

Carbon, soil moisture and fAPAR assimilation

Wolfgang Knorr

Max-Planck Institute of Biogeochemistry

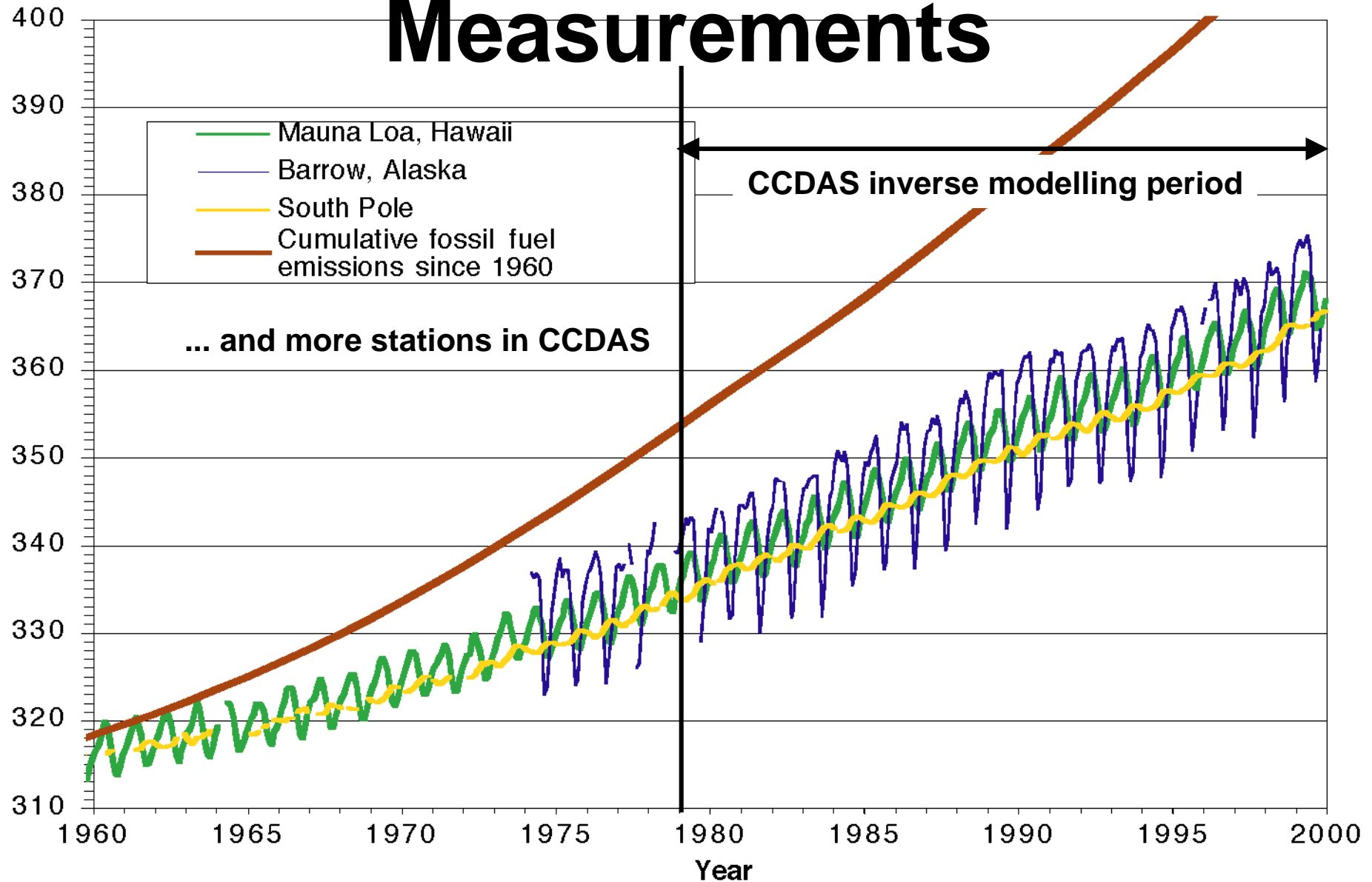
Jena, Germany ¹

*Acknowledgments: Nadine Gobron ², Marko Scholze
³, Peter Rayner ⁴, Thomas Kaminski ⁵,
Ralf Giering ⁵, Heinrich Widmann¹*

