



When is a trend meaningful? Insights to carbon cycle variability from the CESM2 large ensemble

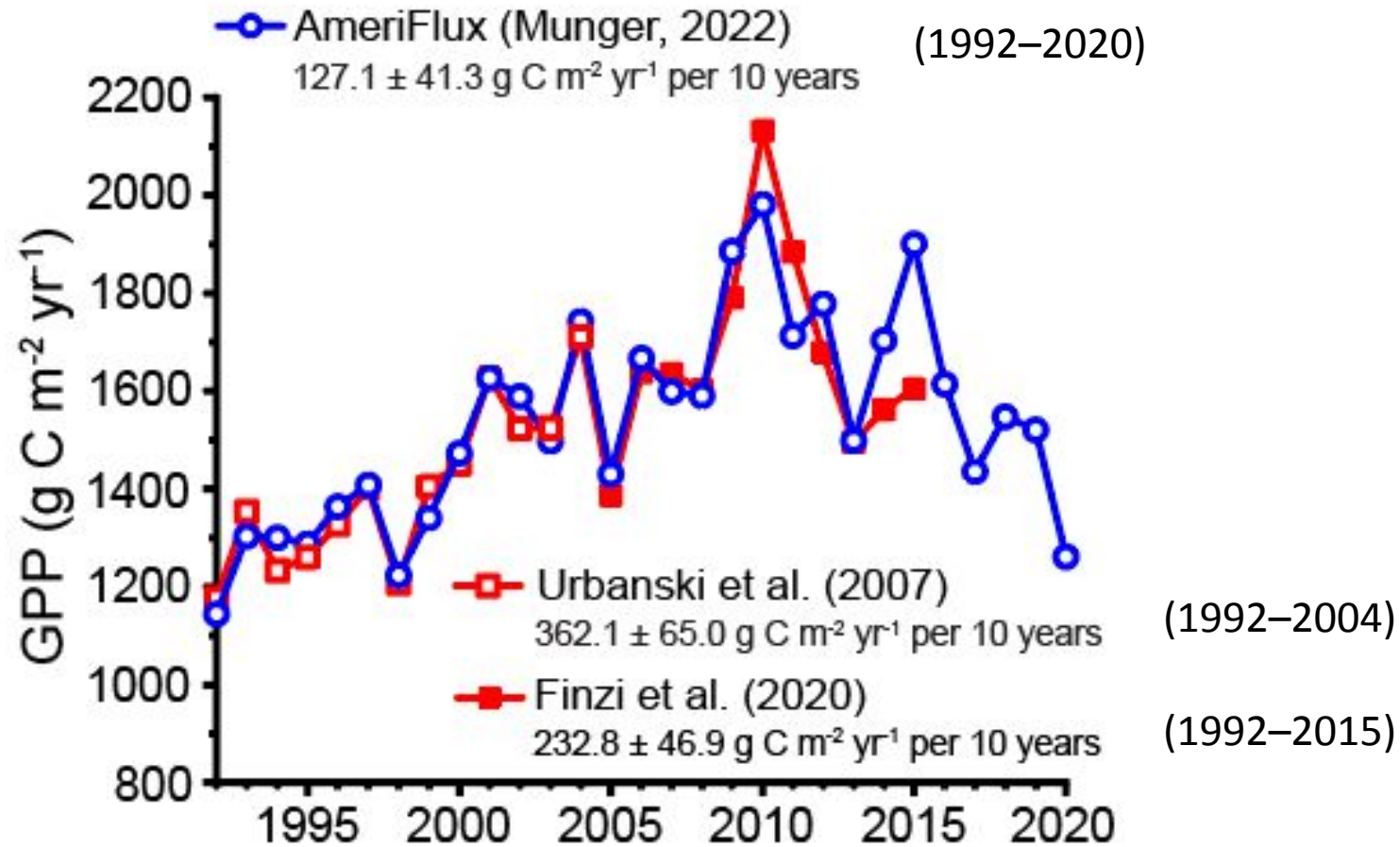
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CESM Land Model Working Group
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Carbon cycle trends at Harvard Forest



How does unforced variability (internal variability) affect GPP trends over the different time periods?

Initial condition large ensembles




nature
climate change

PERSPECTIVE

<https://doi.org/10.1038/s41558-020-0731-2>

Check for updates

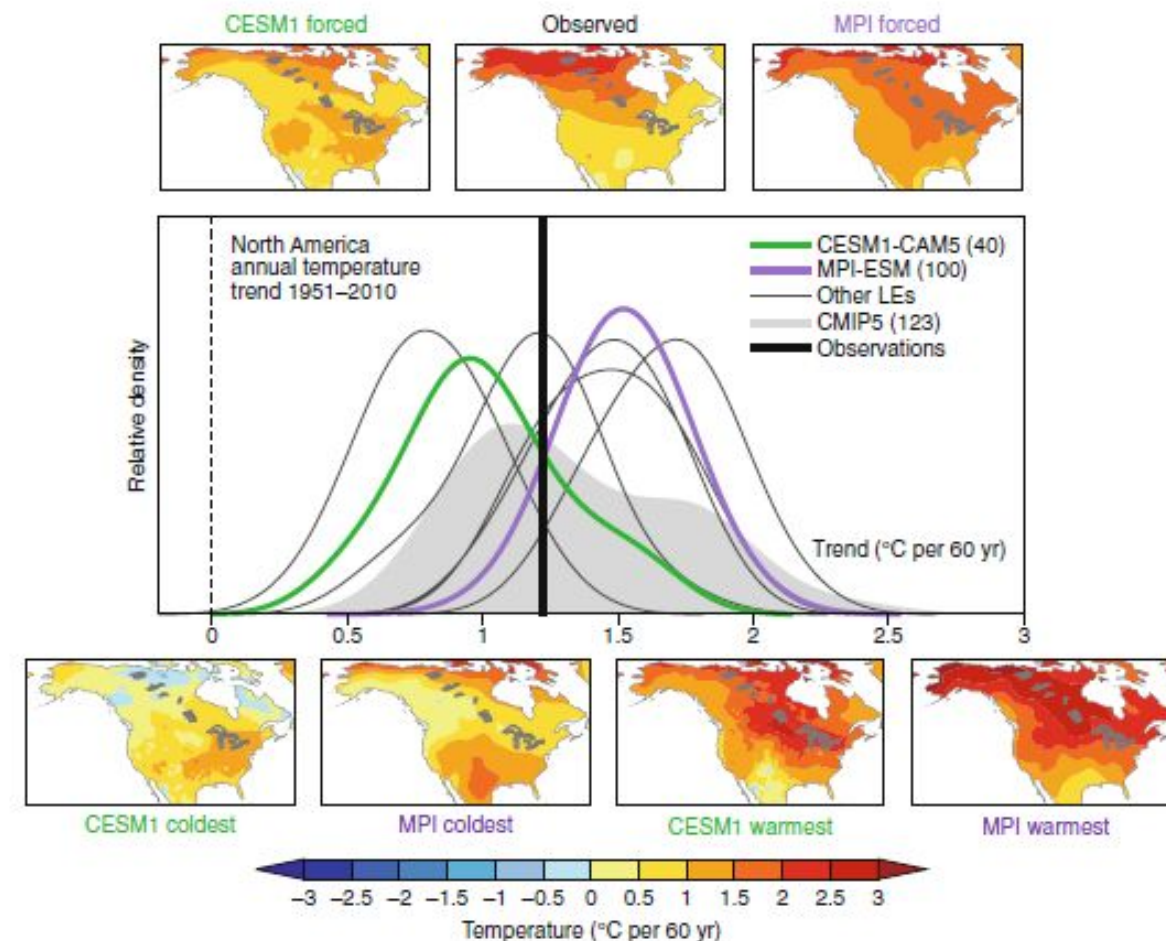
Insights from Earth system model initial-condition large ensembles and future prospects

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N. S. Lovenduski^{2,12,15} , J. Marotzke^{2,16} , K. A. McKinnon^{2,17} , S. Minobe^{2,18} , J. Randerson^{2,19} ,
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Internal variability: uncertainty in initial atmospheric and oceanic states produces different climate trajectories, each with its own random sequence of unforced variability and each an equally plausible realization of climate change

50 members of the CESM2 LE (1850–2100) that differ only in initial conditions for 1850

Rodgers et al. (2021) Earth Syst. Dynam., 12, 1393–1411



CESM2 Initial Condition Large Ensemble

MACRO
(20 members)

Different climate states (10 years apart)
between years 1001 and 1191

MICRO 1231
(20 members)

