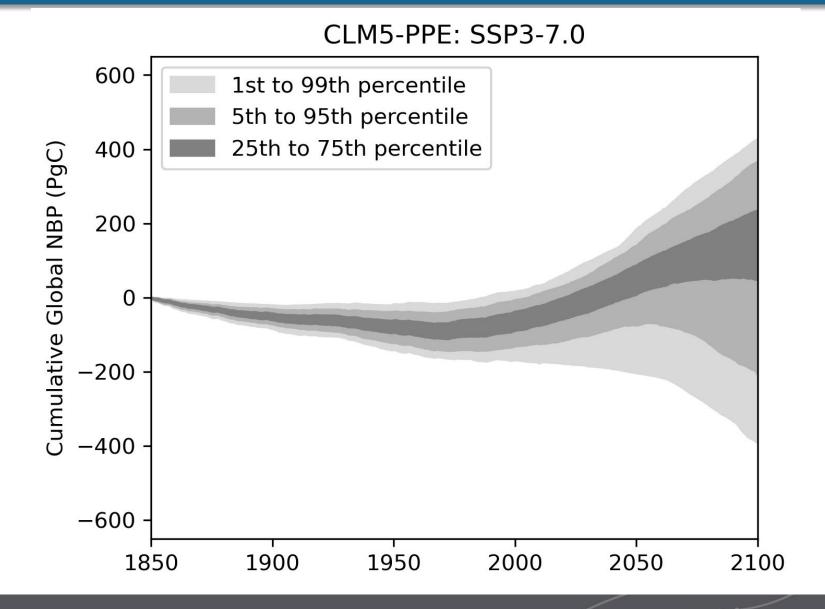
### Multi-model ensembles show wide range in the land carbon sink



### Spread from one model (varying parameters) is of similar magnitude

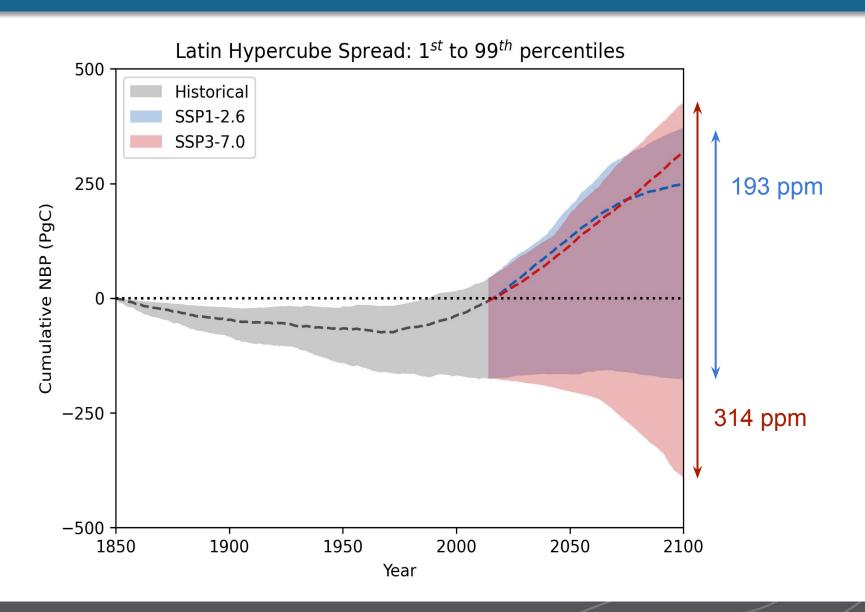


### Establishing quantiles is quite a bit trickier

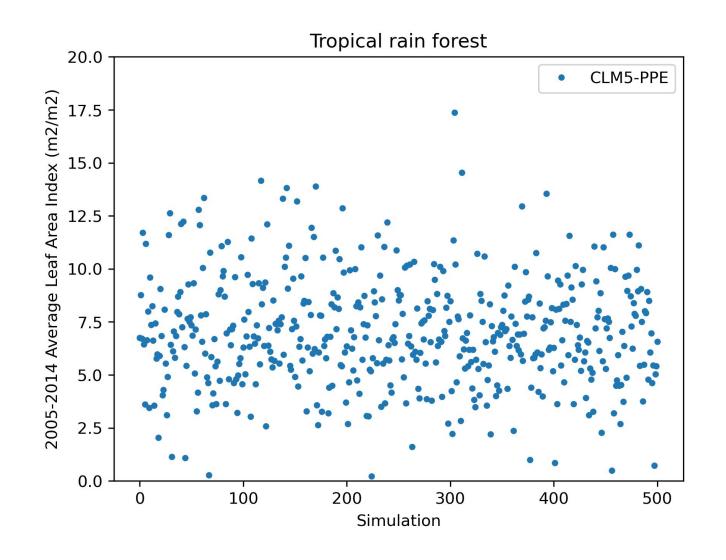


this assumes that all 500 simulations are equally likely

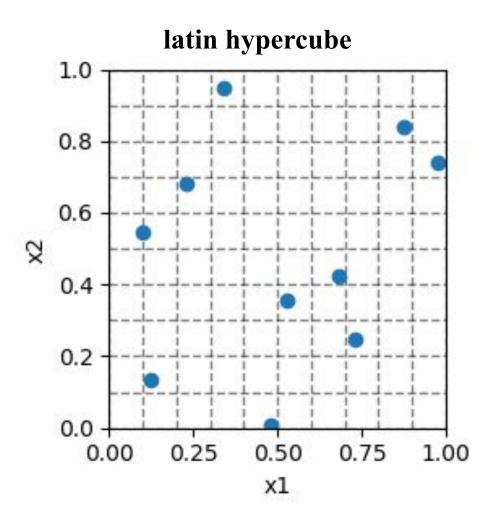
# Parametric uncertainty is larger than scenario uncertainty



