

Can we predict the variability of ecosystem and carbon cycle

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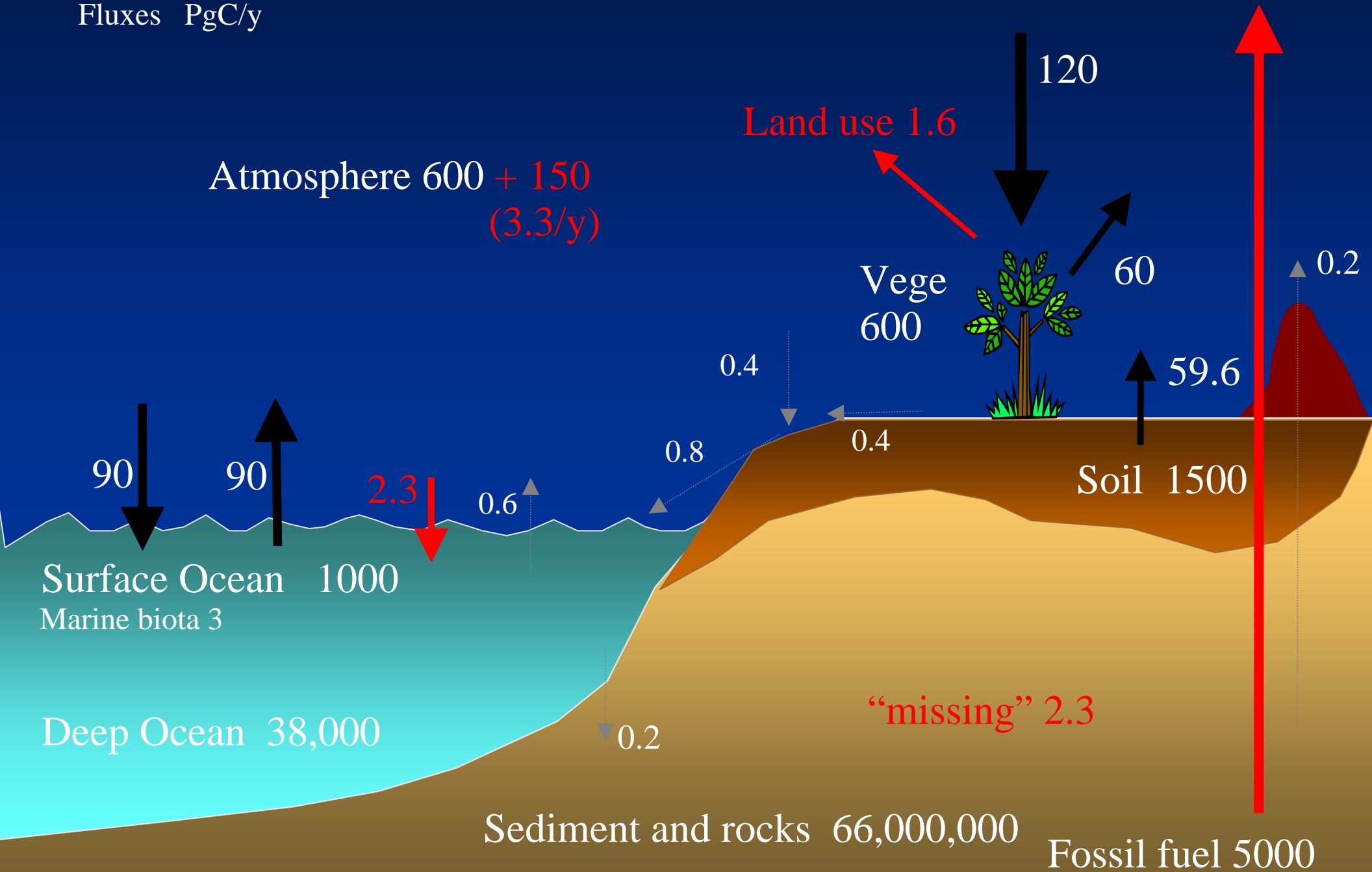
Contributors: M. Heimann, A. Mariotti, C. Roedenbeck, P Wetzel, E. Maier-Reimer
H. Qian, R. Iacono, E. Munoz
E.Kalnay, G.J.Collatz, A. Vintzileos, S.Lord

August 9, IGSNRR, China

The Disturbed Carbon Cycle

Pools PgC (10^{15} g)
Fluxes PgC/y

Fossil Fuel 6.3



The “missing” carbon sink and the future of carbon sources and sinks

Fossil + Land-use = Atmosphere + Ocean + Land

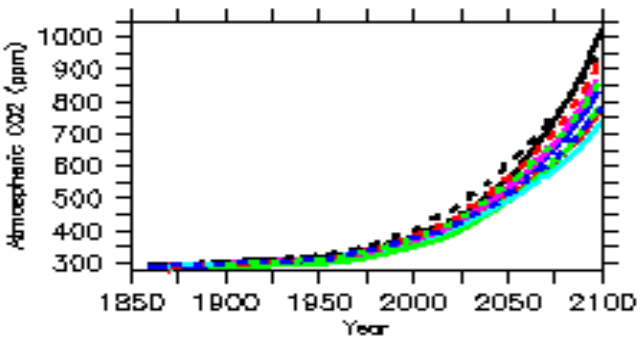
1990s:	6.3	1.6	3.3	2.3	2.3	Pg/y
2050s:	16	?	?	?	?	

(IPCC A1B scenario)

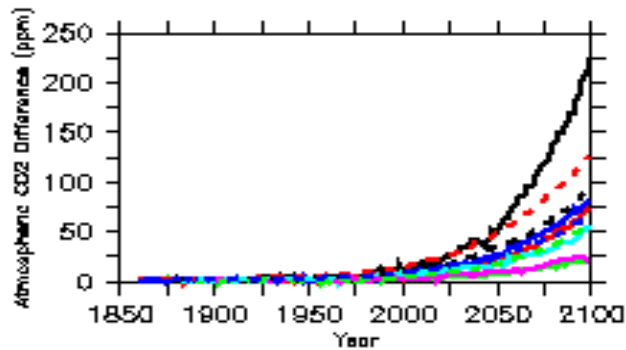


The “missing” or ‘residual’ land carbon sink

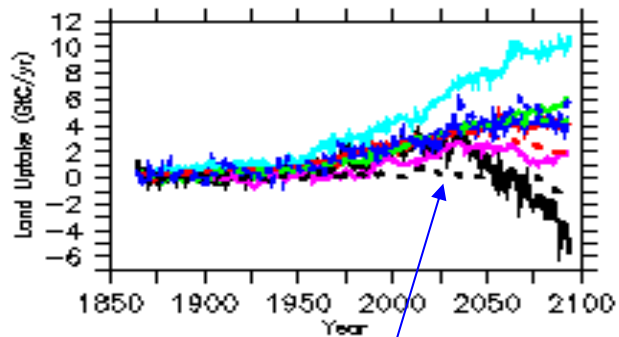
CO₂



Δ CO₂ from climate feedback

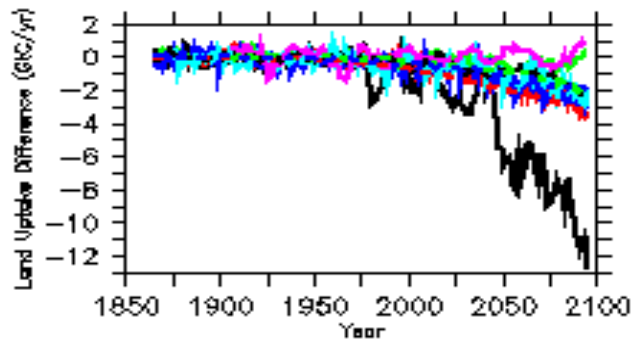


Land uptake

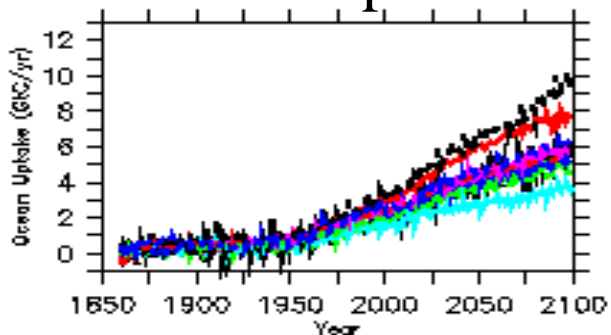


UMD model

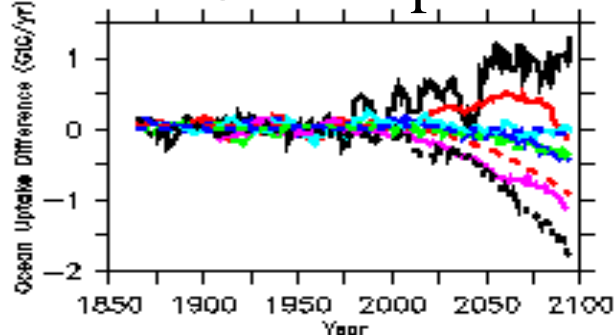
Δ Land uptake



Ocean uptake



Δ Ocean uptake



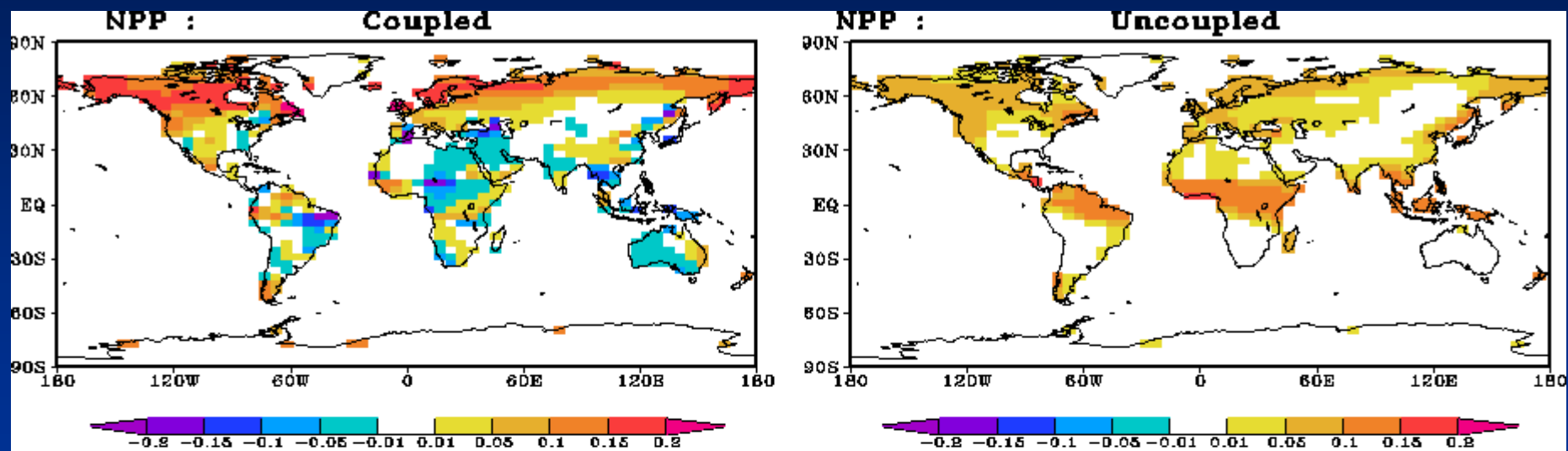
Enhanced global warming from carbon-climate interaction: the C4MIP results

--- UMD Earth System Model (CABO)

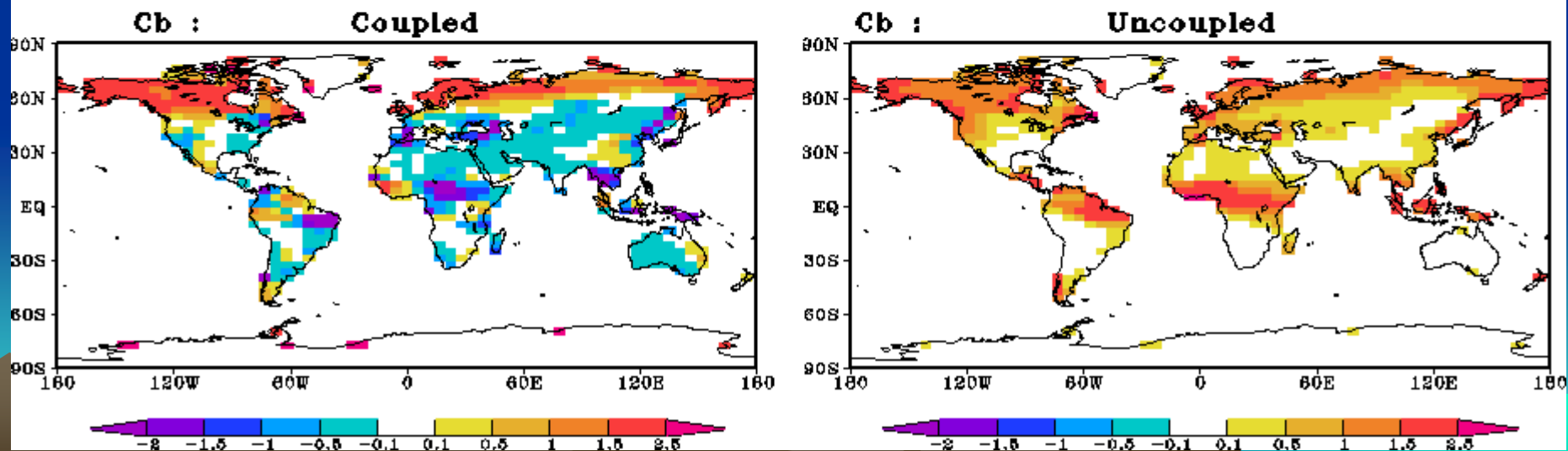
Major differences in land response: interannual variability as a testbed

Difference: 2071/2100 – 1850/79

Net Primary Production

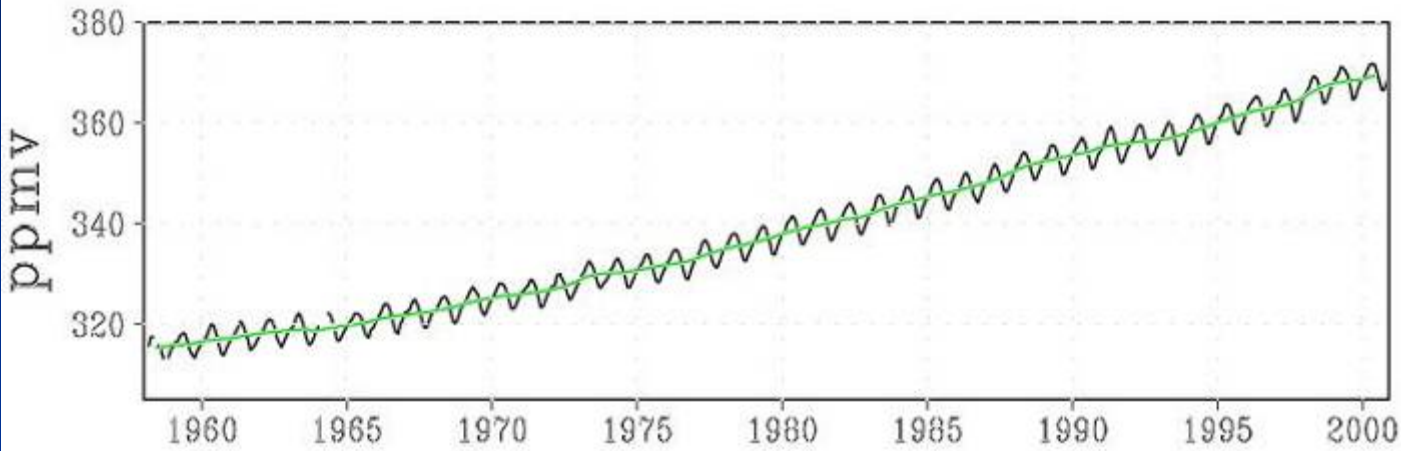


Total land carbon

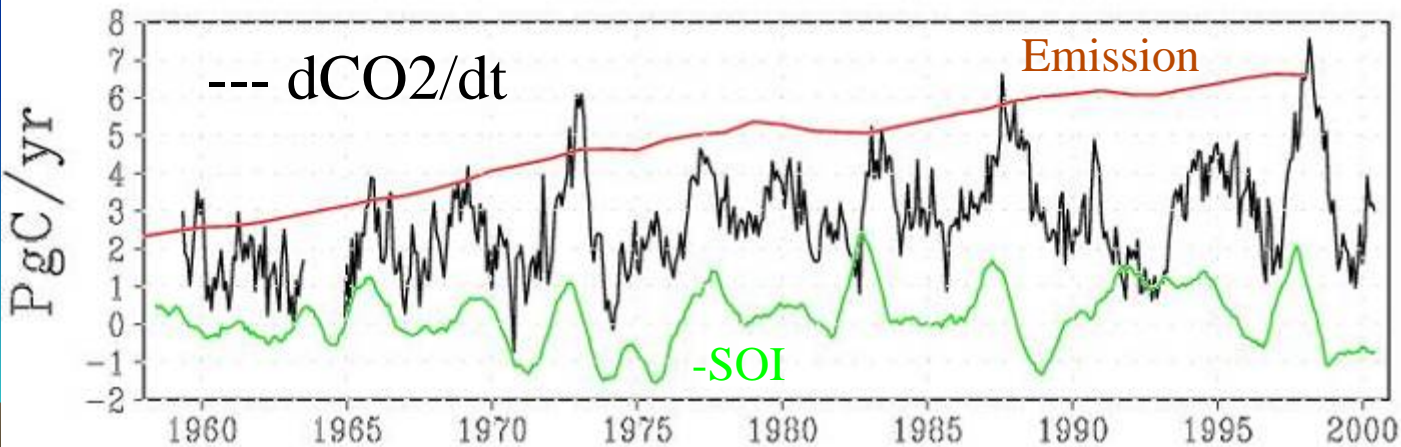


Atmospheric CO2 Variability 1958-2000

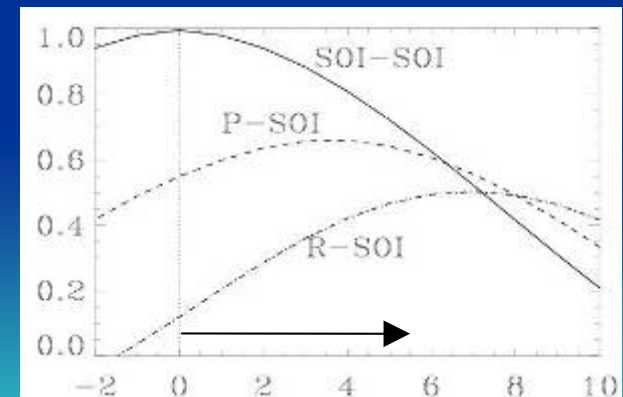
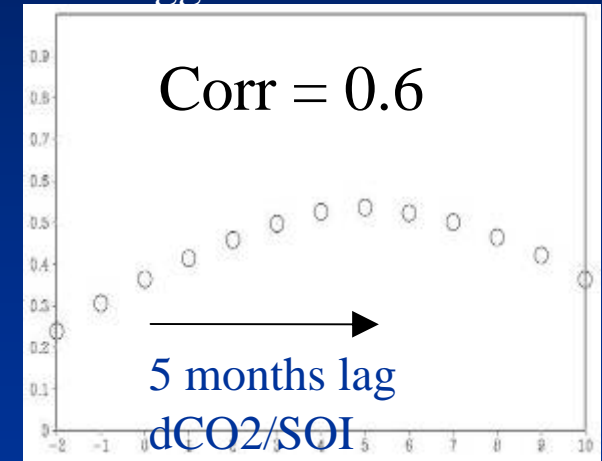
CO2 concentration Mauna Loa



Emission and CO2 Growth Rate



Lagged Correlations



3-6 months lag
Hydrology/SOI

20th Century Observed Physical Climate

Forcing

Coupled Carbon Model

Atmosphere

Transport

Reanalysis

Atmospheric CO₂

Precipitation
Temperature
Radiation
wind, vapor

Precip, Temp
(CRU, CMAP, GISS)

Carbon
Exchange

Land

Soil Moisture/temperature

Vegetation+
Soil Carbon

Ocean Physics

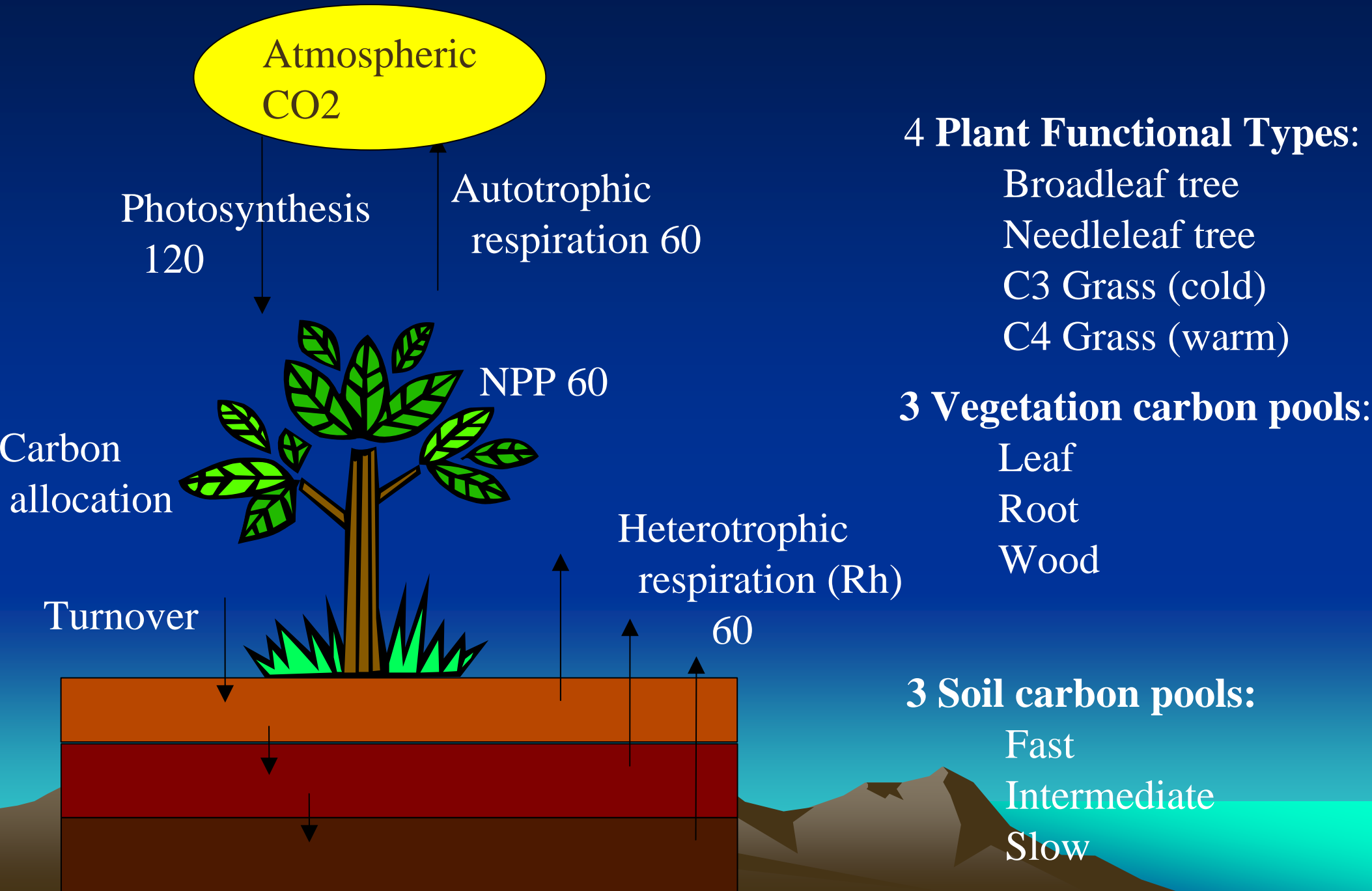
Circulation
Temperature
Salinity

Reanalysis

Ocean Chemistry/Biology

Goal: To understand the changing carbon cycle in the 20th Century

The VEGAS Model (VEgetation-Global Atmosphere-Soil Model)



VEGAS II

Photosynthesis:

Light (PAR, LAI, Height), soil moisture, temperature, CO₂

Respiration:

Temperature, soil moisture, lower soil pools slower decay

Competition:

