



Predominately **P**essimistic **P**lants
Populate the **P**lanet

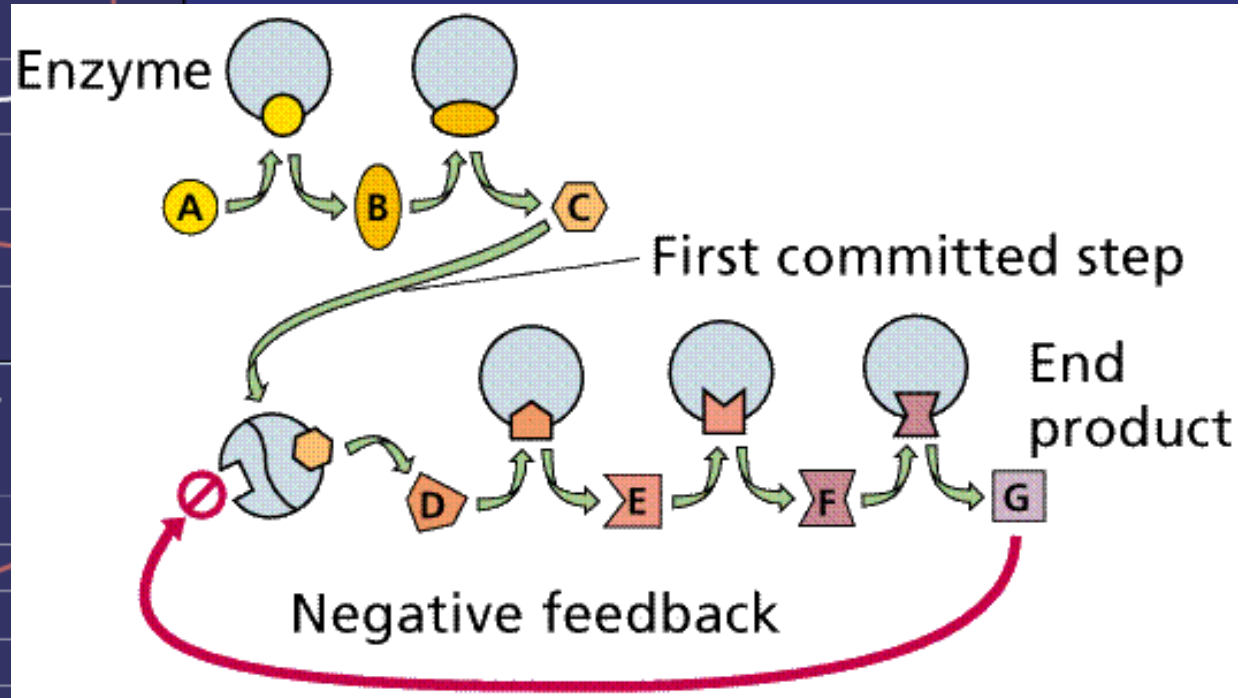
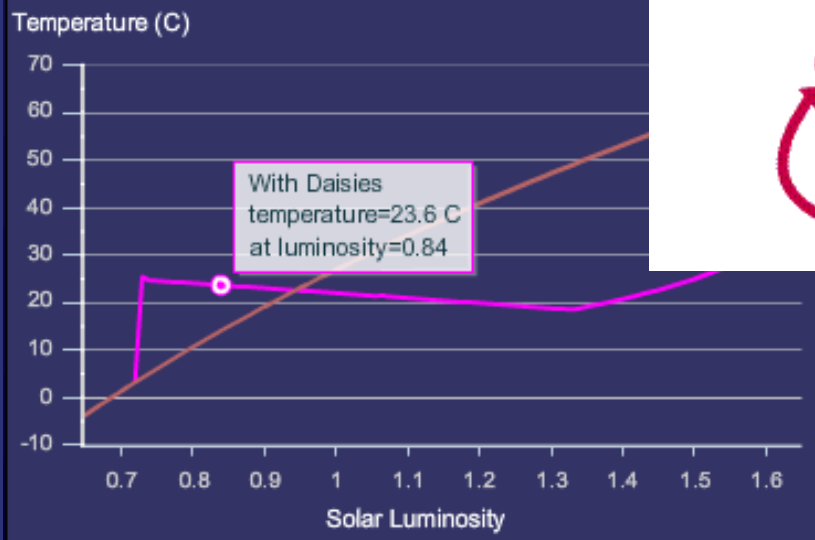
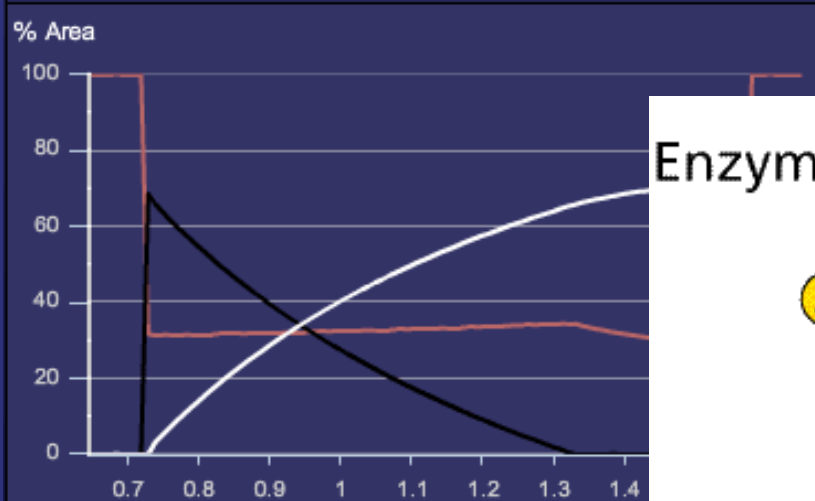
**Insights from eddy flux towers and model
experiments on regional biogeochemical-climate
feedbacks**

ANKUR DESAI, UW-MADISON, KIT IMK-IFU

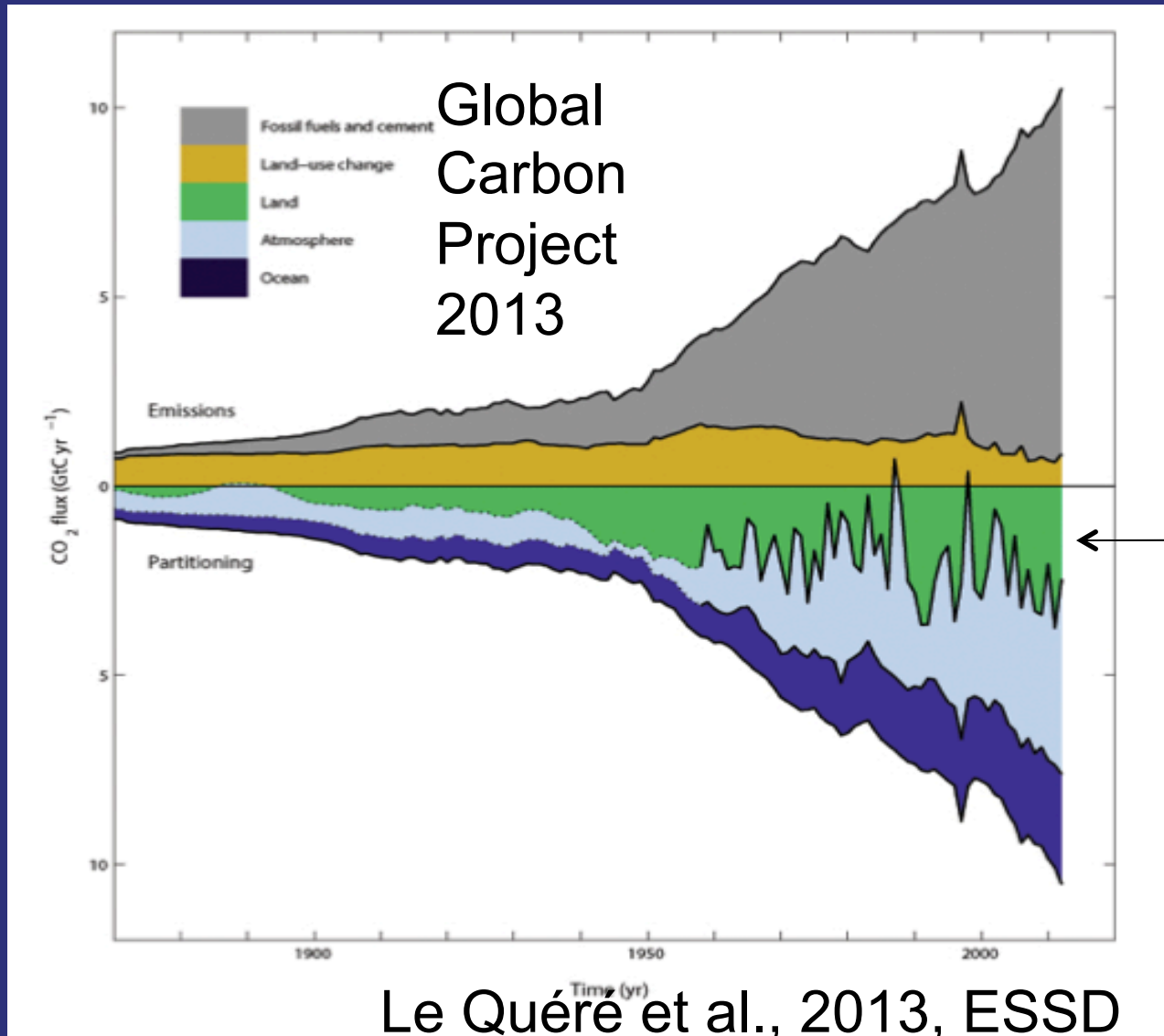
PROVACATIVE?



Negative Feedbacks

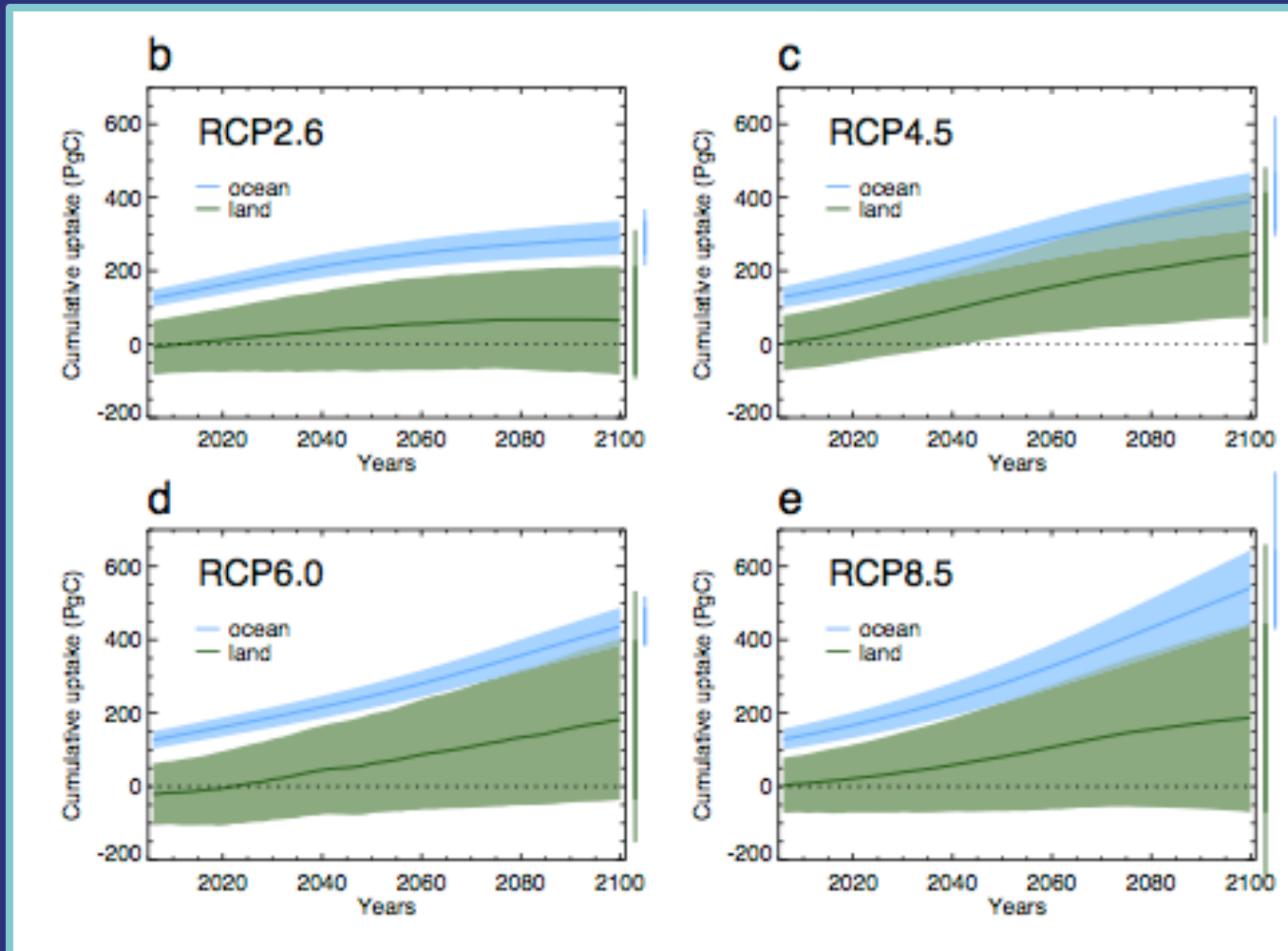


Terrestrial land sink is the largest source of variability in the atmospheric CO₂ growth rate