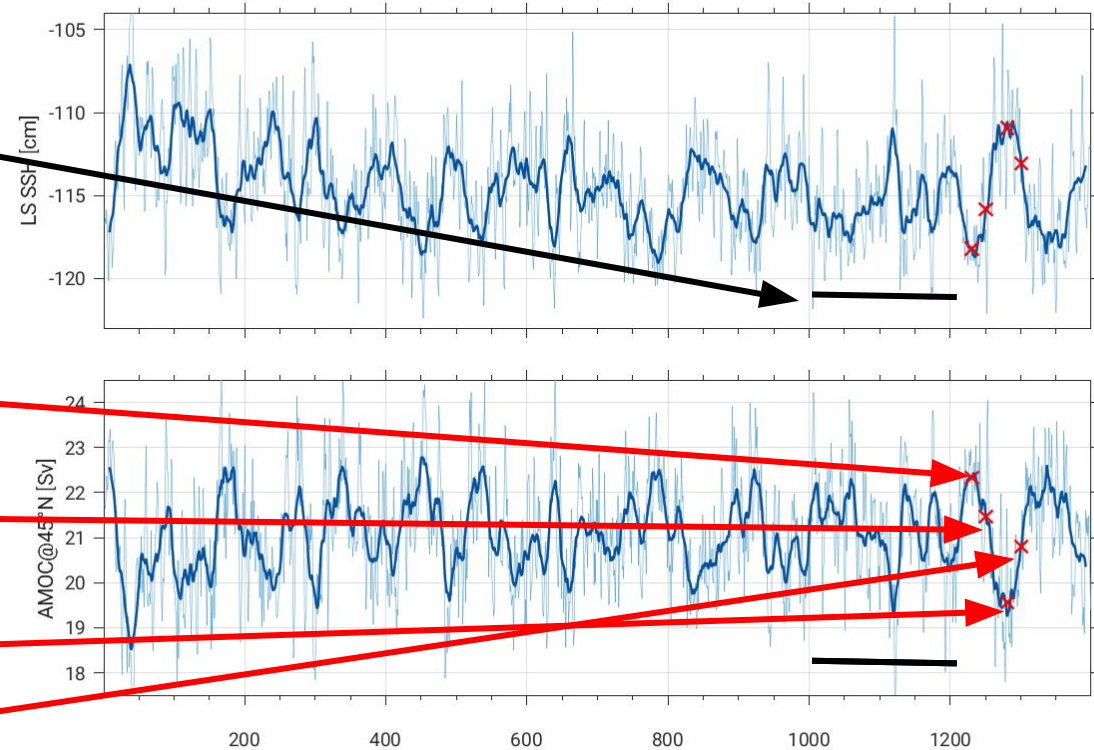
MICRO 1251
(20 members)

MICRO 1281
(20 members)

MICRO 1301
(20 members)

4 sets of 20 members, initialized from 4 different climate
states (years 1231, 1251, 1281, 1301)

The 20 members differ by initial perturbation of order 10^{-14}
to the air temperature field

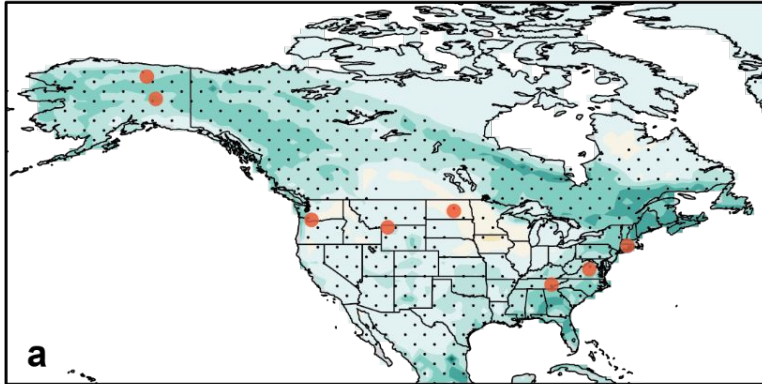


See:

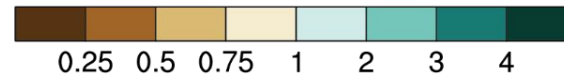
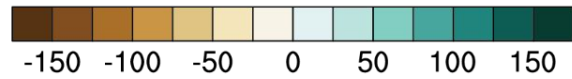
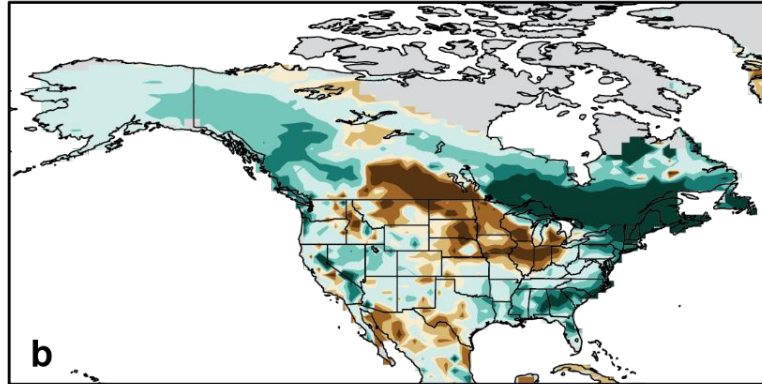
Rodgers et al. (2021) Earth Syst. Dynam., 12, 1393–1411

Gross primary production (1991–2020)

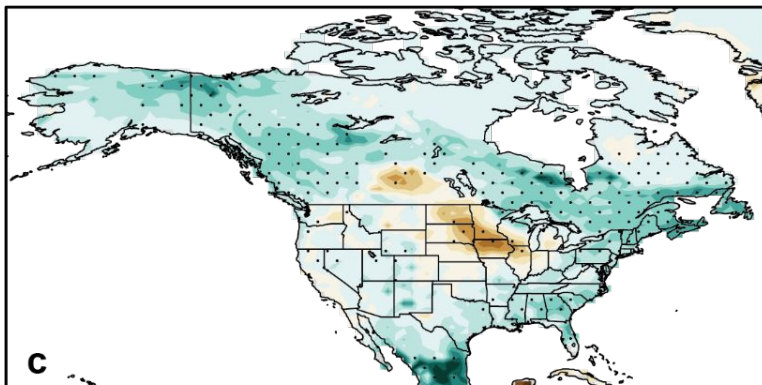
Ensemble mean



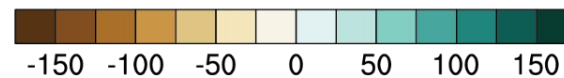
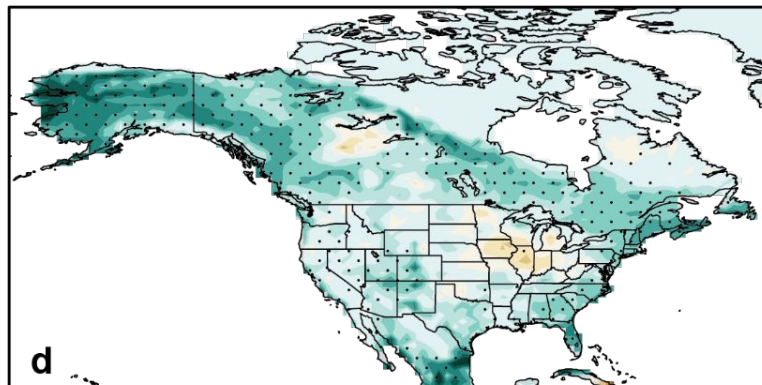
Ensemble mean / standard deviation