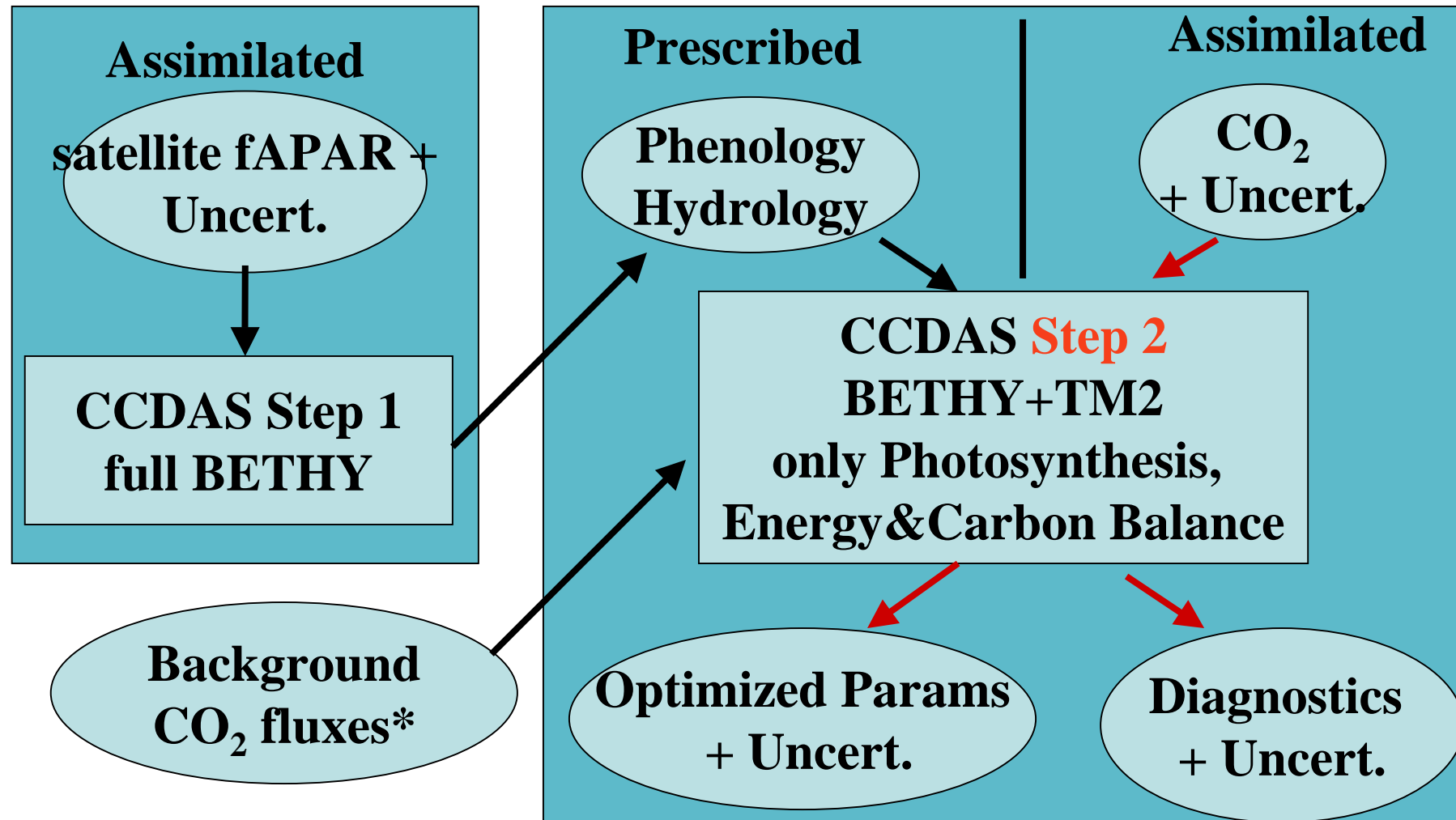
Overview

- **CO₂ – climate linkages**
- **Satellite fAPAR as soil moisture indicator**
- **Assimilation of fAPAR**