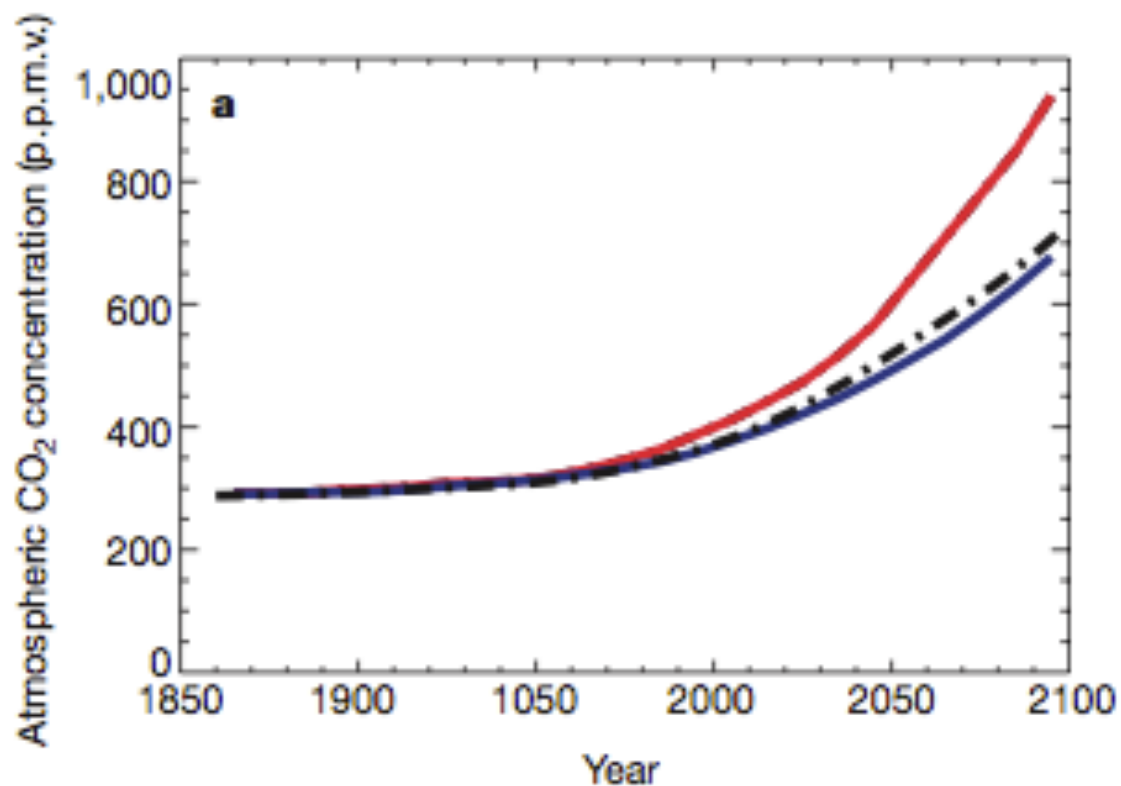
← Land

Terrestrial carbon cycle feedback is a leading order uncertainty for climate simulation

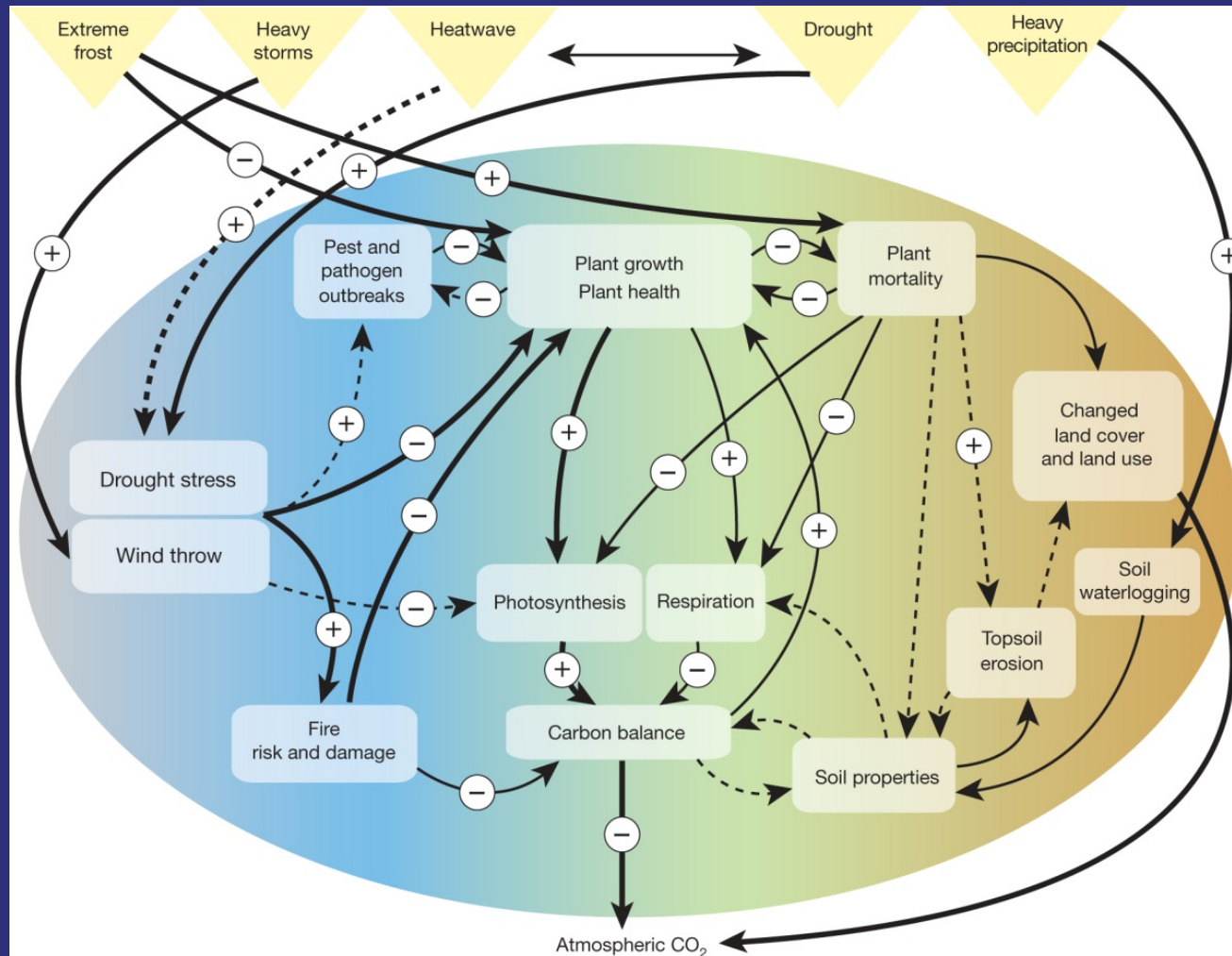


Acceleration of global warming due to carbon-cycle feedbacks in a coupled climate model

Peter M. Cox*, Richard A. Betts*, Chris D. Jones*, Steven A. Spall* & Ian J. Totterdell†



Processes and feedbacks triggered by extreme climate events?



M Reichstein *et al.* *Nature* 500, 287-295 (2013) doi:10.1038/nature12350

No one trusts a model except the one who wrote it; everyone trusts an observation except the one who made it – Harlow Shapley (by way of Matt Disney)

Willow Creek - NetCam SC IR - Thu Sep 20 11:31:17 2012

Temperature: 36.0 °C internal, 9.0 °C outside

RH: 0%, Pressure: 944.0 millibars

Exposure: 400

PROLOGUE



Who we are



Eddy covariance is mature technology



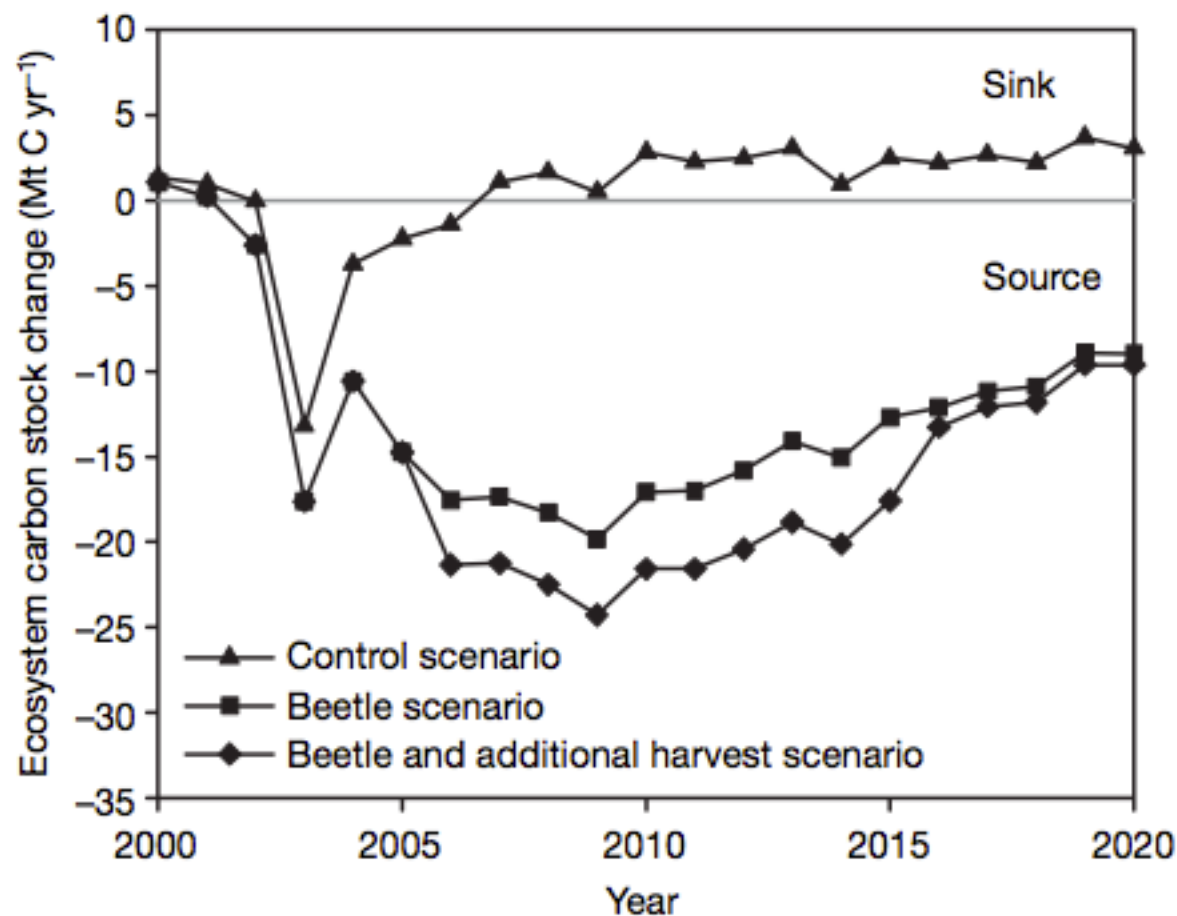
B. Cook

An aerial photograph taken from the perspective of someone looking out of an airplane window. The foreground shows the dark grey fuselage of the aircraft with several oval-shaped ventilation holes. A white, cylindrical probe or sensor extends from the fuselage towards the center of the frame. The background is a vast, mountainous landscape covered in dense green forests. The mountains recede into the distance under a sky filled with soft, white clouds. The overall scene is a high-altitude, scenic view of a natural environment.

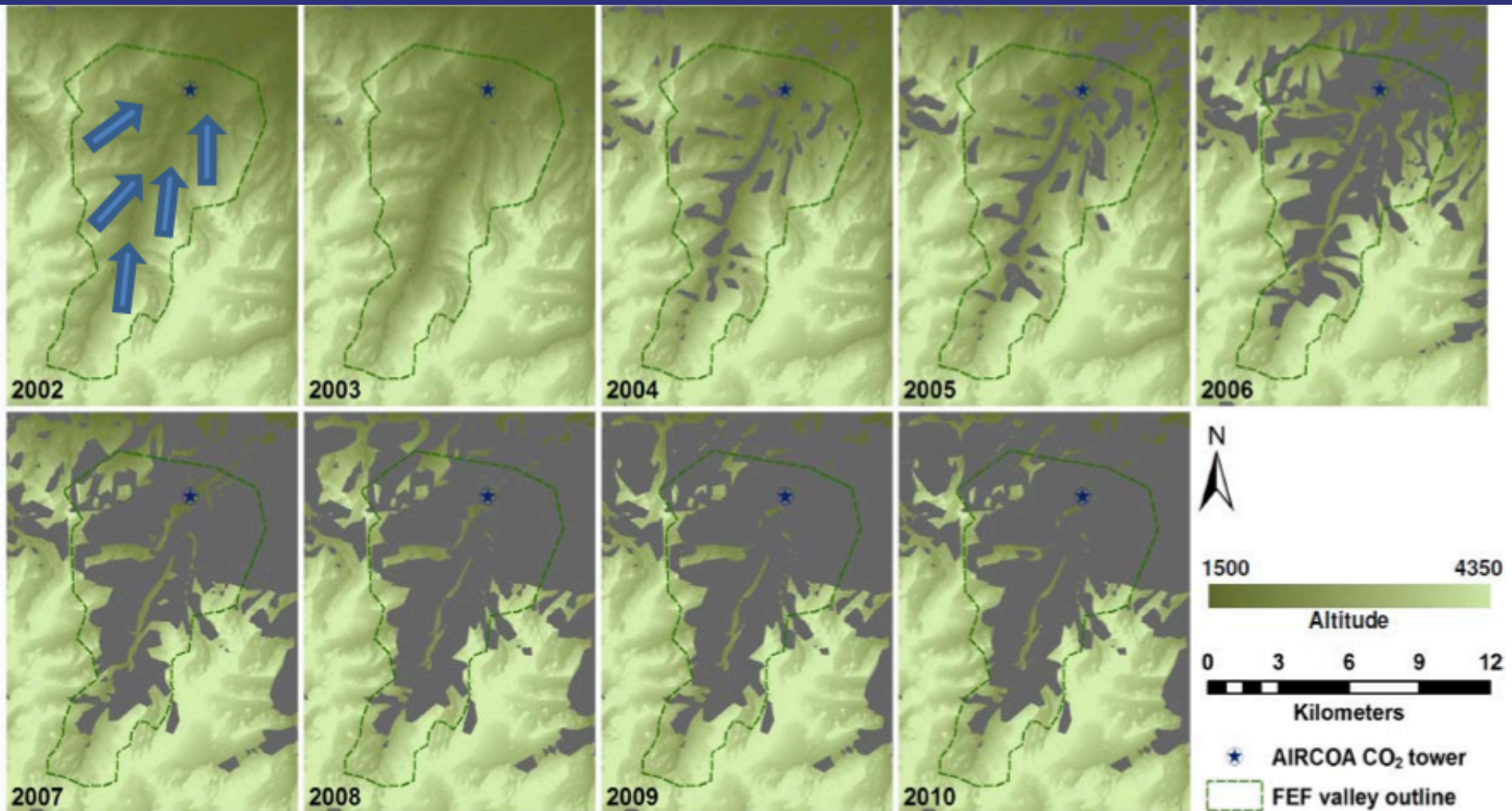
PROOF(?)