Ensemble member 1281.015



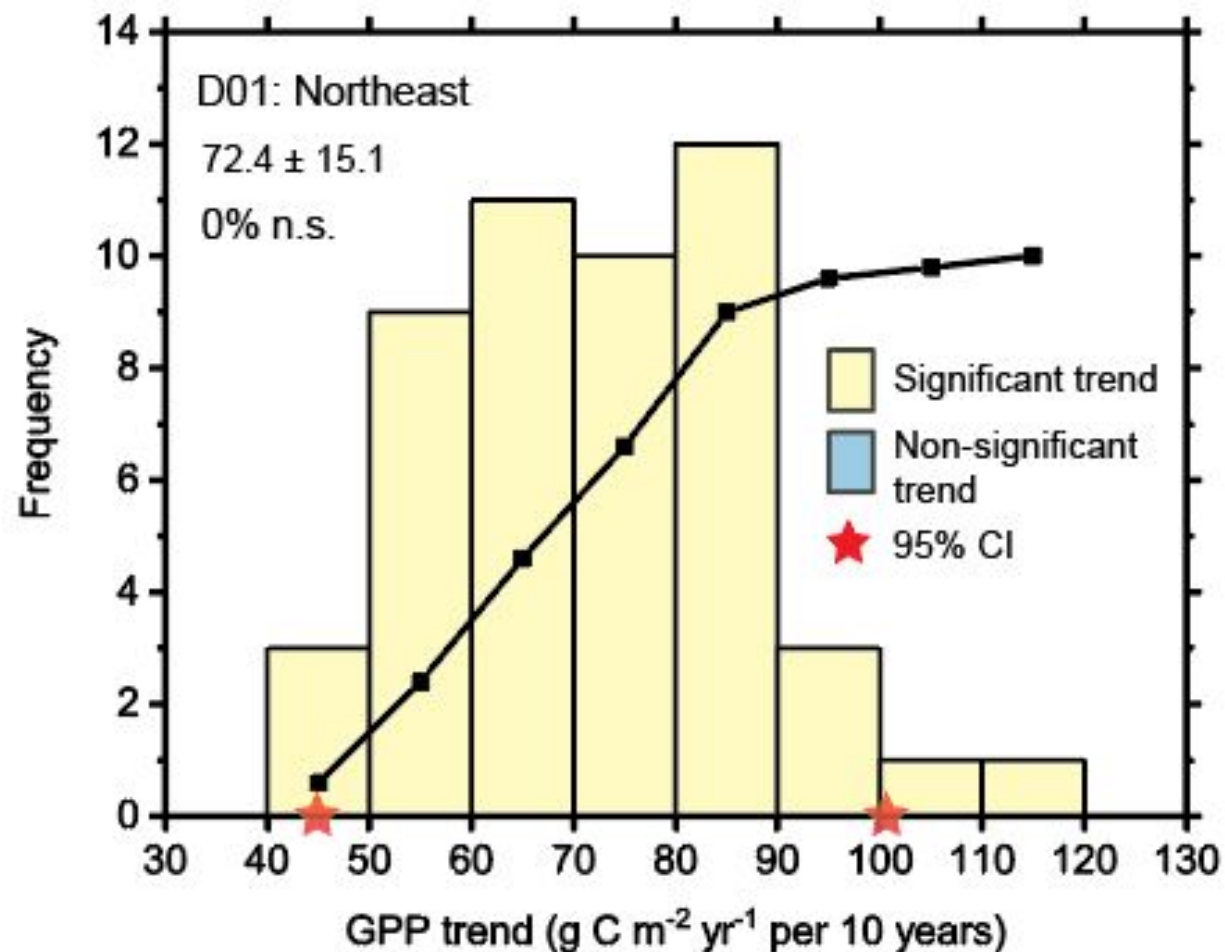
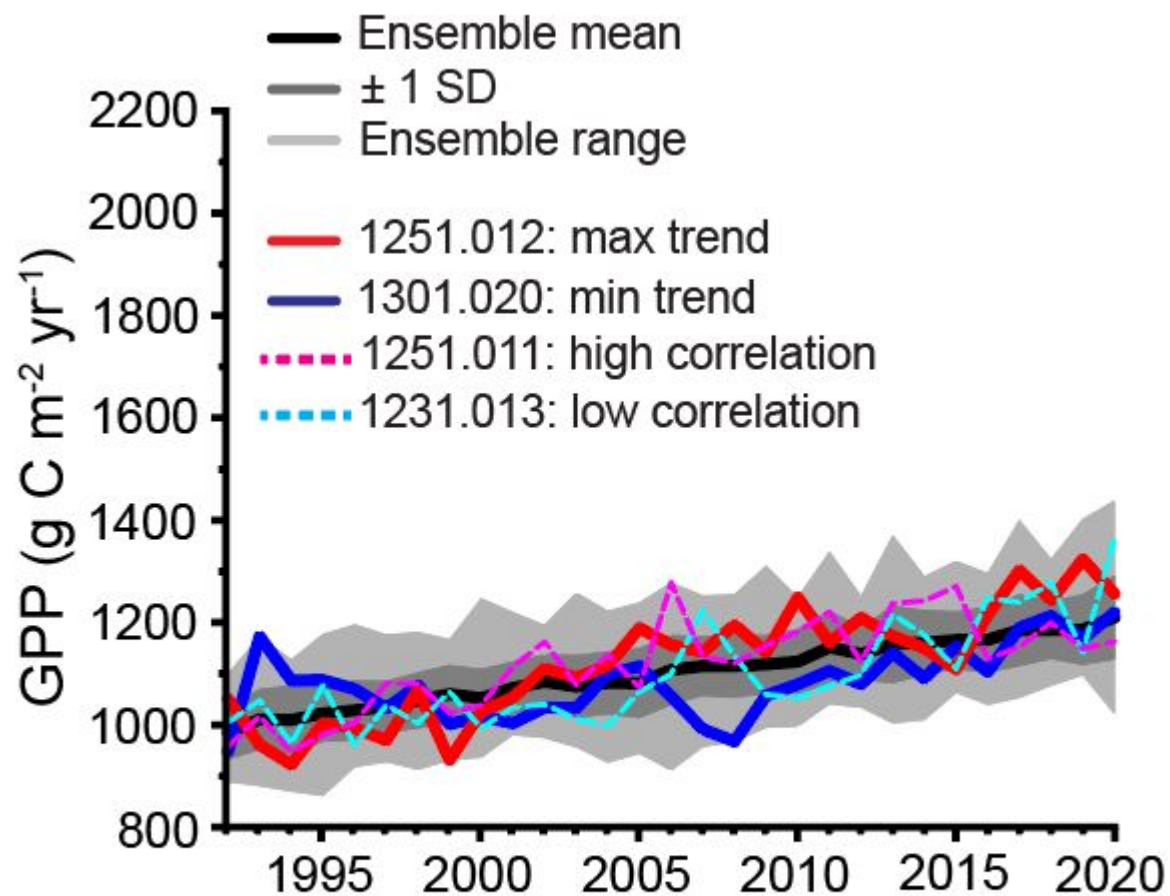
Ensemble member 1231.018