Atmospheric CO₂ Measurements



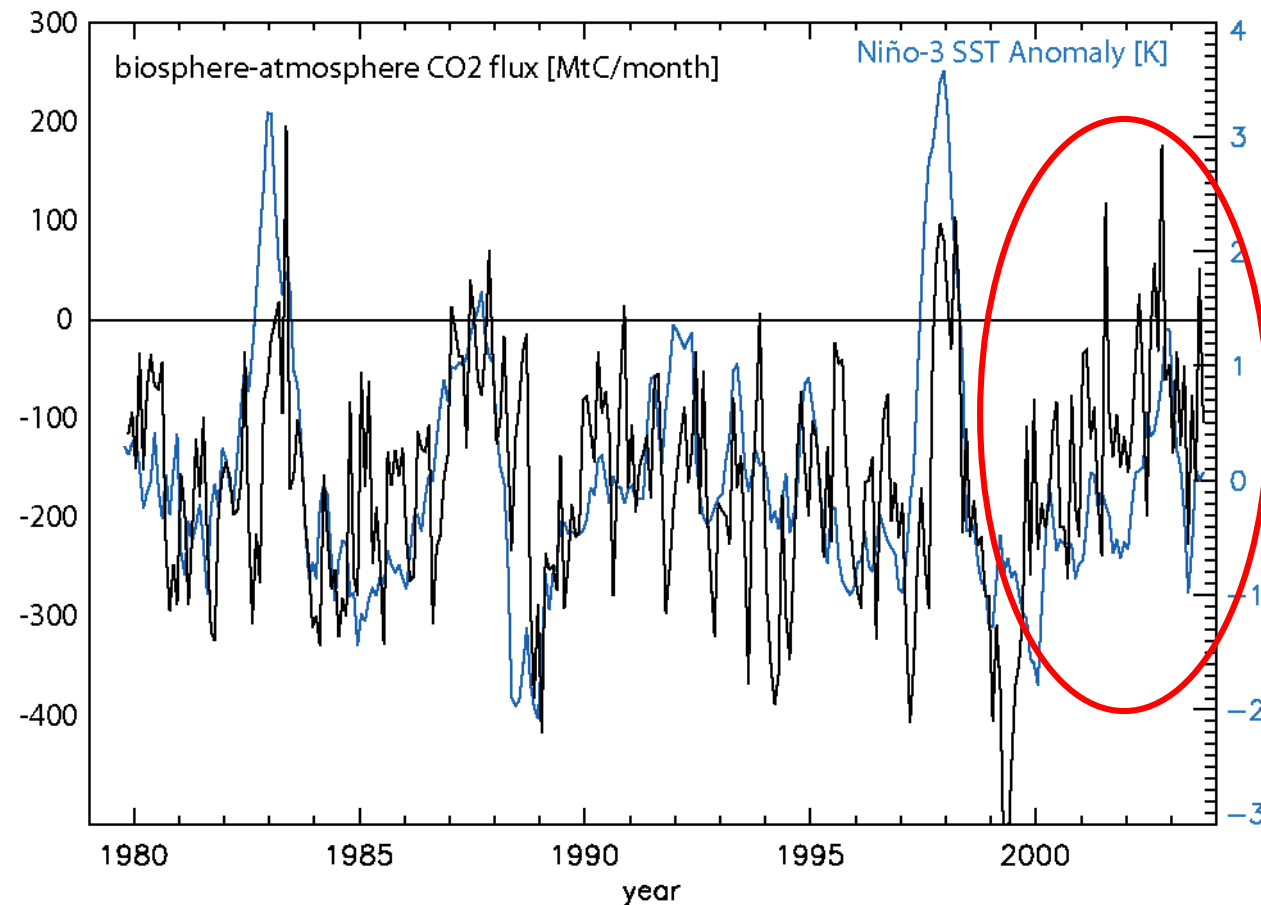
Carbon Cycle Data Assimilation System (CCDAS)



* **ocean:** Takahashi et al. (1999), LeQuere et al. (2000); **emissions:** Marland et al. (2001), Andres et al. (1996); **land use:** Houghton et al. (1990)