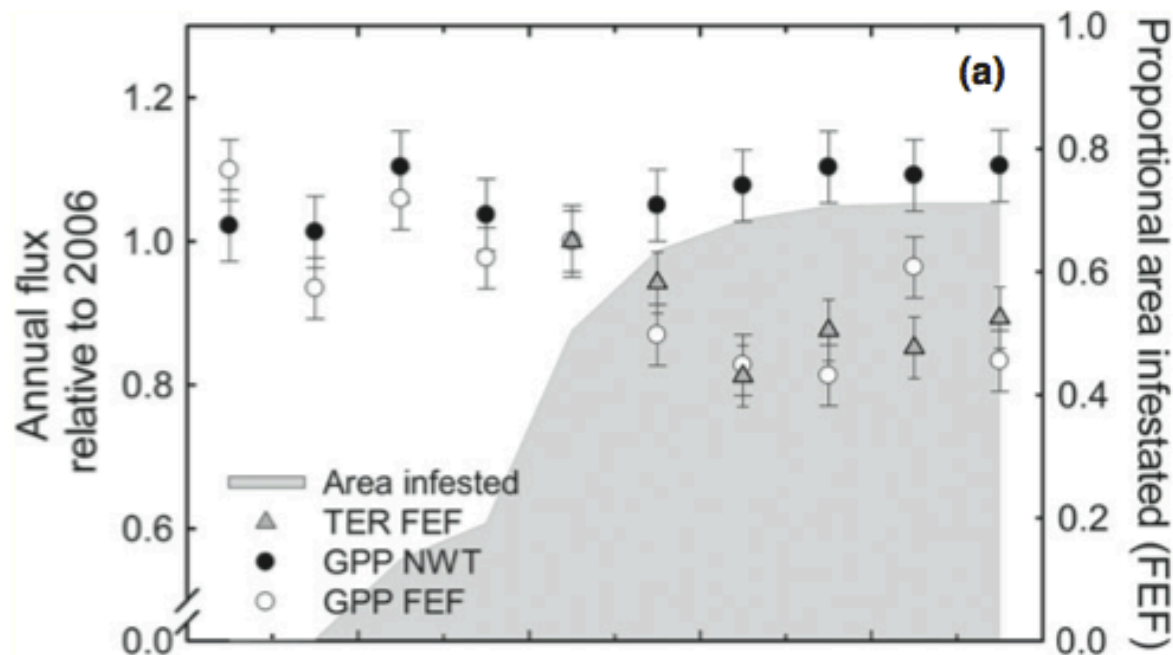
Mountain pine beetle and forest carbon feedback to climate change

W. A. Kurz¹, C. C. Dymond¹, G. Stinson¹, G. J. Rampley¹, E. T. Neilson¹, A. L. Carroll¹, T. Ebata² & L. Safranyik¹



Attack of the beetles





ECOLOGY LETTERS

Ecology Letters, (2013)

doi: 10.1111/ele.12097

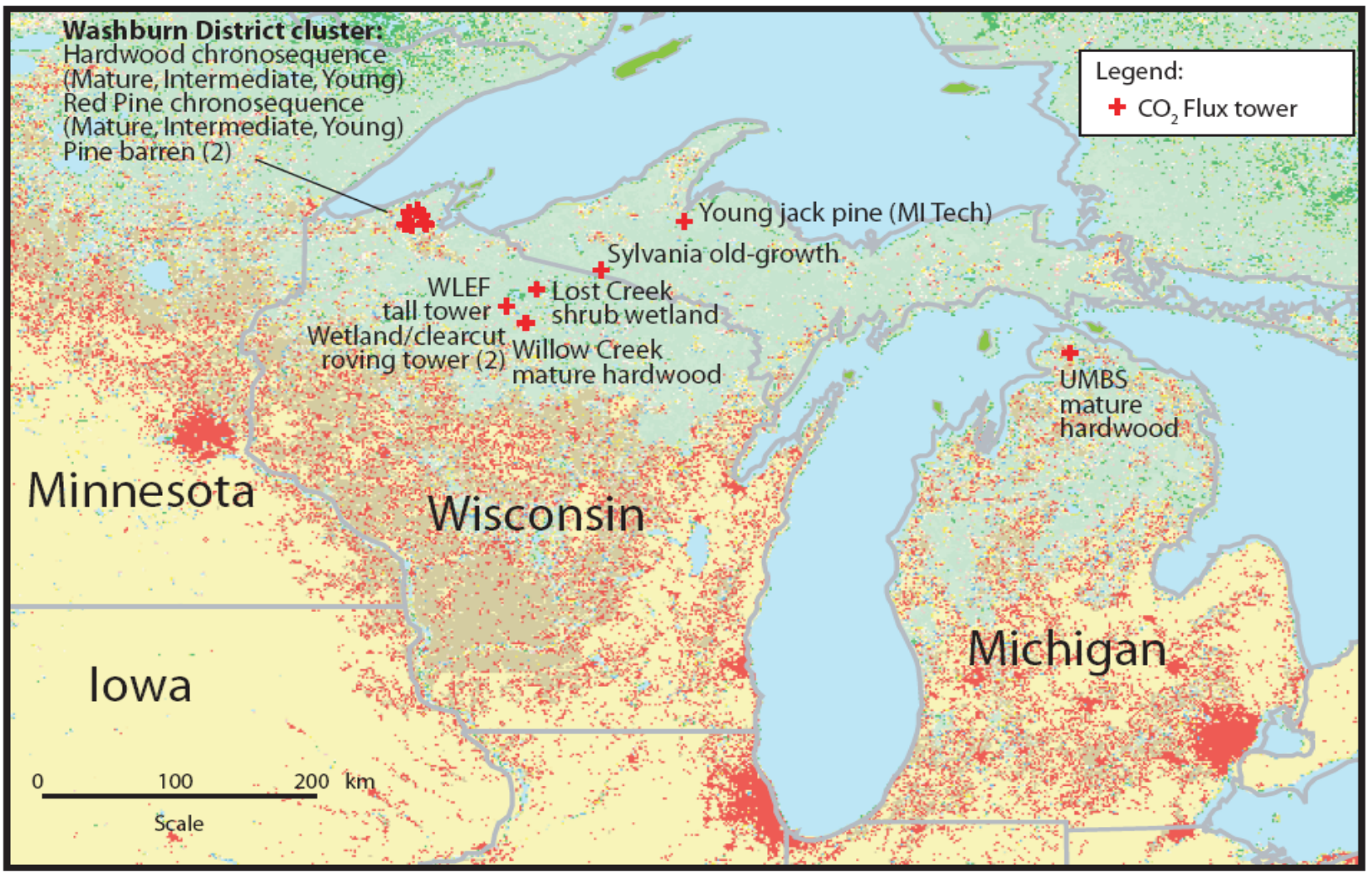
LETTER

Persistent reduced ecosystem respiration after insect disturbance in high elevation forests

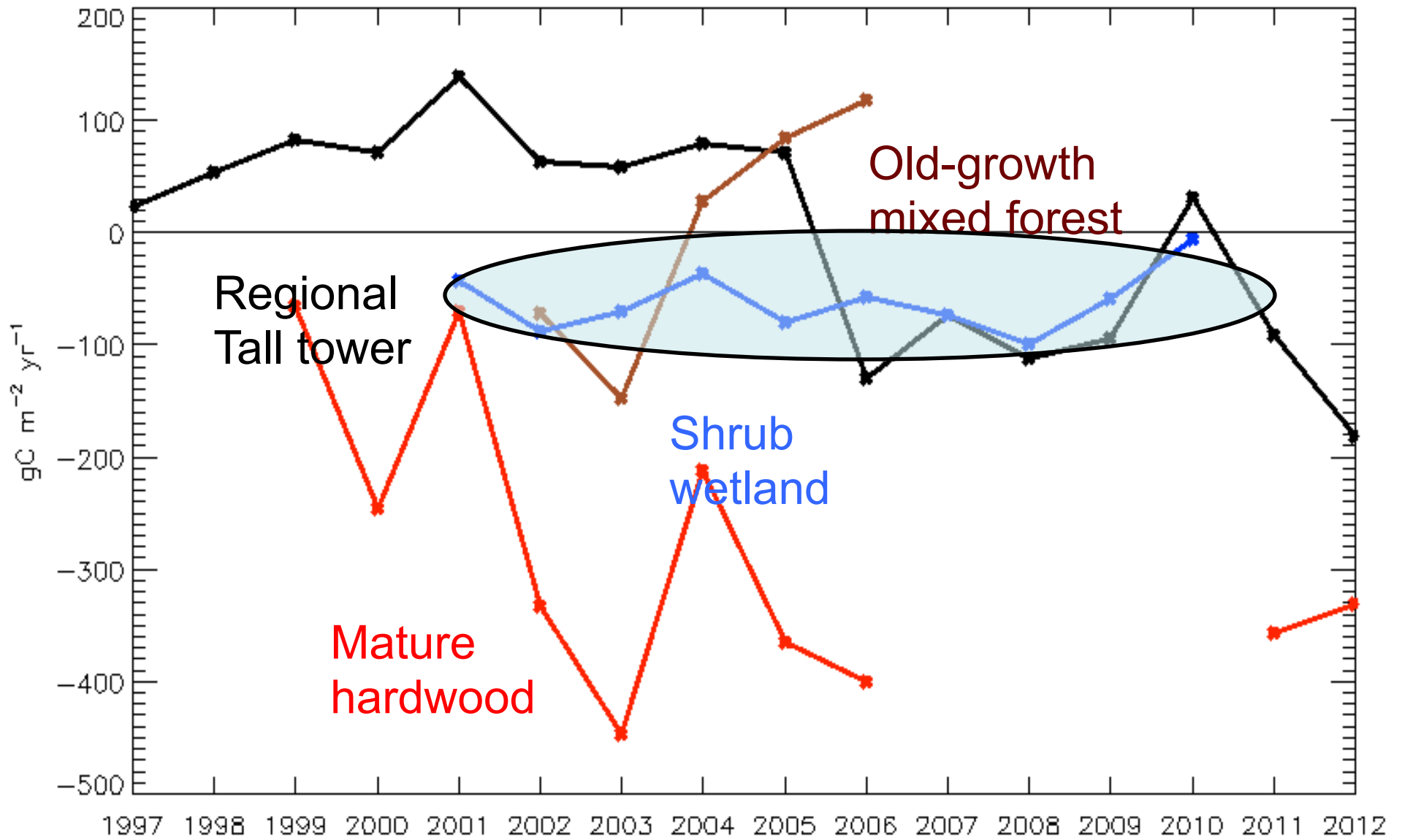
David J. P. Moore,^{1,†*} Nicole A. Trahan,^{2,†} Phil Wilkes,³ Tristan Quaife,⁴ Britton B. Stephens,⁵ Kelly Elder,⁶ Ankur R. Desai,⁷ Jose Negron⁶ and Russell K. Monson^{1,8}

Abstract

Amid a worldwide increase in tree mortality, mountain pine beetles (*Dendroctonus ponderosae* Hopkins) have led to the death of billions of trees from Mexico to Alaska since 2000. This is predicted to have important carbon, water and energy balance feedbacks on the Earth system. Counter to current projections, we show that on a decadal scale, tree mortality causes no increase in ecosystem respiration from scales of several square metres up to an 84 km² valley. Rather, we found comparable declines in both gross primary productivity and respiration suggesting little change in net flux, with a transitory recovery of respiration 6–7 years after mortality associated with increased incorporation of leaf litter C into soil organic matter, followed by further decline in years 8–10. The mechanism of the impact of tree mortality caused by these biotic disturbances is consistent with reduced input rather than increased output of carbon.

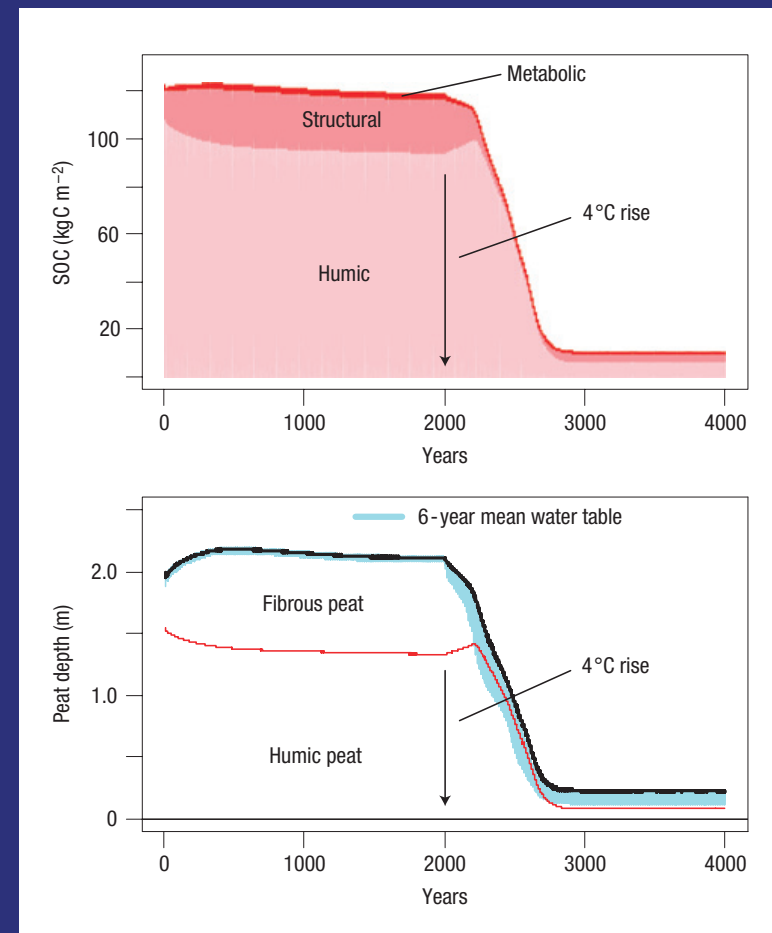


Annual NEE



Peatland carbon is vulnerable to climate and hydrological change

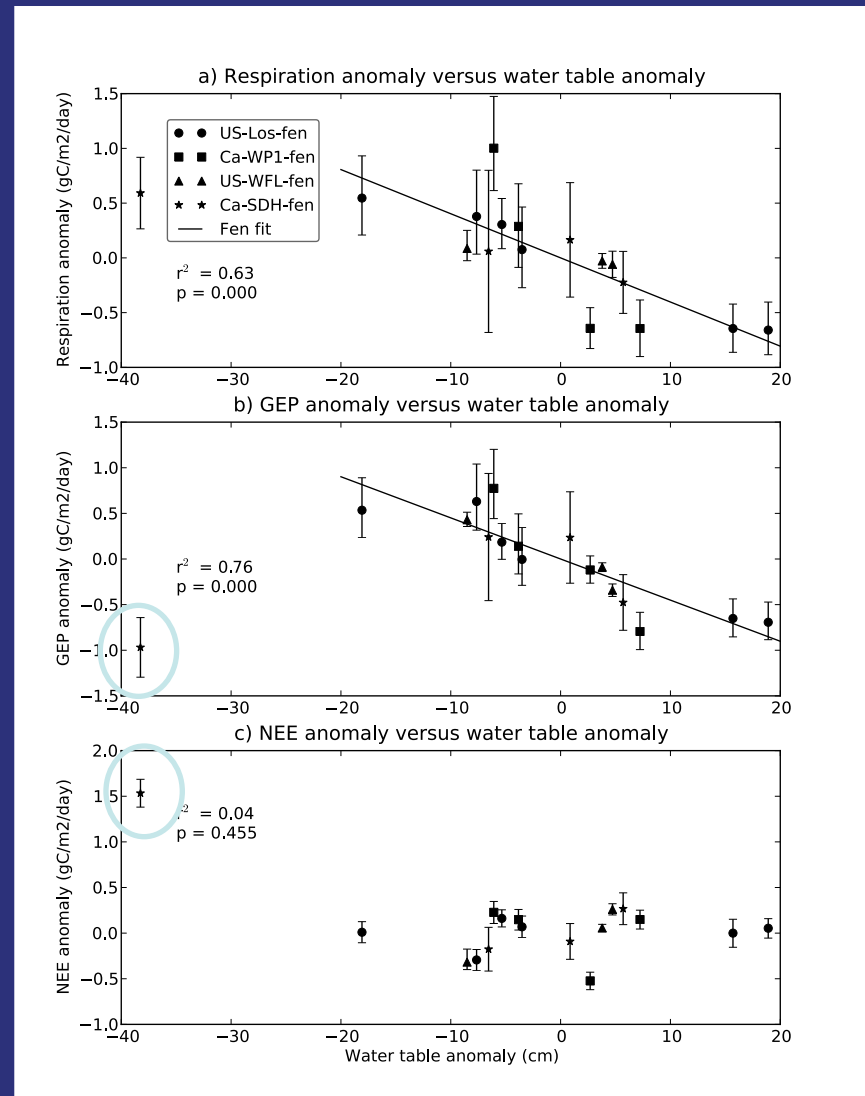
- Peat carbon is preserved by cool temperatures and flooded conditions
- Warming and drying can disrupt the process and lead to carbon loss