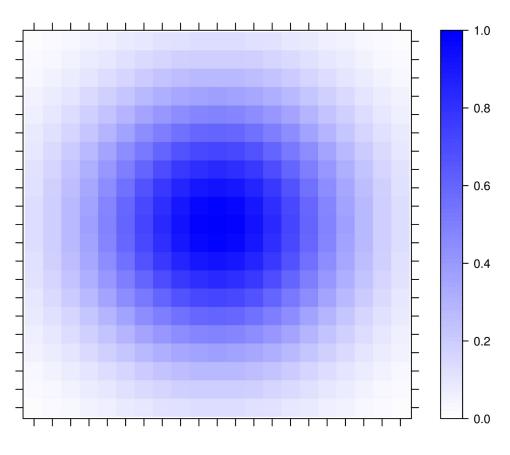
## Many of these simulations seem unlikely



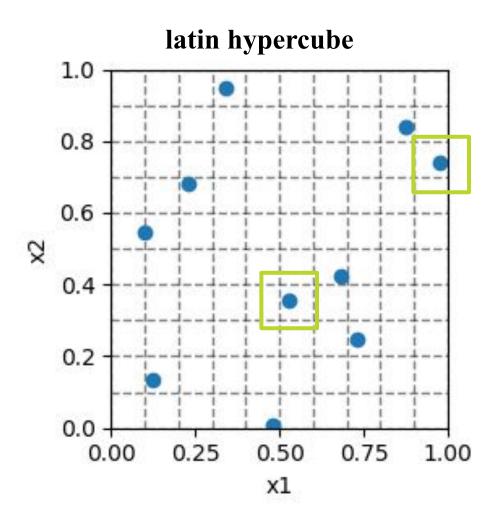
# Parameter sampling paradigms

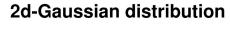


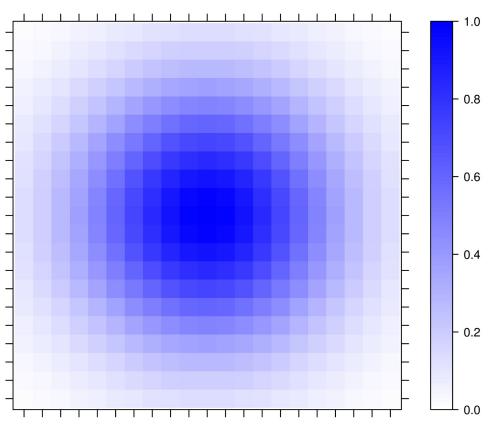




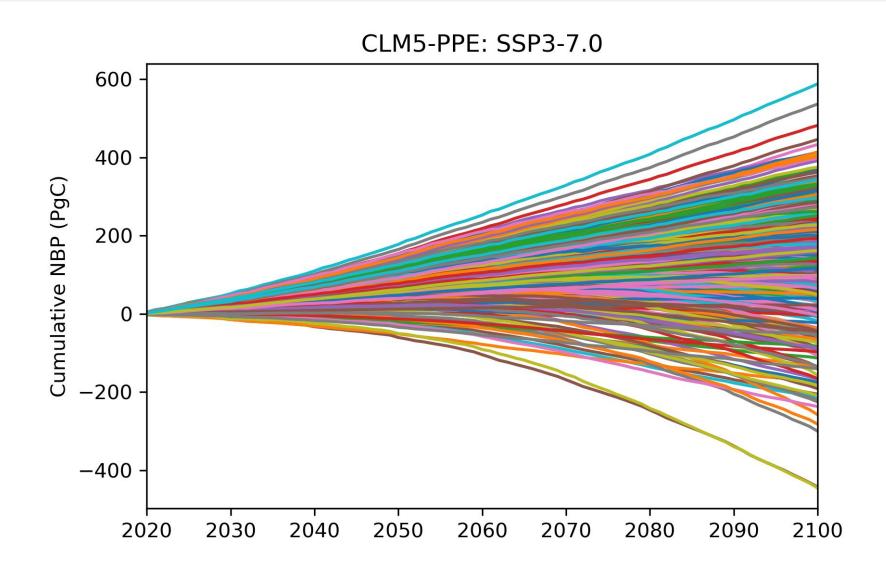