Net growth, shading => fractional cover

Fire:

moisture, fuel load, PFT dependent resistance

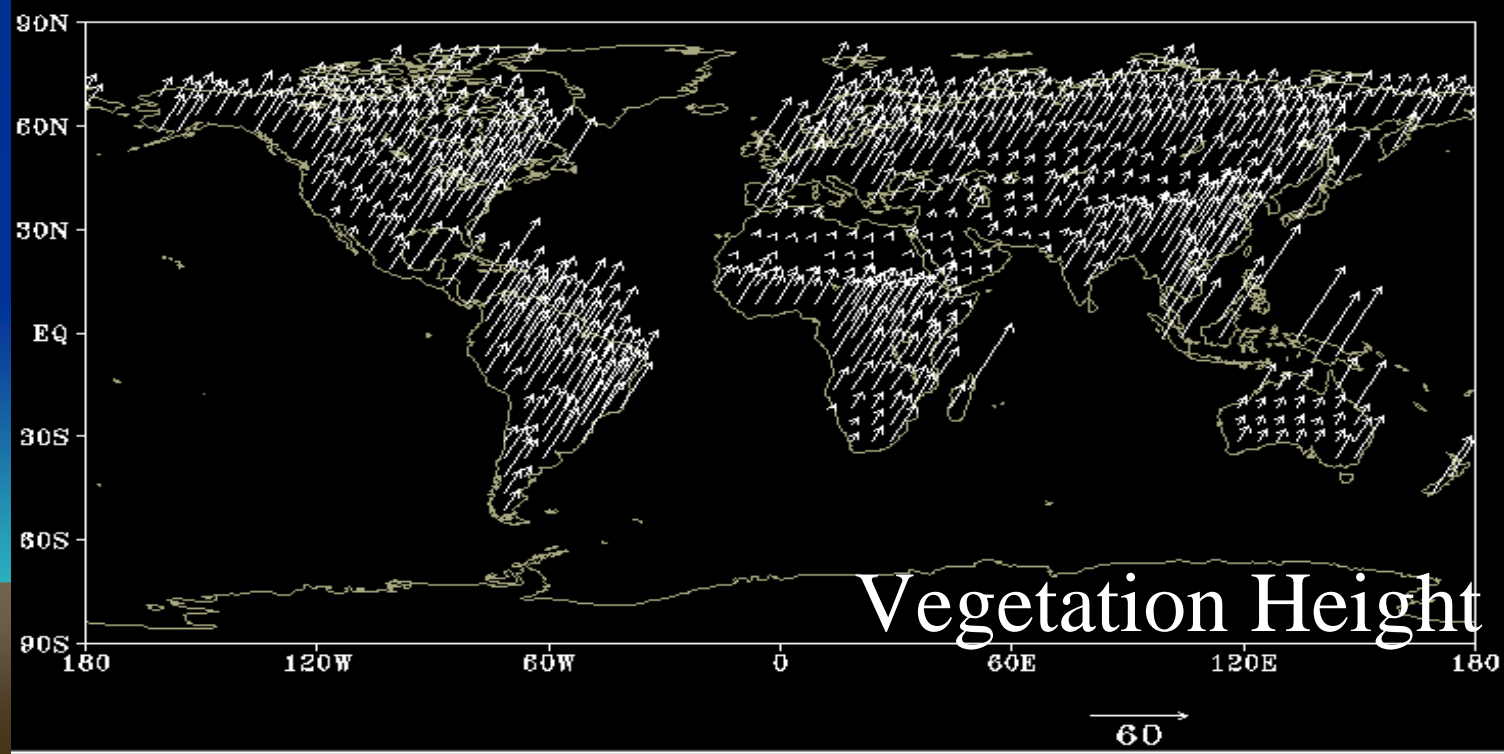
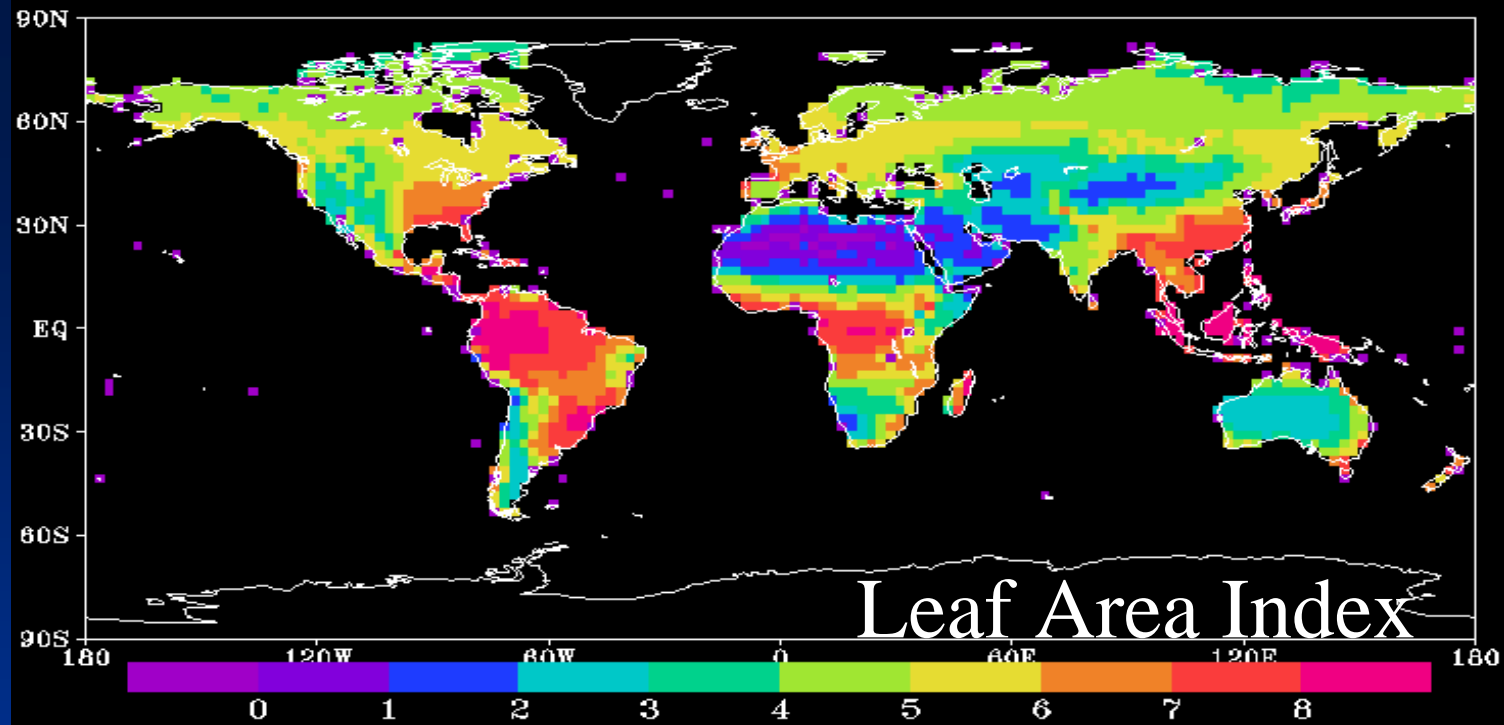
Wetland/CH₄:

moisture, topography gradient

Carbon 13:

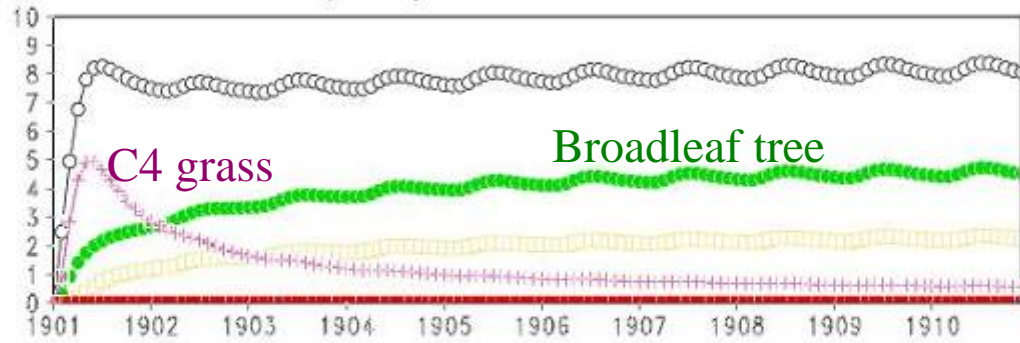
C₃/C₄ competition: temperature, CO₂





Vegetation Dynamics over the Amazon after disturbance

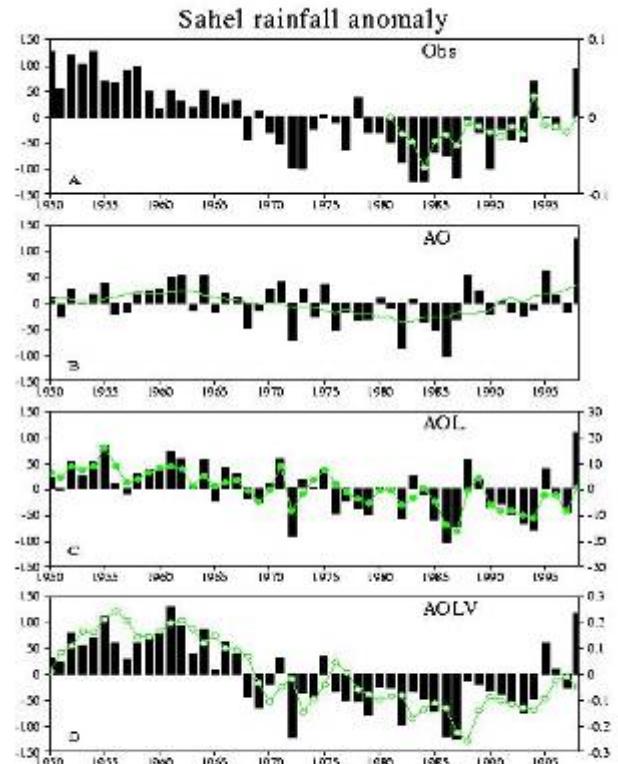
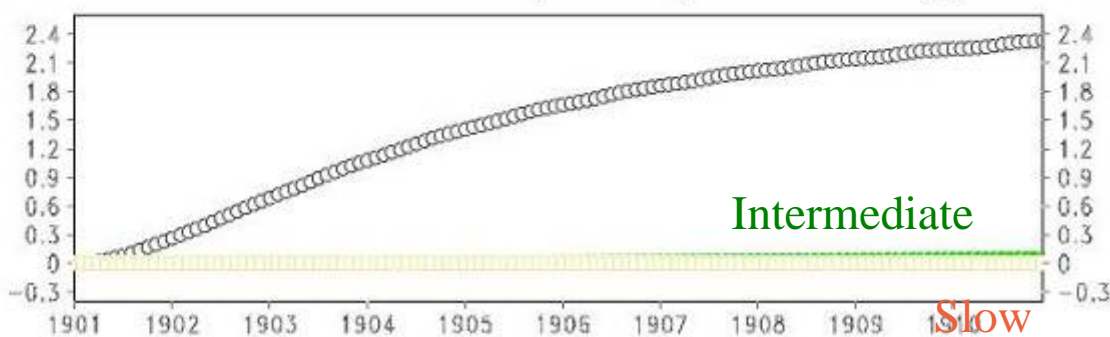
Leaf Area Index (LAI): Total, PFT 1,2,3,4 Amc



Vege Carbon: leaf/root/wood kg/m2



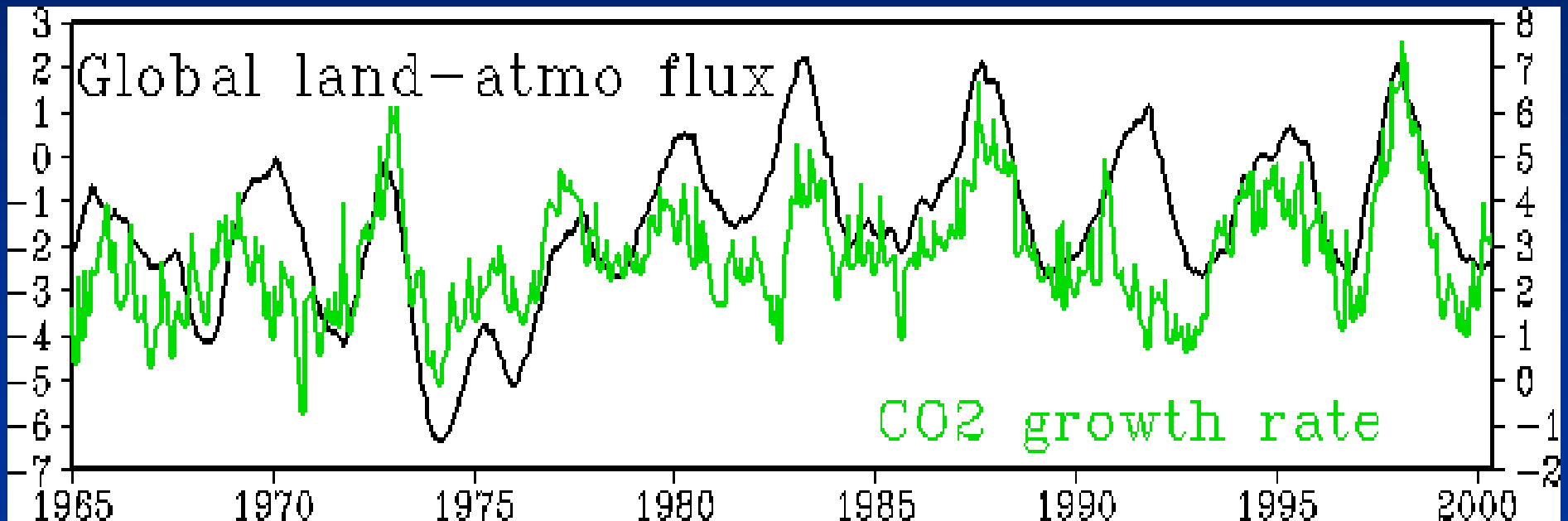
Soil Carbon: fast/med/slow kg/m2



The dramatic drying trend in the Sahel from the 1950s to the 1980s is initially forced by SST (b), but amplified by soil moisture (c) and vegetation (d). Zeng, et al. 1999: Science, vol 286, 1537-1540.

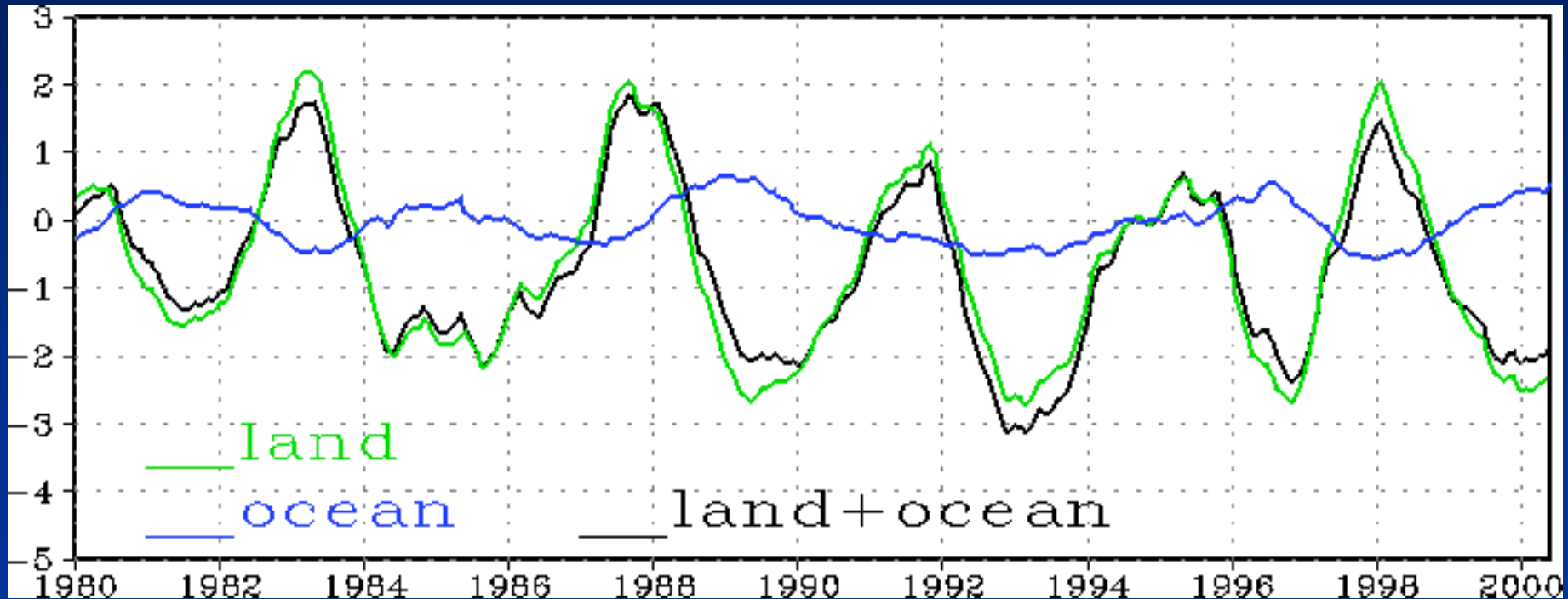
Mechanisms of Interannual Variability I

Modeled land-atmo flux vs. MLO CO2 growth rate



Terrestrial carbon model forced by observed climate variability

Land vs. ocean fluxes



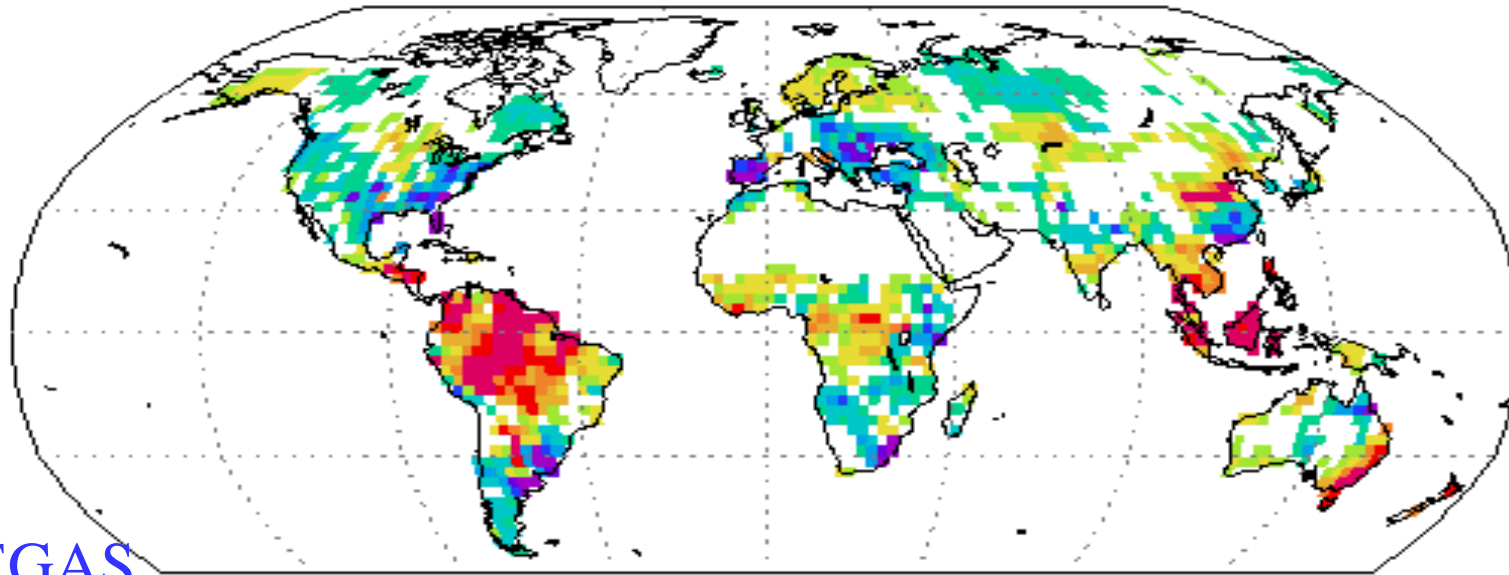
Land: VEGAS

Ocean: HAMOCC

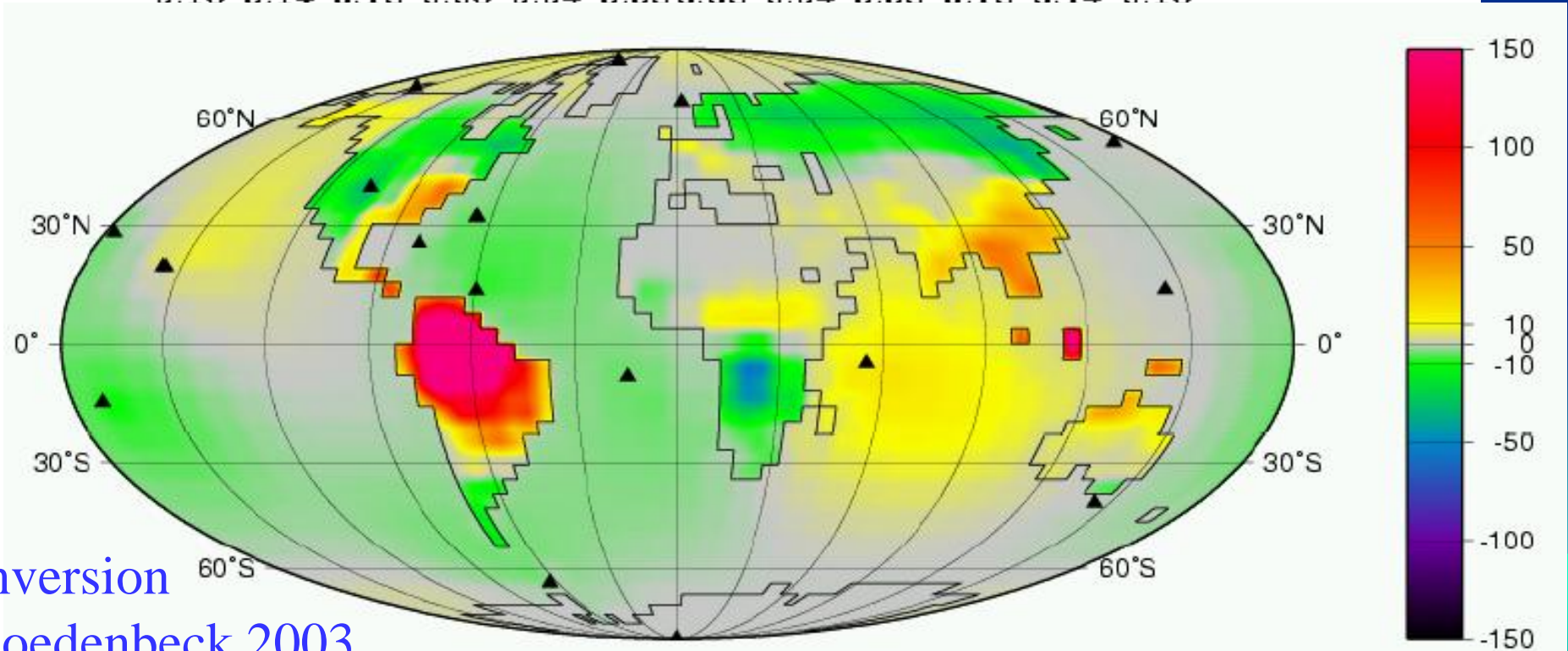
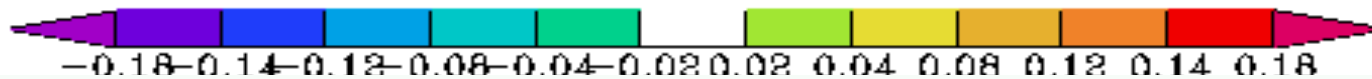
Land contributes to most of the interannual variability,
with significant contribution from ocean

Modeling results supported by in-situ data and inversion

El Nino 97/98 C Flux anomalies (Jun1997-May1998)

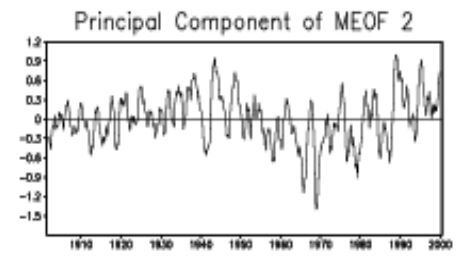
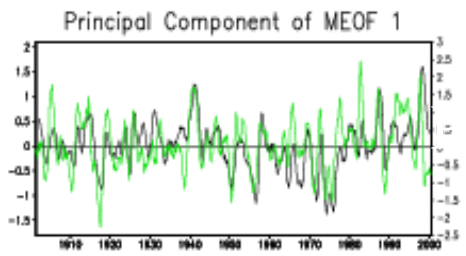


VEGAS

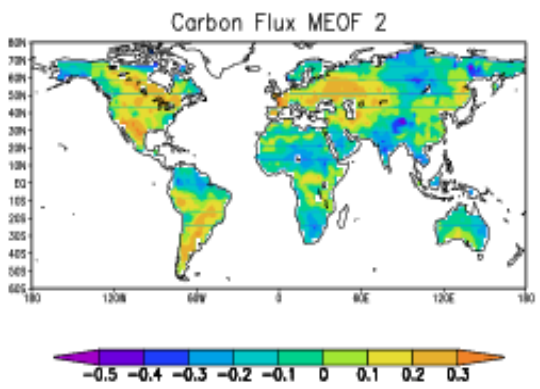
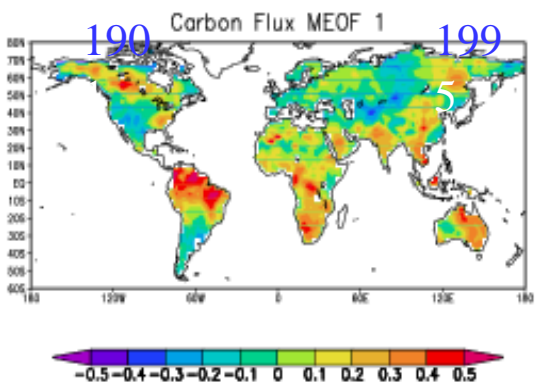