Ise et al 2008

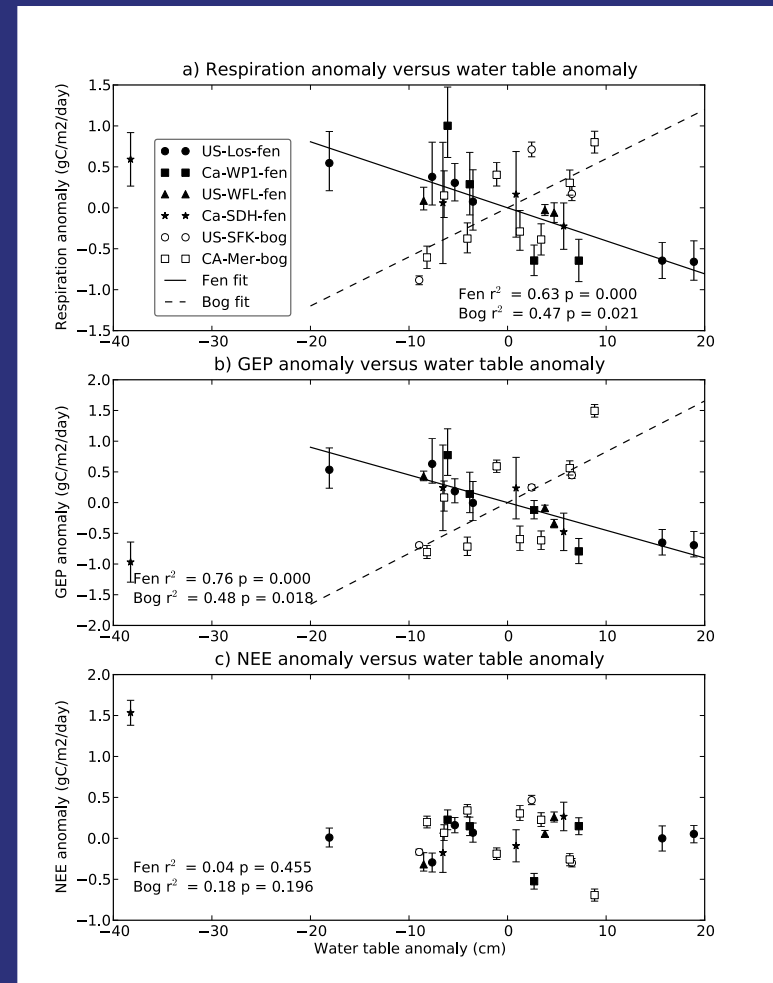
Hydrological effects in four fens

- Eddy-covariance summer carbon flux anomaly vs. water table anomaly for four northern fen sites
- Both ER and GEP increase with deeper water tables (long time scales)
- Drying over short time scale can lead to reduction in GEP and net CO₂ emission
- **NEE has no significant correlation with water table**



Contrasting effects in bogs:

- Bog C fluxes (white symbols) have lower magnitude and opposite sign correlation with water table
- Once again, no correlation of NEE with water table

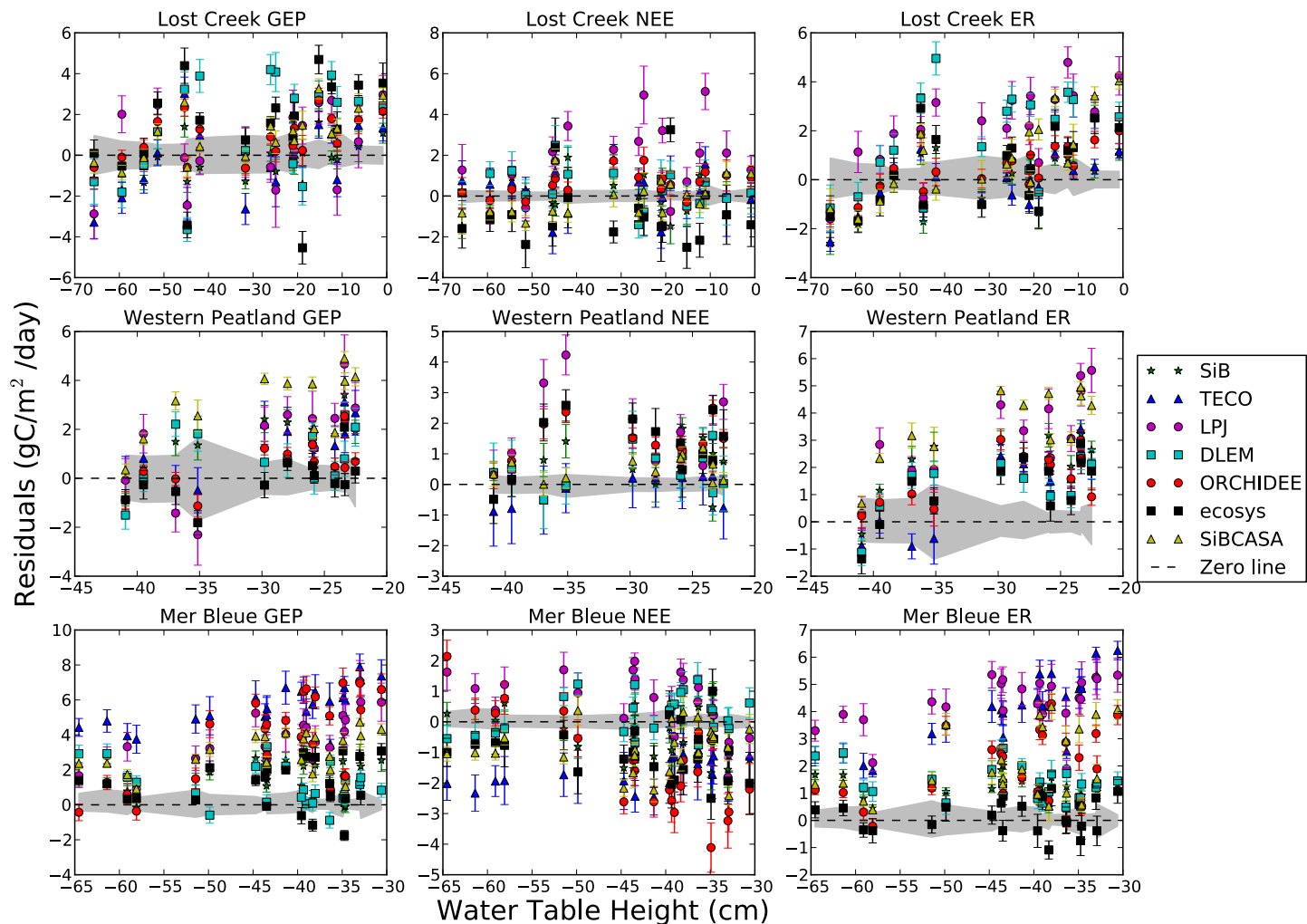


How well did models simulate peatland processes?

Model name	Temporal resolution	Soil layers	Soil C pools	N cycle	Max soil moisture
DLEM	Daily	2	3	Yes	Saturation
Ecosys	Hourly	8	9	Yes	Saturation (with water table)
LPJ	Daily	2	2	No	Field capacity
ORCHIDEE	30-min	2	8	No	Field capacity
SiB	30-min	10	None	No	Saturation
SiBCASA	30-min	25	9	No	Saturation
TECO	30-min	10	5	No	Saturation

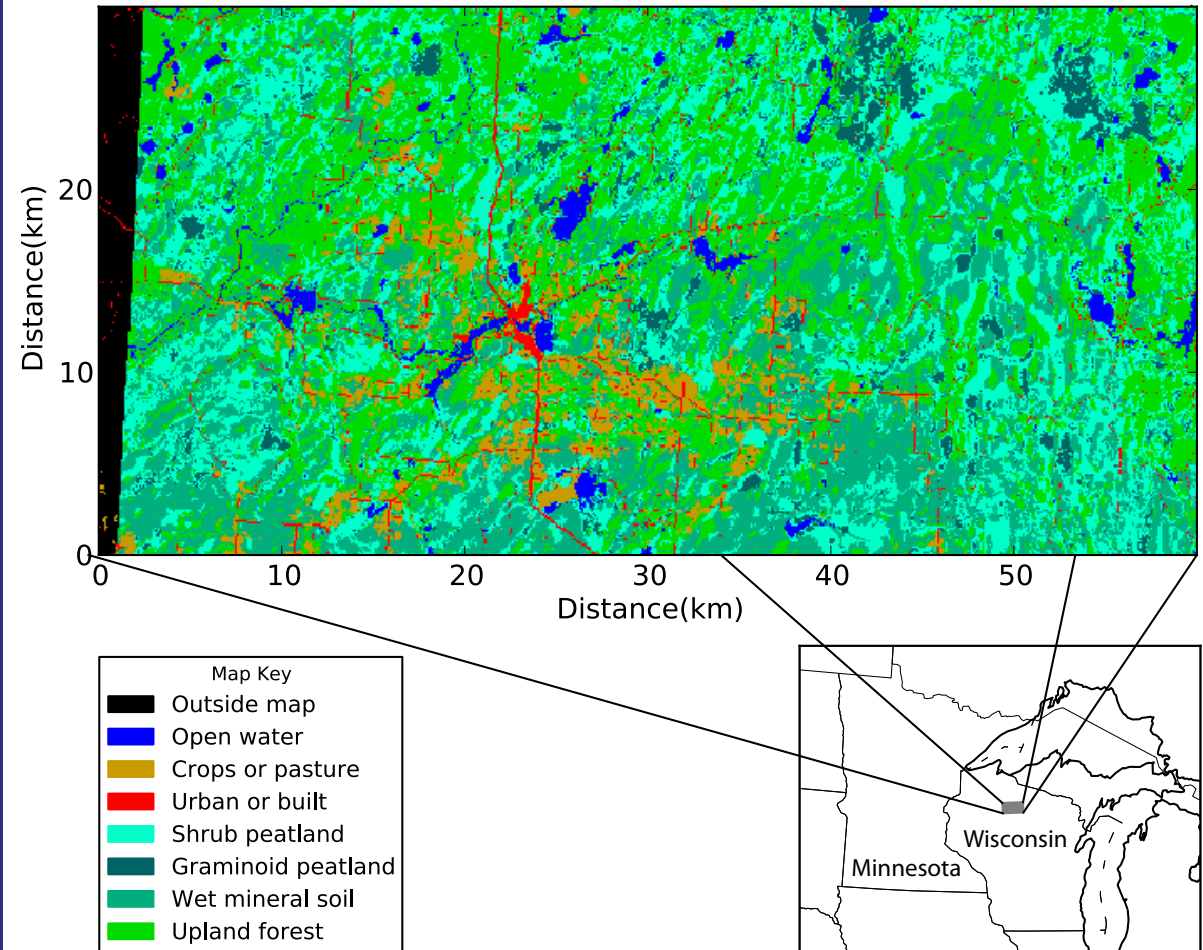
Sulman et al., JGR-G, 2011

Monthly residuals were correlated with observed water table



Maybe longer term?