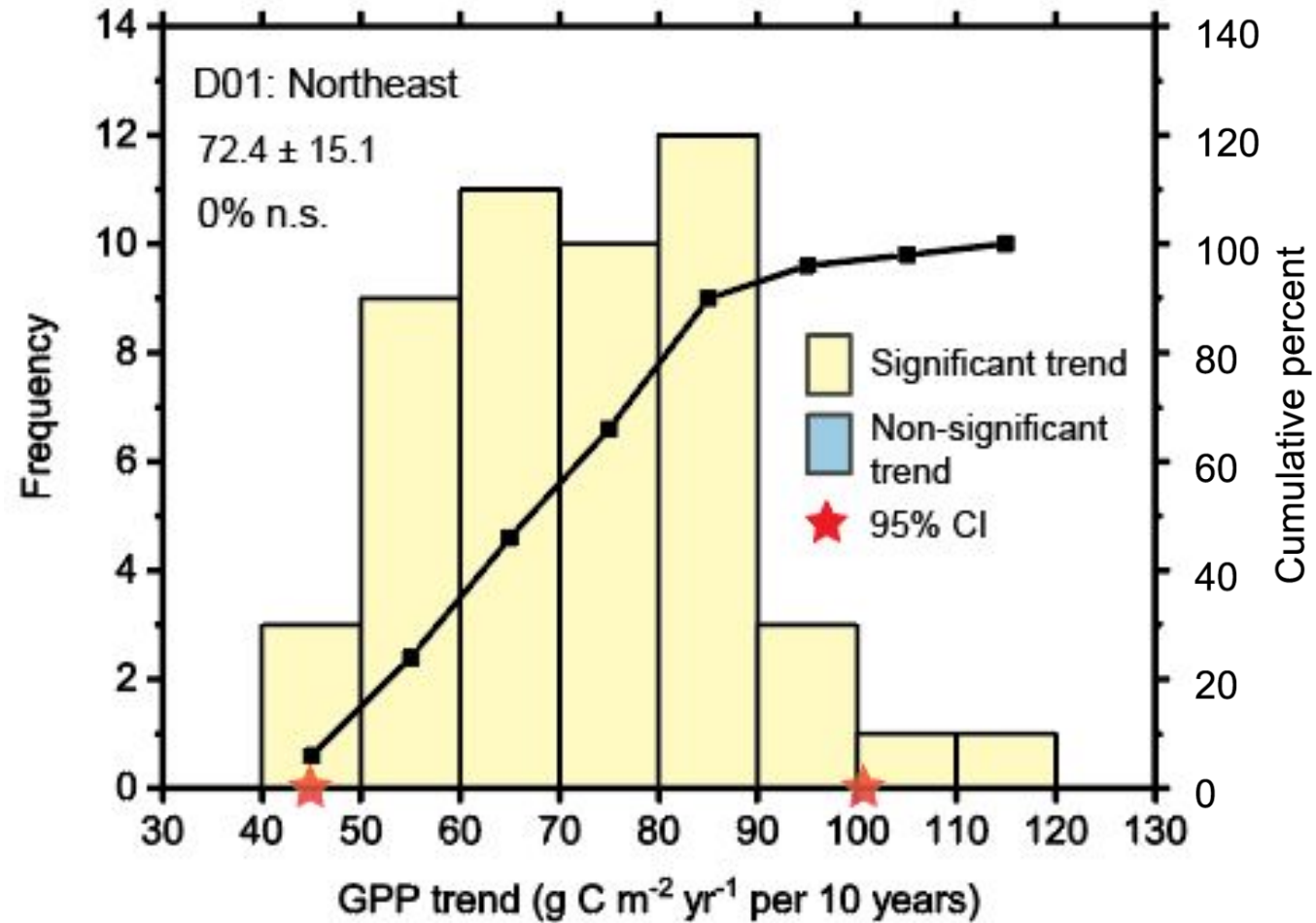
Statistically significant trend

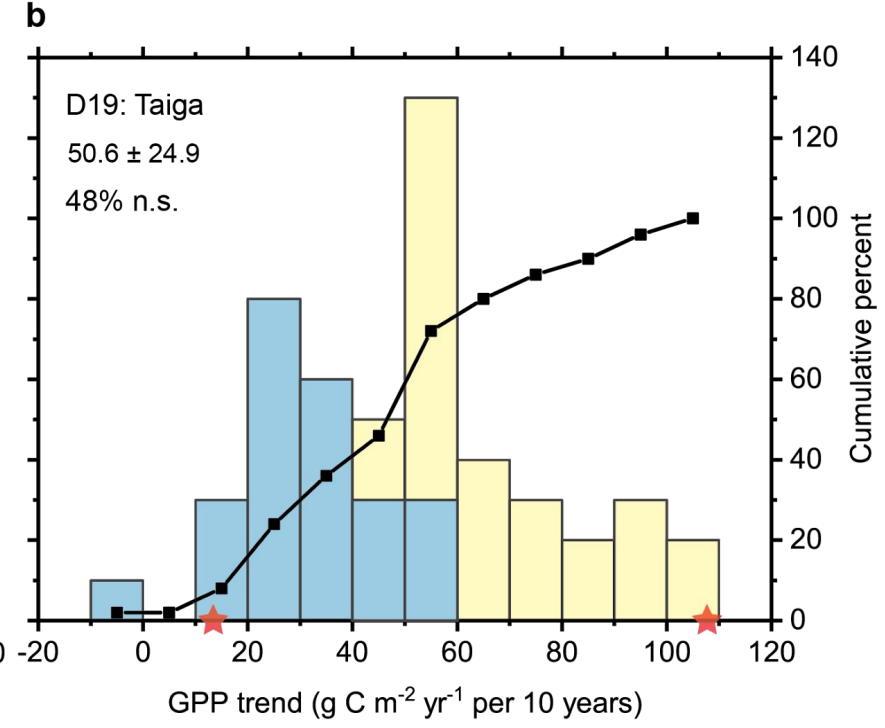
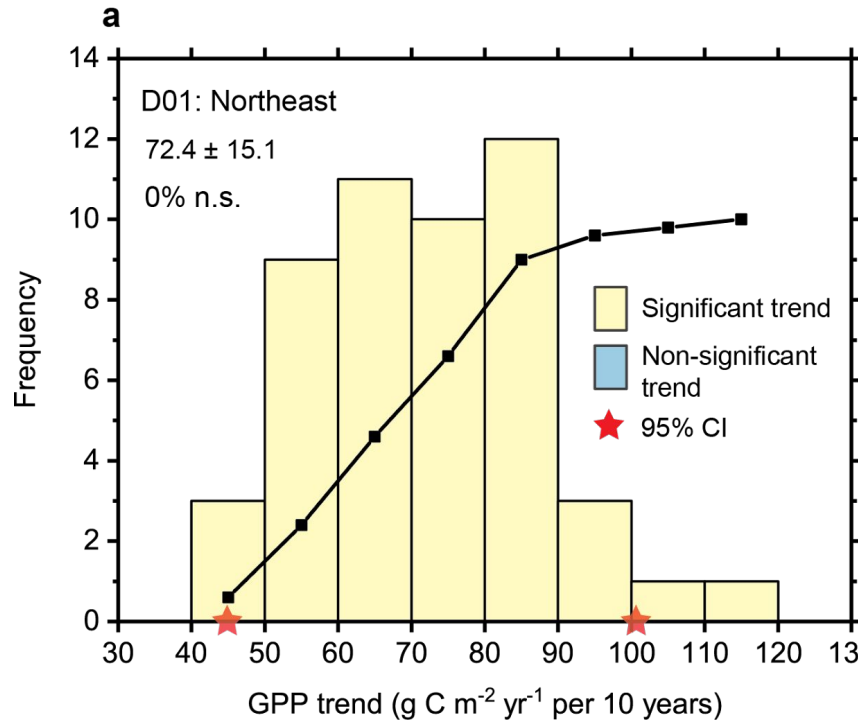
GPP trend ($\text{g C m}^{-2} \text{ yr}^{-1}$ per 10 years)

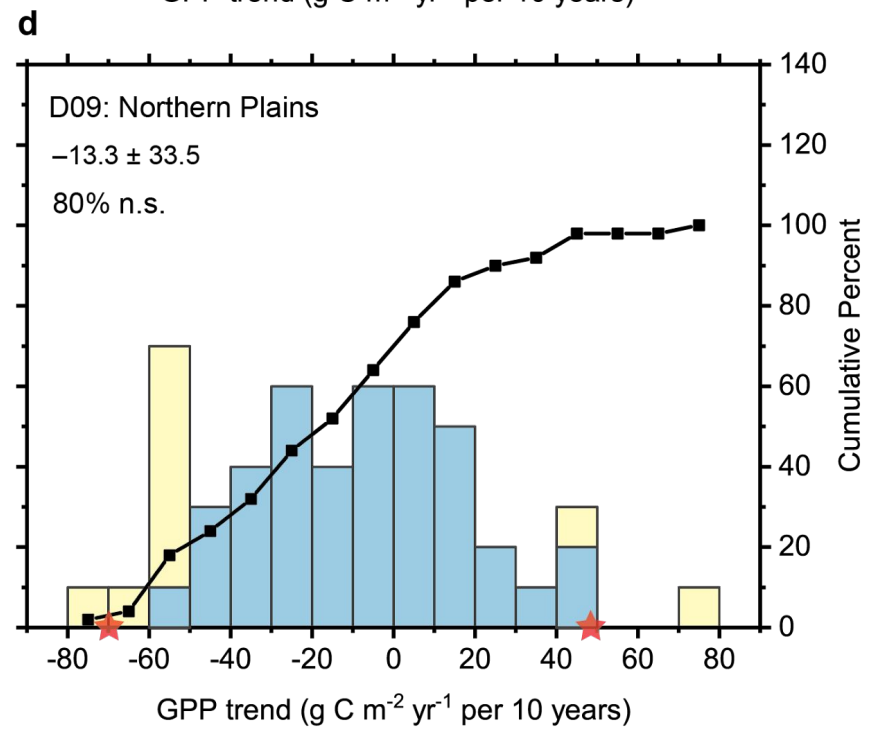
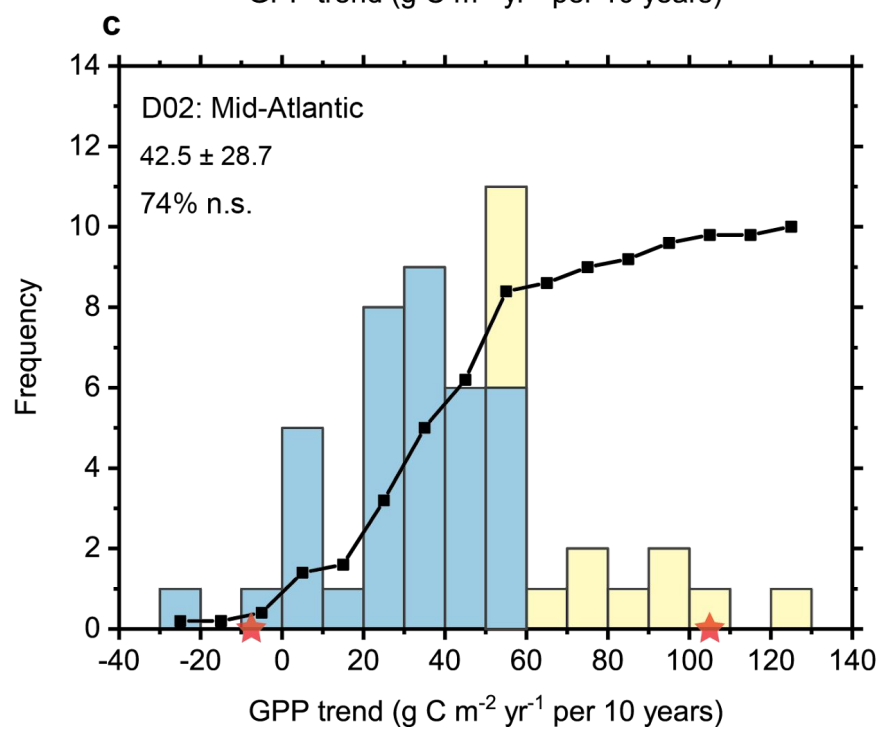
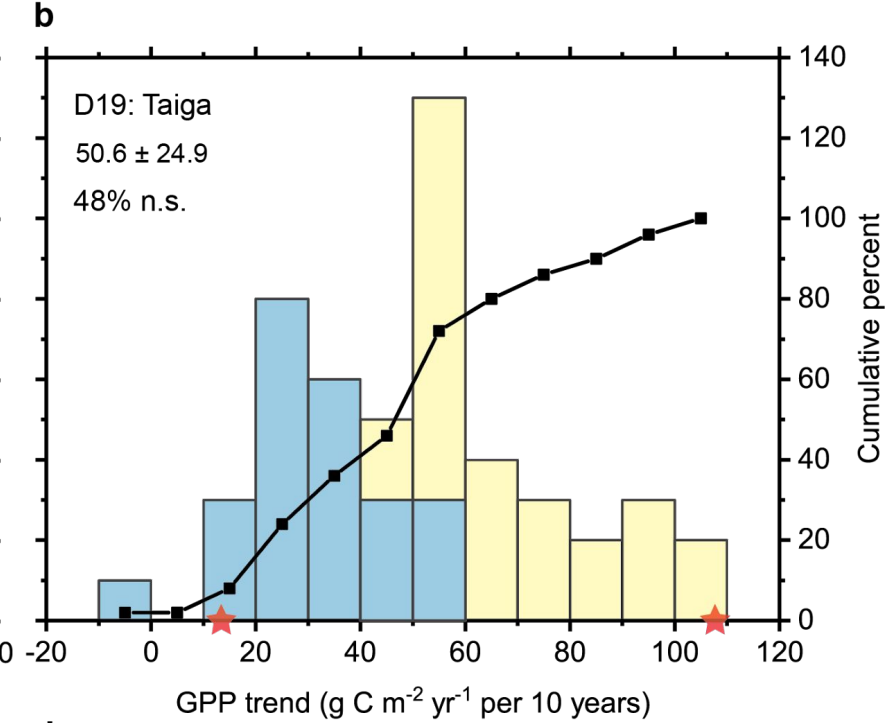
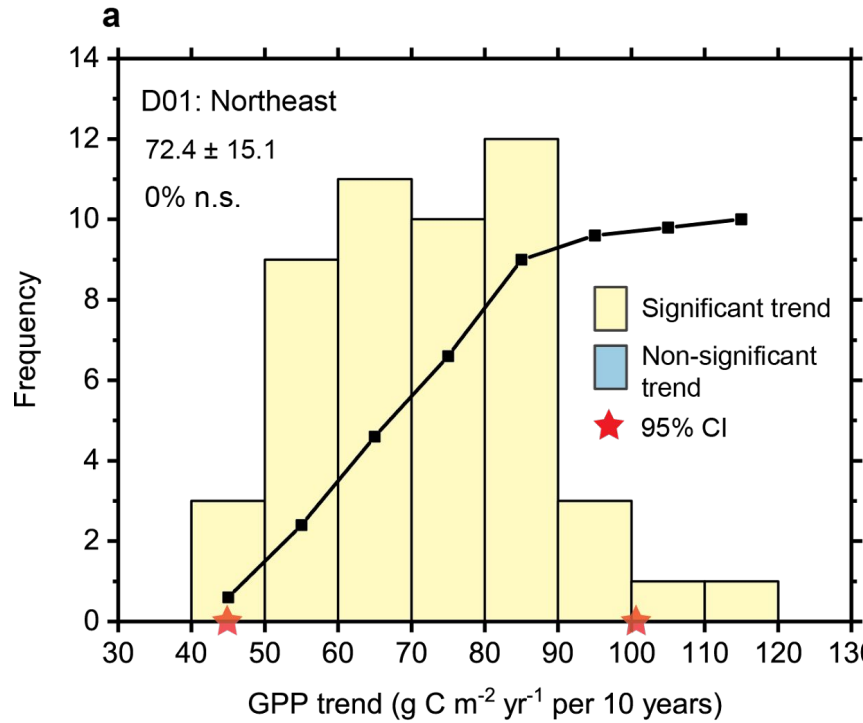
Statistical distribution of GPP trends