Inversion
Roedenbeck 2003

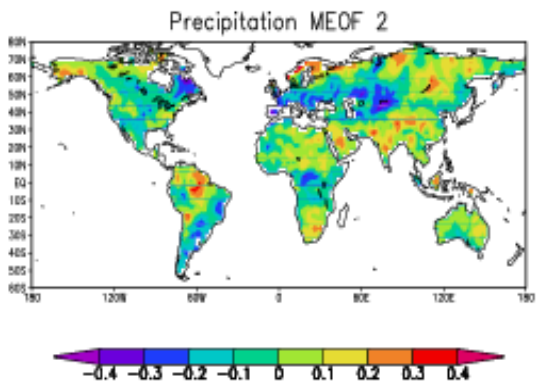
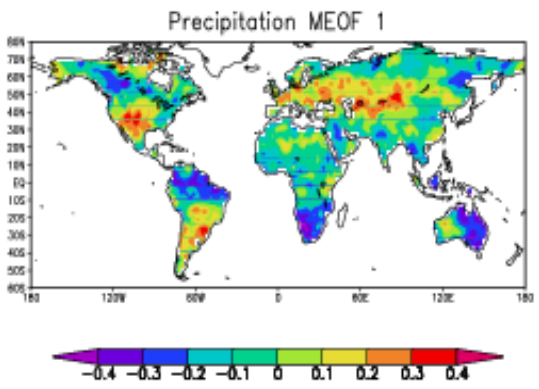
PC1



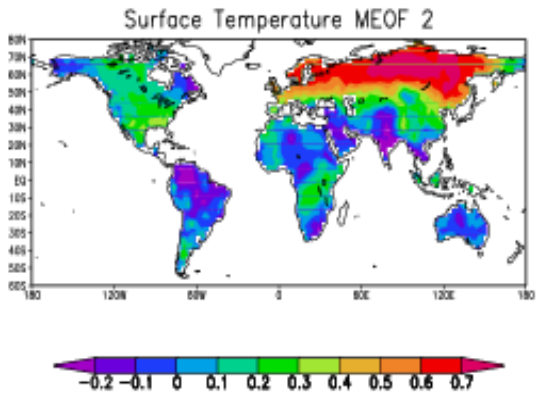
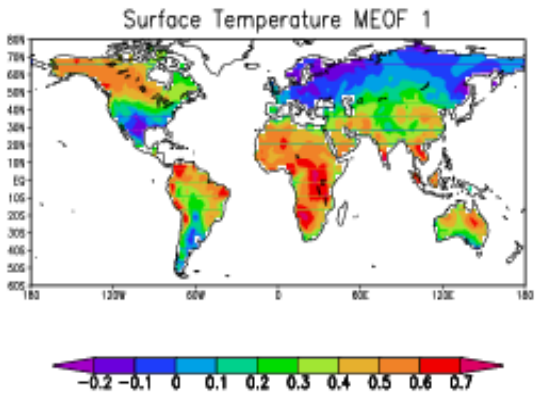
C flux



Precip



Temp



Spatial patterns from multi-variate EOF analysis

Tropics during El Nino

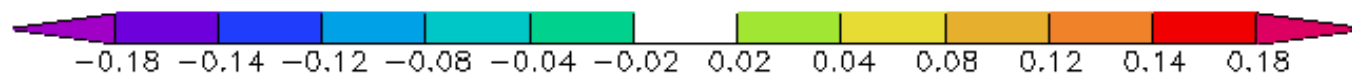
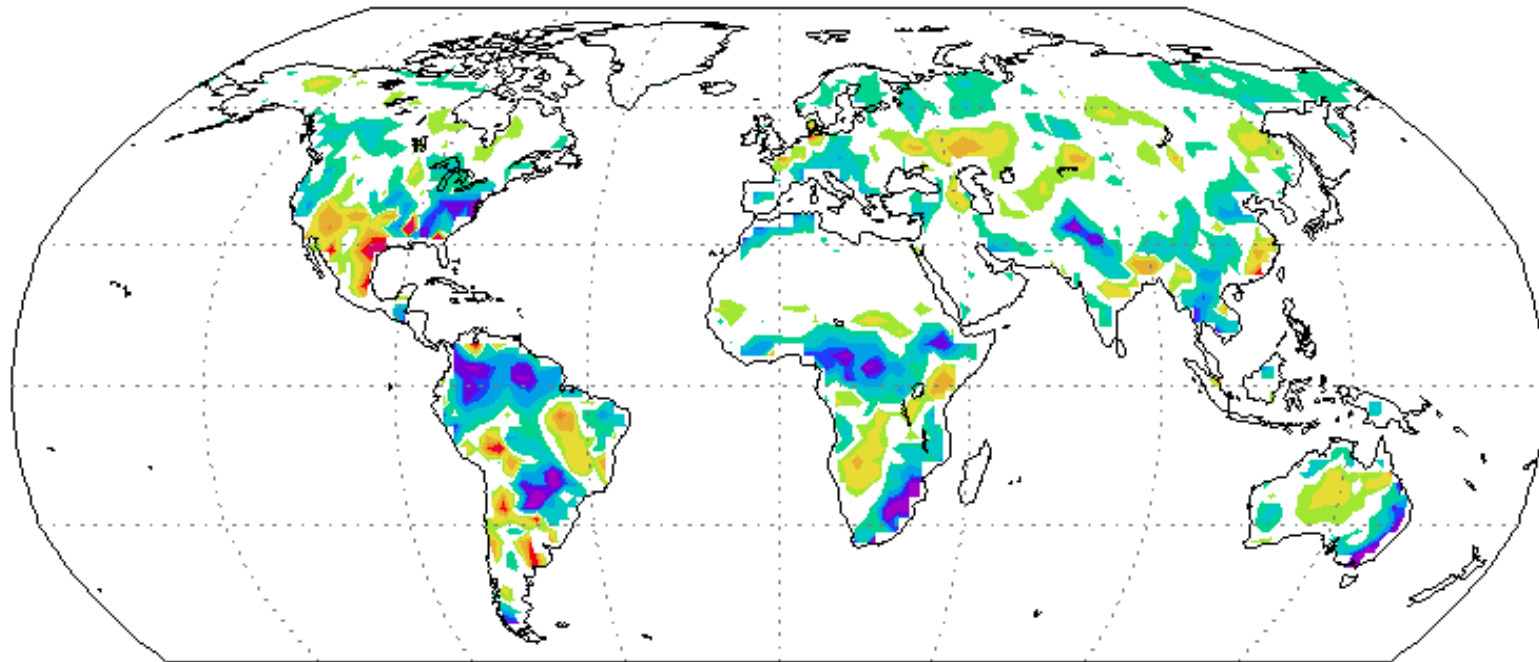
1) Drier and warmer conditions coexist at tropical locations

1+) Drier and warmer across much of tropical land during El Nino

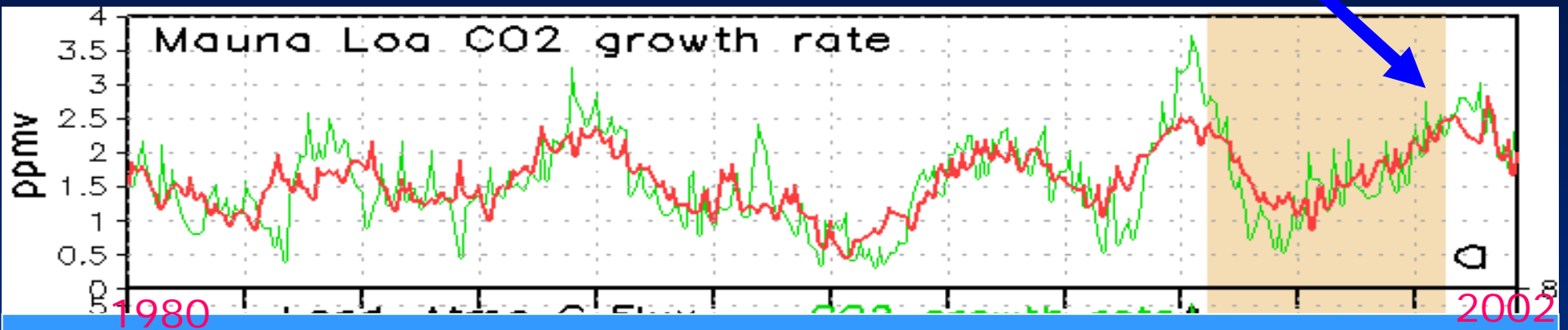
2) Less precip
=> Less growth (lower NPP)
and more fire
=> Less C uptake

Higher T
=> more respiration (higher Rh)
=> more C release

Land-atmo carbon flux JUN1996



Recent Anomalous growth in CO2

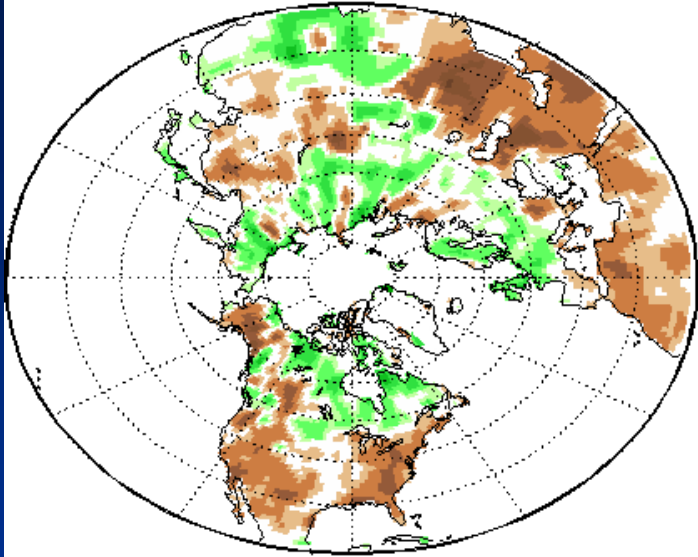


Proposed explanations:

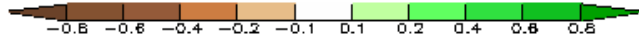
1. Fire in Siberia, North America, and other places
2. Accelerated carbon emission from China, India
3. Mid-latitude drought

Mid-latitude Drought: 1998-2002

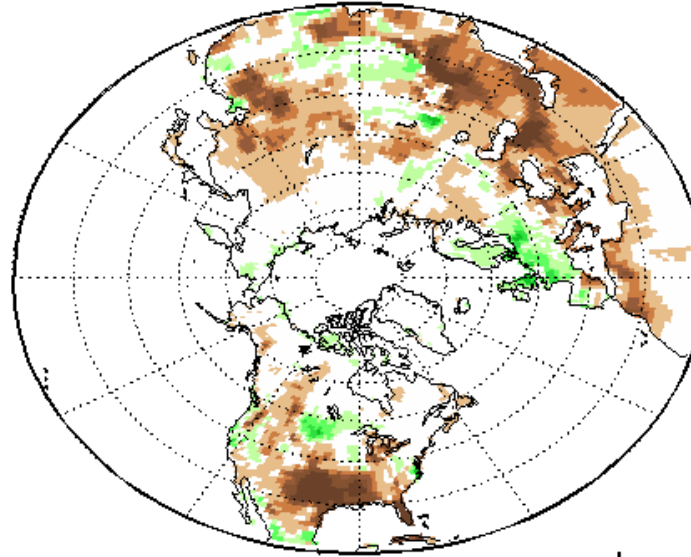
Precipitation



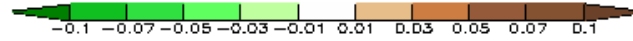
a



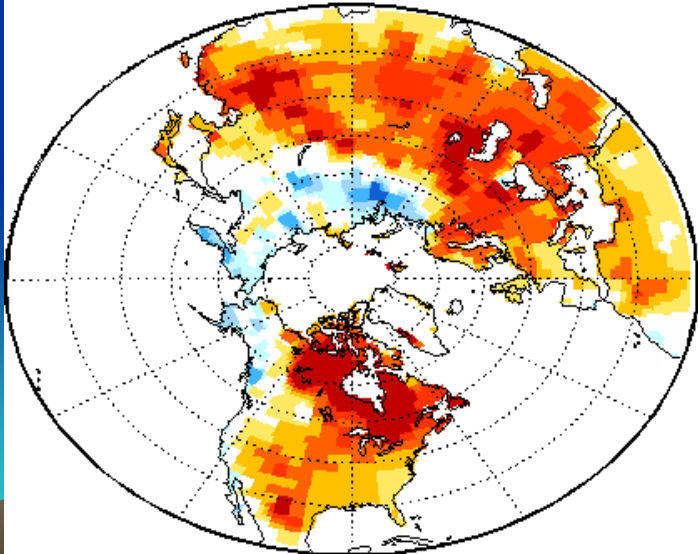
Land-Atmo Flux



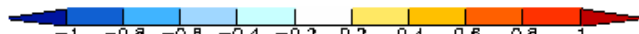
b



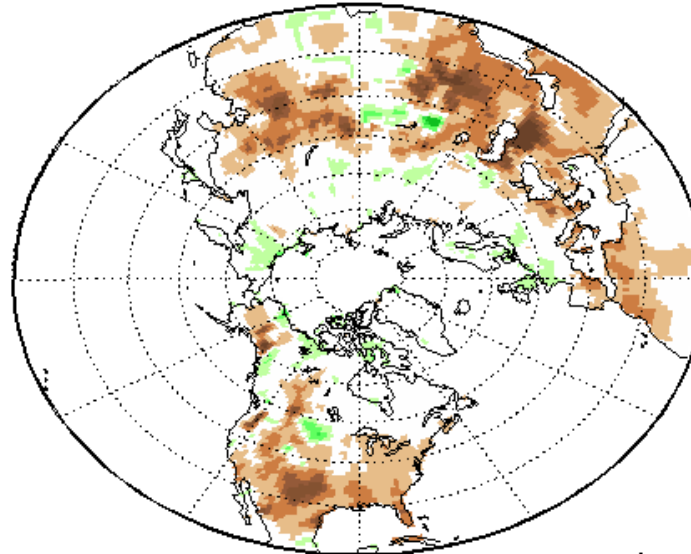
Temperature



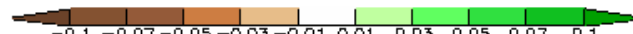
c



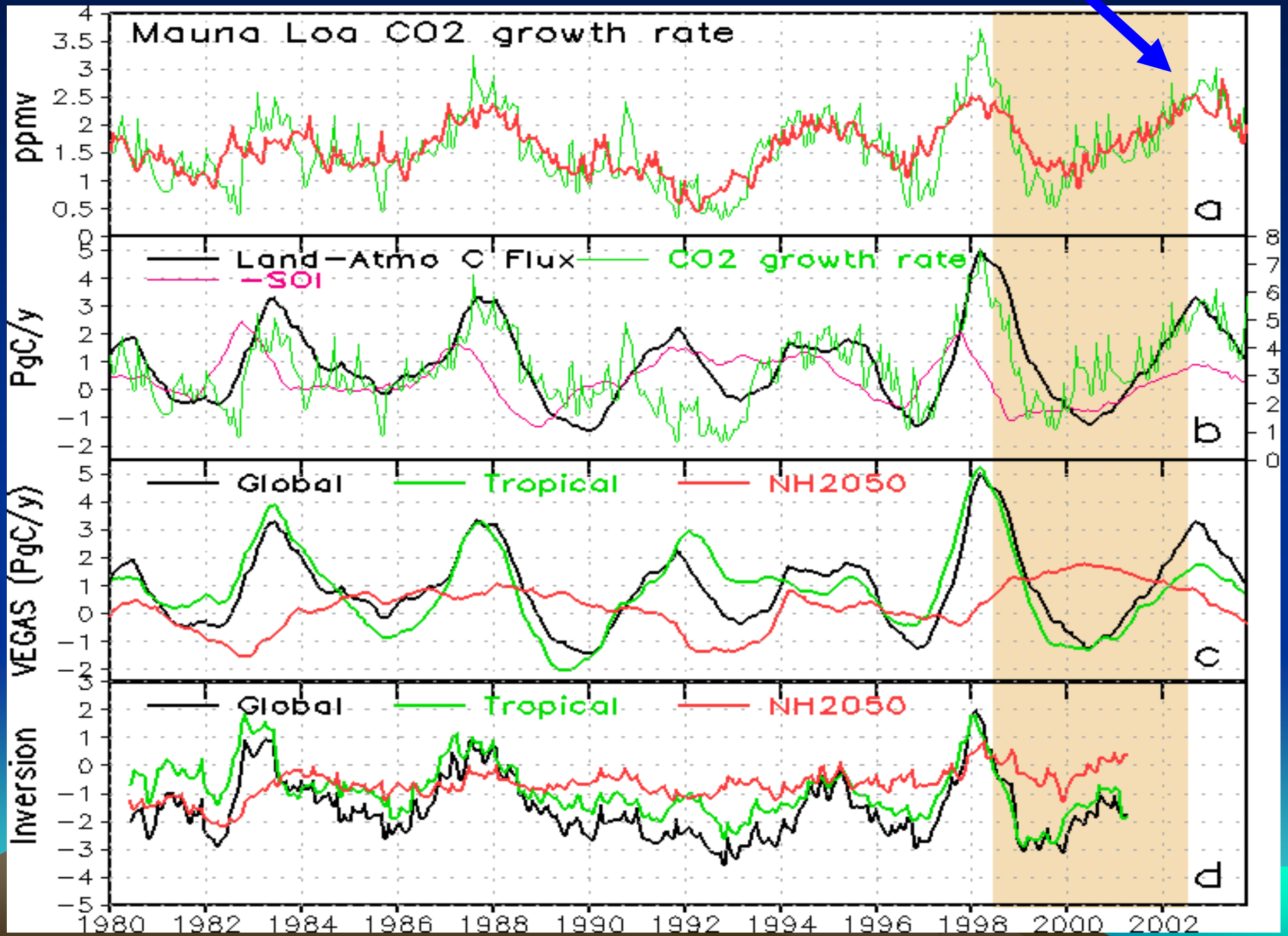
Soil Moisture



d



Recent Anomalous growth in CO2



Conclusions: variability

- . The high correlation between CO₂ and ENSO is mainly due to a 'conspiracy' between climate anomalies and plant/soil physiology
- . Recent anomalously large CO₂ growth can be explained by a (so far) unusual midlatitude drought, a possible glimpse into a warmer world
- . Understanding the mechanisms and processes underlying such interactions provides crucial insight into the fate of anthropogenic CO₂ and the degree of future climate change
- . Such variability may be predictable!



Seasonal-interannual Prediction of Ecosystem and Carbon Cycle

Two strands of recent research made this a real possibility

- Significantly improved skill in atmosphere-ocean prediction system, such as CFS at NCEP
- Development of dynamic ecosystem and carbon cycle models that are capable of capturing major interannual variabilities, when forced by realistic climate anomalies

A pilot study at U Maryland:

1. Feasibility study using a prototype eco-carbon prediction system
2. Dynamic vegetation as an interactive component?



The NCEP Climate Forecast System (CFS, Saha et al. 2005)



CFS captures major ENSO and other seasonal-interannual variability
no warming trend, why?

Forecasting Procedure I

Climate Prediction

CFS (9mon, 15 members)

CFS (9mon, 15 members)

Spinup

Precip
Temp

Precip
Temp

Ecosystem+
Carbon Model

VEGAS

Initialization

VEGAS

Predicted
Eco-carbon

Output

9mon, 15 members

1 mo forecast
ensemble mean

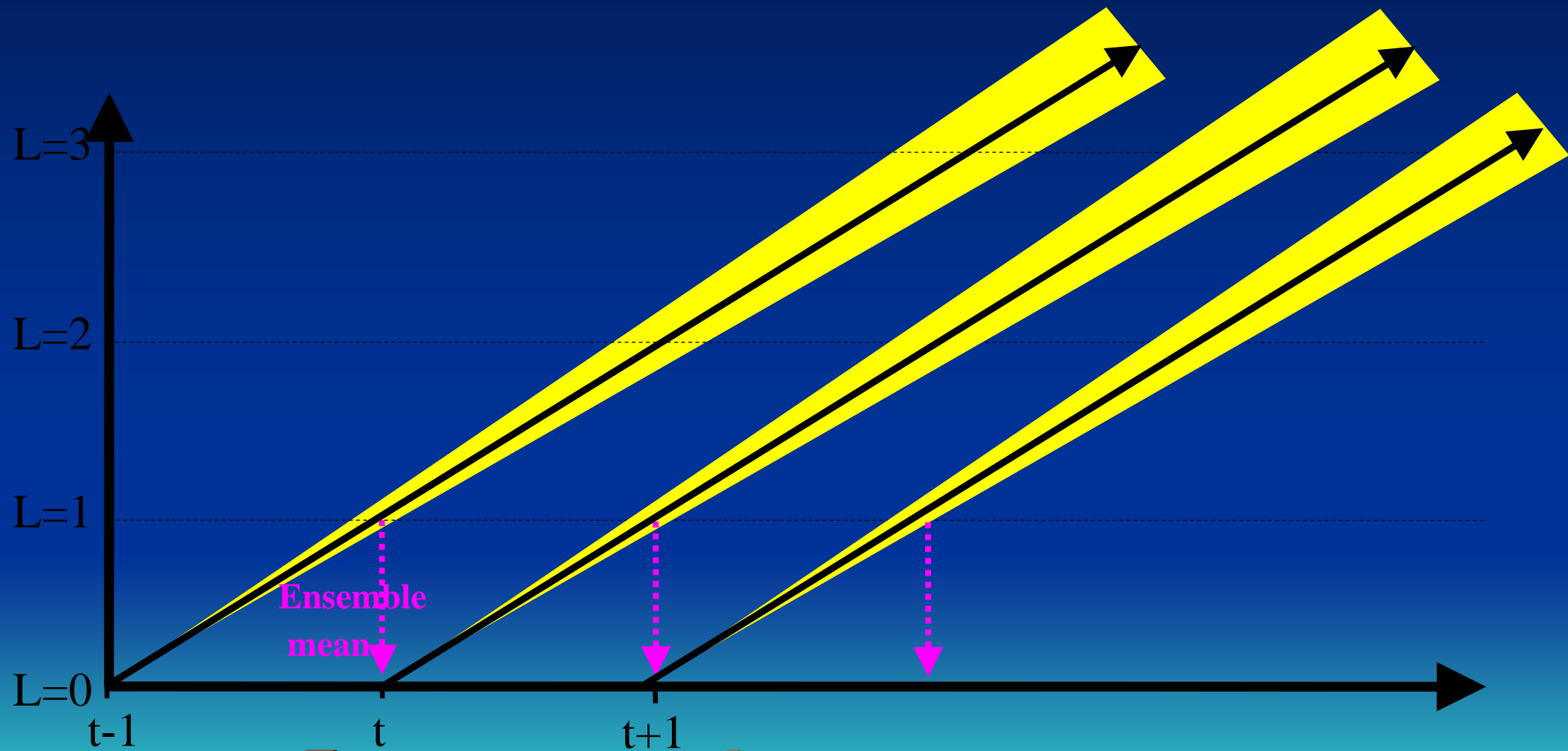
Output

9mon, 15 members

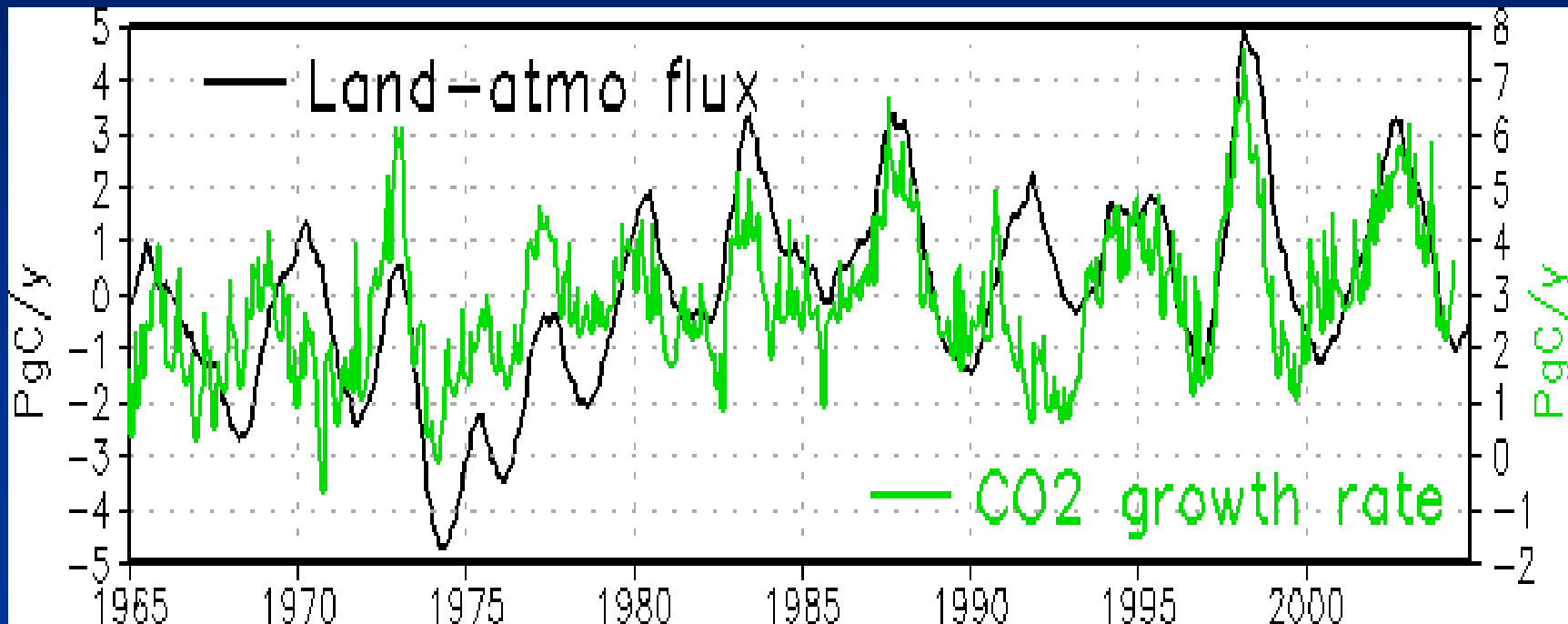
Month 1

Month 2

Forecasting procedure II



NEE('validation') and MLO CO2

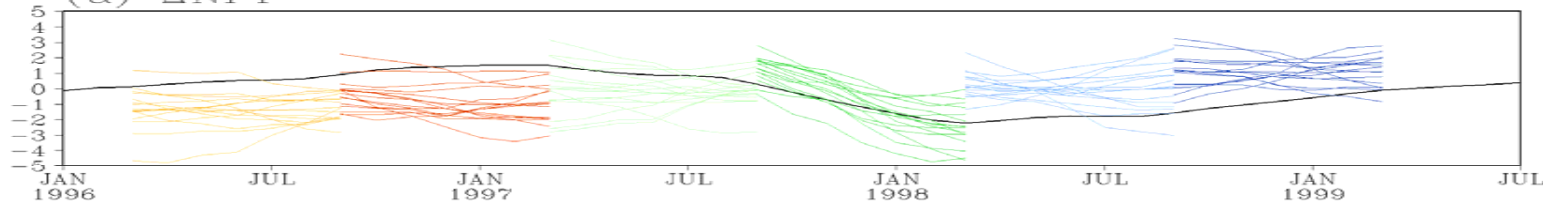


NEE (land-atmo C flux): VEGAS forced by observed climate (Precip, T)
This will be called 'observed' as there is no true observation available
Ocean contribution smaller, so NEE can be compared with MLO CO2