# Parameter sampling paradigms



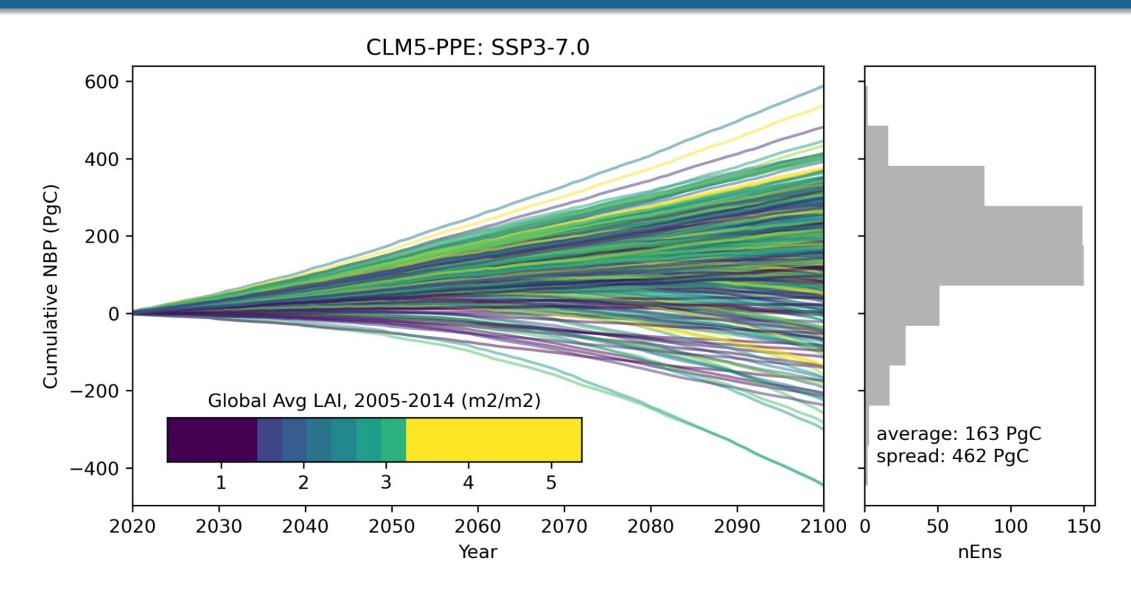




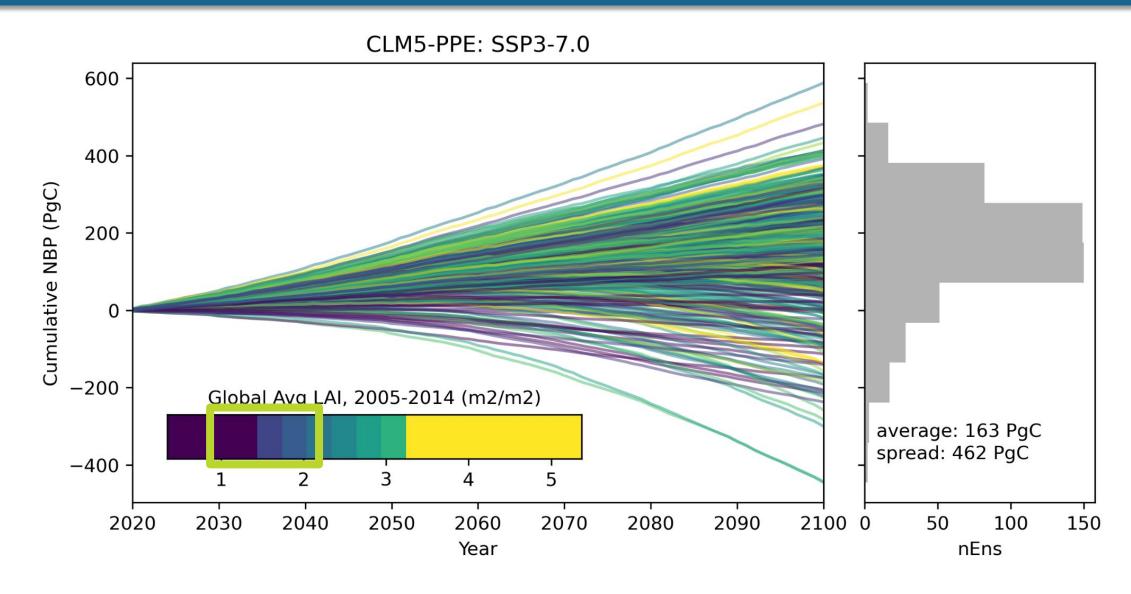
### Can we use observations to better estimate uncertainty?



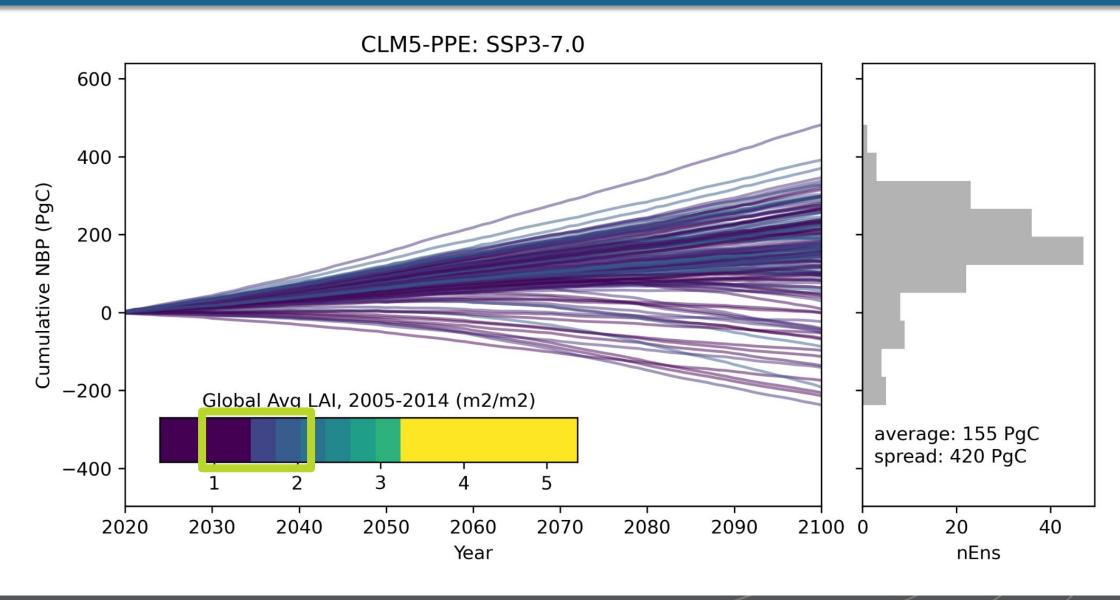
## Do global mean LAI observations constrain uncertainty?