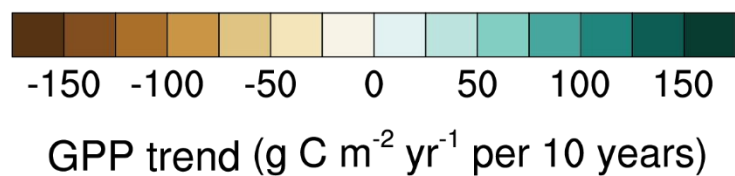
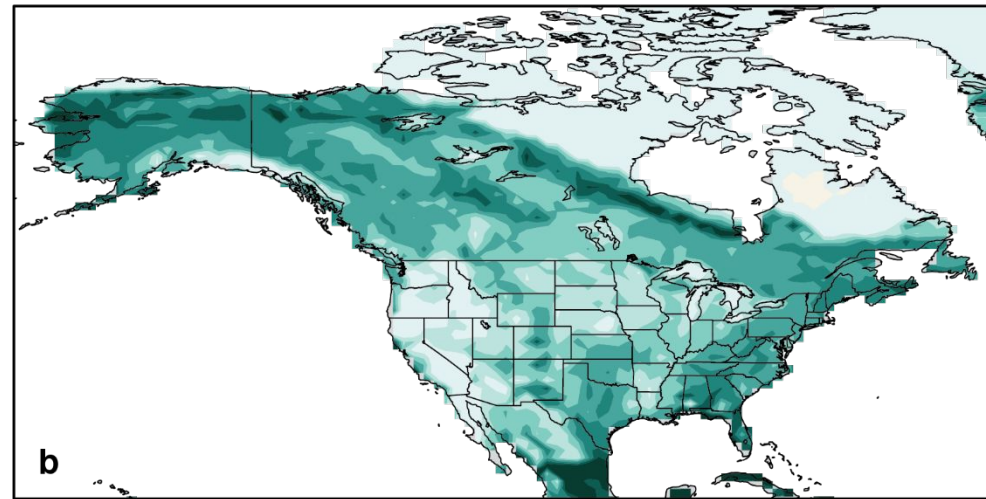
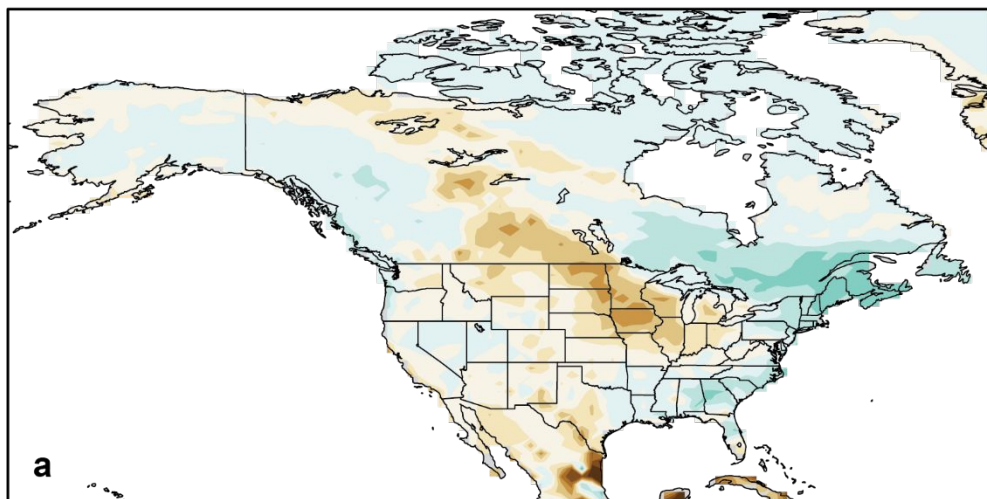
Statistical distribution of GPP trends







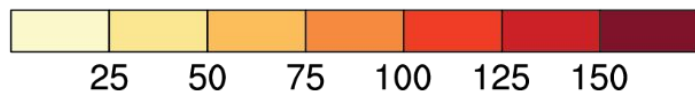
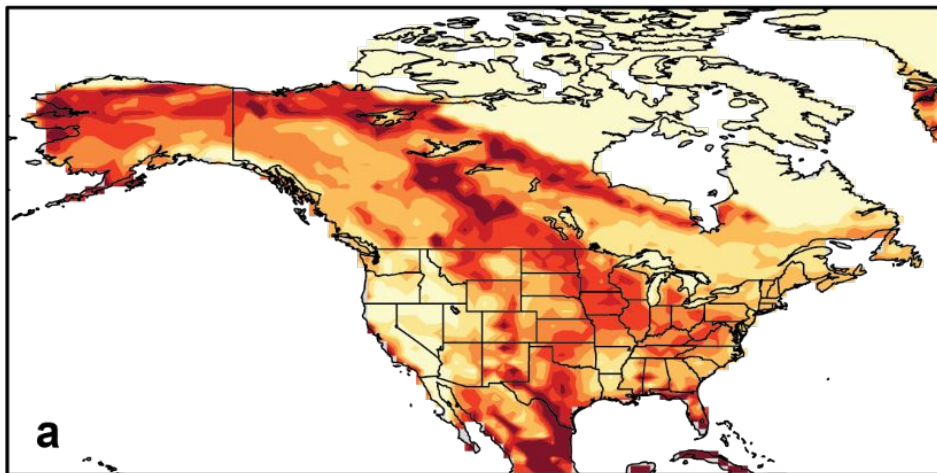
95% confidence interval of trend



95% CI: range of trends ($n = 48$) after excluding the smallest and largest trends for each grid cell

95% confidence interval of trend

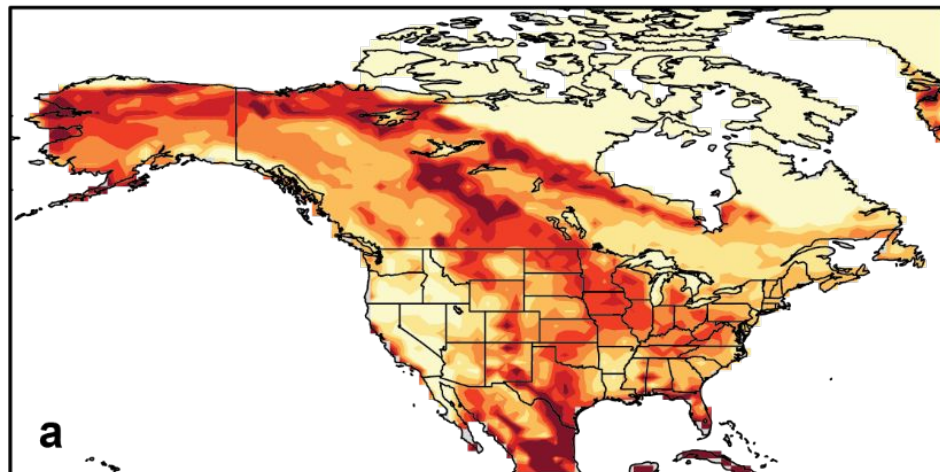
Full ensemble



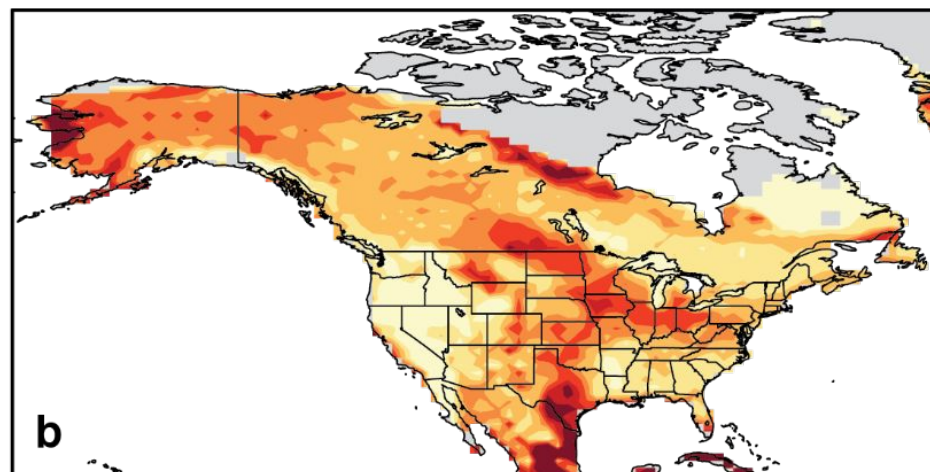
95% confidence interval (g C m⁻² yr⁻¹ per 10 years)