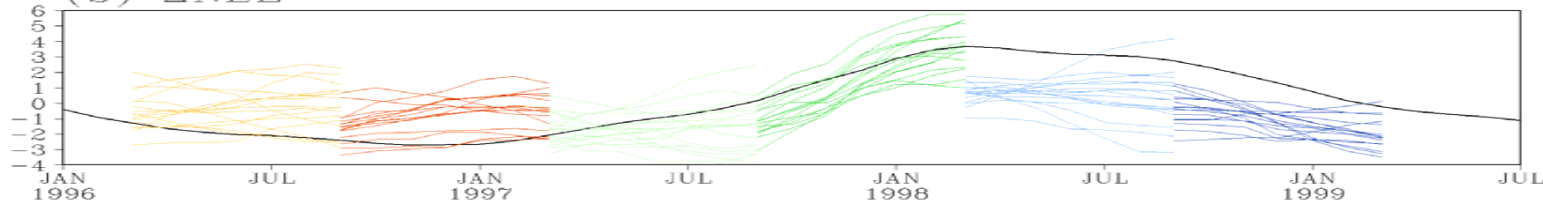
Plumes: NPP, P, T etc.

GB (1996–1998)

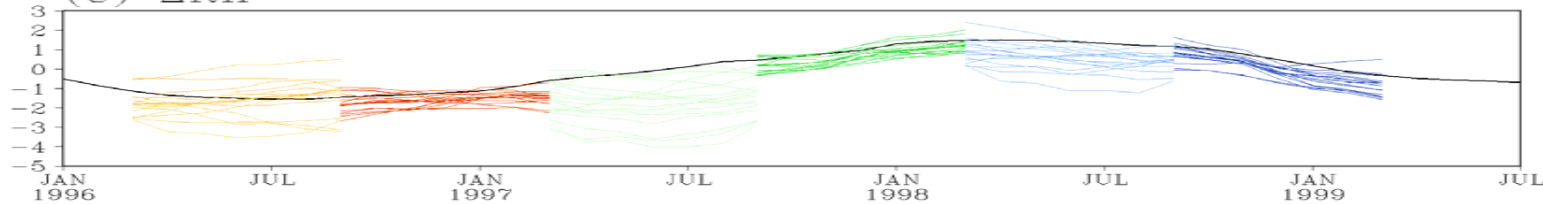
(a) ΔNPP



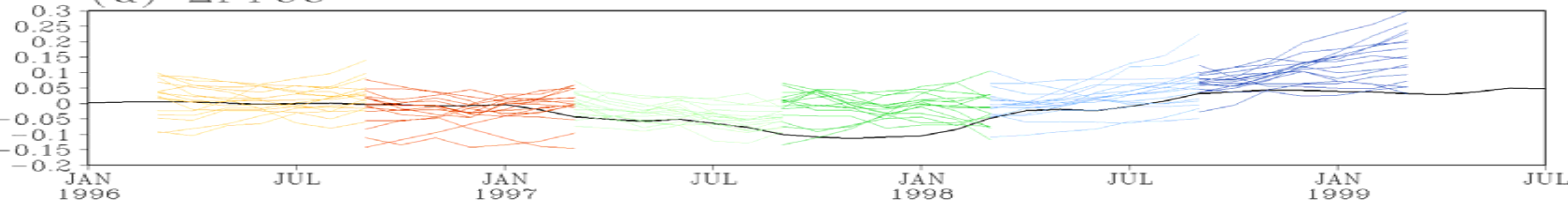
(b) ΔNEE



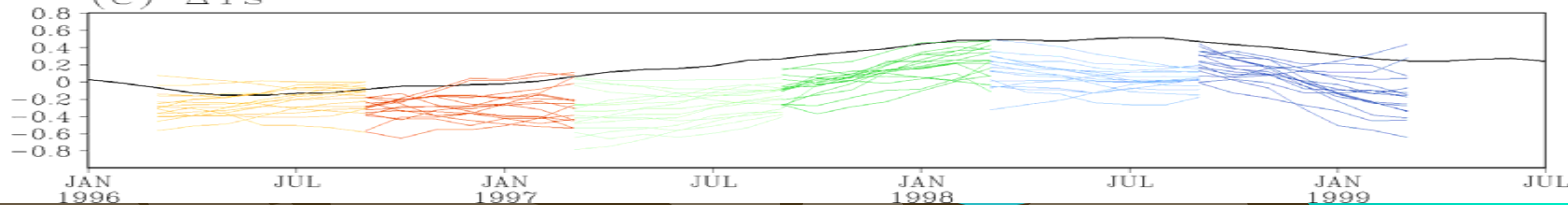
(c) ΔRh



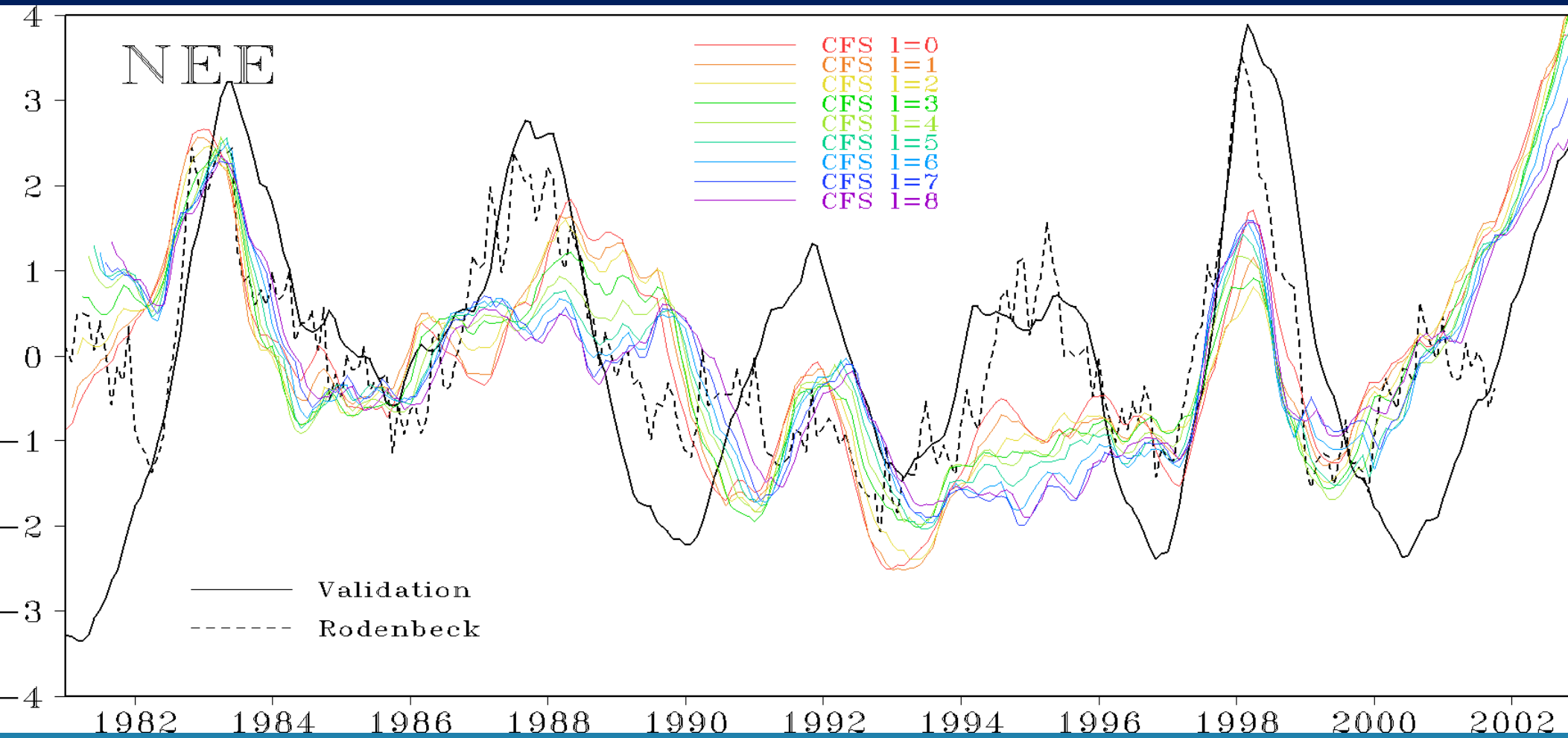
(d) $\Delta Prec$



(e) ΔTs

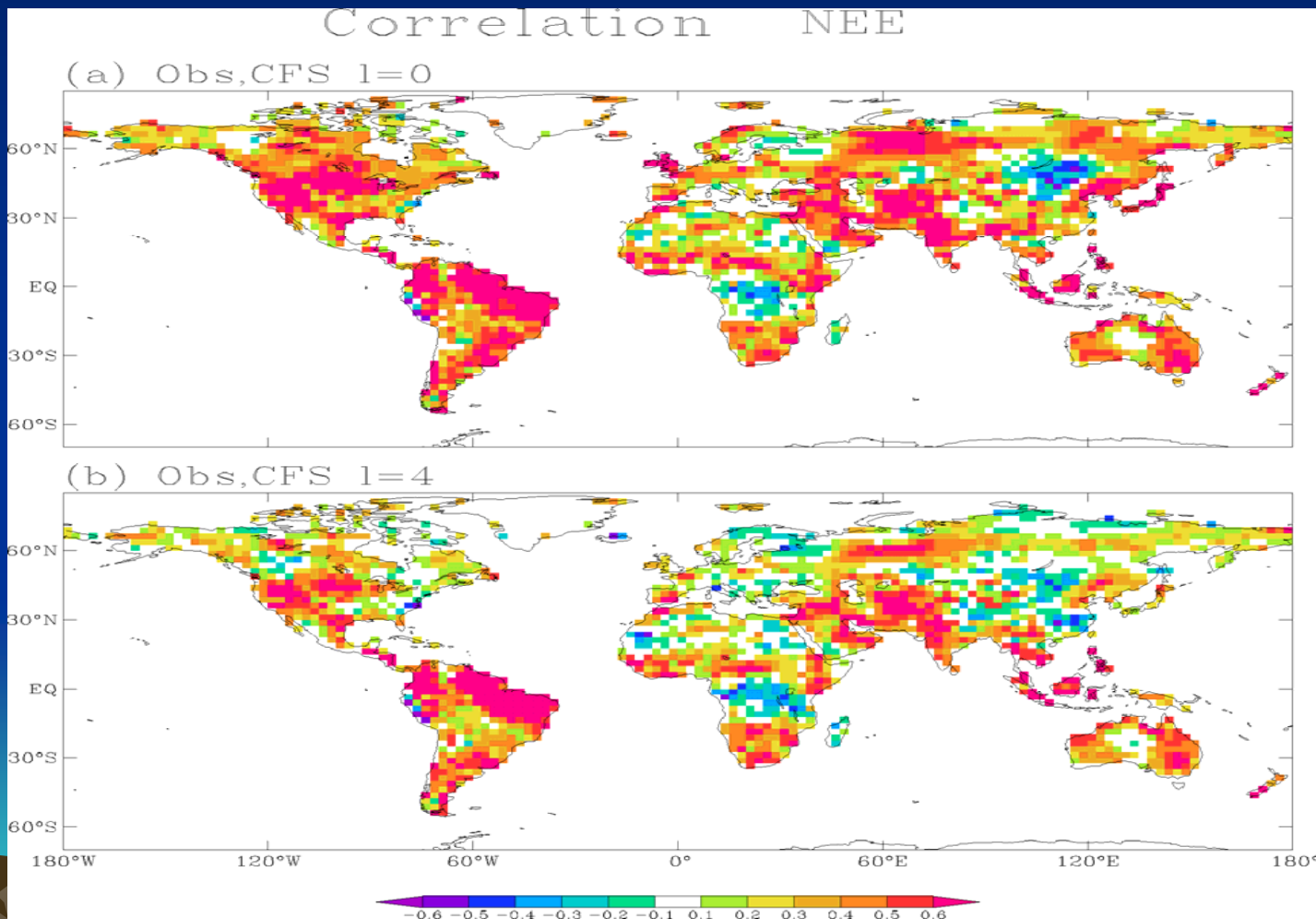


Predicted global carbon flux



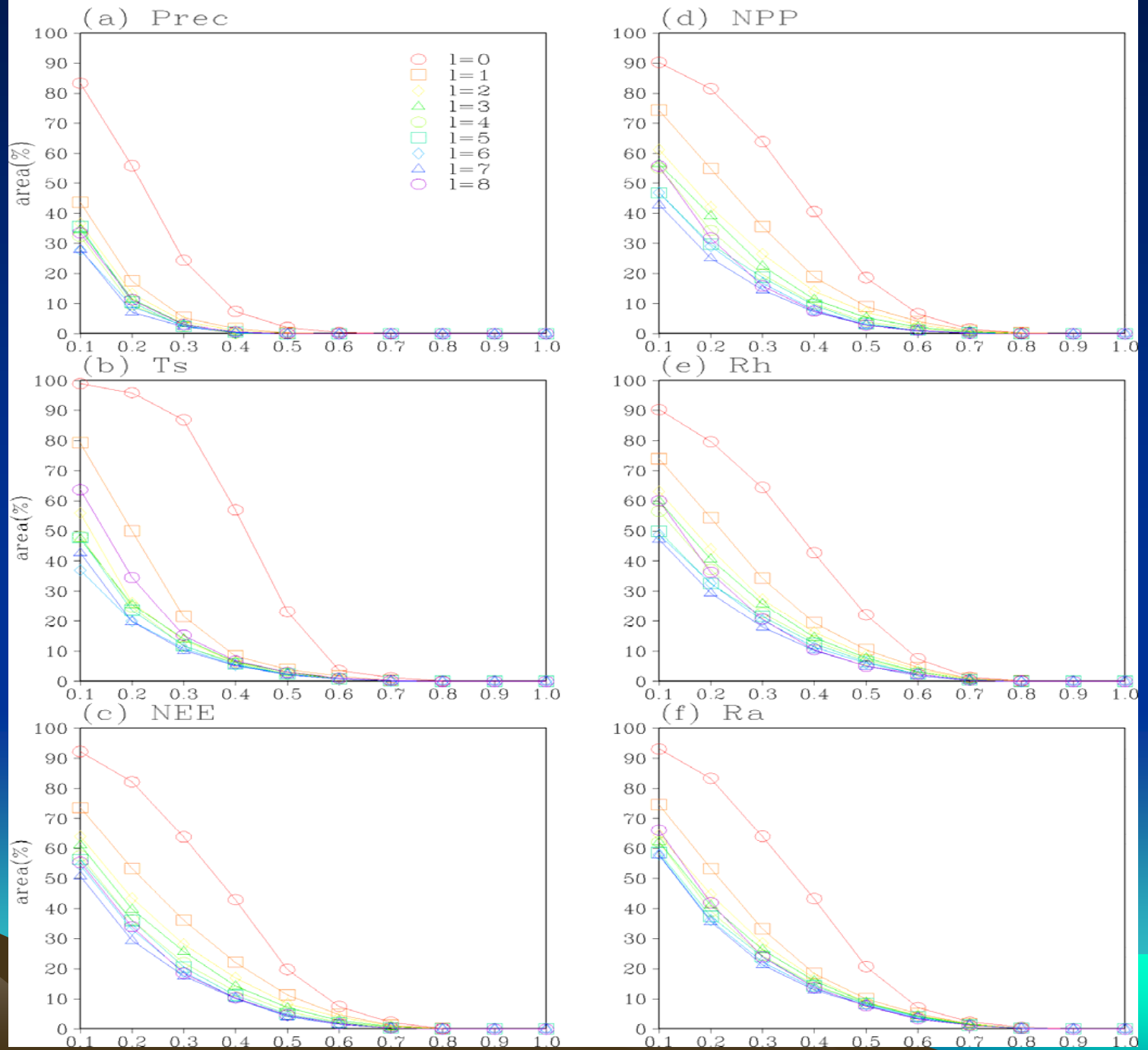
1. CFS/VEGAS captures most of the interannual variability, but
2. Amplitude is underestimated