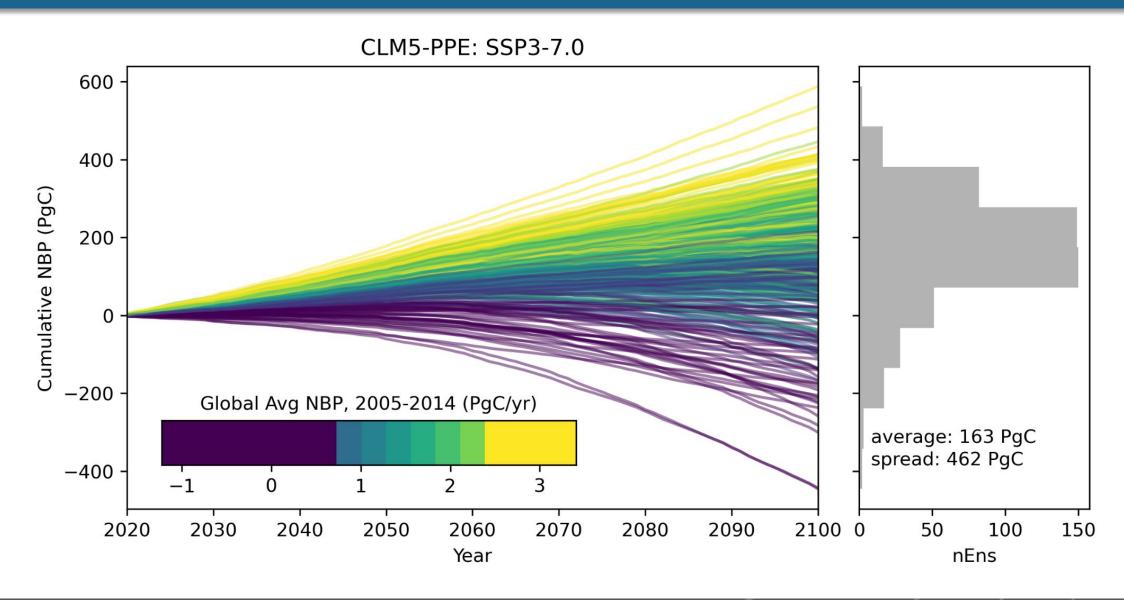
## Do global mean LAI observations constrain uncertainty?



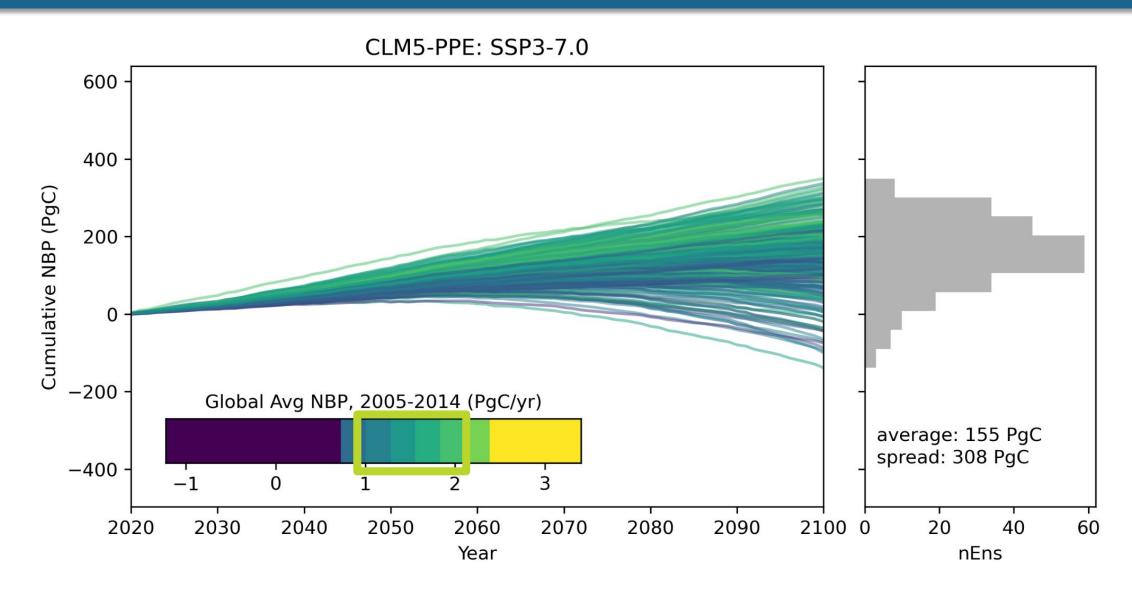
## Do global mean LAI observations constrain uncertainty? (no)



### **Historical NBP is the best constraint on future NBP**

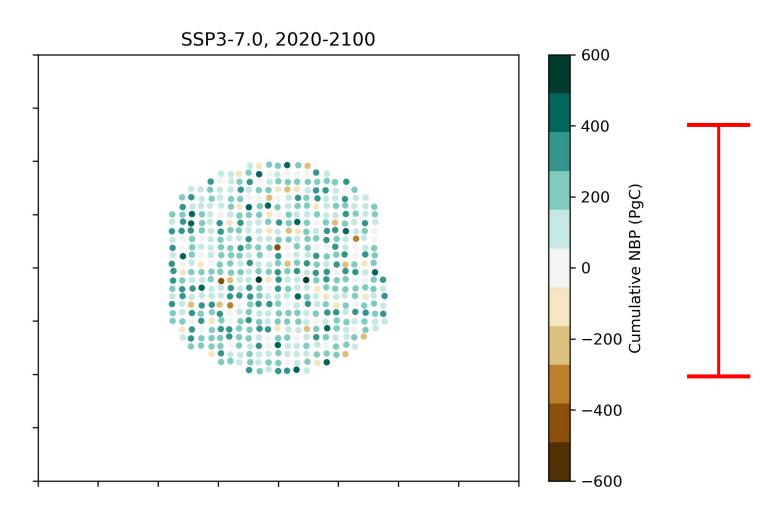


### **Historical NBP is the best constraint on future NBP**



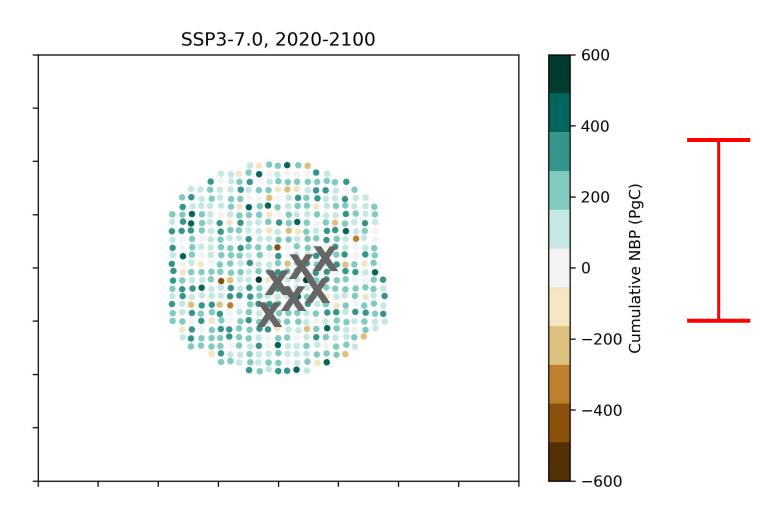
### What makes for effective constraints?