95% confidence interval of trend

Full ensemble



Ensemble member 1251.013

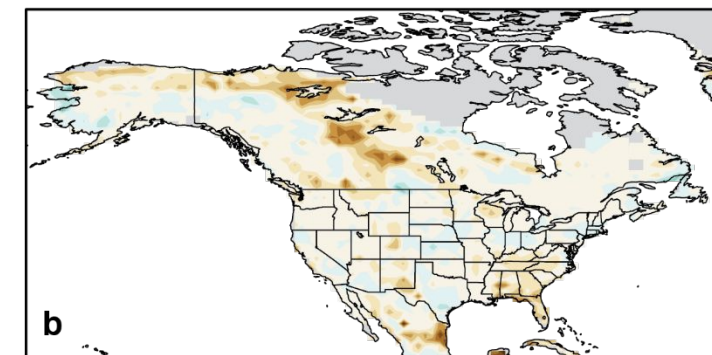


95% CI obtained from linear regression ($b_1 \pm 2.048 * s.e.$) for ensemble member 1251.013

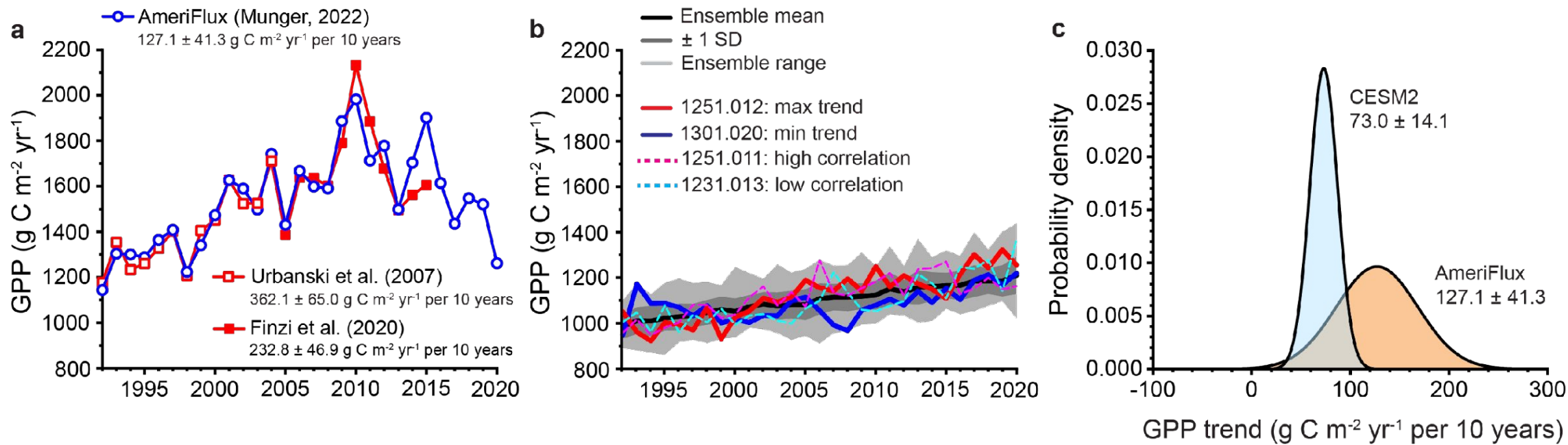


95% confidence interval ($\text{g C m}^{-2} \text{ yr}^{-1}$ per 10 years)

The standard error of the regression slope (from a single ensemble member) estimates the spread across all ensemble members

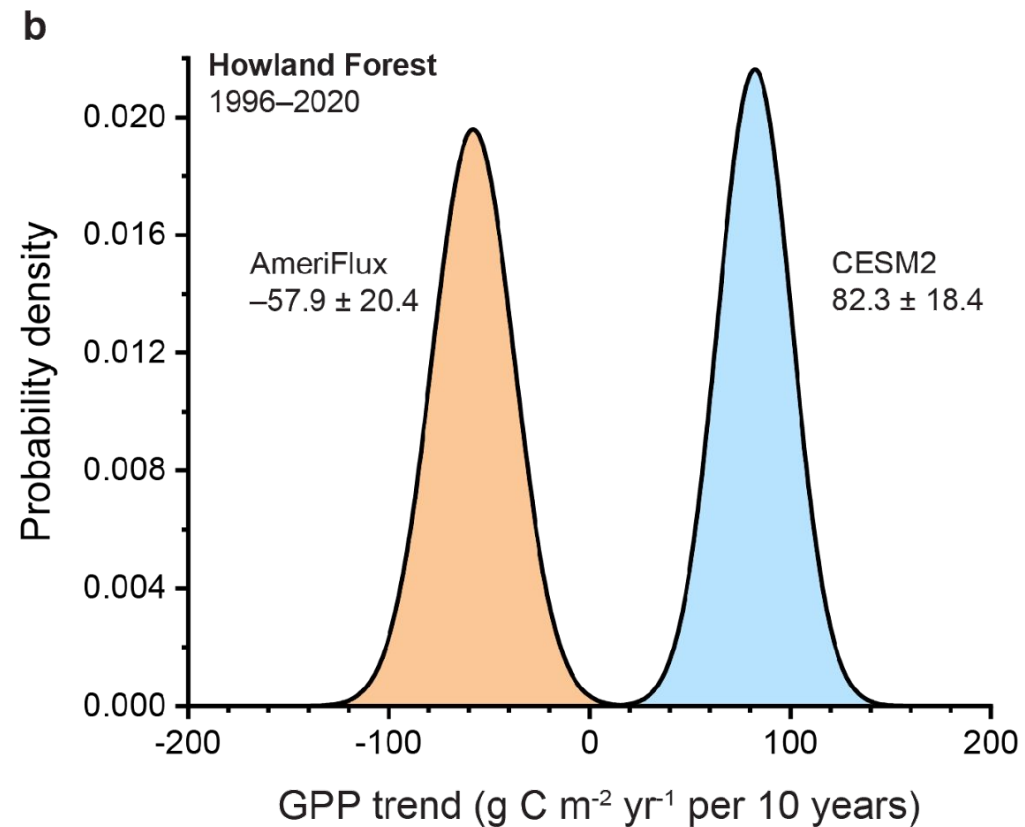
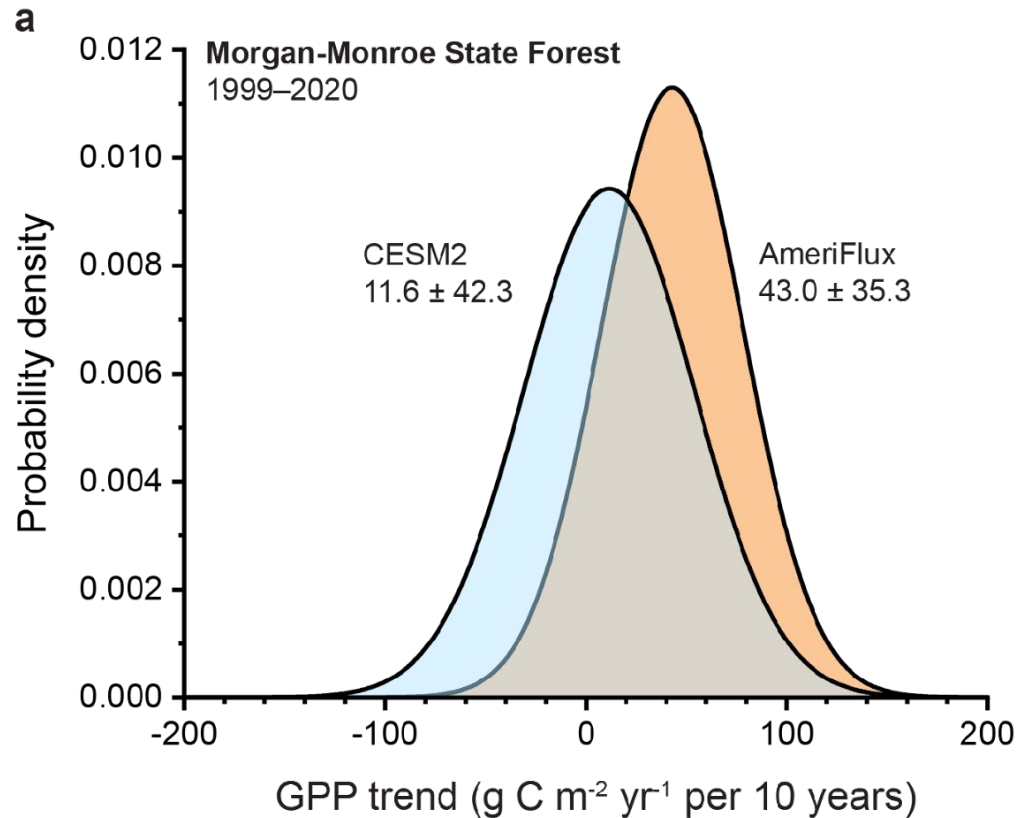


How do observations compare with models?