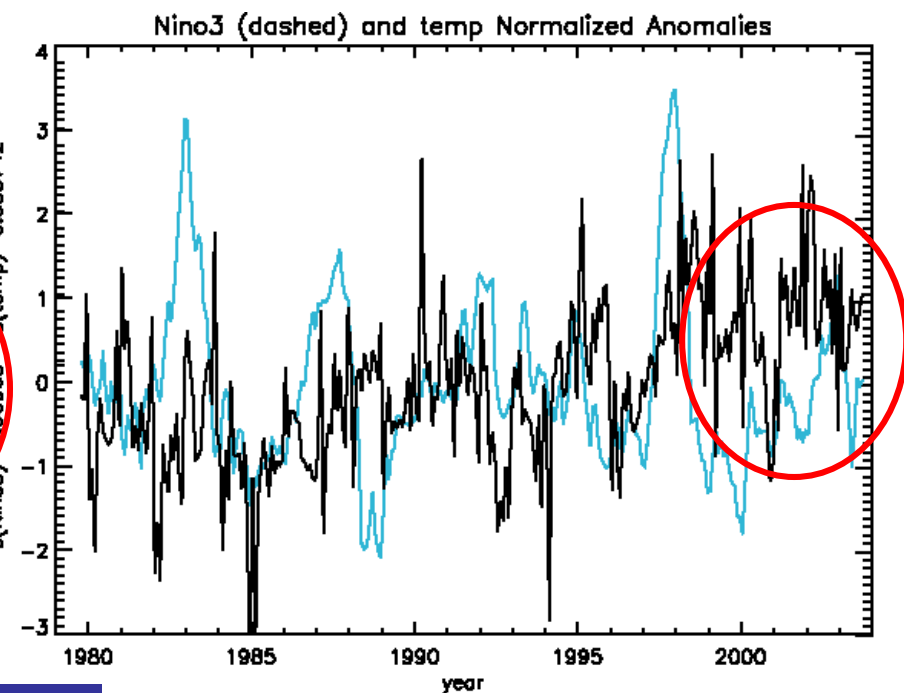
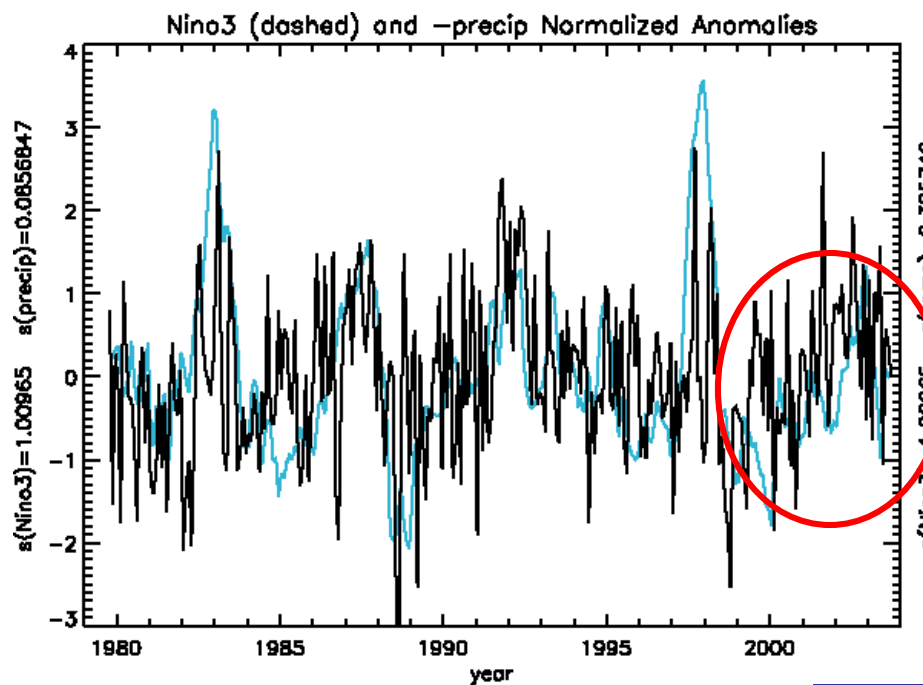
Terr. biosphere–atmosphere CO₂ fluxes

ENSO



... preliminary results from extended CCDAS run

ENSO and global climate normalized anomalies



ENSO

-precipitation

temperature

... global drying and warming trend



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Sharp CO2 rise divides opinions

Climate scientists are puzzled over the possible significance of rising levels of atmospheric carbon dioxide (CO2).

Some think a recent acceleration in CO2 increases could be a sign of imminent, rapid global warming.

But others say the evidence of just two years is inconclusive, and suspect that natural causes are likelier culprits.

The UK government's chief scientific adviser, Sir David King, says the rise appears on the evidence so far to be an aberration, not the start of a trend.



Many ice bodies from the poles to the tropics are in retreat

[Home](#) > [Wissenschaft](#) > [Erde](#)

12. Oktober 2004

[Druckversion](#) | [Versenden](#) | [Leserbrief](#)MYSTERIÖSE CO₂-WERTE

Forscher sehen Anzeichen für Hitzespirale

Von Volker Mrasek

Die Erde könnte am Beginn eines galoppierenden Treibhauseffekts stehen. Der Kohlendioxid-Gehalt der Atmosphäre ist in den vergangenen zwei Jahren sprunghaft gestiegen, wie neue Messungen ergaben. Forscher vermuten, dass Ozeane und Wälder ihre Grenzen als Klimagas-Schlucker erreicht haben.