Anomaly Correlation NEE

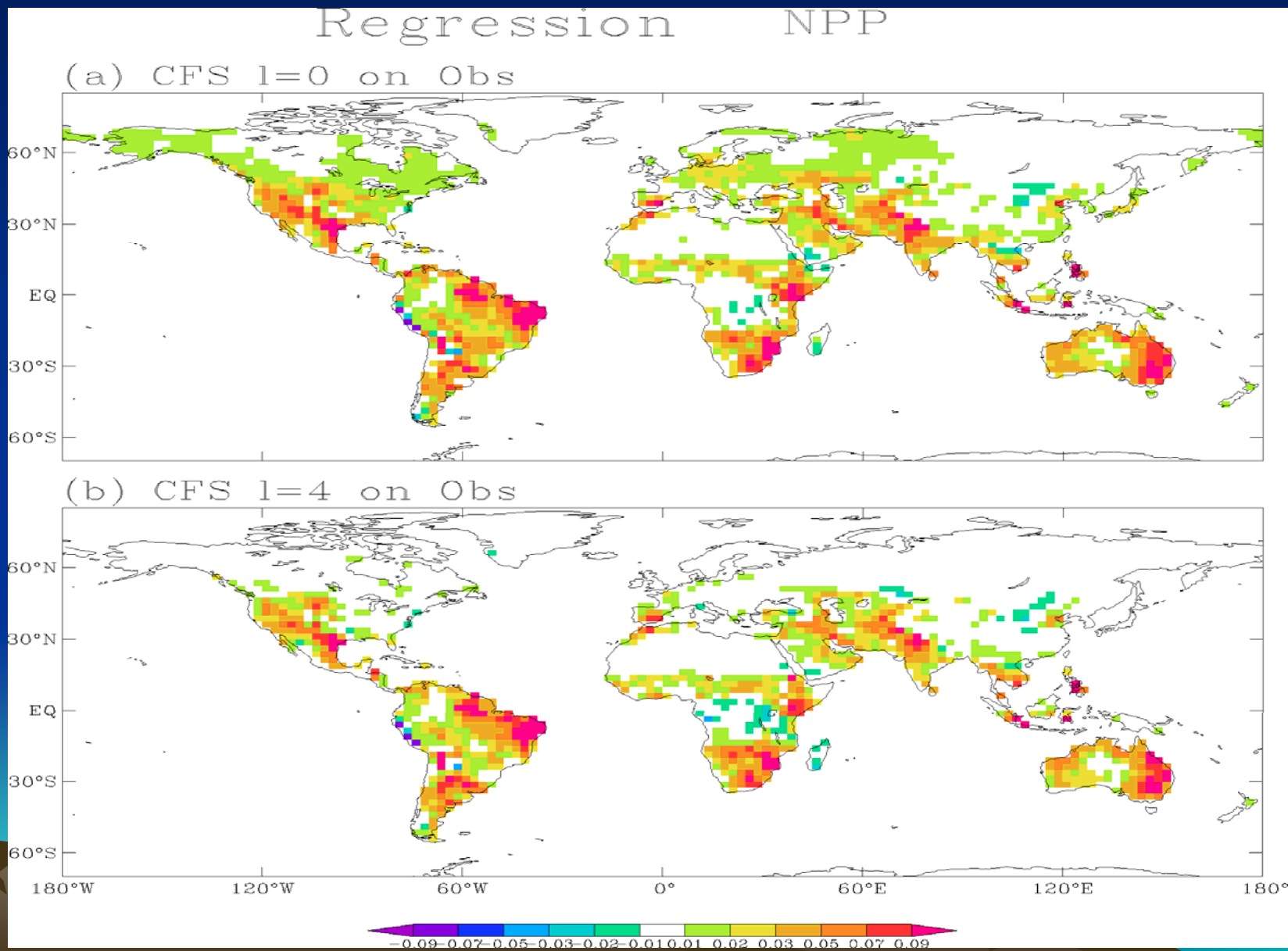


Summary of skill for anomaly correlation

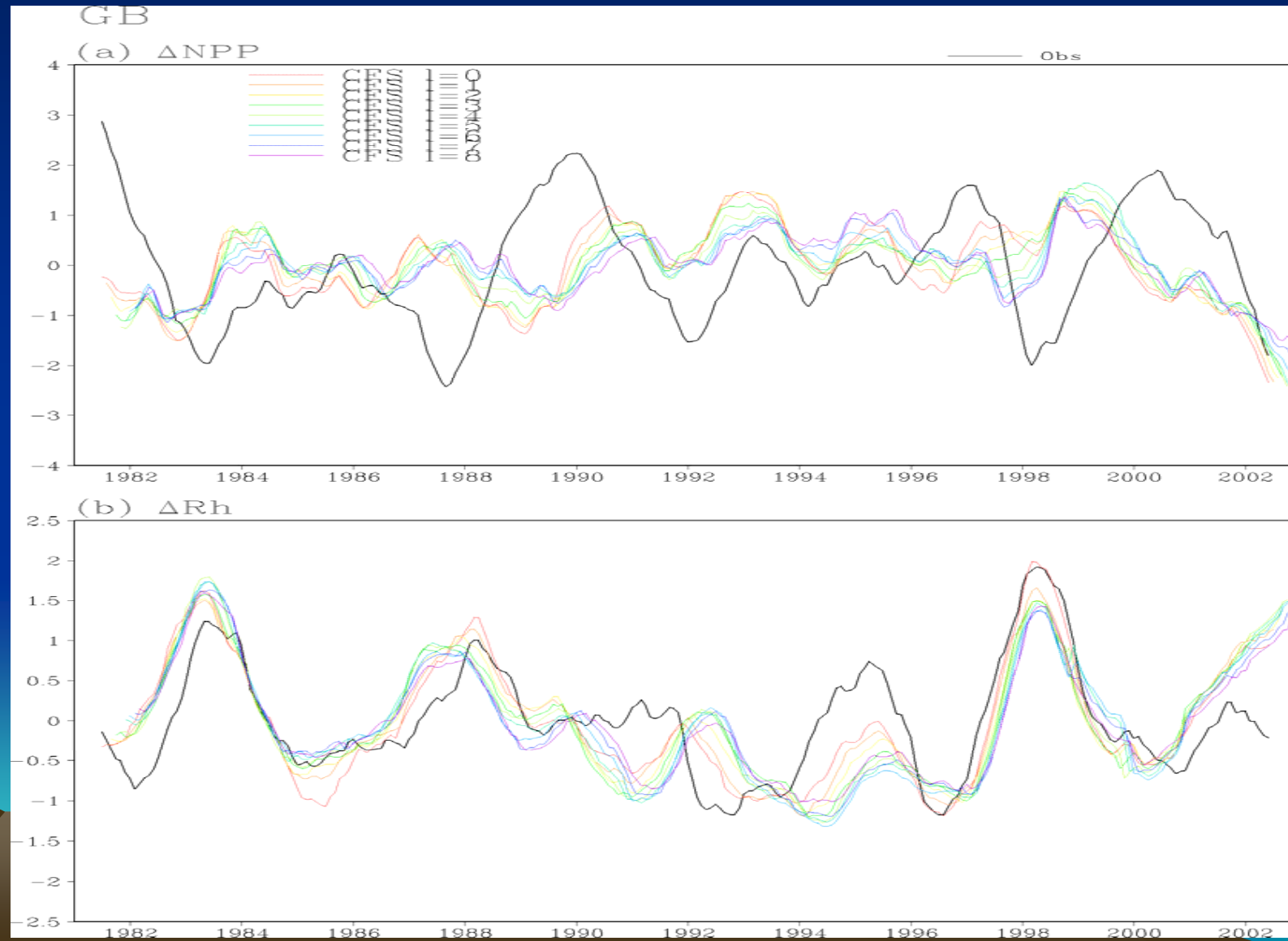
Correlation (CFS,Offline) anom



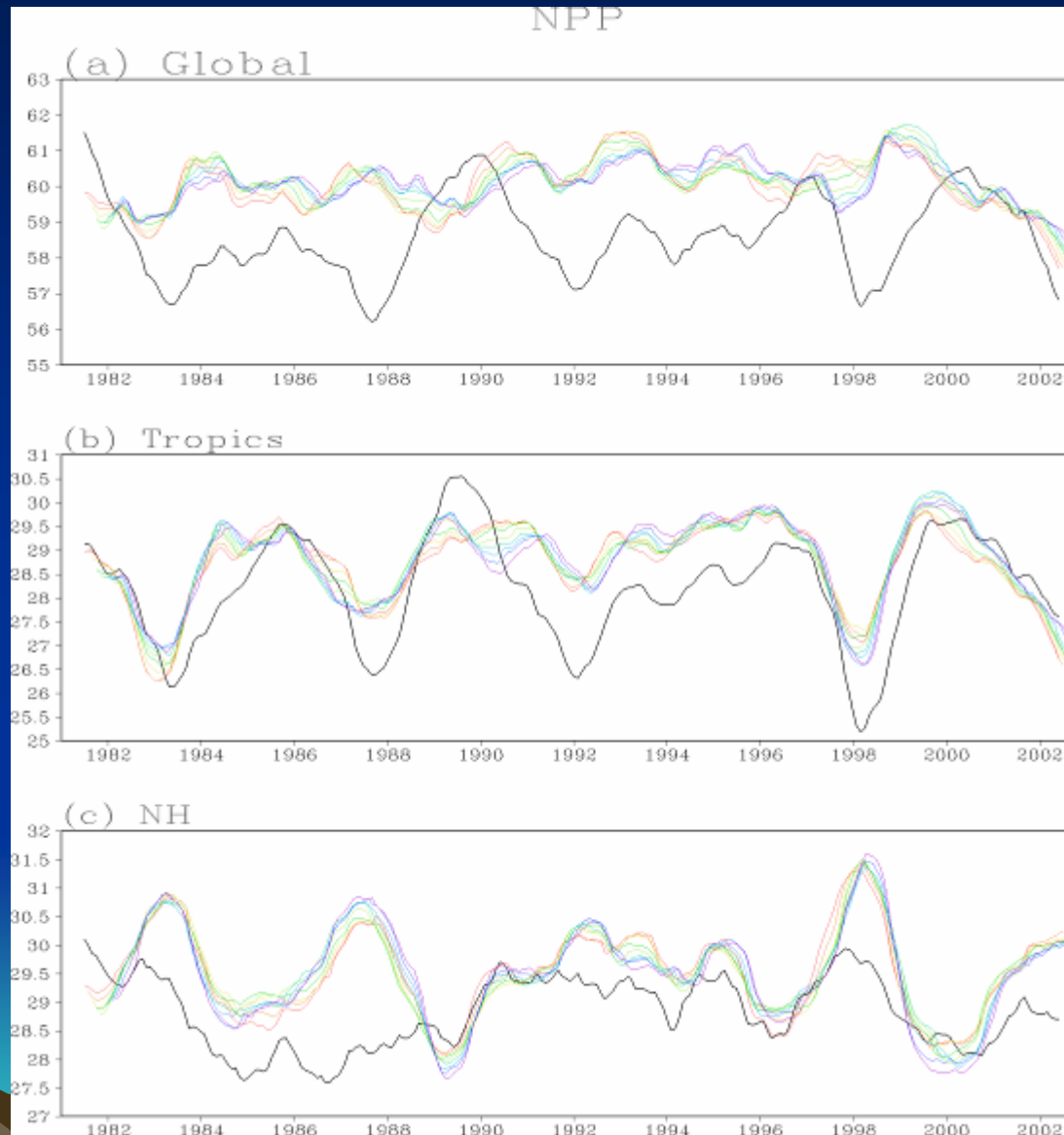
Predicted NPP vs. 'Validation' Regression



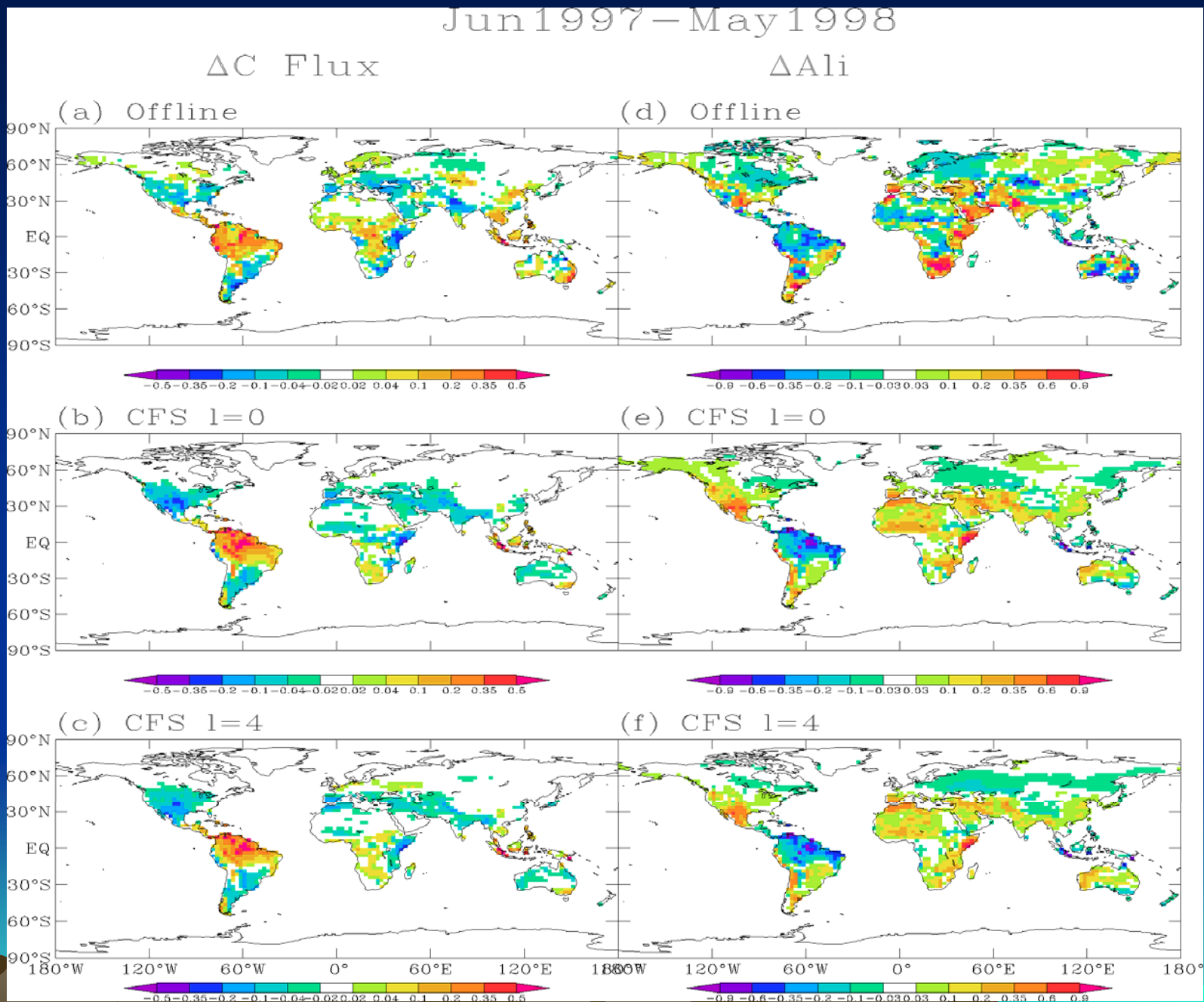
NPP and R_h ($NEE=R_h-NPP$)



Improvement of the prediction system: The NPP Problem

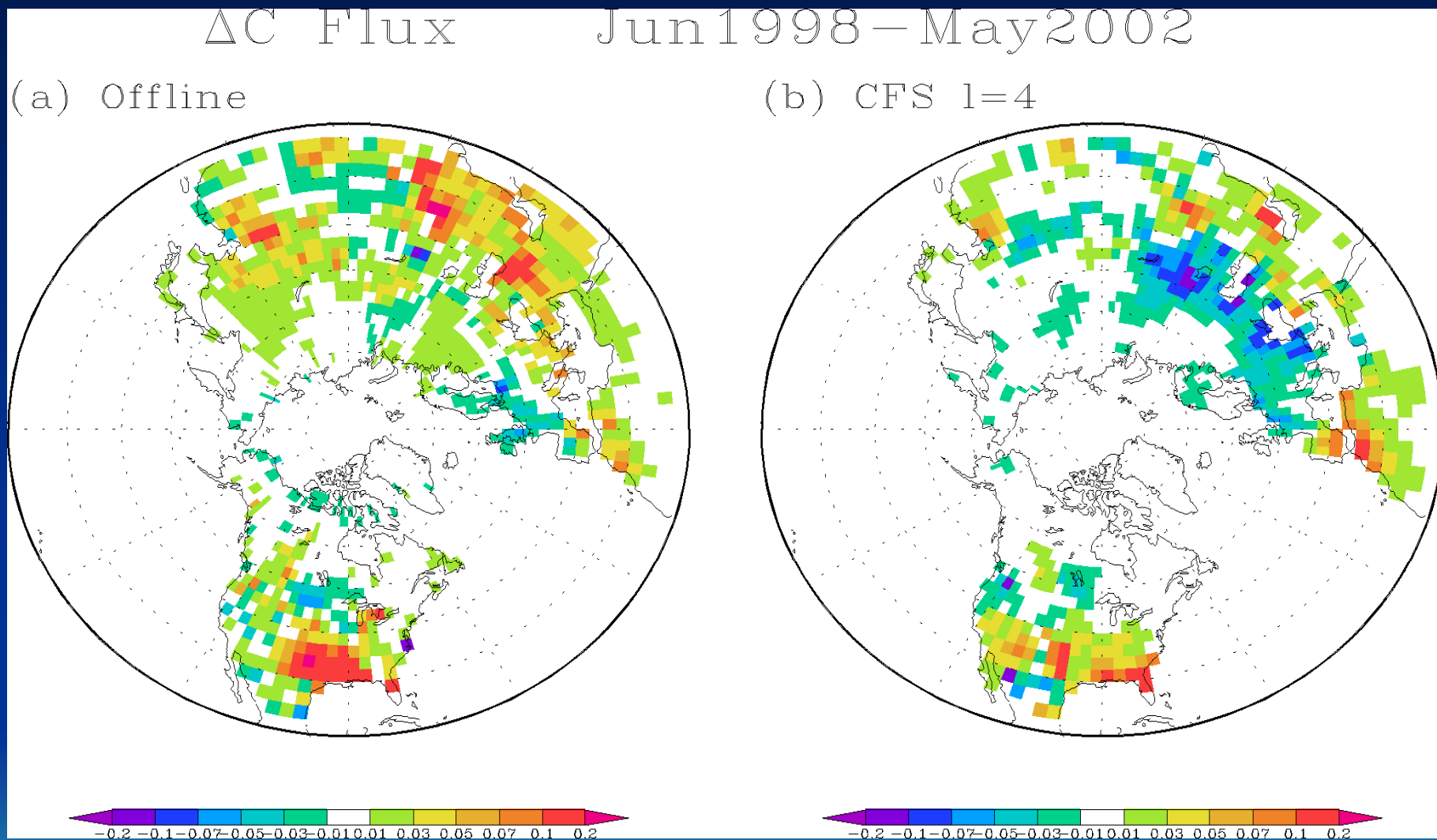


El Nino Jun97-May98 NEE/LAI



Combining statistical with dynamical method to improve the prediction

Beyond ENSO: 1998-2002 Midlatitude Drought



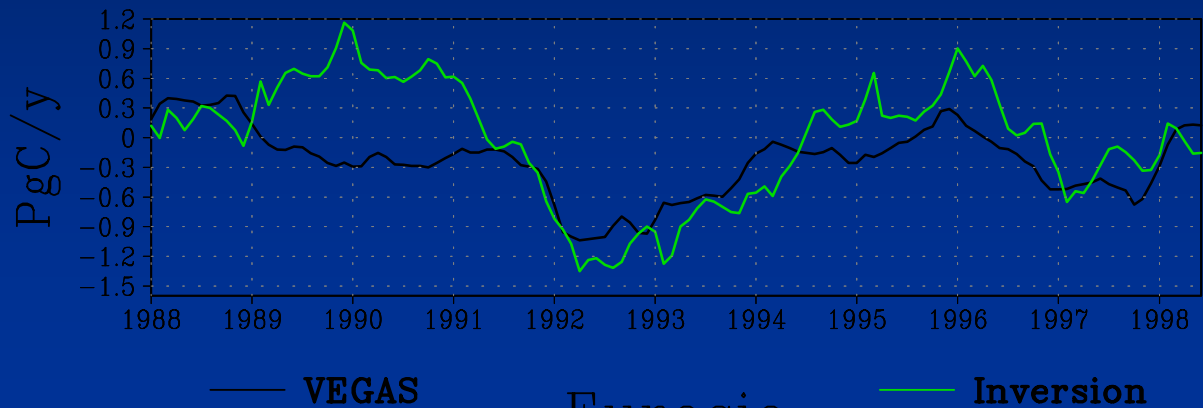
Other variability not related to ENSO or other known climate modes, can also be captured in a dynamical prediction system

Conclusions: prediction

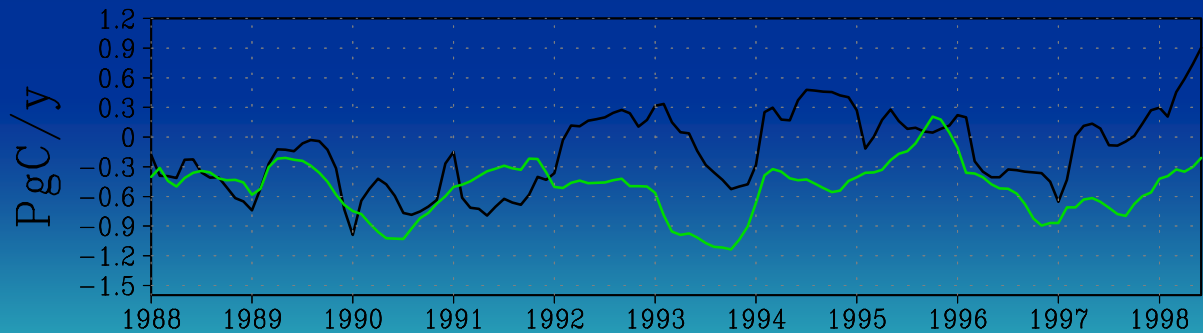
- Encouraging results (better than expected)
- Issues
 - Overestimation at midlatitude screws up global NPP, and too small NEE compared to MLO CO₂
 - Other analysis methods?
 - Terminology: forecast, hindcast, retrospective
- Implications of prediction
 - Applications to ecosystem and carbon cycle
 - A new framework for study eco-carbon response and feedback to climate
 - Identifying ways of incorporating eco-carbon dynamics in the next generation of climate prediction models

Extratropics: forward model comparison with atmo inversion

N. America



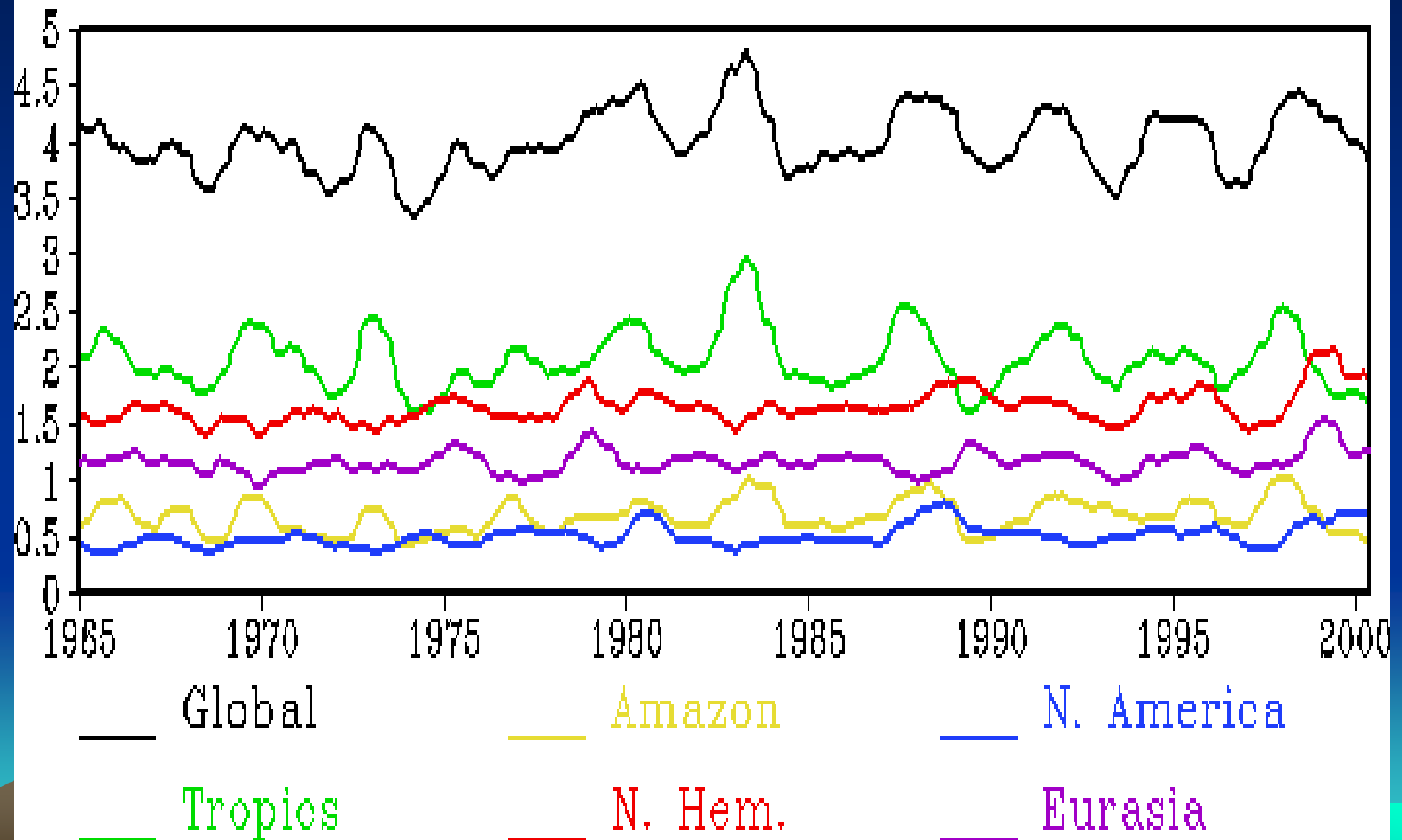
Eurasia



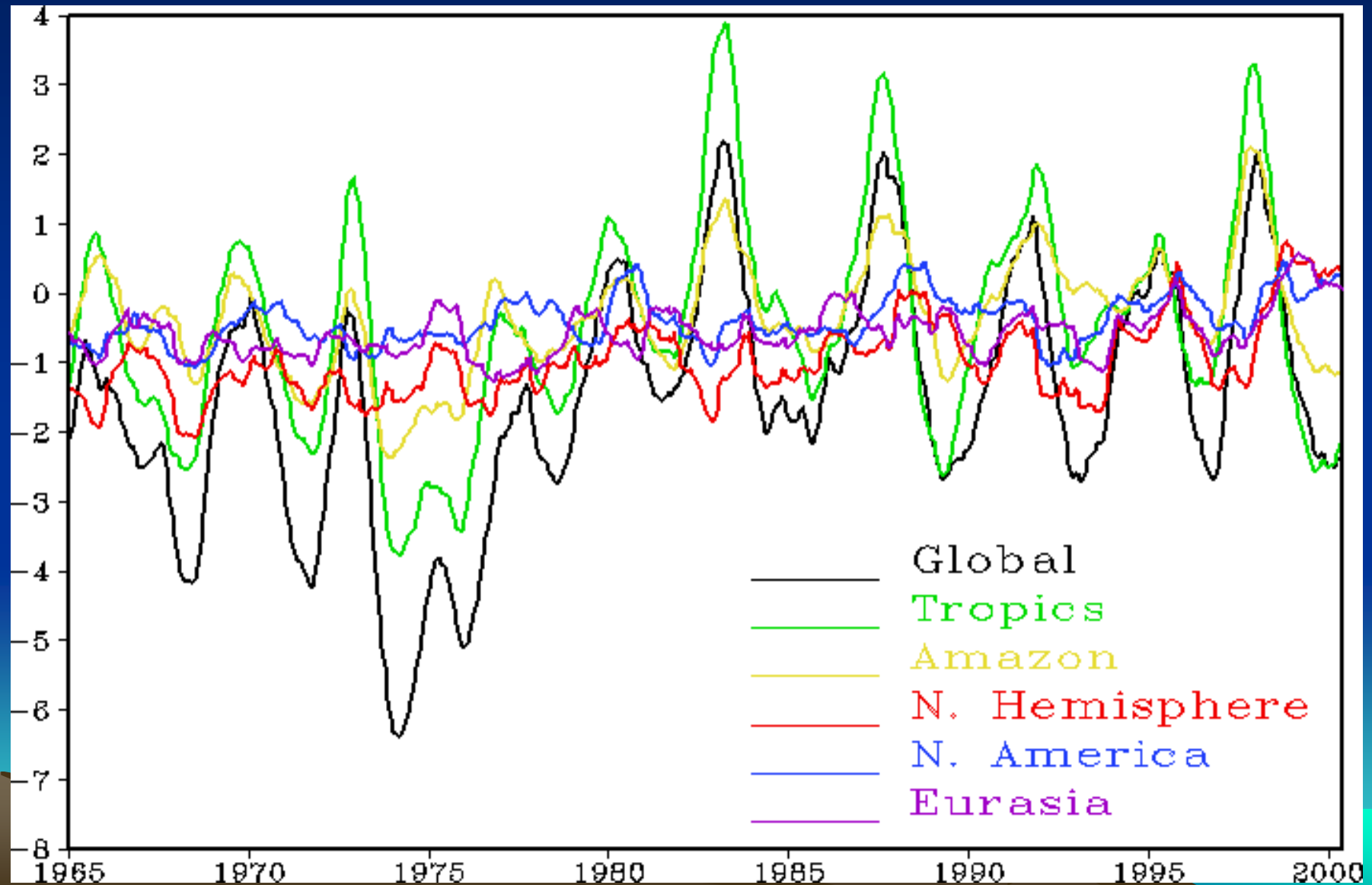
VEGAS

Atmo. Inversion
(Bousquet et al., 2000)