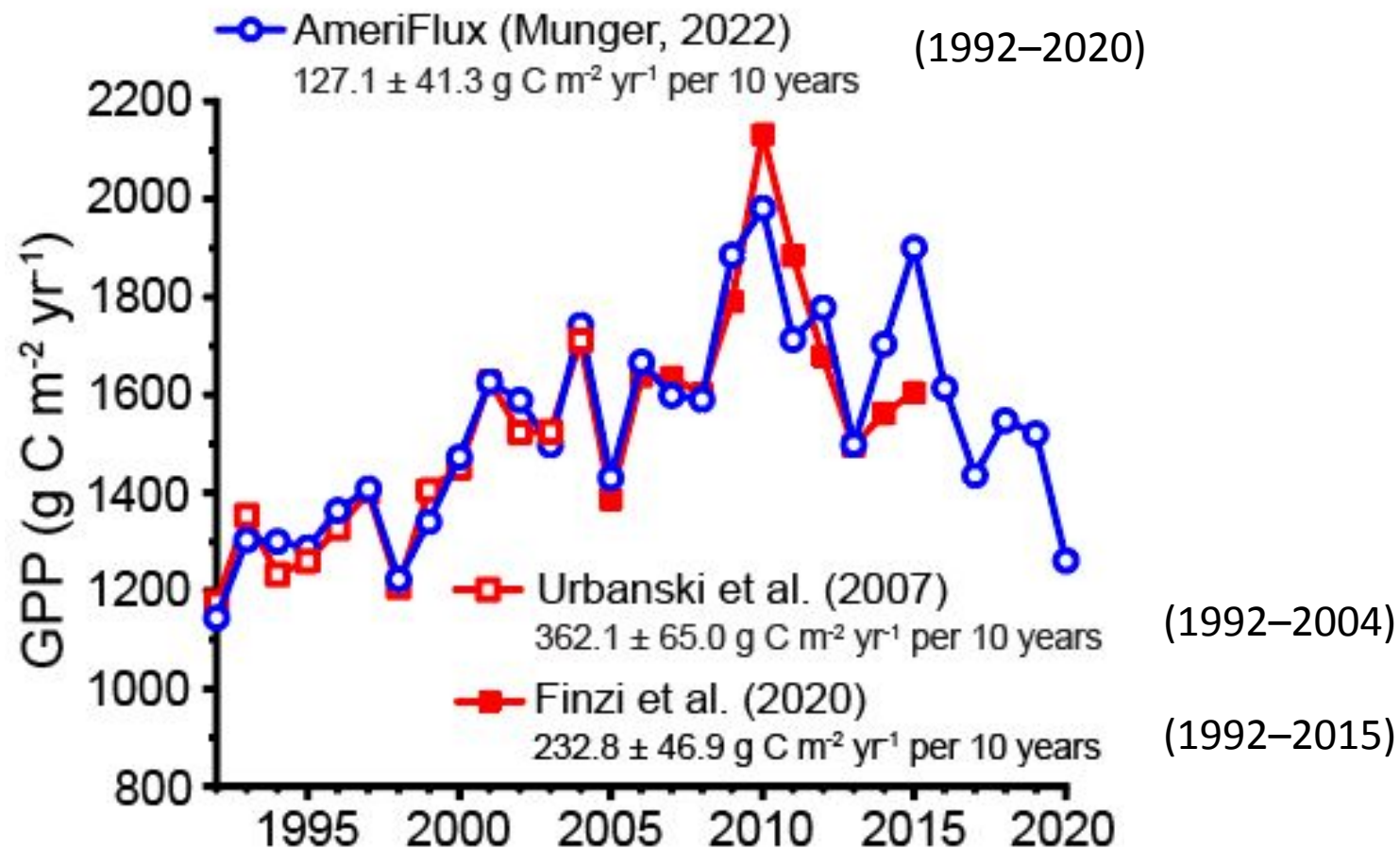


- CLM5 is biased low in terms of absolute GPP but has a trend that is not dissimilar to the observations
- The internal variability of CESM2 ($14.1 \text{ g C m}^{-2} \text{ yr}^{-1} \text{ per 10 years}$) is less than the observations (41.3)

How do observations compare with models?

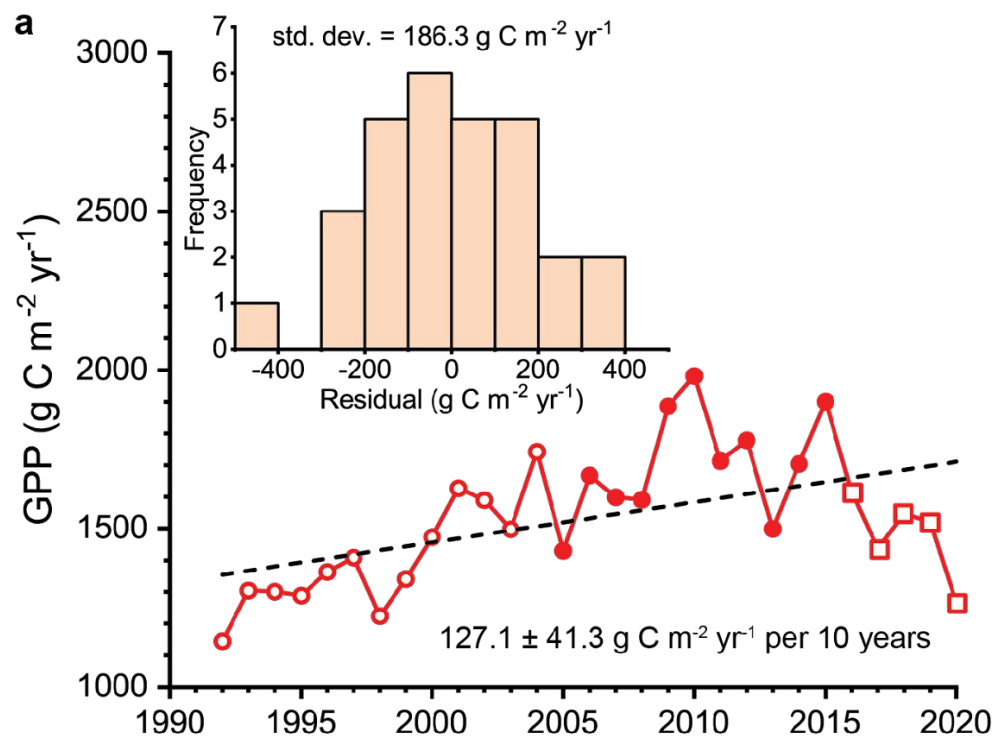


Carbon cycle trends at Harvard Forest



How does unforced variability (internal variability) affect GPP trends over the different time periods?

Conditional probability distribution of observed trends

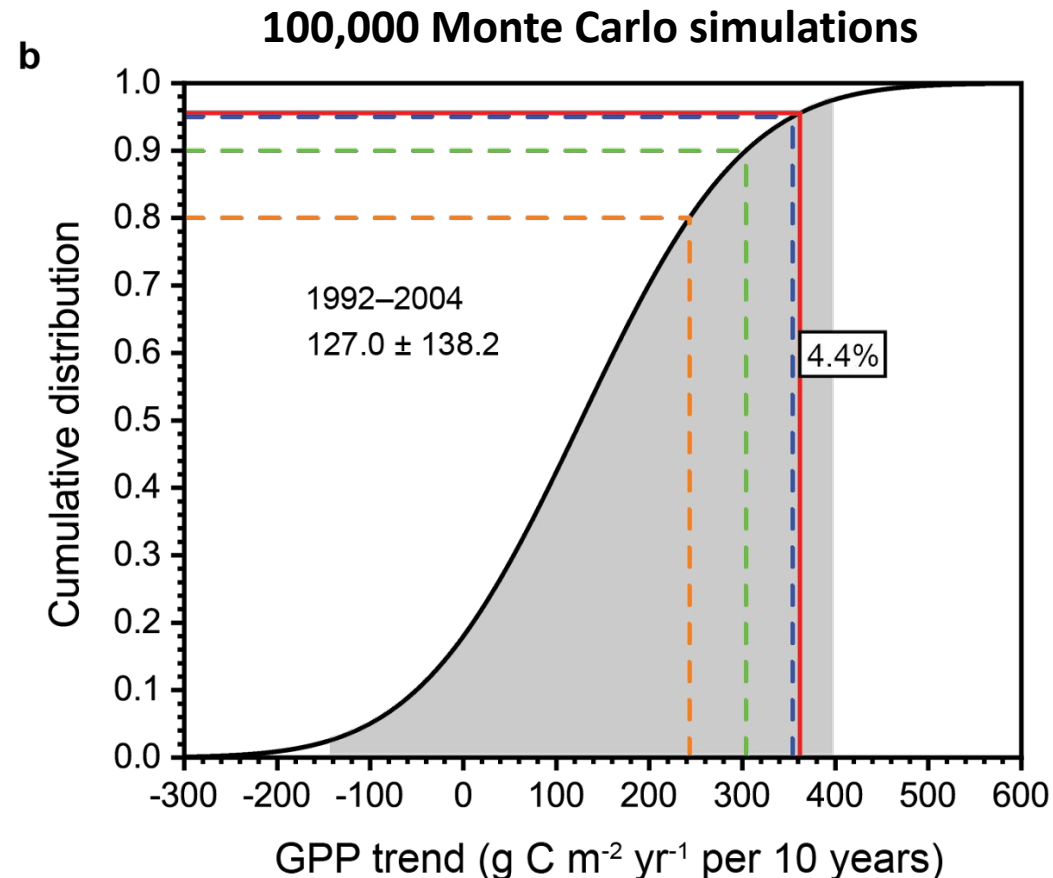
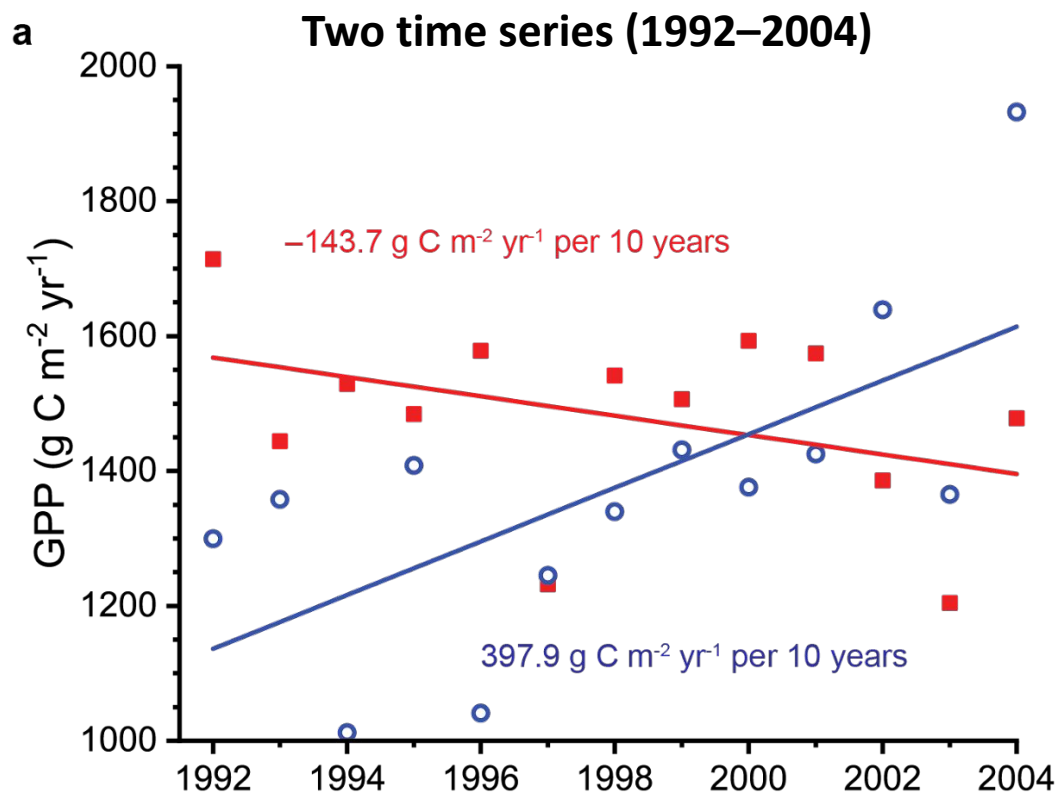