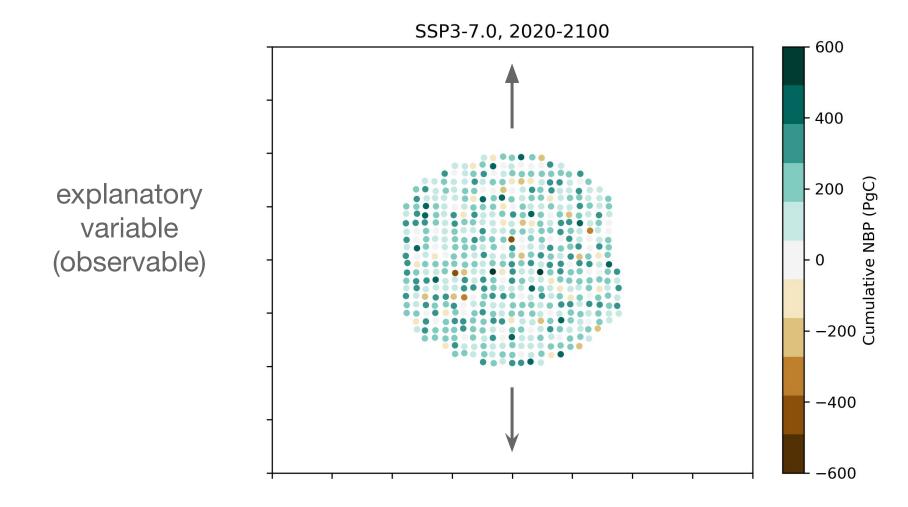
Here are our 500 simulations, without any constraints

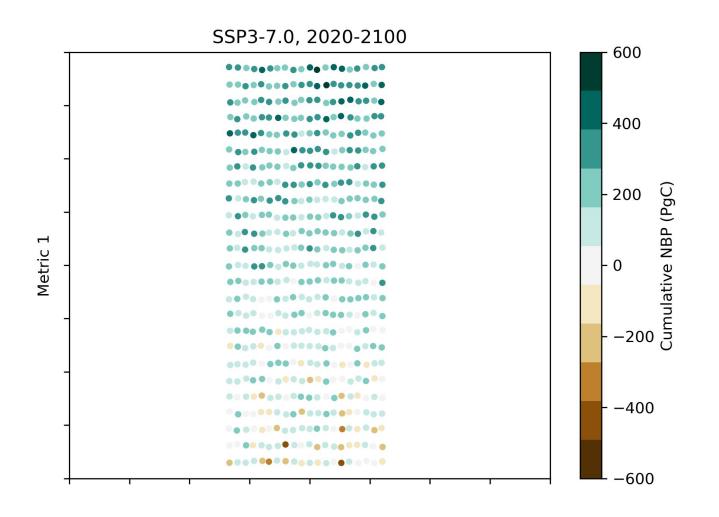


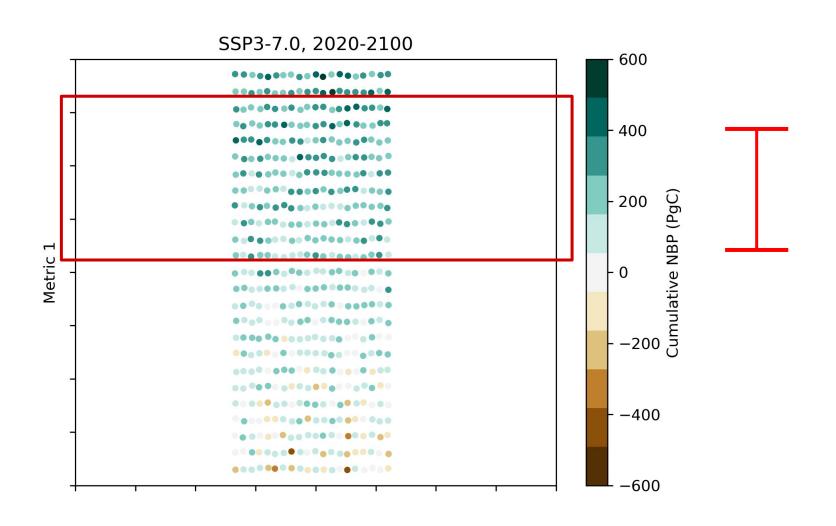
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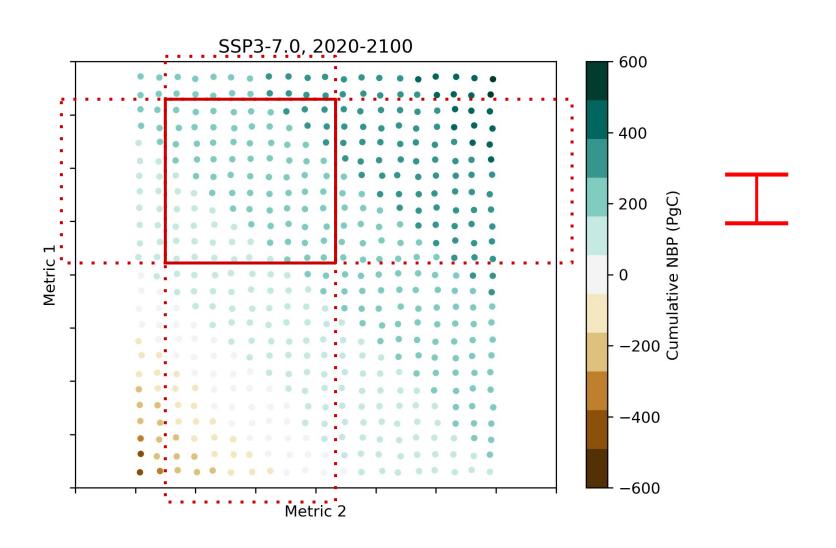
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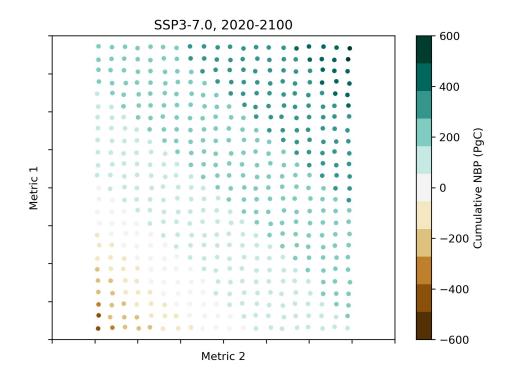