Direct fire carbon flux

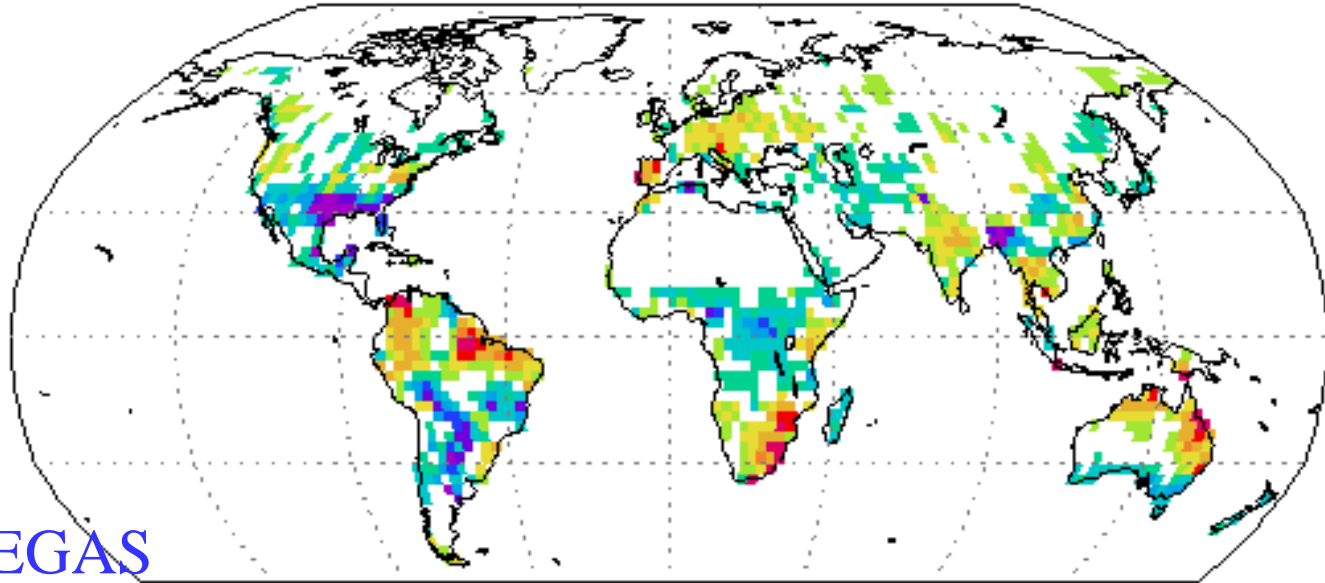


Carbon flux from various regions

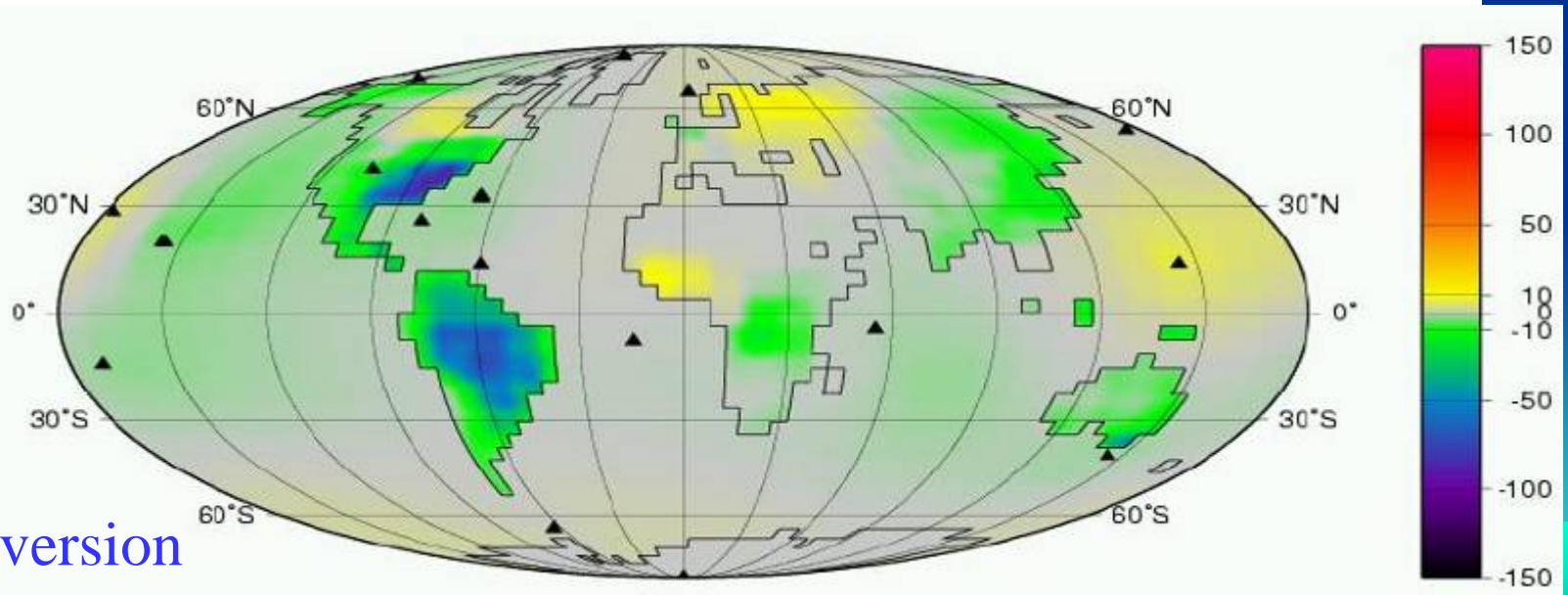


Post-Pinatubo Jun1991-May1993

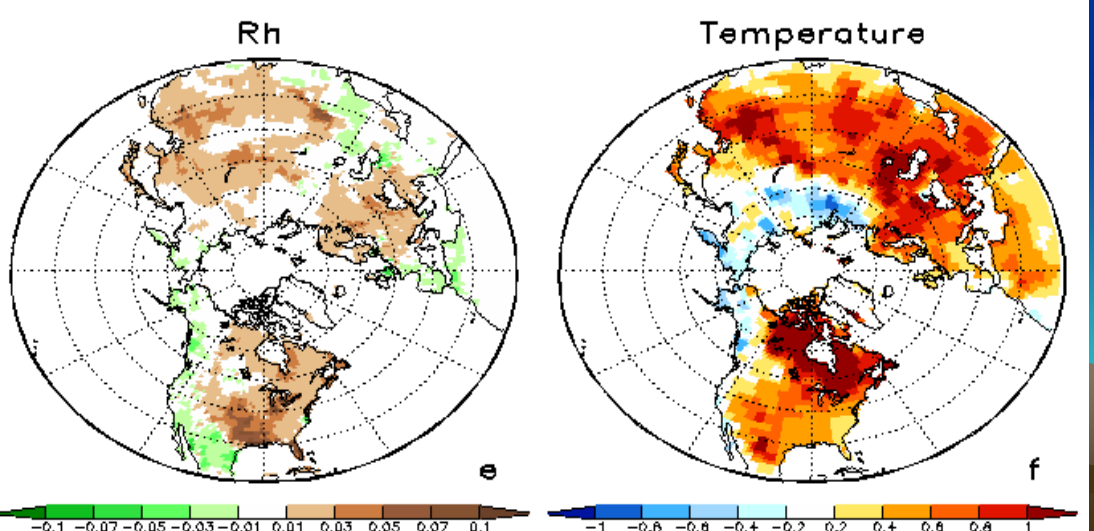
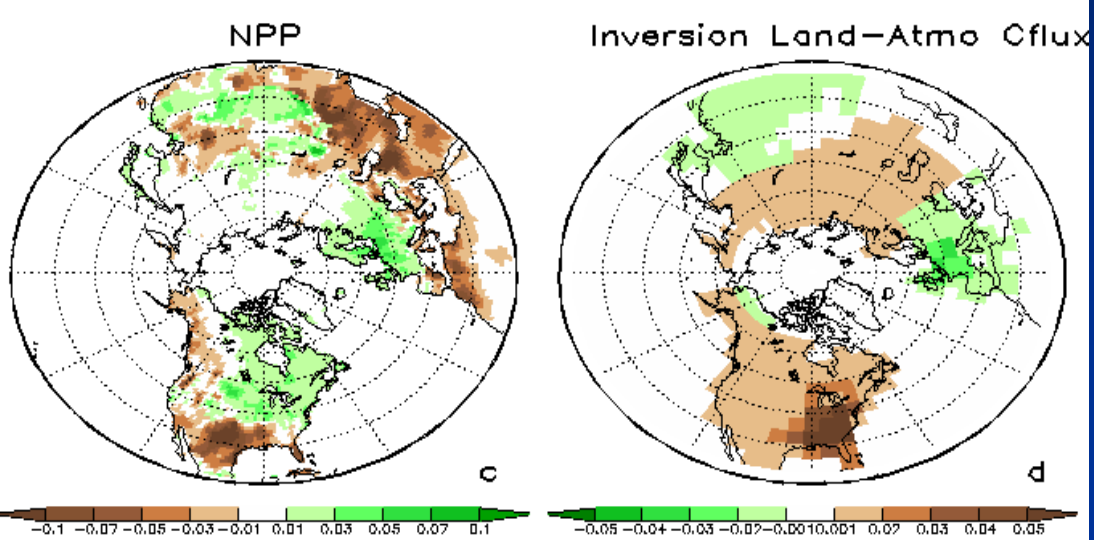
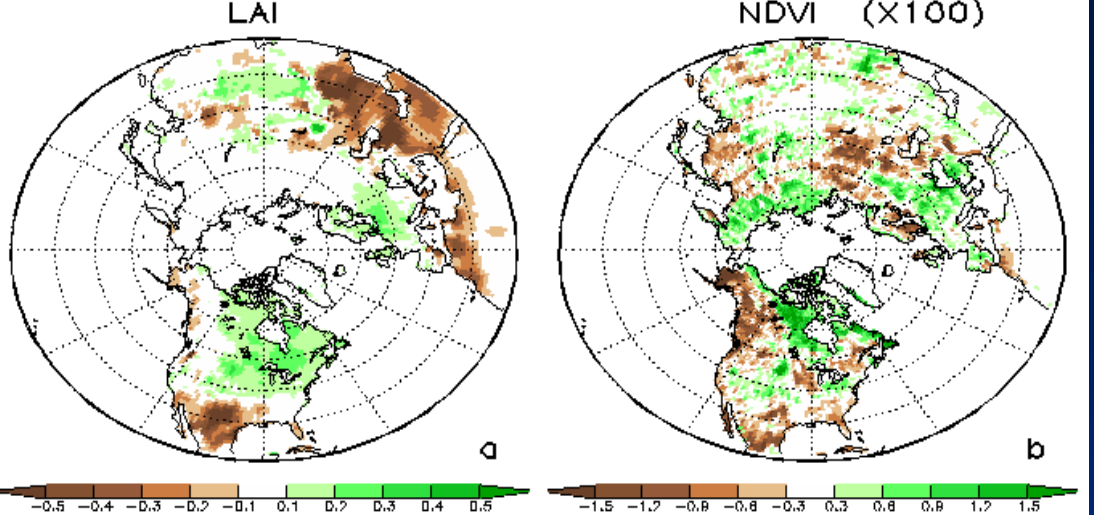
C Flux anomalies (Jun1991-May1993)



VEGAS

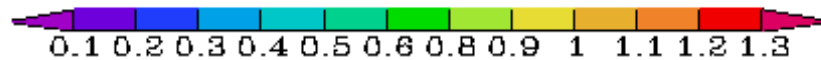
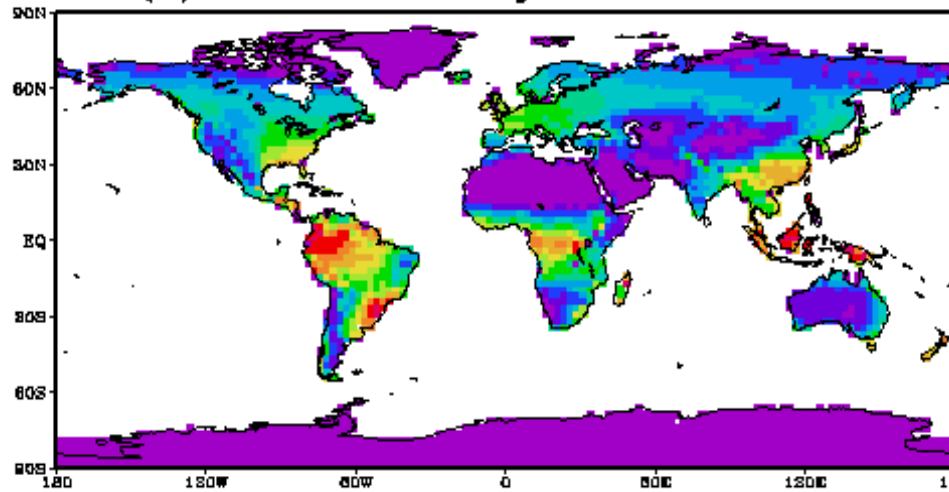


Inversion
Roedenbeck (2003)

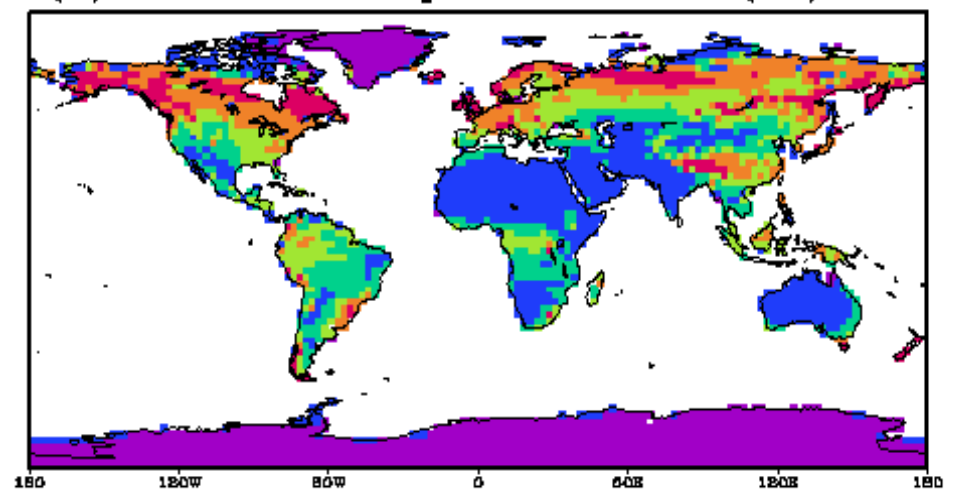


NPP and carbon pools

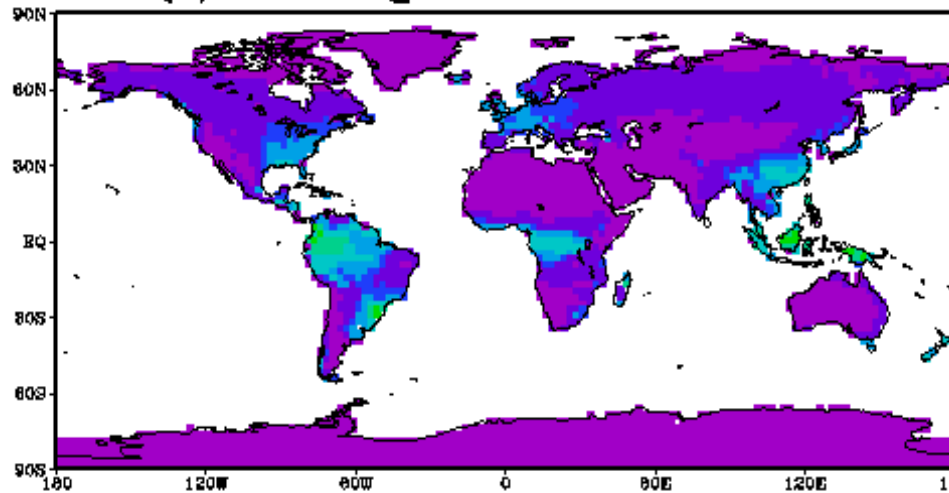
(a) Net Primary Production



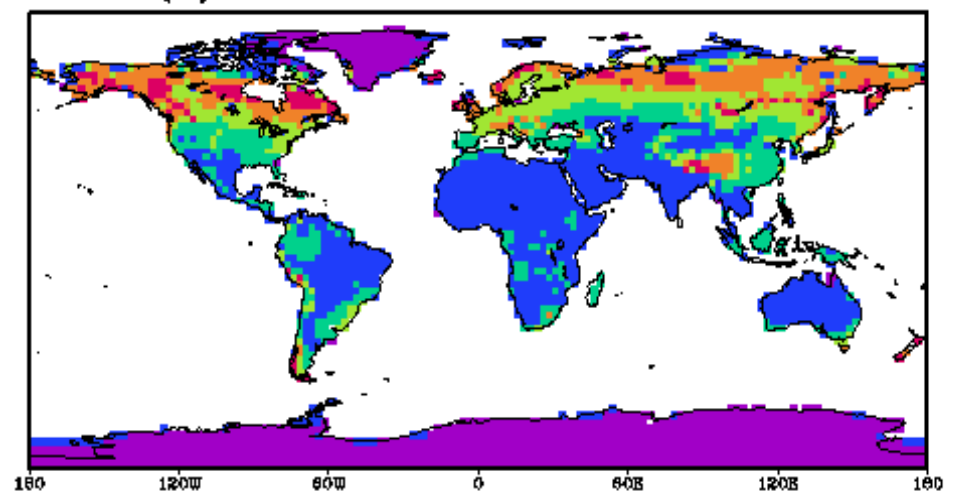
(b) Active Biospheric Carbon (Cb)



(c) Vegetation Carbon

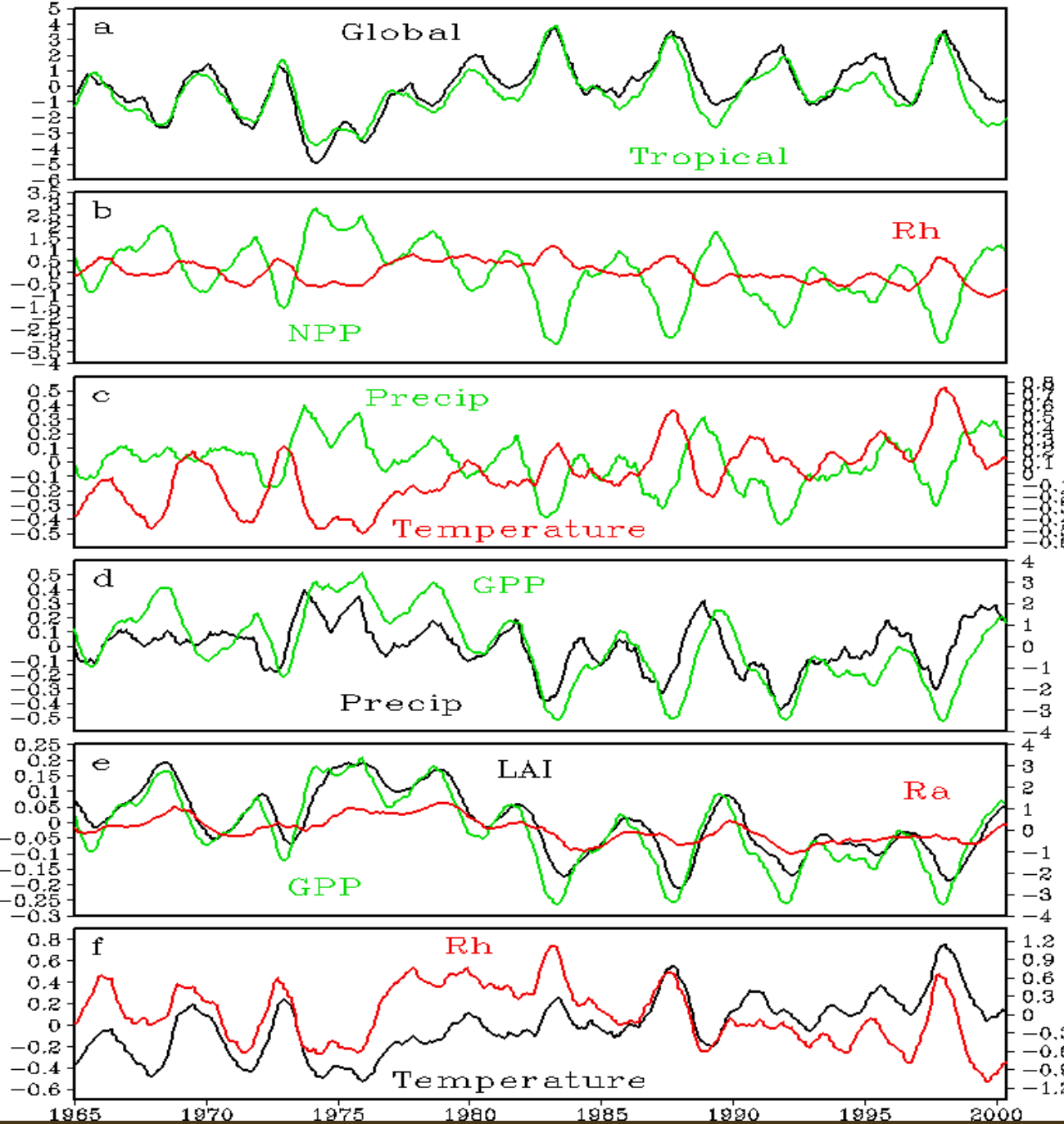


(d) Soil Carbon



Why CO2 correlates so well with ENSO: A 'conspiracy' theory

Tropics



Tropics during El Nino

Precipitation decrease

Temperature increase

Out of phase

NPP decrease

Rh increase

Additive

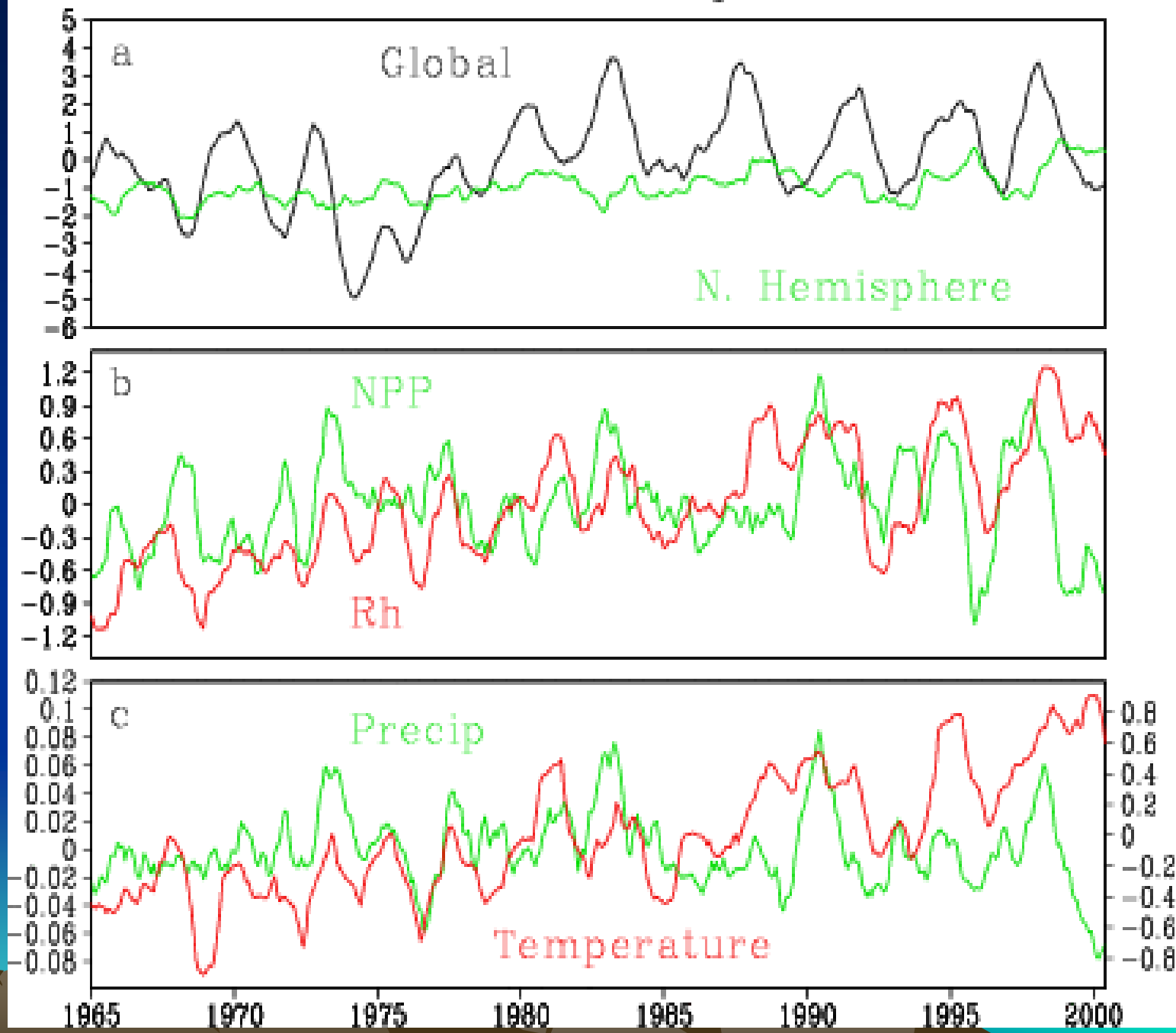
Land-atmo flux (Rh-NPP) increase

+

Spatially coherent climate anomalies

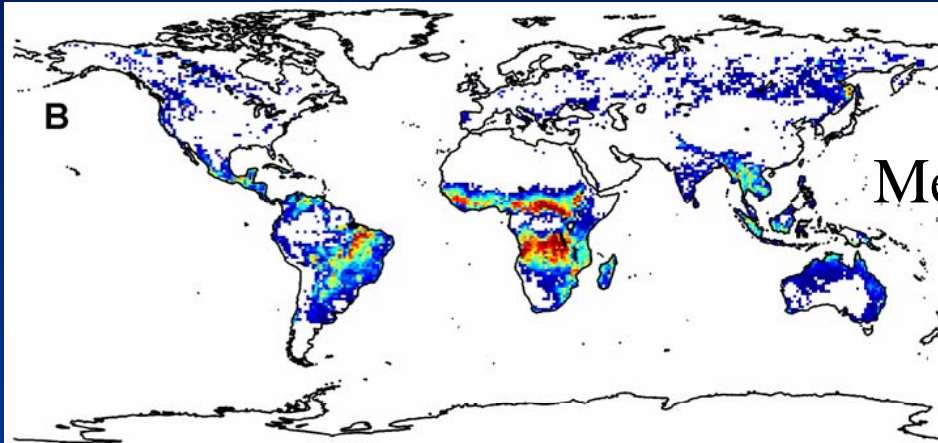
Large land-atmo C flux

Northern Hemisphere

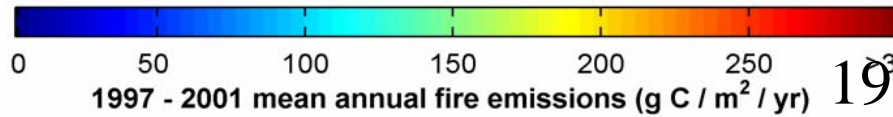


Fire carbon flux during 1997-98 El Nino

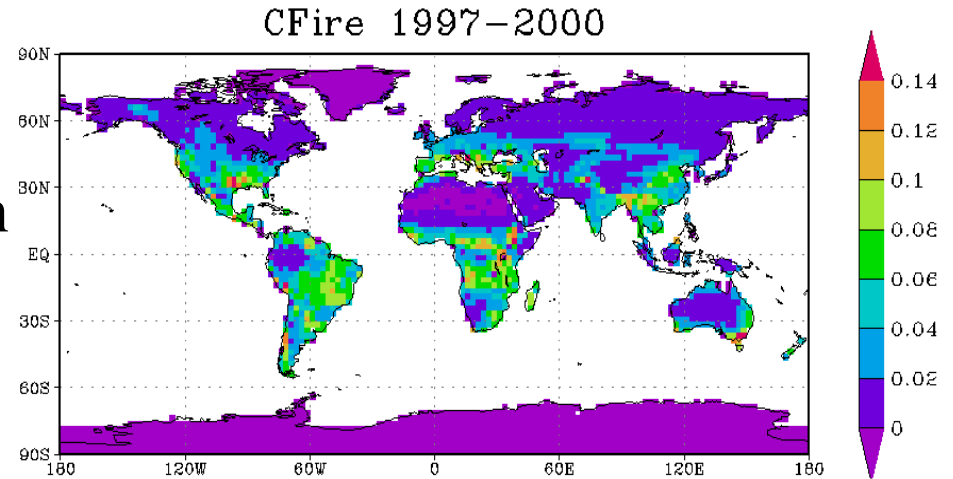
CASA (satellite fire, climate)