Ecoregion	Active area fraction
Upland	38%
Mineral wetland	27%
Shrub peat	29%
Graminoid peat	5%



LANDIS-II model

Sulman et al., Ecosystems, 2013

Water table effects on carbon balance

Peatlands:

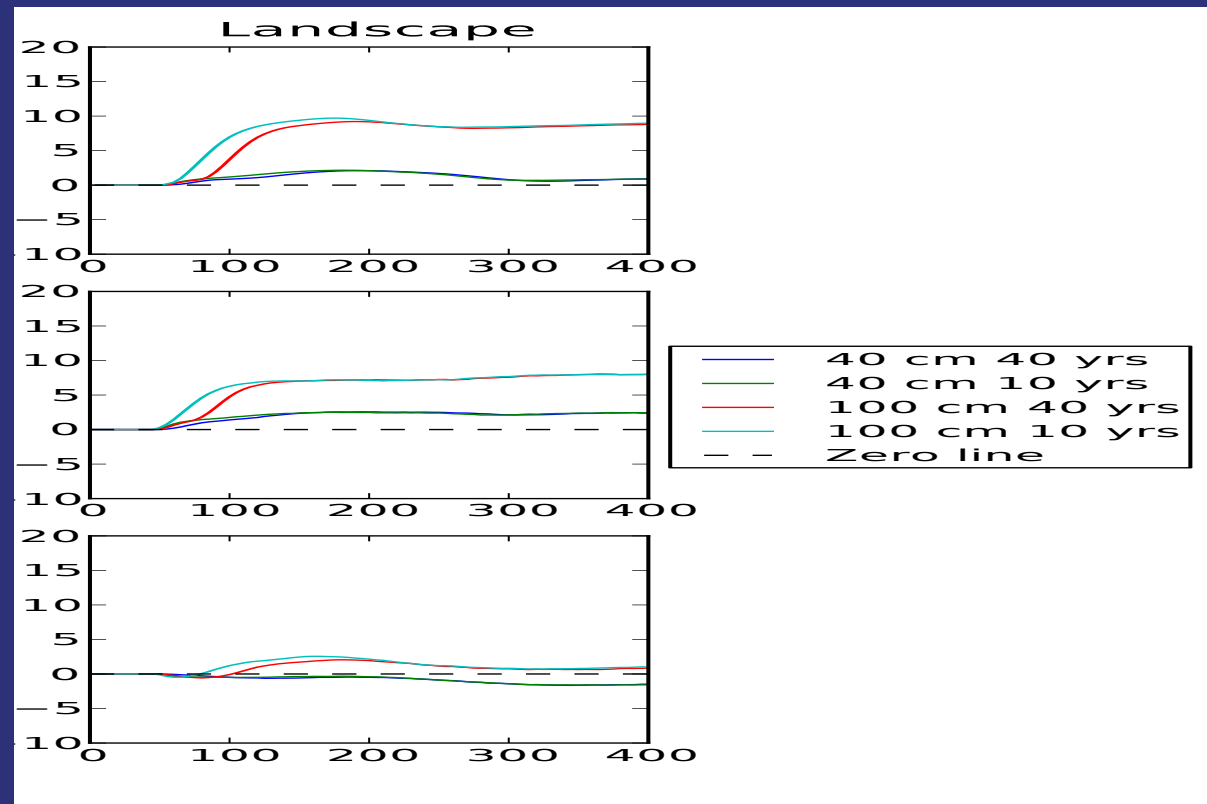
- 100 cm declines:
 - Short term: C gain
 - Long term: C loss
- 40 cm declines
 - Short term: C neutral
 - Long term: C loss

Mineral wetlands:

- C gain for both

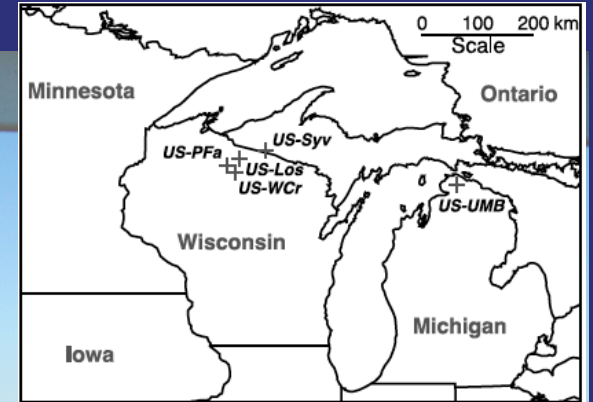
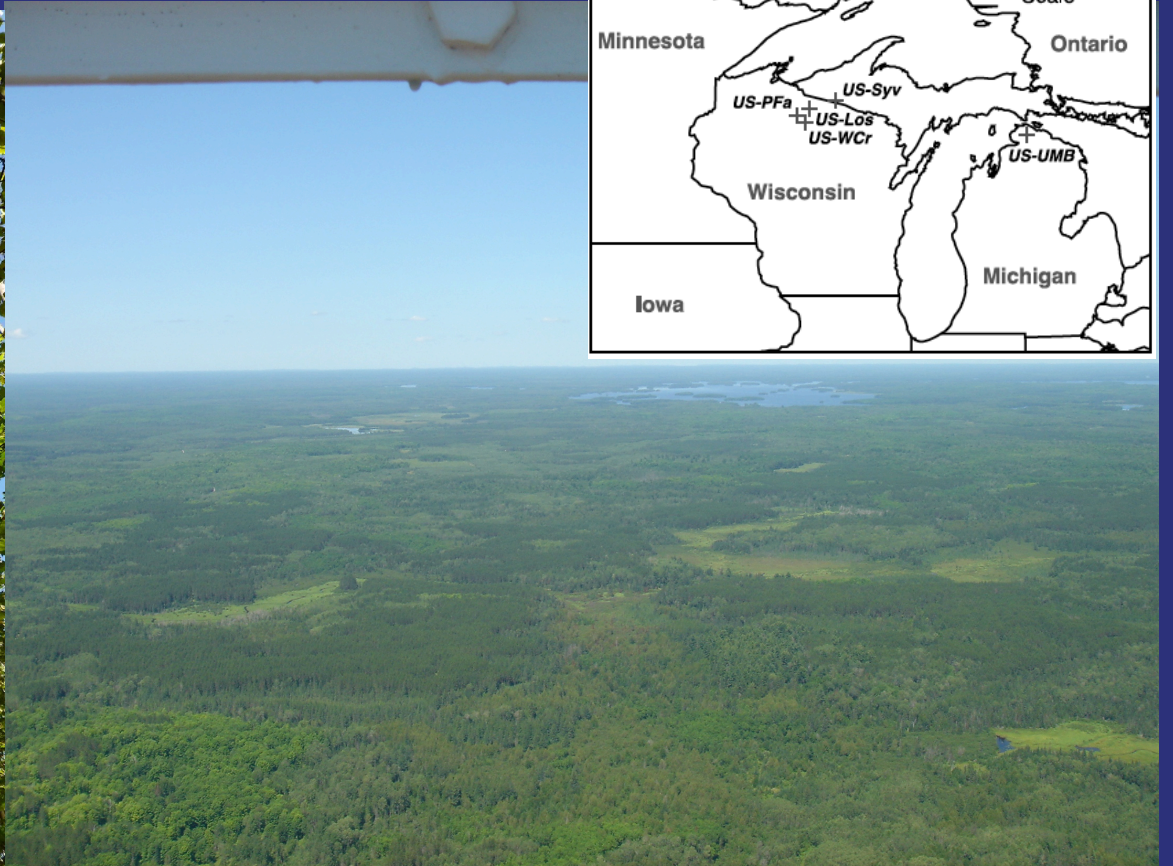
Whole landscape

- Short-term: C increase
- Long-term: C steady
- Time scale of decline made little difference

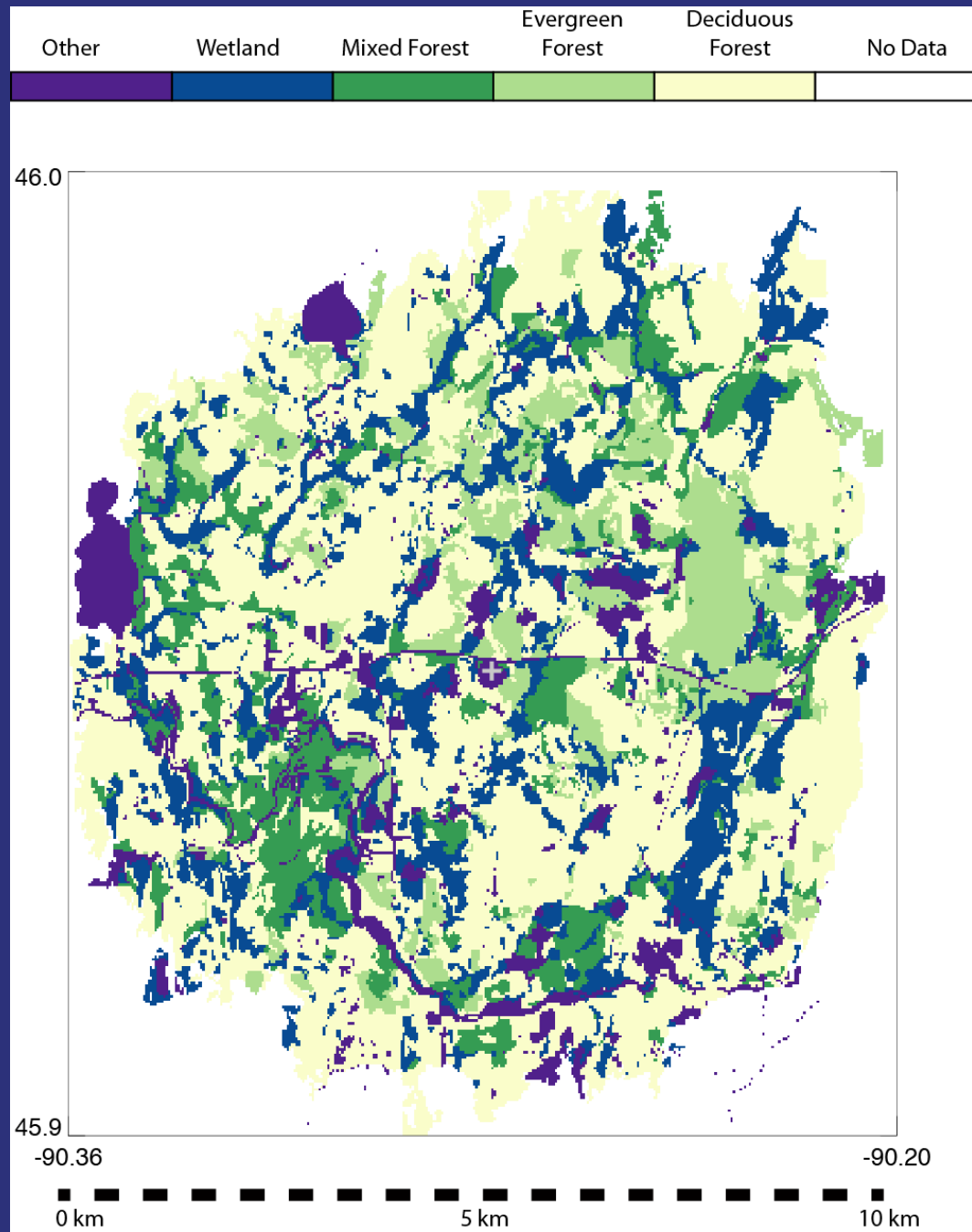


Net change from control run for shallow peat simulations: Different water table scenarios

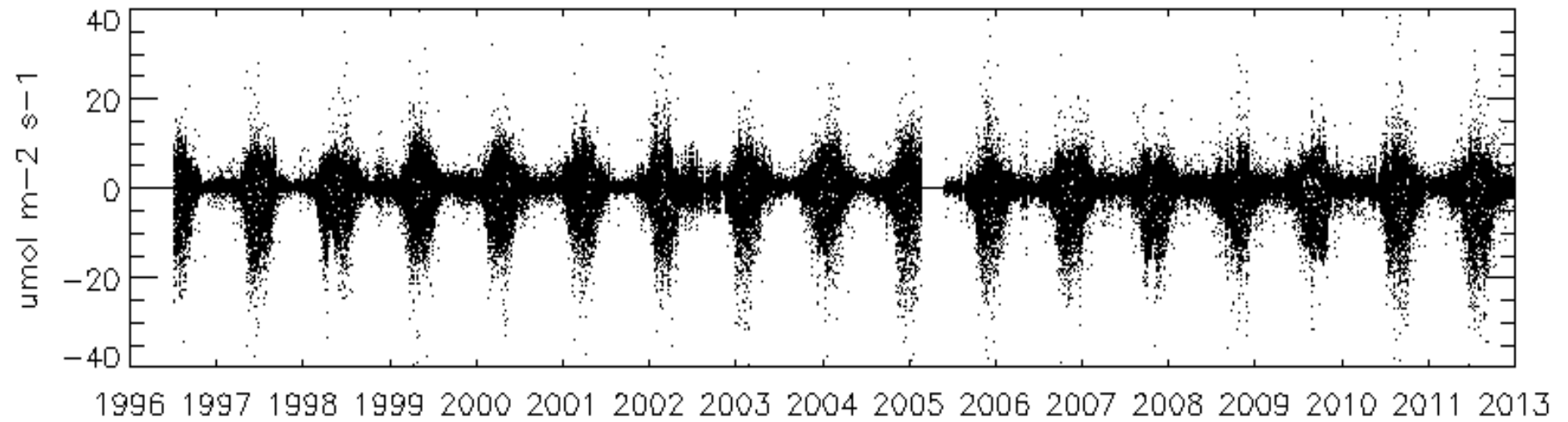
A very tall tower!



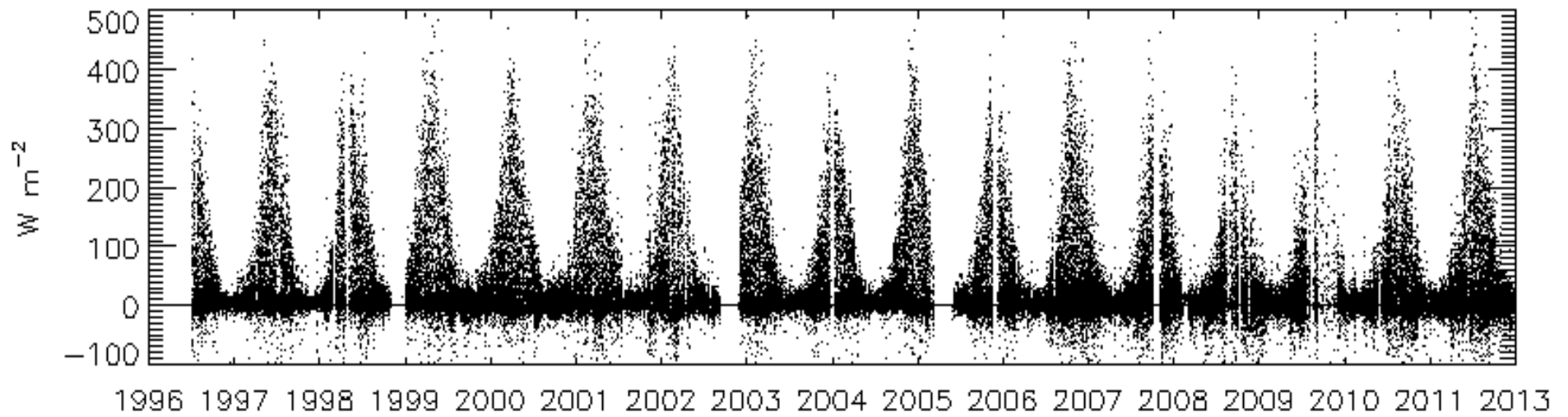
Desai, A.R., 2014. Influence and predictive capacity of climate anomalies on daily to decadal extremes in canopy photosynthesis. *Photosynthesis Research*, 119, 31-47, doi:10.1007/s11120-013-9925-z.