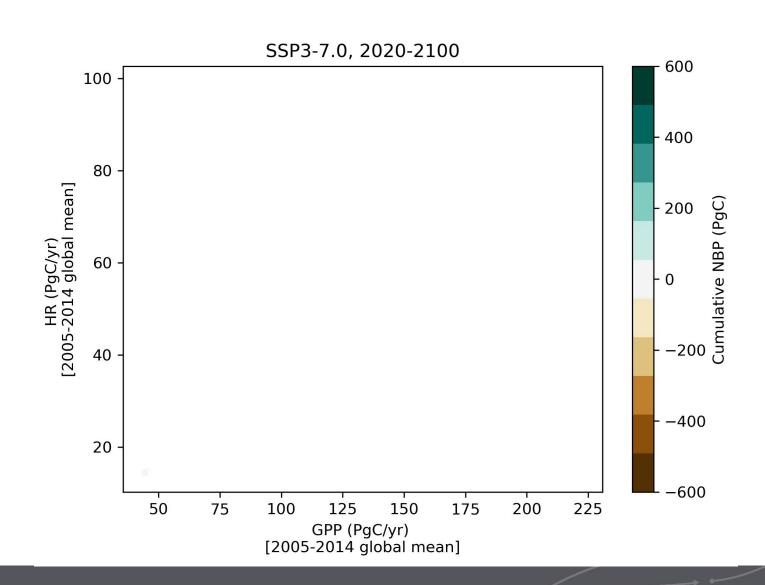


# Take home message from this?

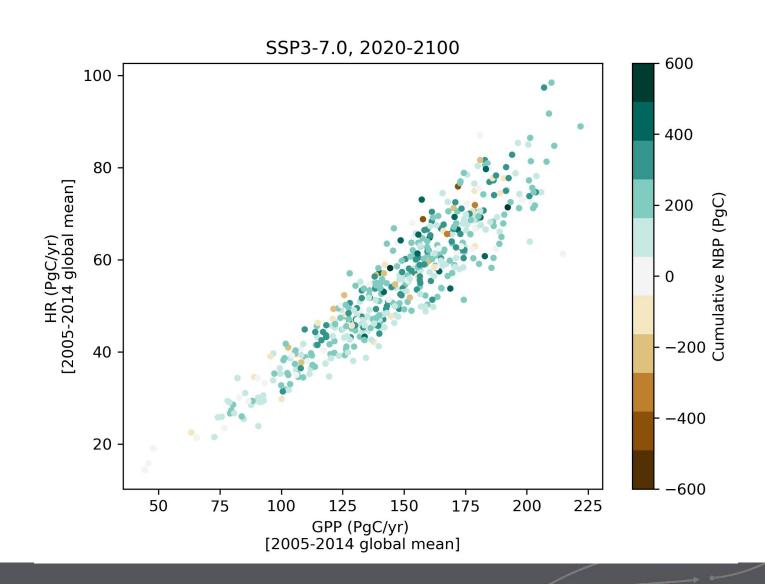
Ideally the observational metrics are correlated with future NBP, but not correlated with each other