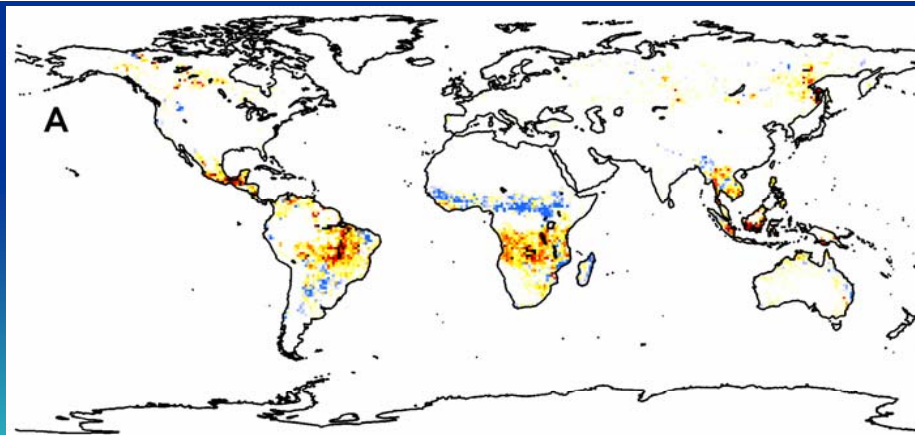
Mean



VEGAS (climate only)

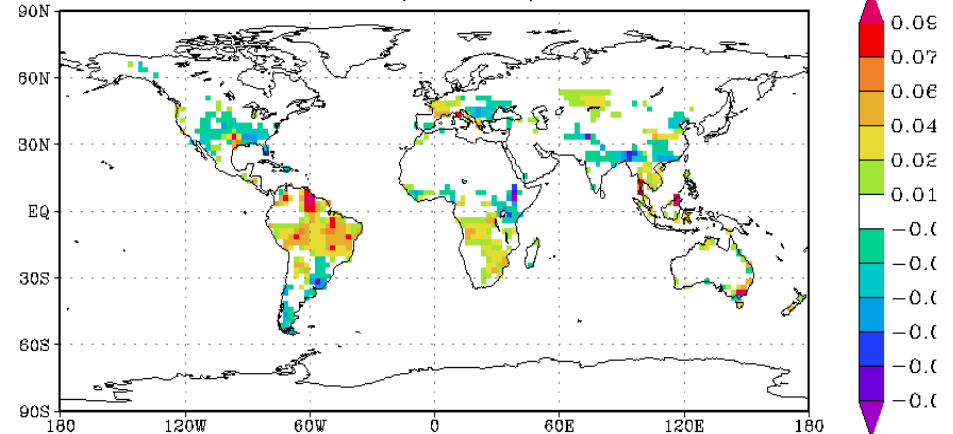


1997-98 El Nino Anomalies



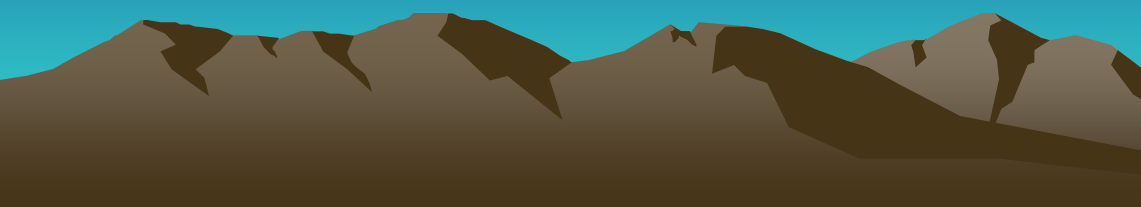
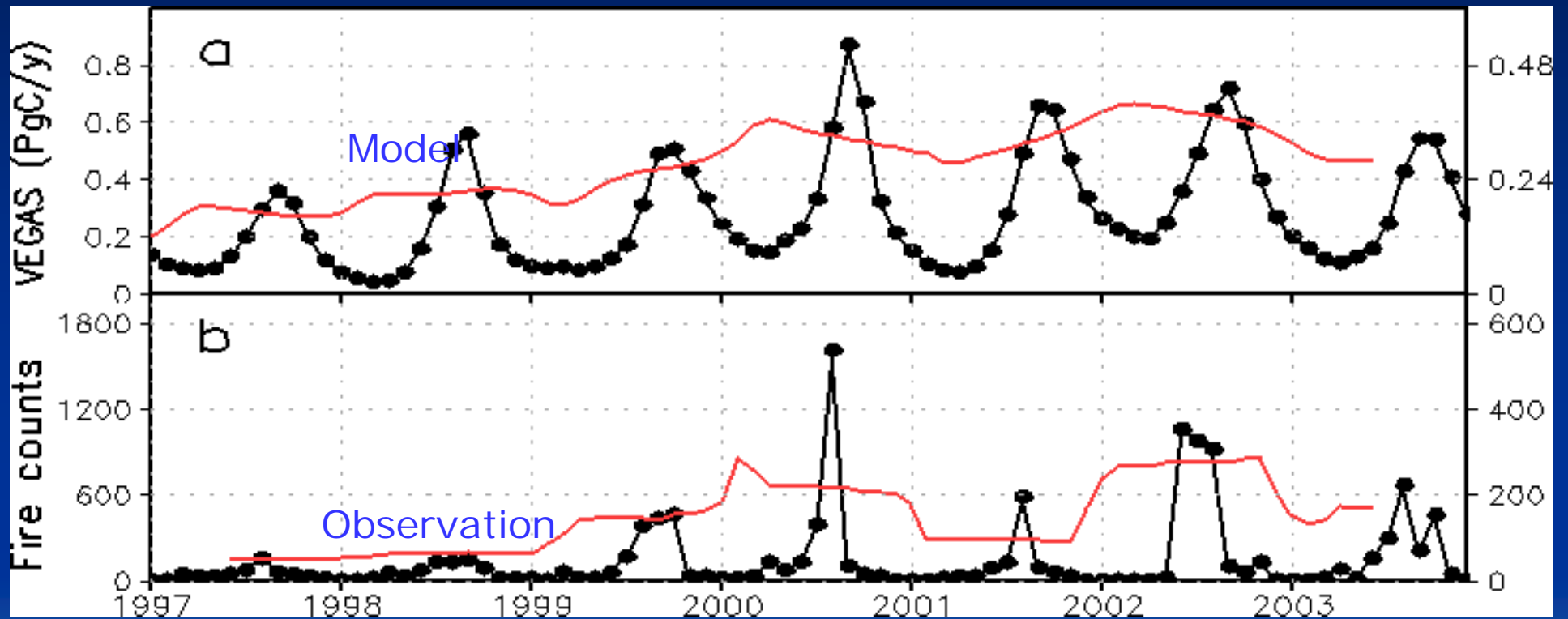
Input: satellite fire counts, climate
1997-2001 mean annual fire emissions anomaly (g C / m² / yr)

CFire anomalies 7/97-8/98 minus 9700



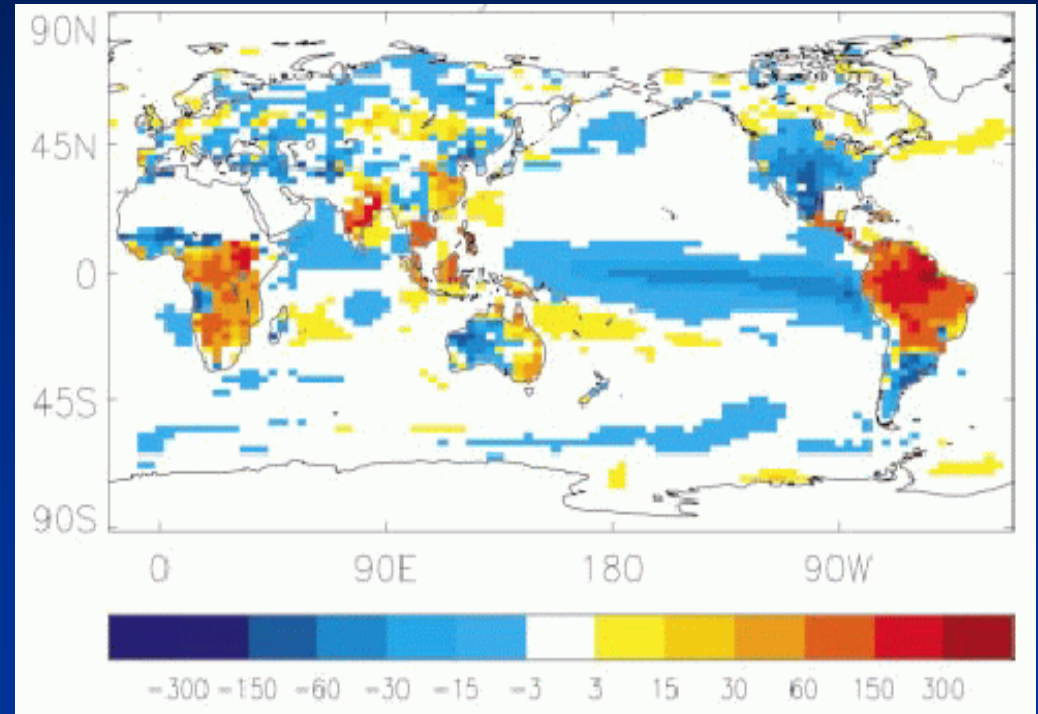
Input: climate only

Fire in the US: Natural vs anthropogenic factors



El Nino-like climate under global warming? Carbon consequences

■



Similar processes may operate
on interannual time scales and
under global warming scenarios

An Earth System Model at UMD

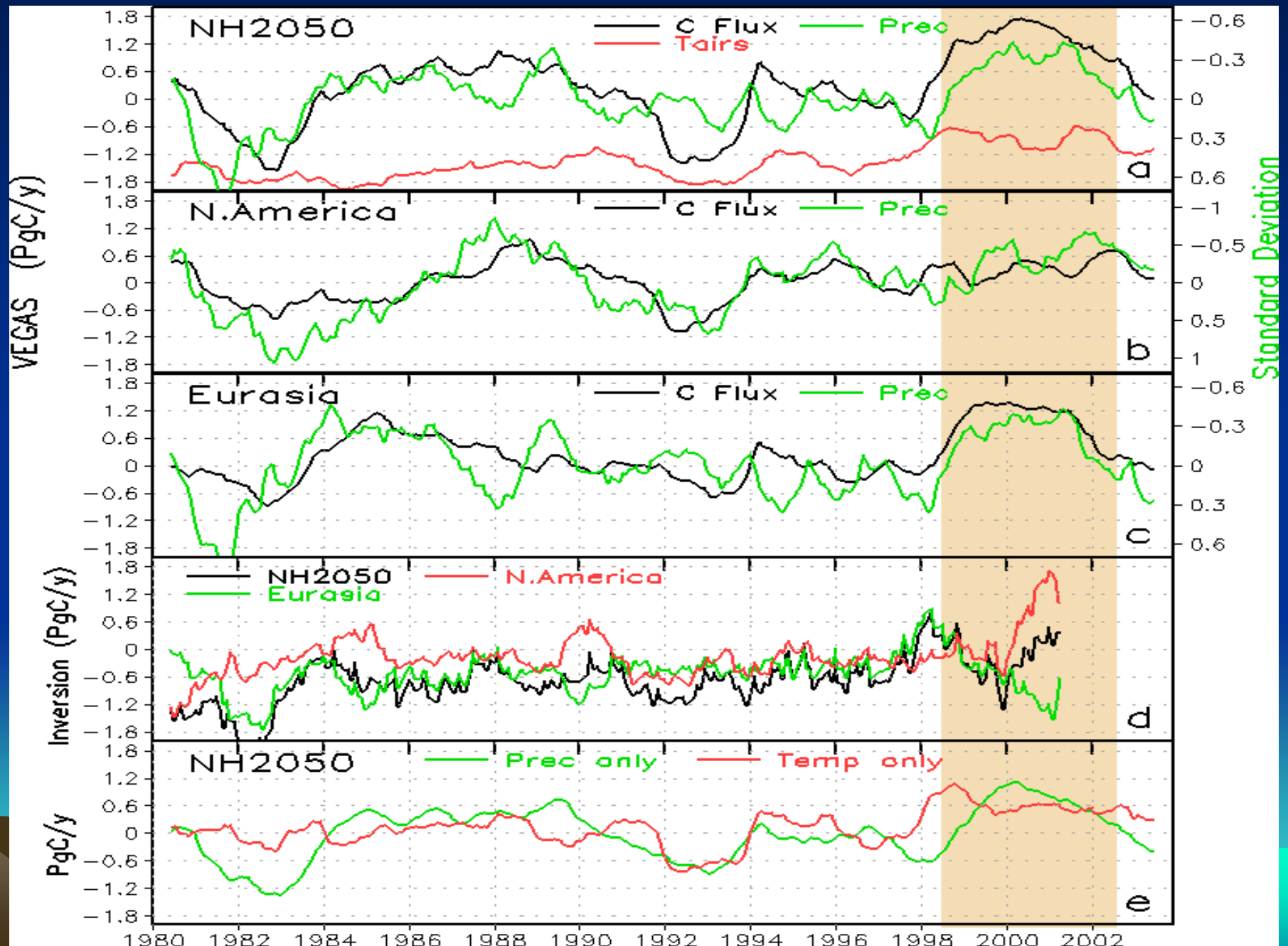
- Team Members

- N. Zeng, R. Murtugudde, A. Busalacchi, R. DeFries (U of Maryland)

- Collaborators

- J. Christian (CCCMA)
 - G. J. Collatz (NASA/GSFC)
 - M. Heimann , C. Roedenbeck (Max-Planck Inst.)
 - A. Mariotti, R. Iacono (ENEA)
 - R. Feely (PMEL)
- 

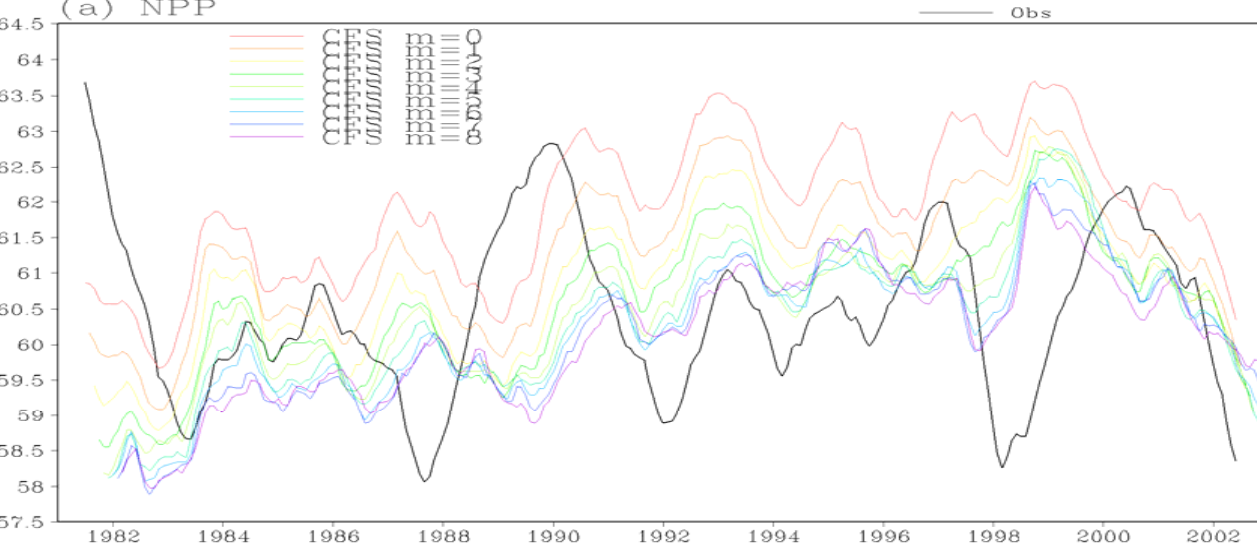
Drying or Warming?



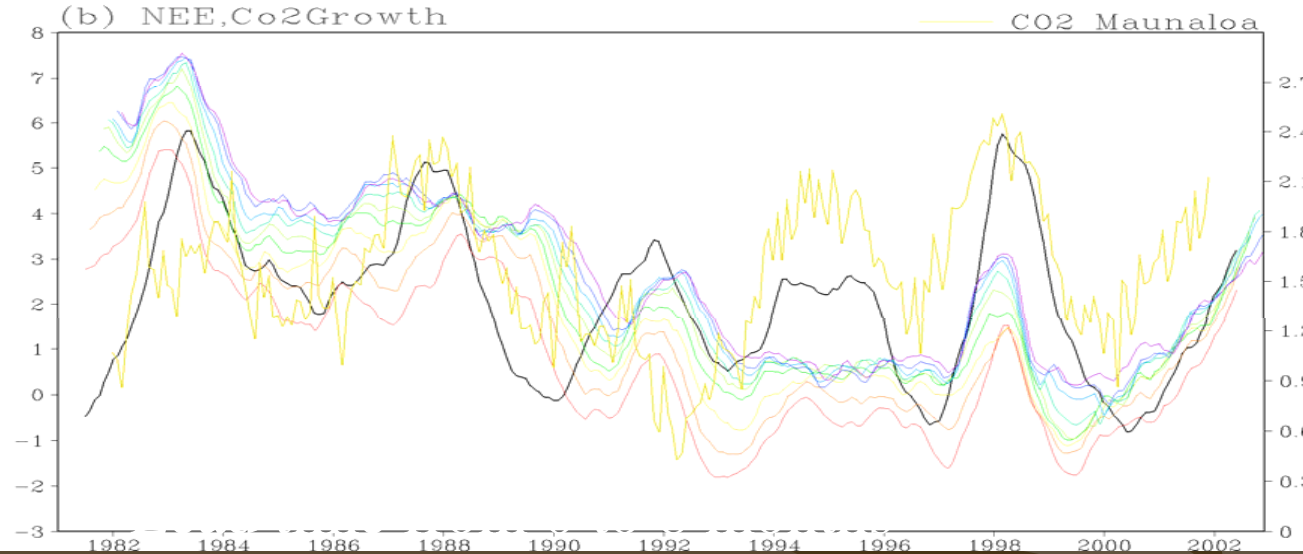
NPP/NEE original—A Drift Problem

GB (12month runme)

(a) NPP



(b) NEE, Co2Growth



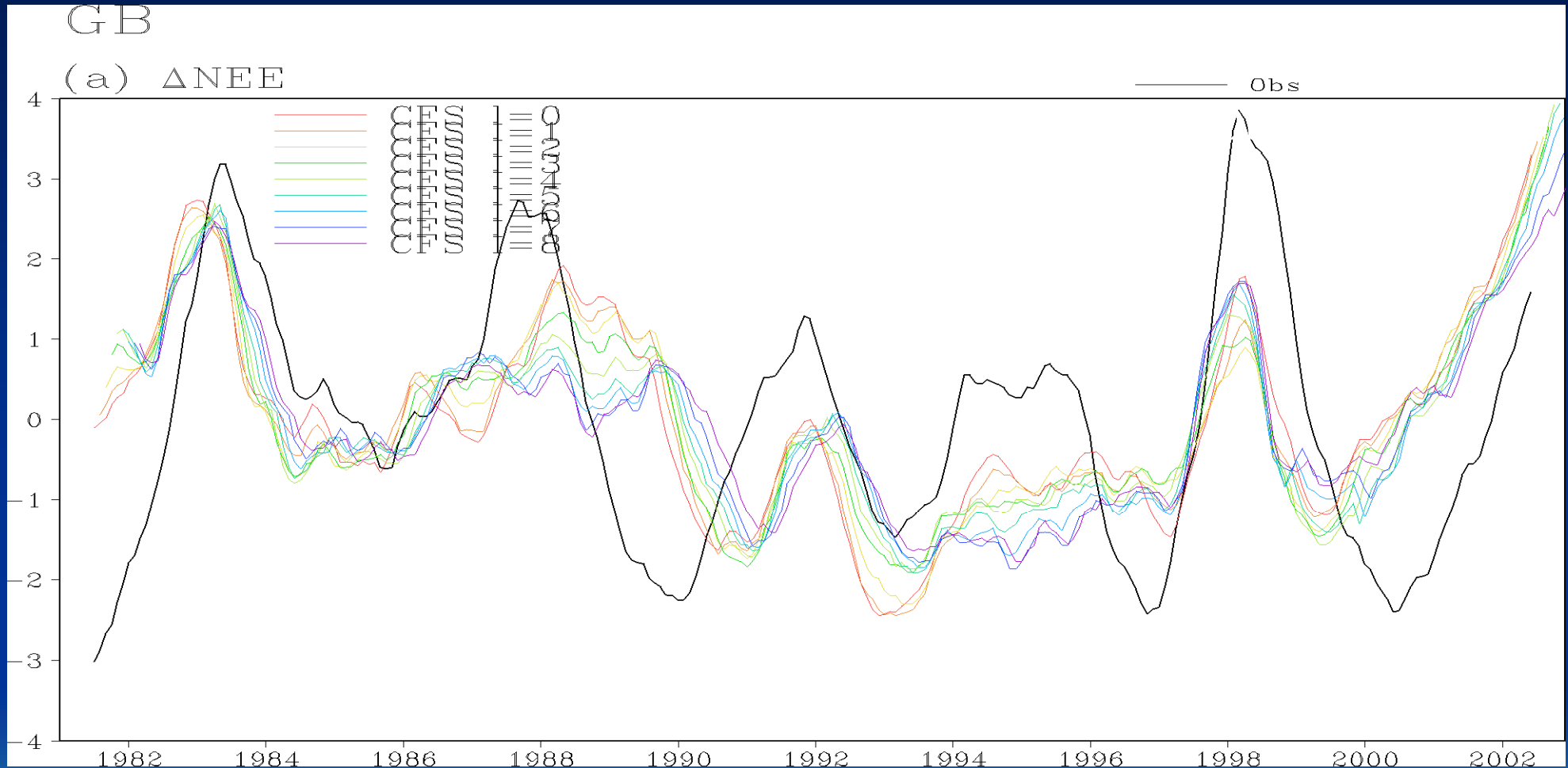
1. Model drift with lead time
Fix:

Removed climatology
for each lead time (L)