NEE of CO₂

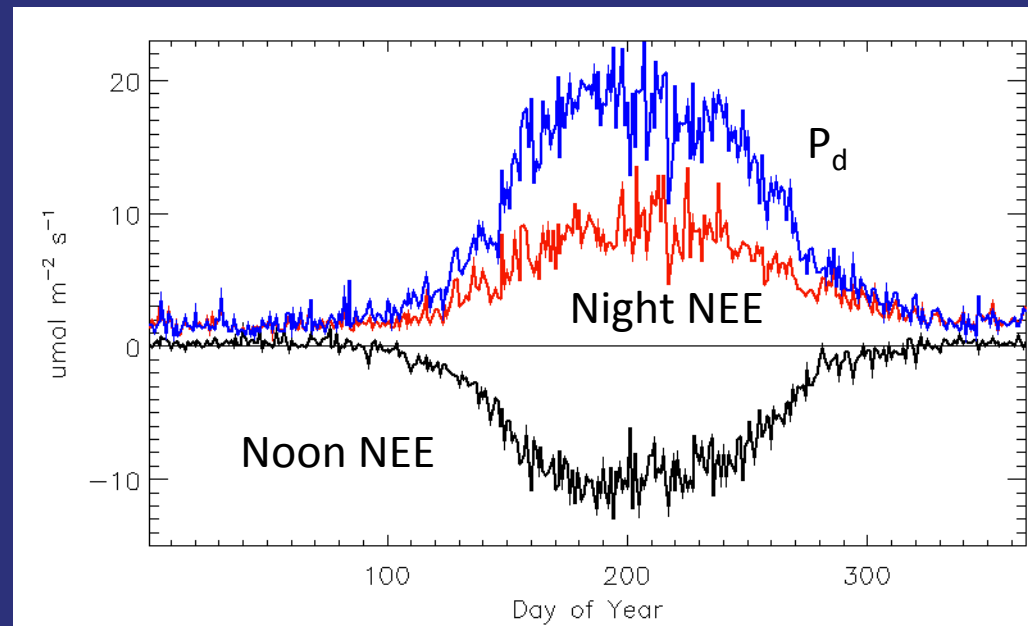


Latent Heat Flux



From NEE to Productivity

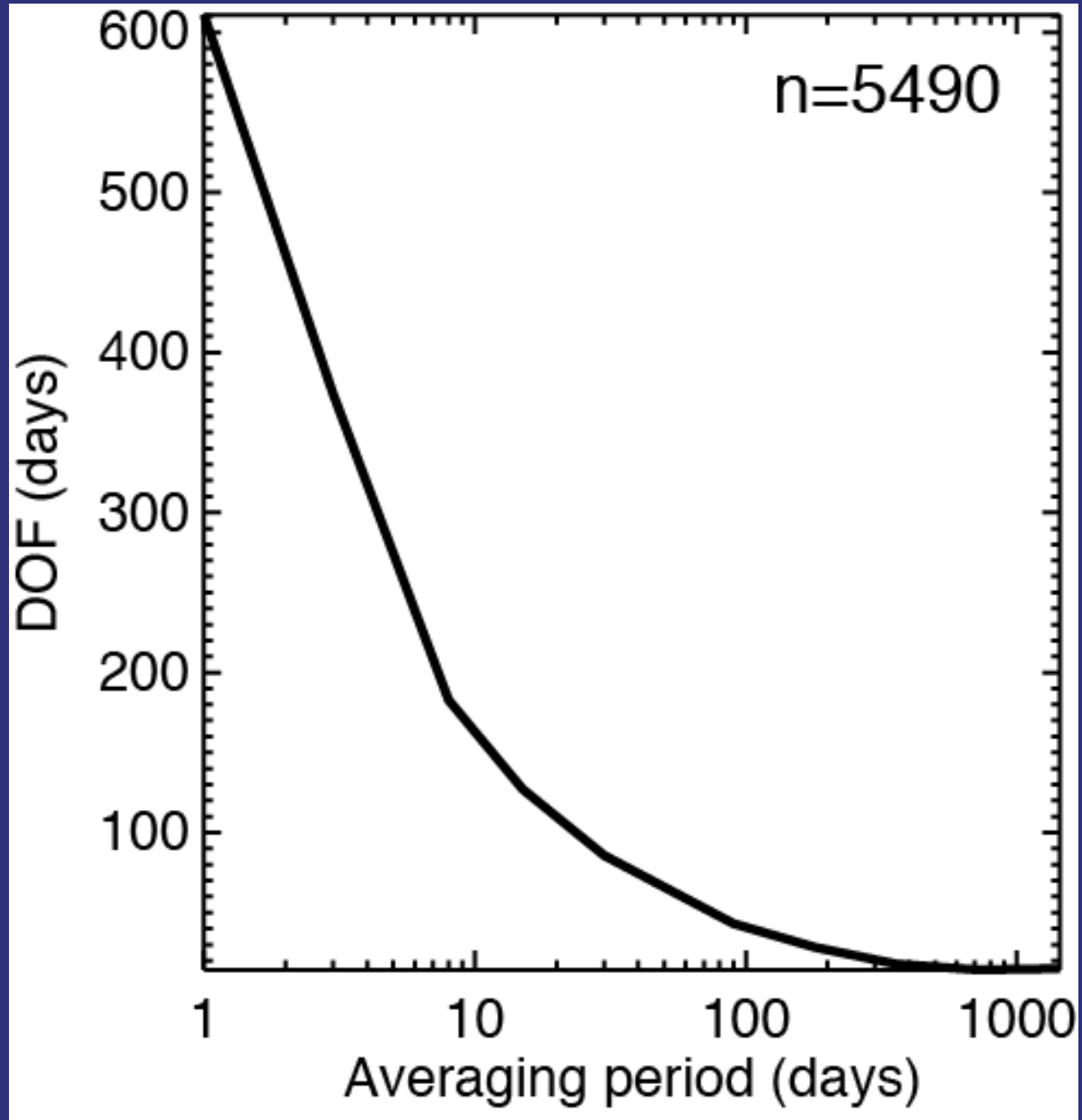
- Flux tower derived GPP is sensitive to model selection and gaps (Desai *et al.*, 2008)
- INSTEAD: Use a data-based approach
 - $P_d = \text{Max nighttime observed NEE} - \text{Mean noon (10-14) NEE}$
 - Reject noon NEE is > 50% gap-filled



Problem

- Every flux tower based correlation is significant when you have thousands to tens of thousands of datapoints
 - Effect sizes may be small, though
- Account for autocorrelation using “reduced degrees of freedom” metric!

$$N_* = \frac{N}{\sum_{t=N/2}^N \left[\left(1 - \frac{t}{N} \right) \rho_t^X \rho_t^Y \right]}$$

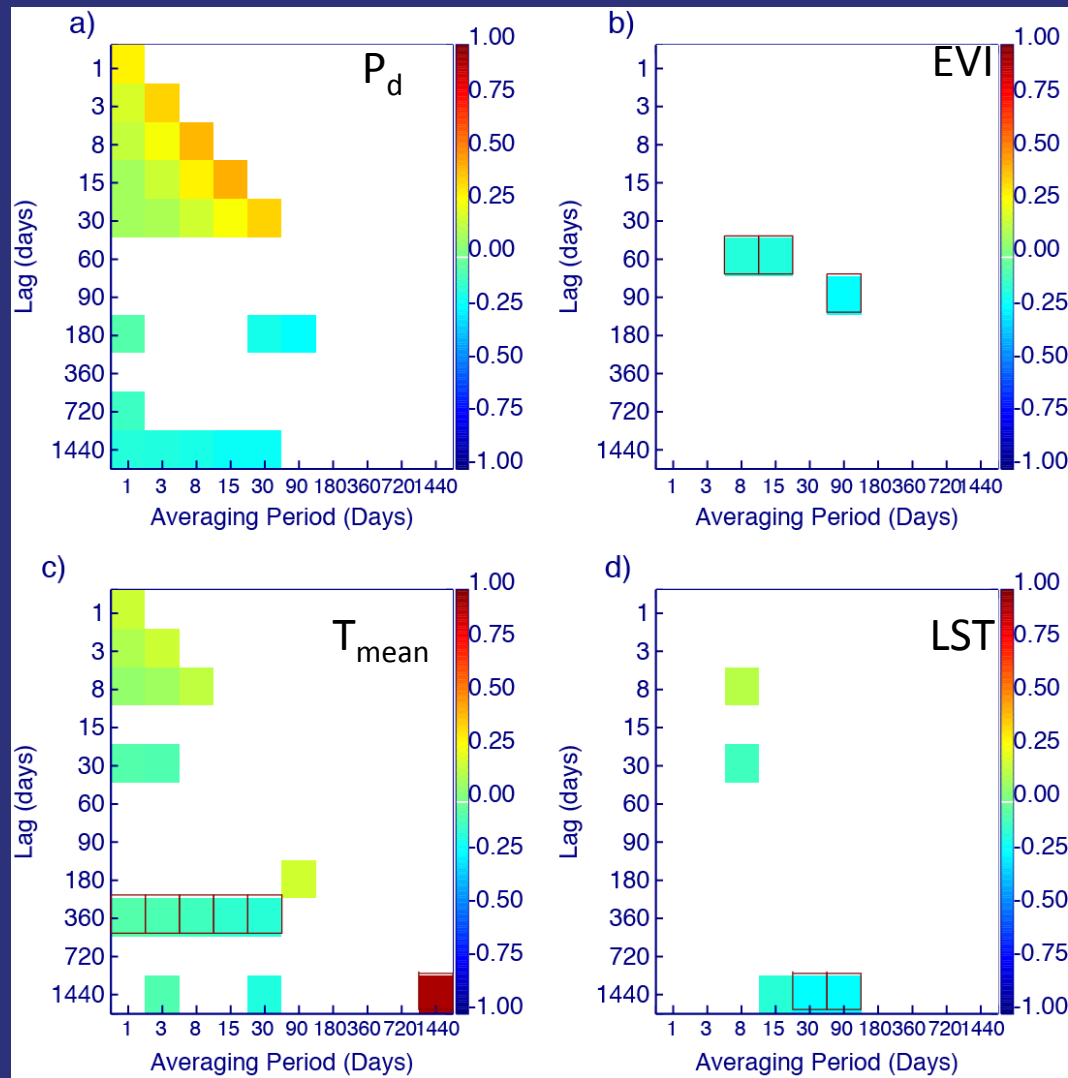


What to test?

Abbreviation	Description	Source
P_d	Photosynthetic drawdown	Flux tower
EVI	Enhanced Vegetation Index, 8-day average	MODIS TERRA/AQUA
ET	Evapotranspiration	Flux tower
WUE	Water Use Efficiency (P_d/ET)	Flux tower
P_{precip}	Daily precipitation	NCDC + NARR Reanalysis
Q_{soil}	10 cm soil moisture	NARR Reanalysis
T_{mean}	Daily temperature	Flux tower + NCDC
T_{min}	Minimum daily temperature	Flux tower + NCDC
T_{max}	Maximum daily temperature	Flux tower + NCDC
T_{range}	Daily temperature range (max - min)	Flux tower + NCDC
LST	Land Surface Temperature, 8-day day/night average	MODIS TERRA/AQUA

Lags are interesting

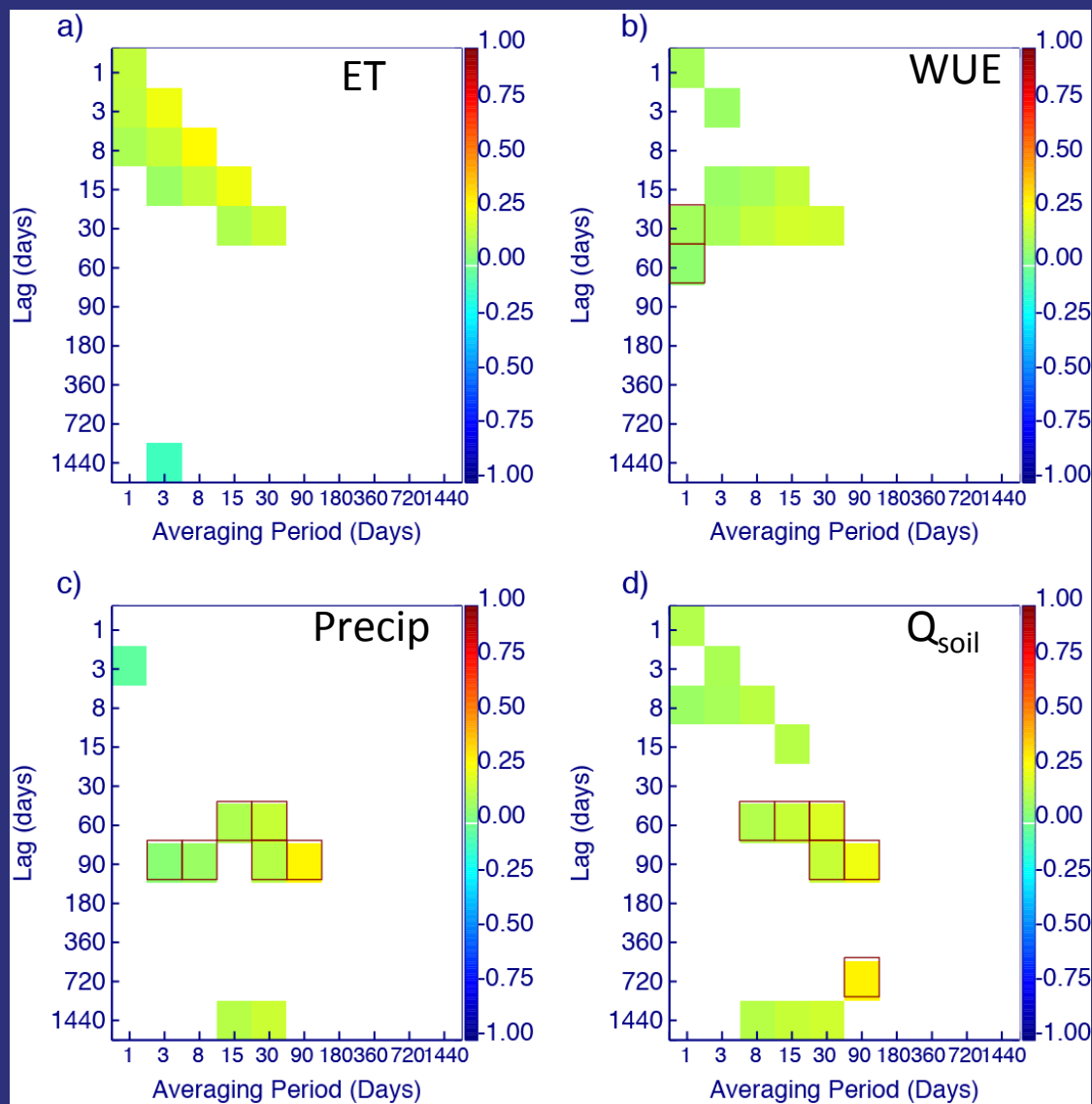
- Red squares = correlations > autocorrelation
- Remotely sensed variables (EVI, LST) have limited ability to predict P_d
- Previous year weekly-monthly temperature has a weak negative relationship to P_d