Monte Carlo simulations

If the forced trend over 1992–2020 is $127.1 \pm 41.3 \text{ g C m}^{-2} \text{ yr}^{-1}$ per 10 years, what is the probability of attaining a trend of 362.1 when sampled over 1992–2004 and 232.8 when sampled over 1992–2015?

GPP for each year 1992–2004 and 1992–2015 is chosen as a random deviate about the 1992–2020 forced trend

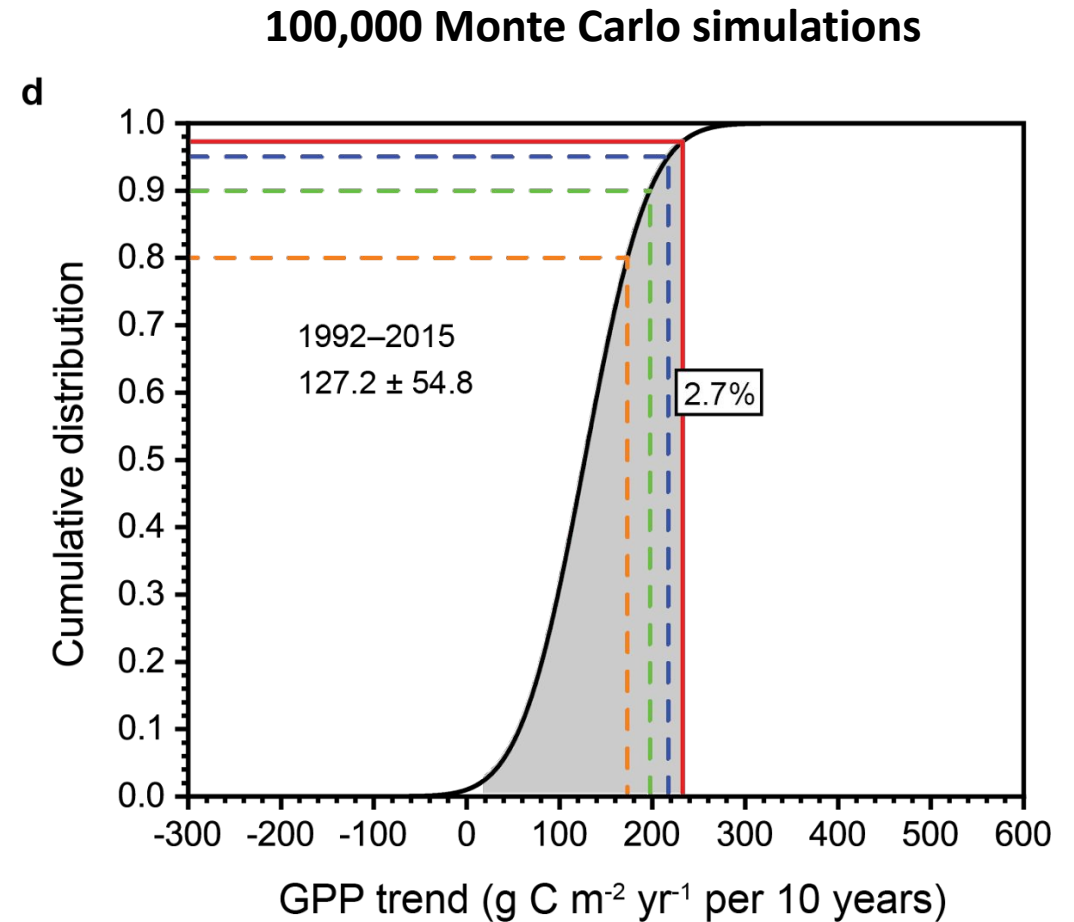
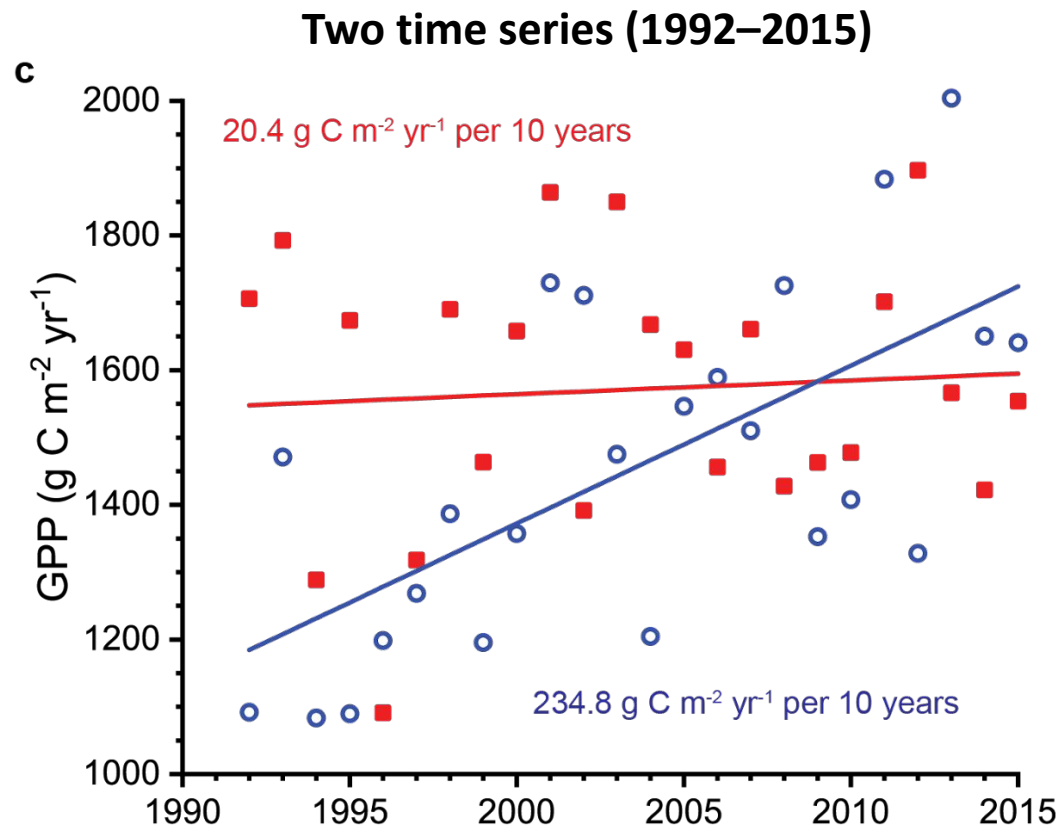
1992–2004



If the forced trend is $127.1 \text{ g C m}^{-2} \text{ yr}^{-1}$ per 10 years:

- 95% CI for 1992–2004 is -144 to $398 \text{ g C m}^{-2} \text{ yr}^{-1}$ per 10 years
- 4.4% chance that a trend equals or exceeds the observed trend (362.1)

1992–2015



If the forced trend is 127.1 $\text{g C m}^{-2} \text{ yr}^{-1}$ per 10 years:

- 95% CI for 1992–2015 is 20 to 235 $\text{g C m}^{-2} \text{ yr}^{-1}$ per 10 years
- 2.7% chance that a trend equals or exceeds the observed trend (232.8)

Concluding thoughts

Observations

- Need a better understanding of how internal variability affects trends
- Standard error of regression trend (slope) is a measure of internal variability (i.e., not just the trend!)
- The observational record is but one realization of many possible alternatives in which the sequence of internal variability could have unfolded differently

Model development

- CLM (land-only): GPP is sensitive to climate realizations. Does model development need to use an ensemble forcing approach?
- CESM (coupled): One realization may give false positive or false negative trends. Is CESM correctly sampling internal variability?
- CMIP: Are differences due to model structure, parameters, or internal variability?
- Uncertainty reduction?