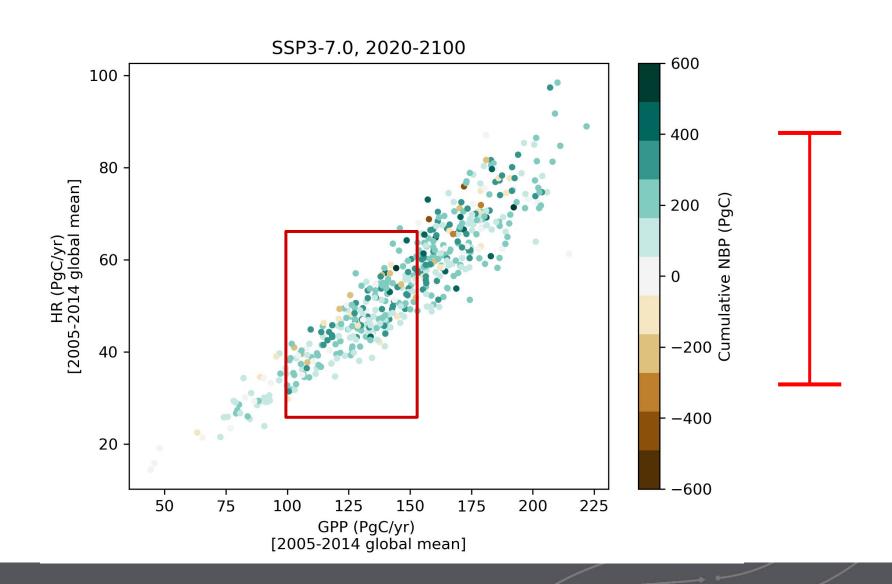
# A more typical example



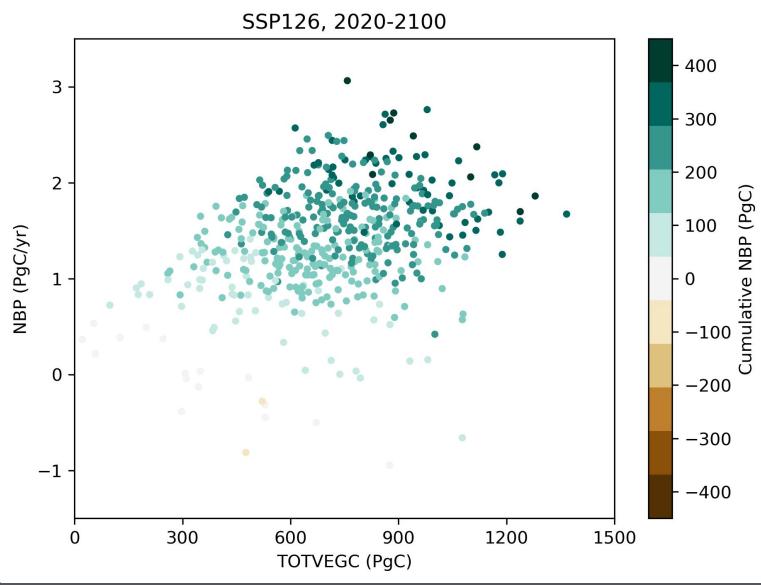
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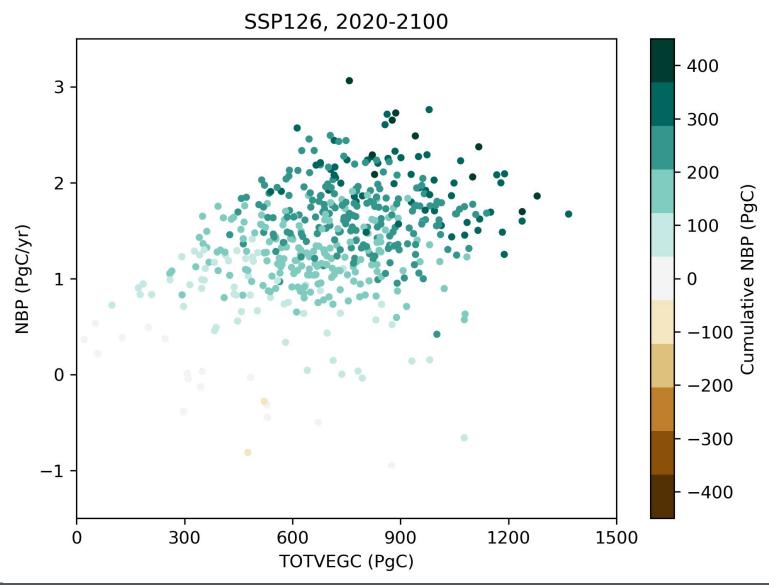


### A better set of constraints...



Future Sink~ 1995-2014 NBP 1995-2014 TOTVEGC

#### A better set of constraints...



Future Sink~ 1995-2014 NBP 1995-2014 TOTVEGC

multi-linear regression coefficients:

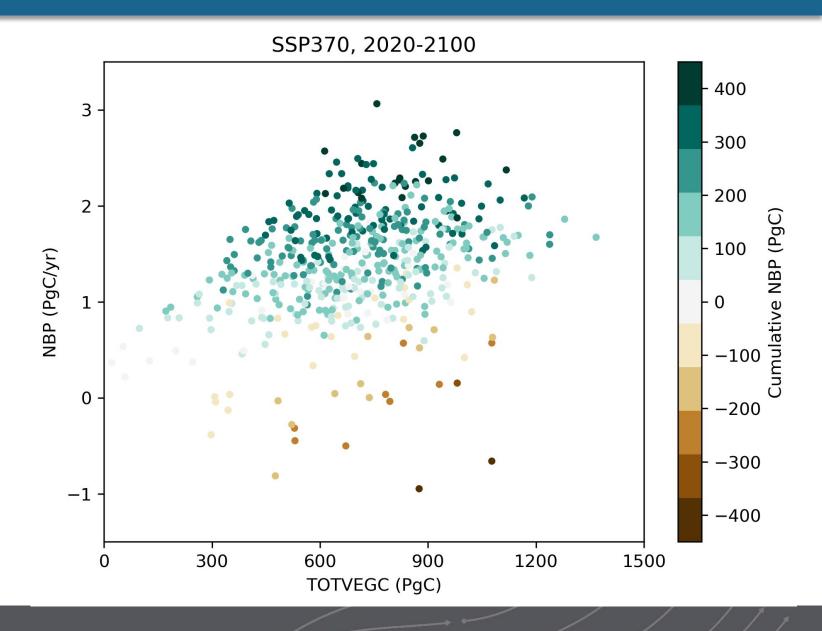
NBP: 95 PgC/PgC/yr

TVC: .14 PgC/PgC

R<sup>2</sup>: 0.79

### Also works for SSP3-7.0

Future Sink~ 1995-2014 NBP 1995-2014 TOTVEGC



### But with different relationships...

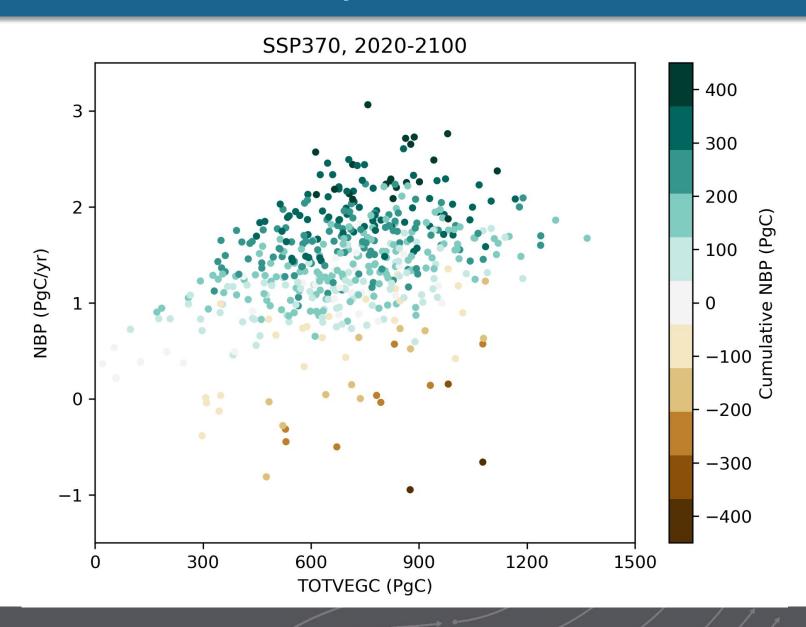
Future Sink~ 1995-2014 NBP 1995-2014 TOTVEGC

multi-linear regression coefficients:

NBP: 227 PgC/PgC/yr

TVC: -.14 PgC/PgC

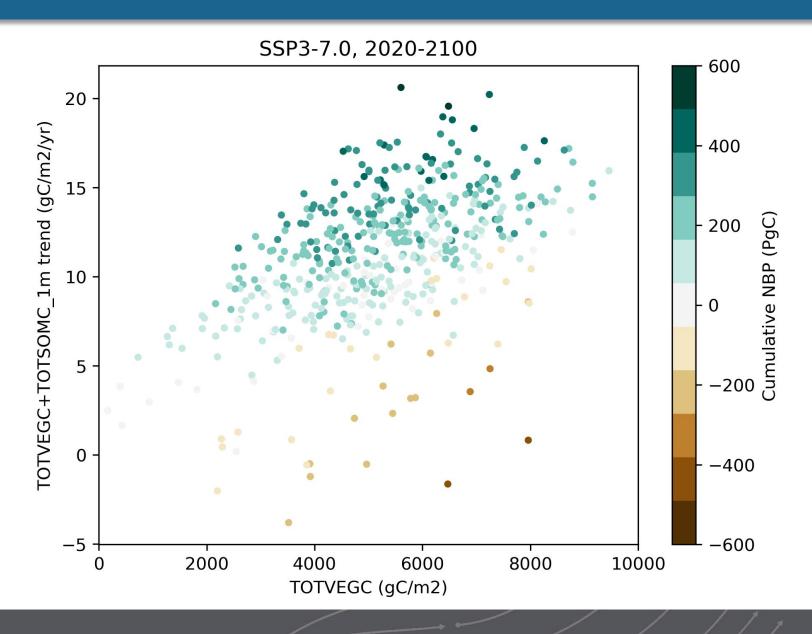
 $R^2$ : 0.73



### NBP is difficult to measure...

But I've found that the: TOTVEGC+TOTSOMC\_1m **trend** 

is an effective stand-in

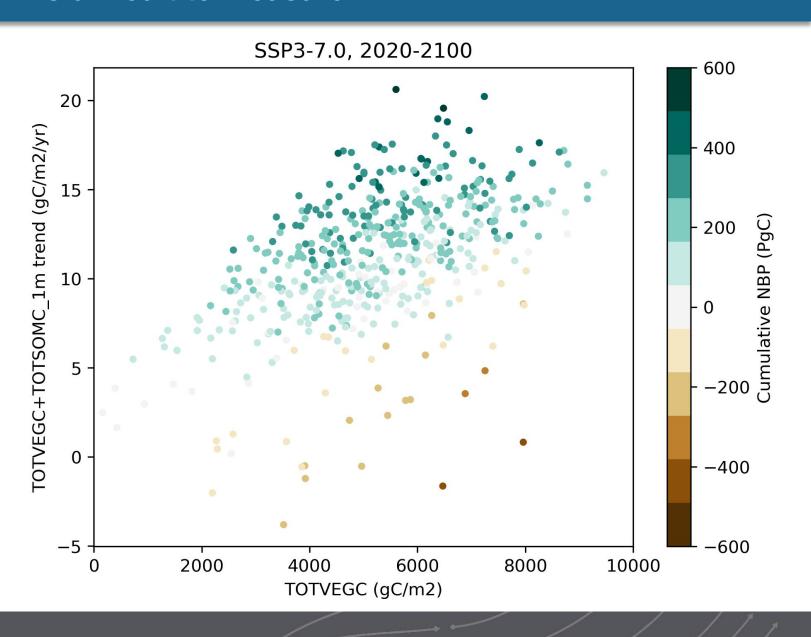


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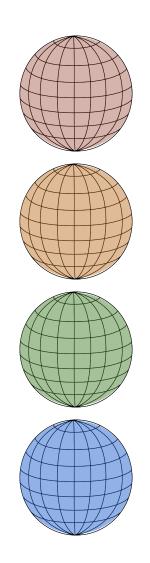
But I've found that the: TOTVEGC+TOTSOMC\_1m **trend** 

is an effective stand-in

ΔTOTECOSYSC=NBP



#### **Conclusions**



- The CLM5-PPE shows a wide spread in carbon cycle futures
  - comparable in size to multi-model spread
  - larger than scenario uncertainty
- Leaf area index is not a very discerning constraint on future NBP
- Past NBP is a nice constraint on future NBP
- Trends in carbon pools tend to be more informative than the gross carbon fluxes

#### **Diagnostics website:**

webext.cgd.ucar.edu/I2000/PPEn11\_OAAT/