Important points 1

- Highly significant autocorrelations at daily to seasonal scales up to one month lag imply a strong biological feedback that can damp response to extremes
- Weak negative autocorrelations at multi-year scales also highlight slow press processes and oscillations
- Remotely sensed anomalies have little correlation to carbon flux even though mean seasonal variation correlates highly

Moisture lags are even more interesting

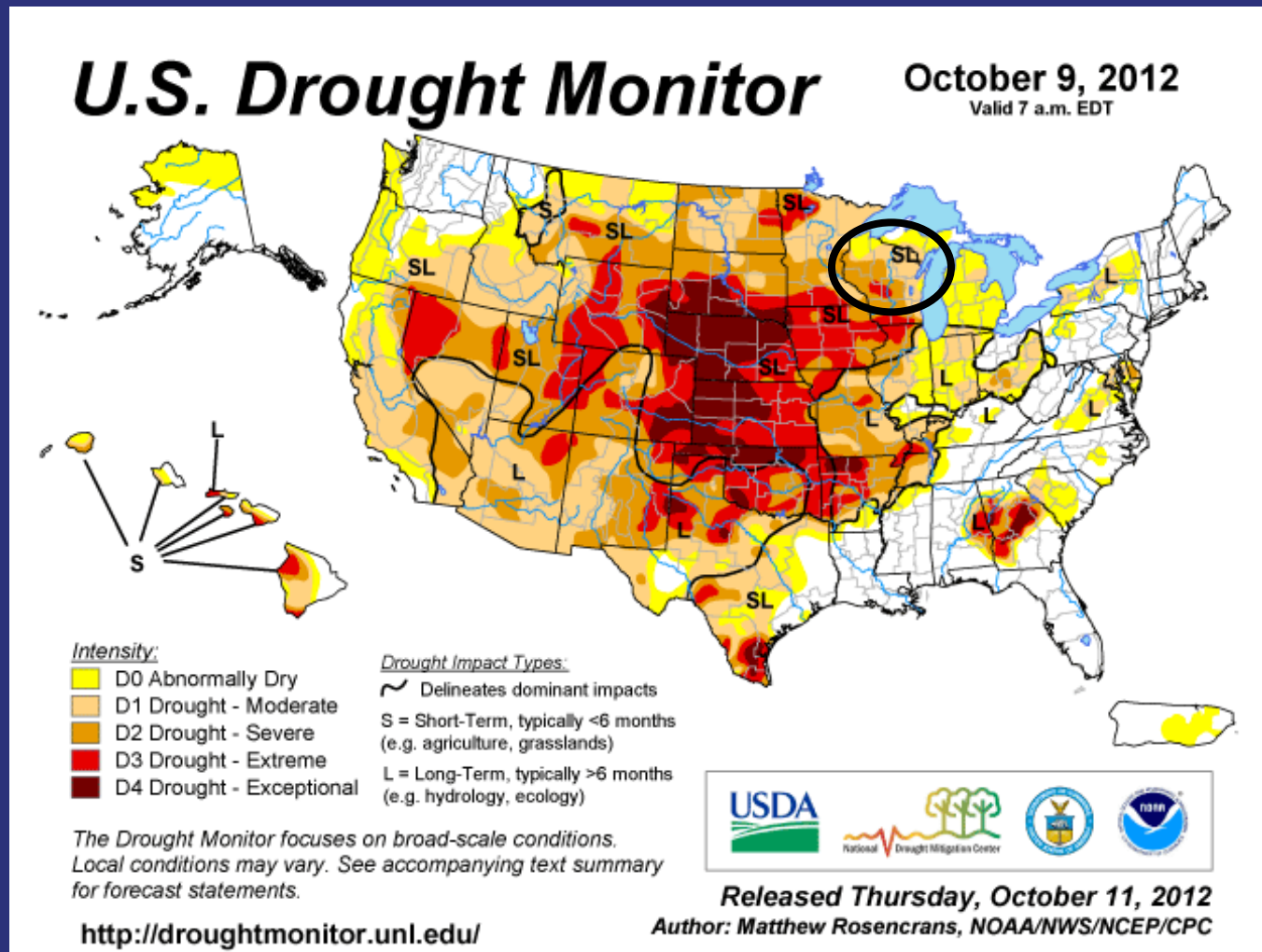


- Earlier season (2-3 month) weekly-seasonal precipitation/soil moisture has strongest predictive effect on P_d
- Beyond that, P_d autocorrelation dominates

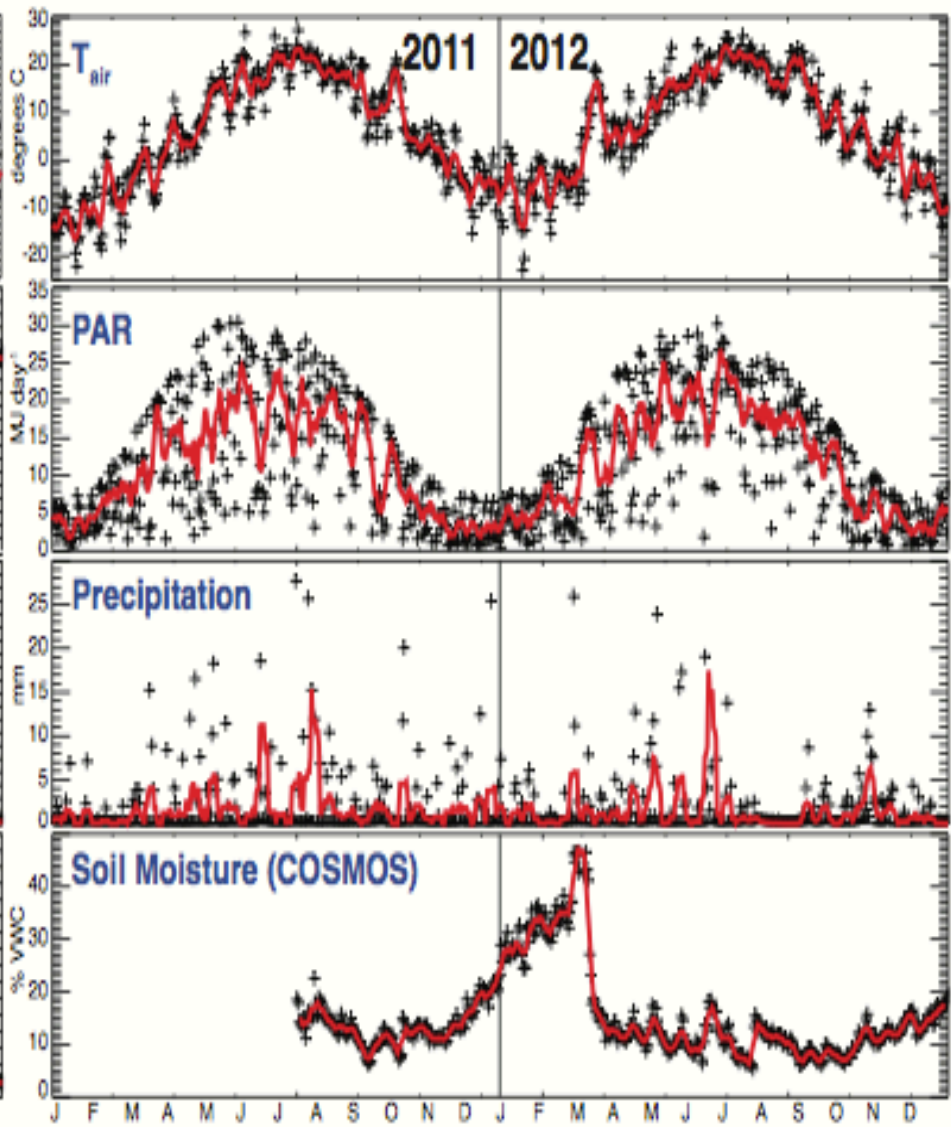
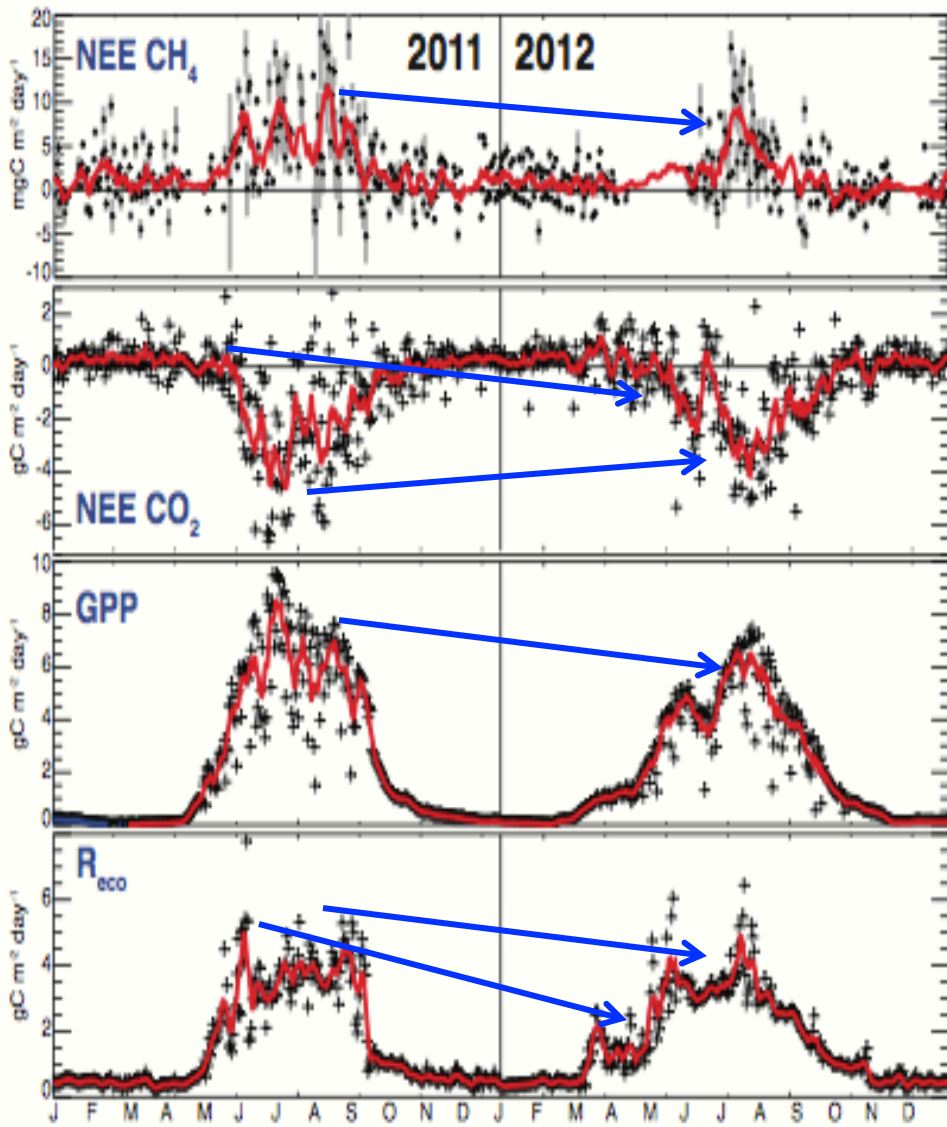
Important points 2

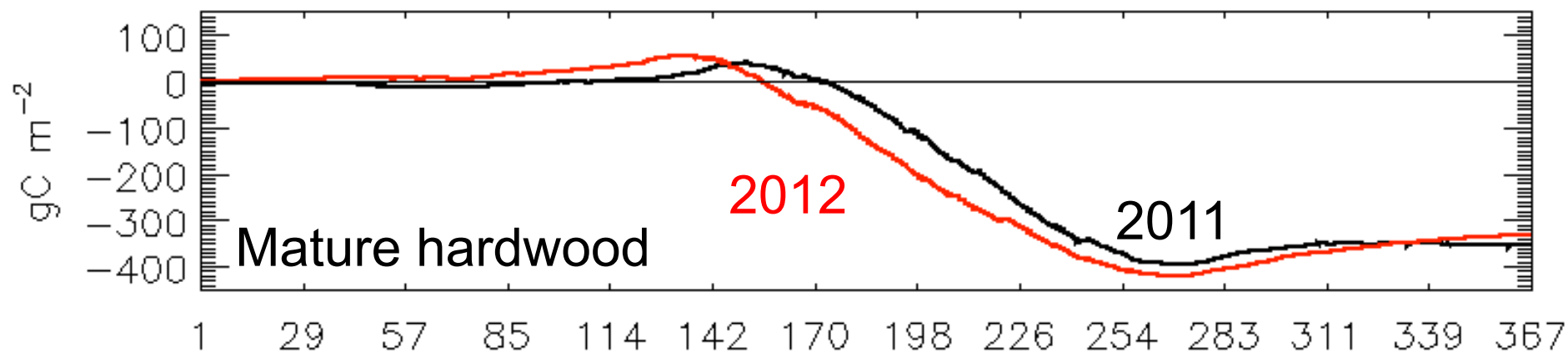
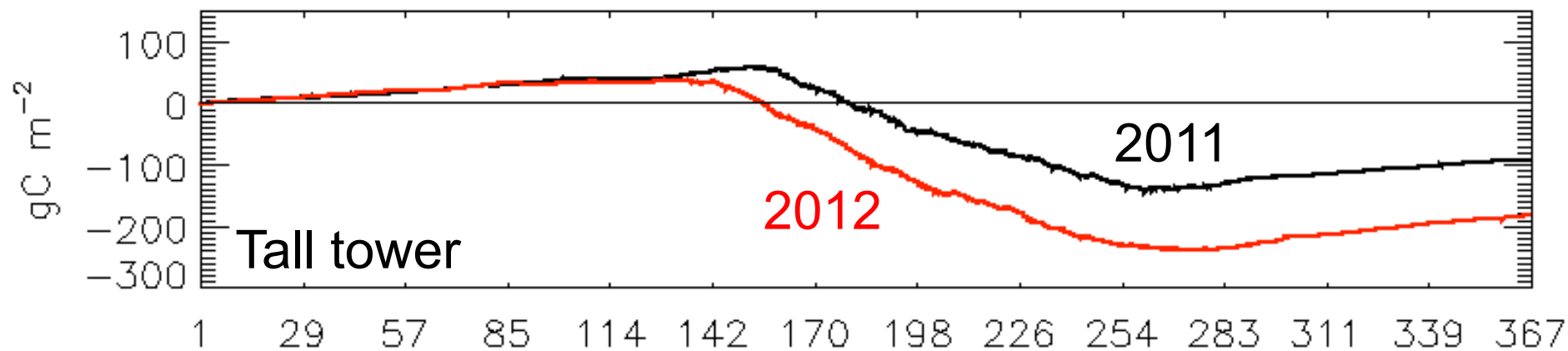
- Moisture extremes impact to regional carbon sequestration display significant seasonal lags and primarily influence monthly to seasonal uptake
- Positive correlations imply mesic forest is in-fact moisture limited, but not in the usual sense