2. Trend in Modeled NPP
Detrended

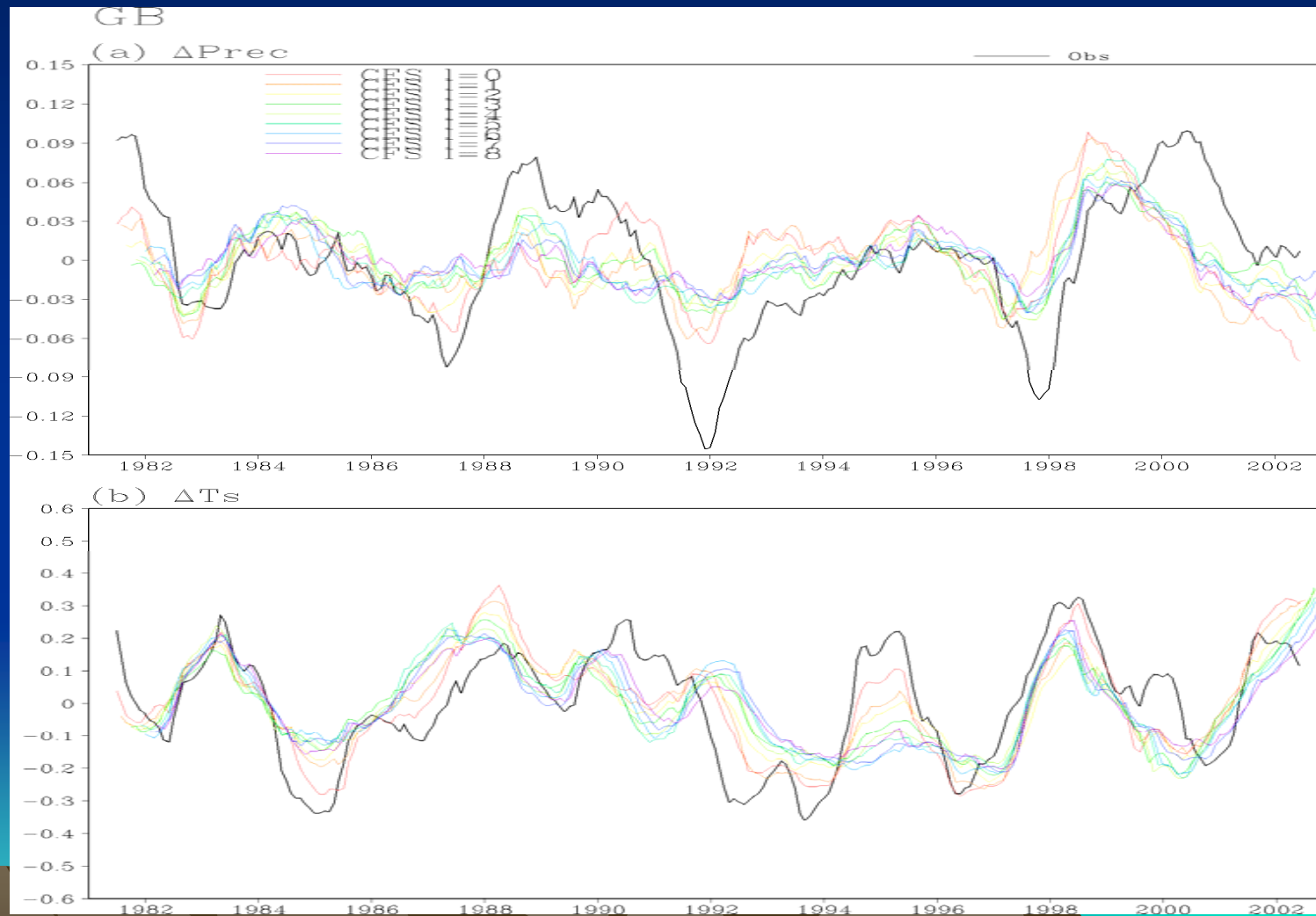
3. No warming trend in CFS
Detrended

Predicted global carbon flux

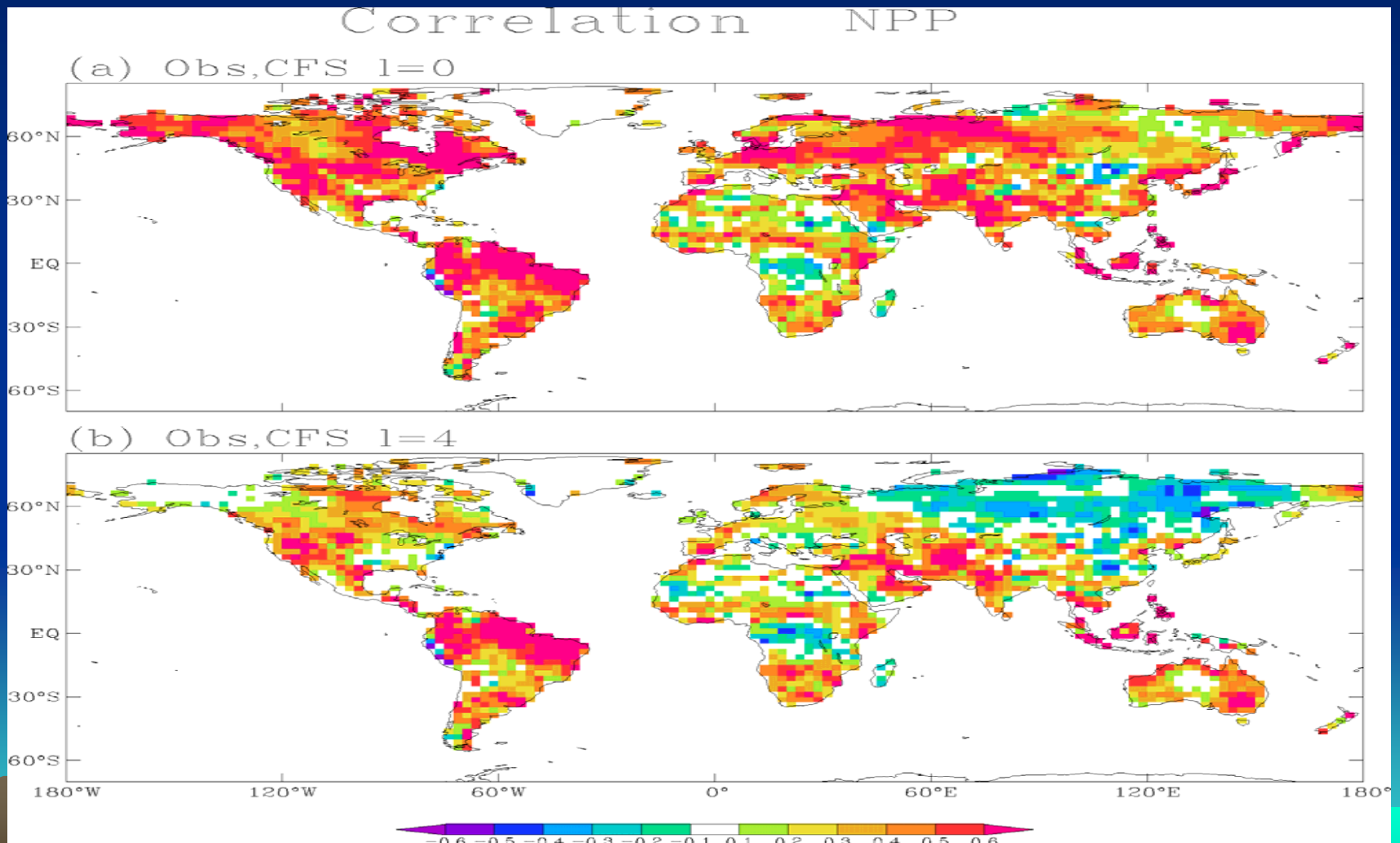


1. CFS/VEGAS captures most of the interannual variability, but...
2. Amplitude is underestimated

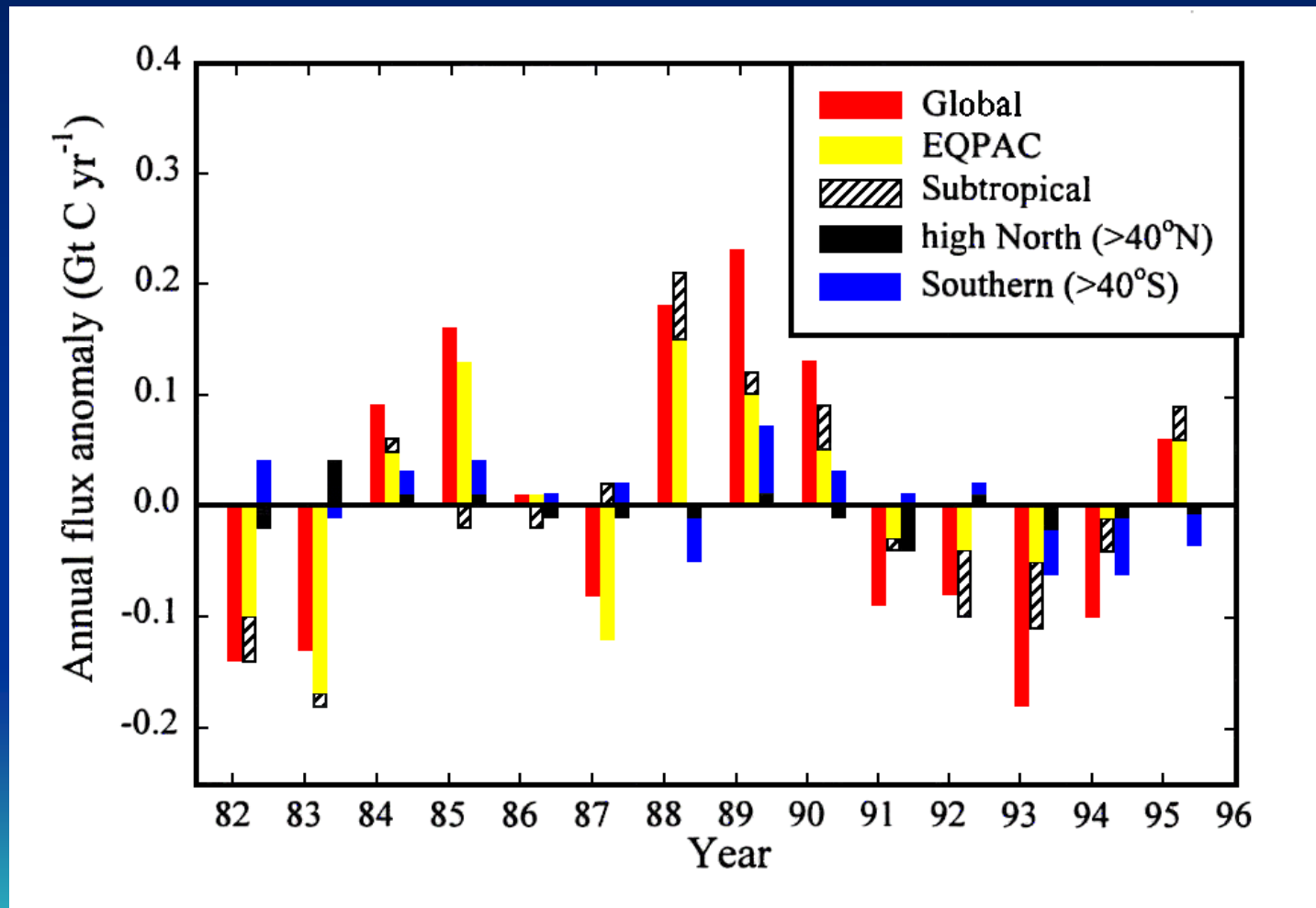
Prec and Temp



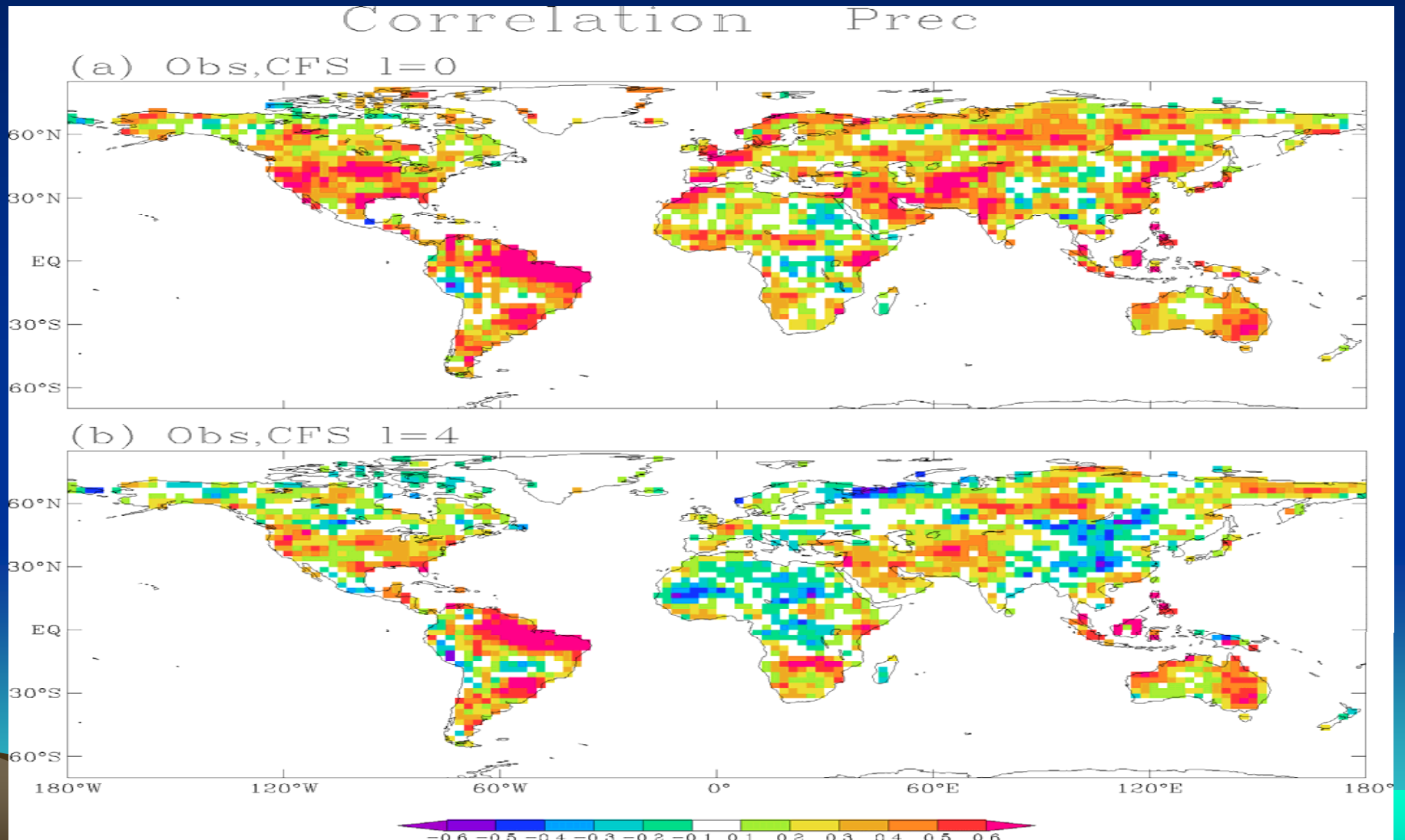
Anom Correlation NPP



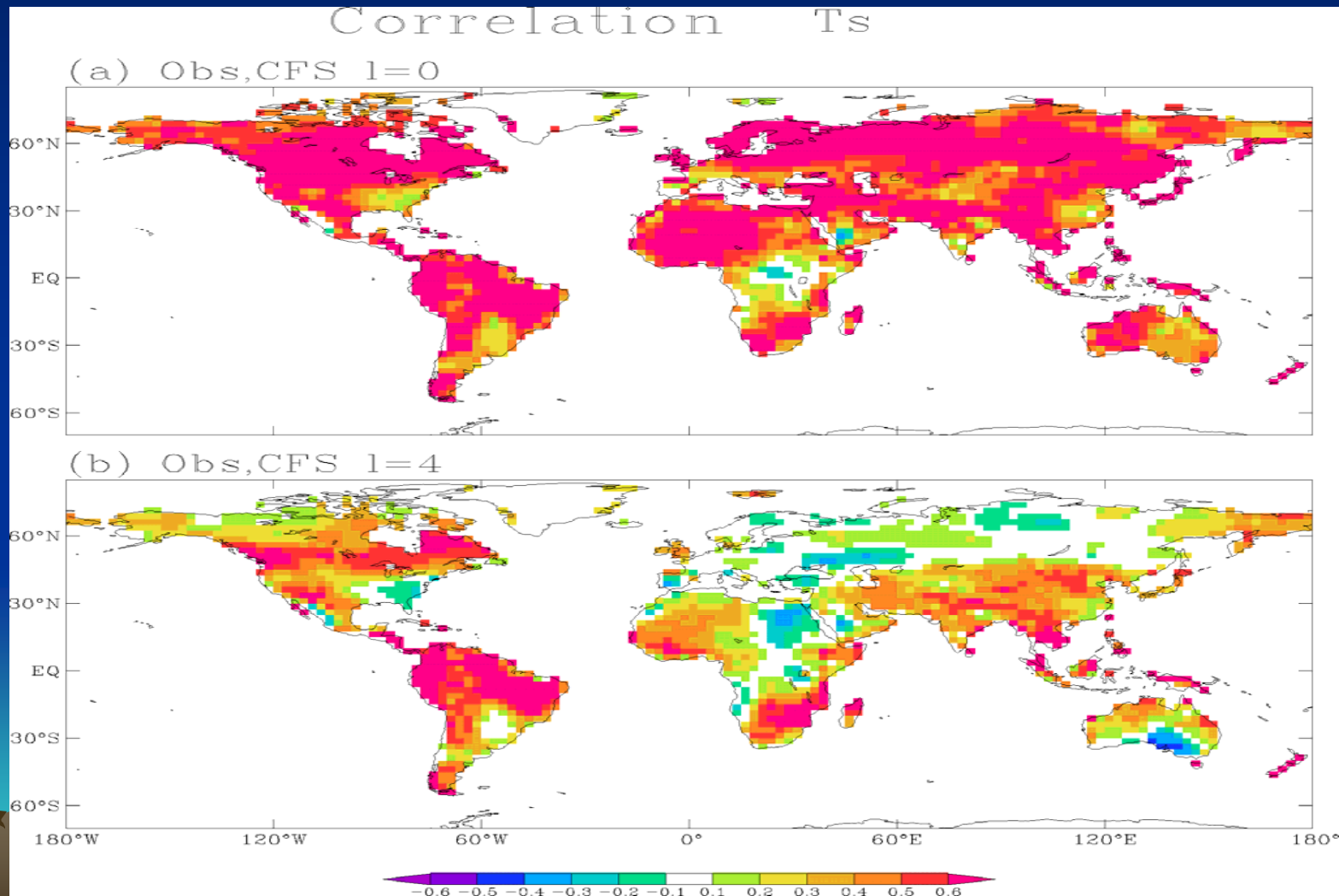
Oceanic CO₂ flux 1982-96 based on pCO₂ measurements

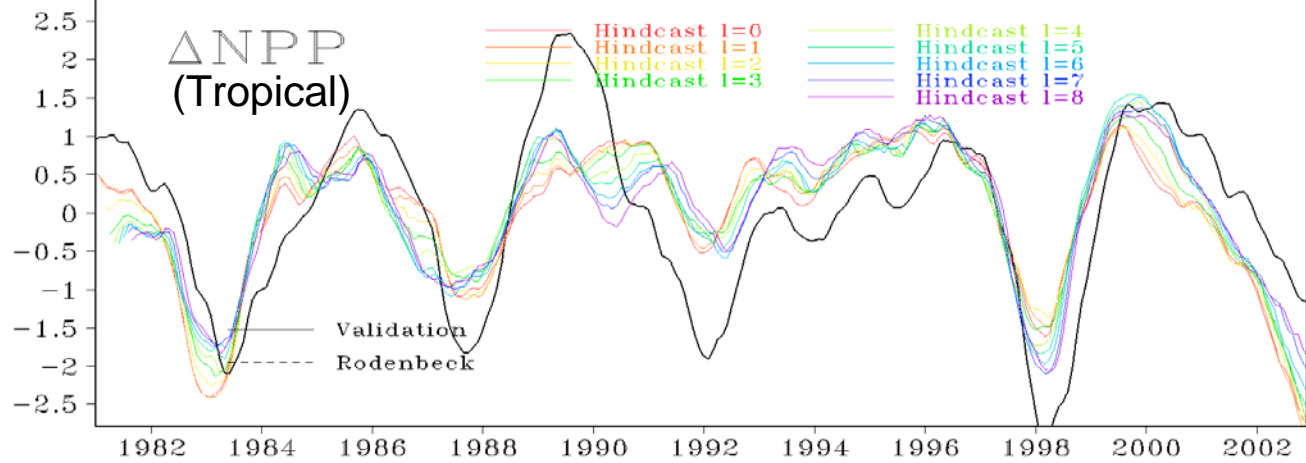


Anomaly correlation Precip

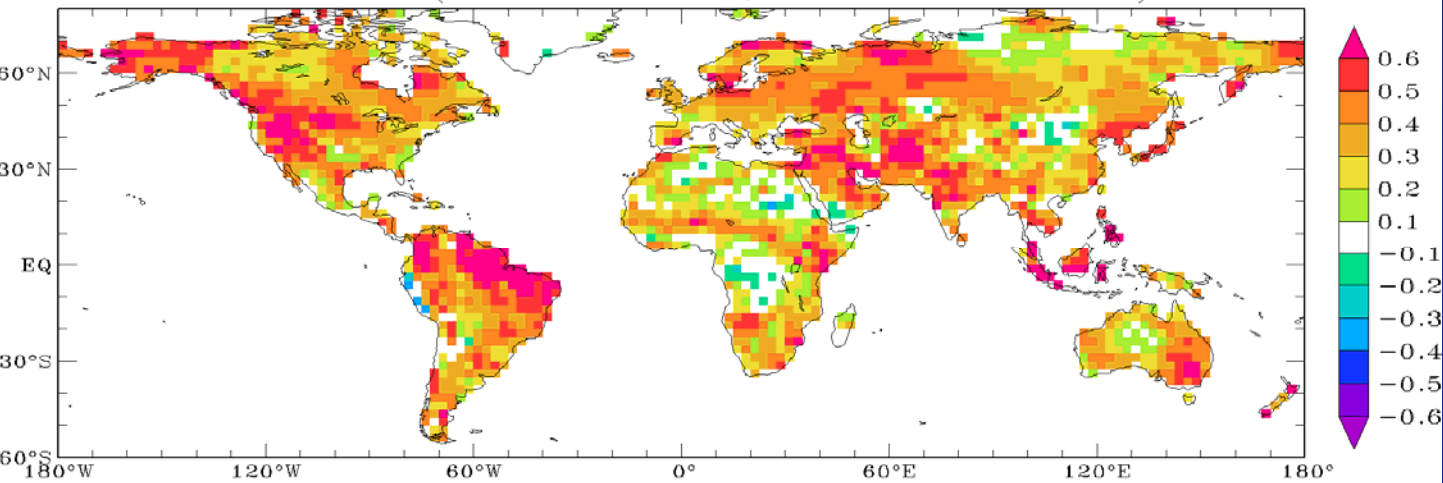


Anomaly Correlation Temperature



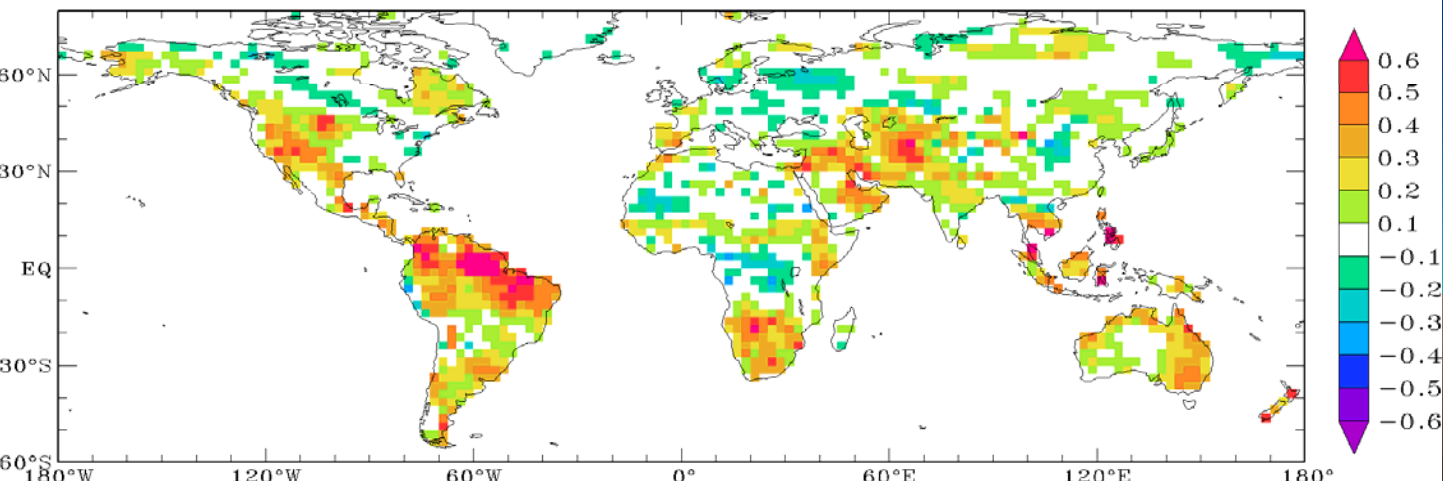


Correlation(Validation, Hindcast l=0)



Lead = 0 month

Correlation(Validation, Hindcast l=6)



Lead = 4 months

Predicted NPP
vs. 'Validation'