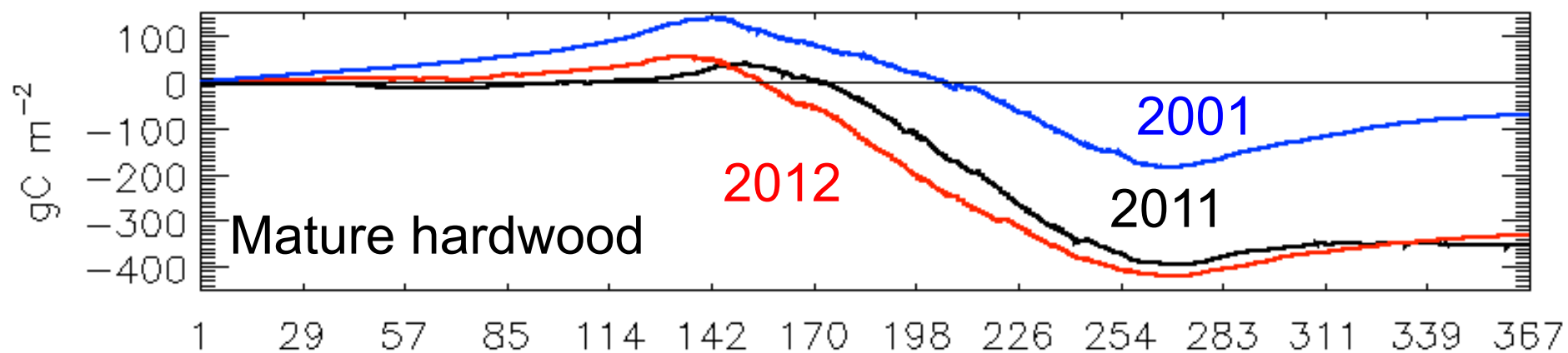
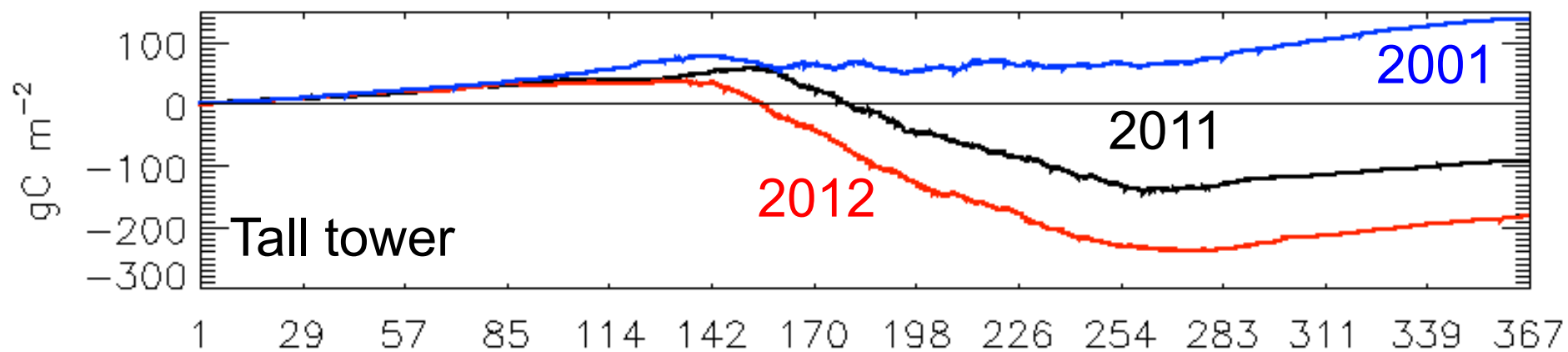
What about 2012?



Wolf et al., in prep; Xu et al., in prep









Important points 3

- Warm, dry conditions more likely promoted a longer growing season through phenology than reduced uptake by stomatal closure
- Biotic disturbances and their frequency/ extremes may be more important than climate extremes in many places

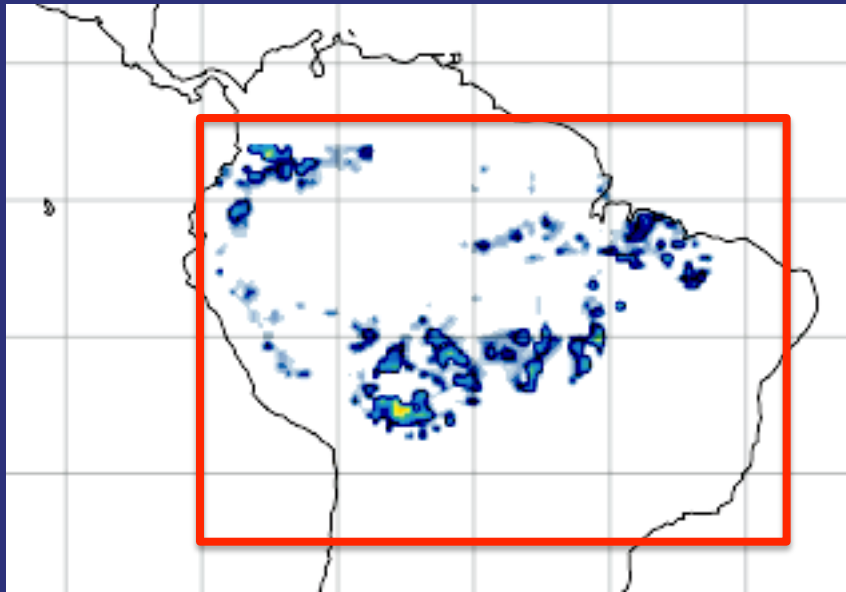
PROBLEMS





TROPICS ARE INTERESTING....

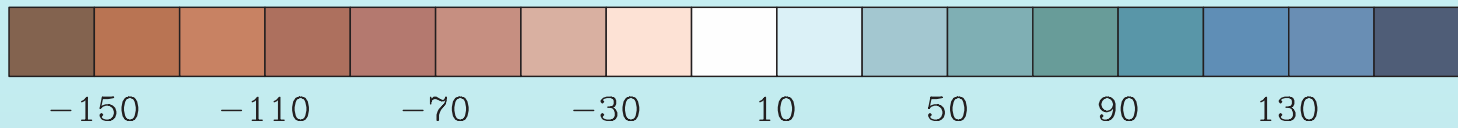
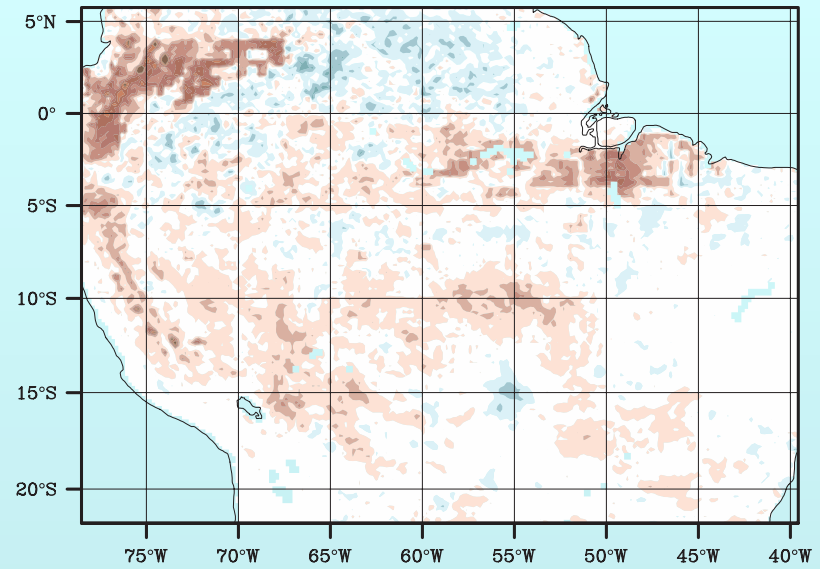
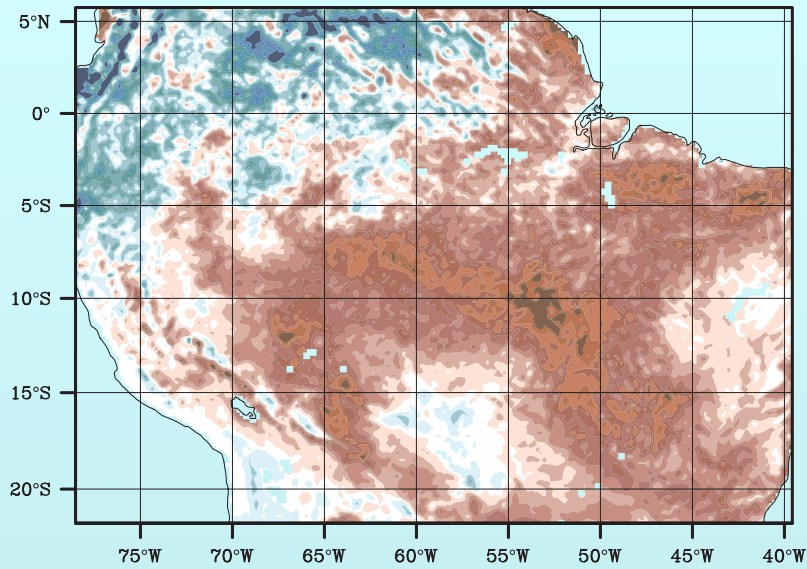
WRF-Noah Setup



Bagley, J.E., Desai, A.R., Harding, K.J., Snyder, P.K., and Foley, J.A., 2014. Drought and deforestation: Has land cover change influenced recent precipitation extremes in the Amazon? *J. Climate*, 27, 345-361, doi:10.1175/JCLI-D-12-00369.1.

- Spatial Resolution: 20km x 20km
- Timestep: 60 seconds
- For 2003, 2004, 2005, 2007, 2009, and 2010 the model was run from March 15 – October 15 with and without deforestation
- Total of 12 seven-month simulations completed with hourly output

Precipitation Rate (mm/month)



Dry Season
Anomaly

Deforestation
perturbation

Amazon Rainforest Percent Changes with Deforestation

In nearly every
measure the
impact of
deforestation is
greater during
drought years

% Δ Precipitation Rate
% Δ Sensible Heat Flux
% Δ Latent Heat Flux
% Δ Net Surface Radiation
% Δ Boundary Layer Height
% Δ Rel. Soil Moisture Top Layer
% Δ Rel. Soil Moisture Bot. Layer
% Δ 2m Specific Humidity
% Δ Level of free convection
% Δ Lifting condensation level

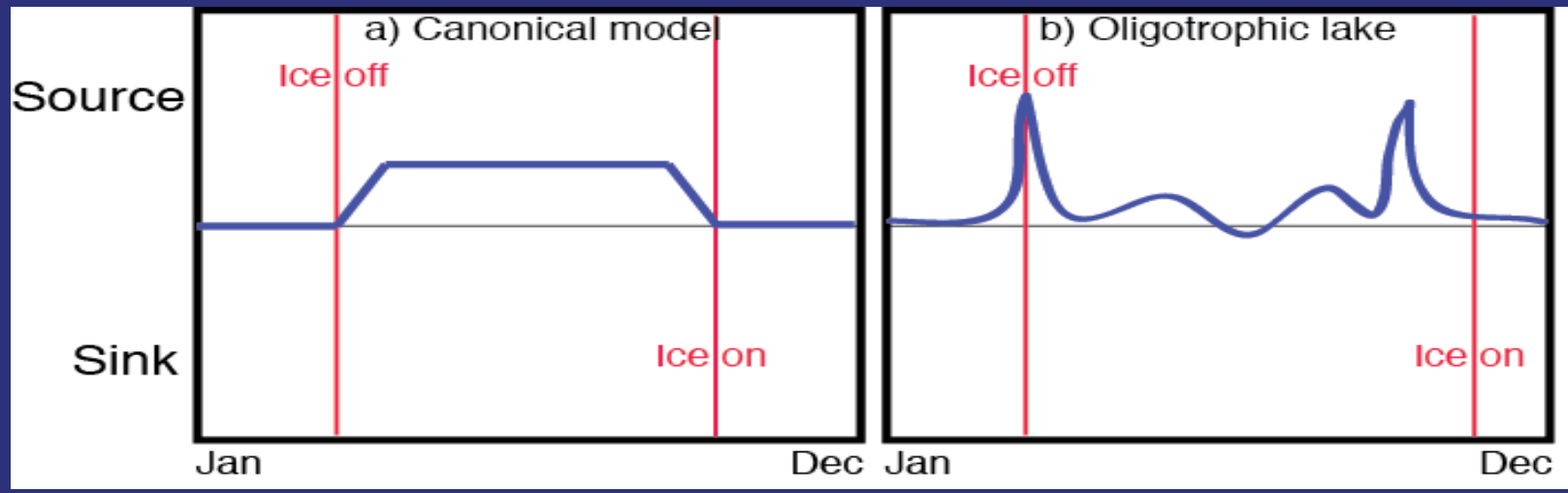
July - September	
Pluvial Years	Drought Years
-4.99%	-5.93%
+4.48%	+4.28%
-3.63%	-5.57%
-2.41%	-2.70%
-.11%	+1.36%
-3.00%	-4.38%
+3.50%	+5.09%
-.77%	-1.31%
+2.62%	+5.52%
+1.29%	+3.94%

PREDICTIONS



In the future...

- As models get more sophisticated and realistic, a greater number of negative (restoring) feedbacks will be successfully resolved
- However, this does not negate the very real risk of climate change on thresholds, long-term shifts, and other ecosystem state changes *regardless* of the feedback direction
- Further, some systems may be more sensitive than others



PLATITUDES





The Penultimate Slide

Thanks!

- Contributors:
 - Jonathan Thom, Ke Xu, Arlyn Andrews, Dan Baumann, Bruce Cook, Dave Moore, Britt Stephens, Justin Bagley, Ben Sulman, Malgorzata Golub, Mike Dietze, many others...
- Funding:
 - NSF, NOAA, DOE, USDA, WI Focus on Energy