Luftverschmutzung:
Industrialisierung brachte CO₂-
Schub

Verlieren Ozeane und Wälder ihre Funktion als Bremsklotz der Erderwärmung? Schlucken sie nicht mehr genügend Kohlendioxid? Messungen aus dem Pazifik schüren diese Befürchtung. Danach stieg der CO₂-Gehalt der Erdatmosphäre sowohl 2002 als auch 2003 ungewöhnlich stark an.

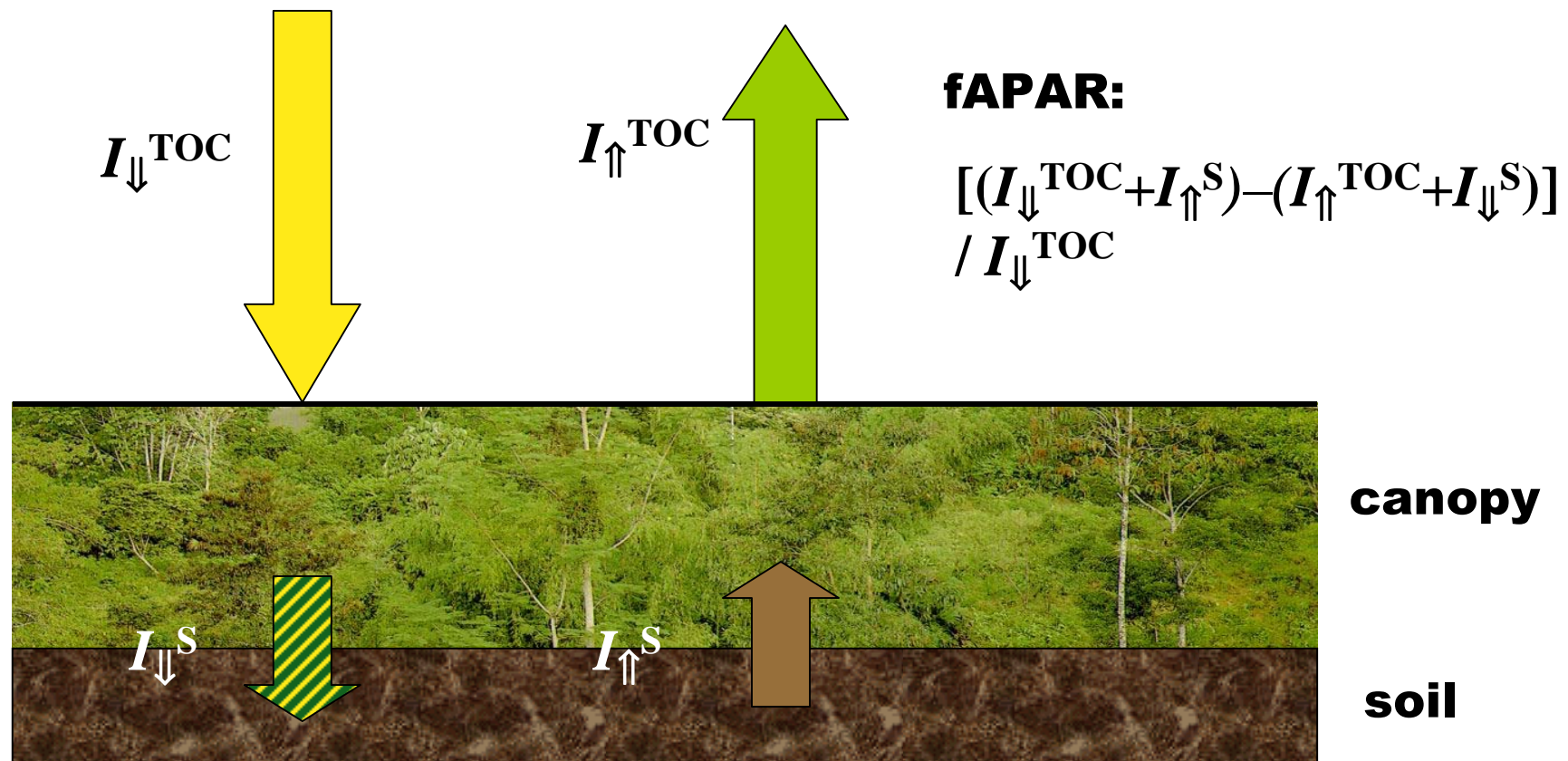
for more information see:

<http://www.CCDAS.org>

Overview

- CO₂ – climate linkages
- **Satellite fAPAR as soil moisture indicator**
- Assimilation of fAPAR

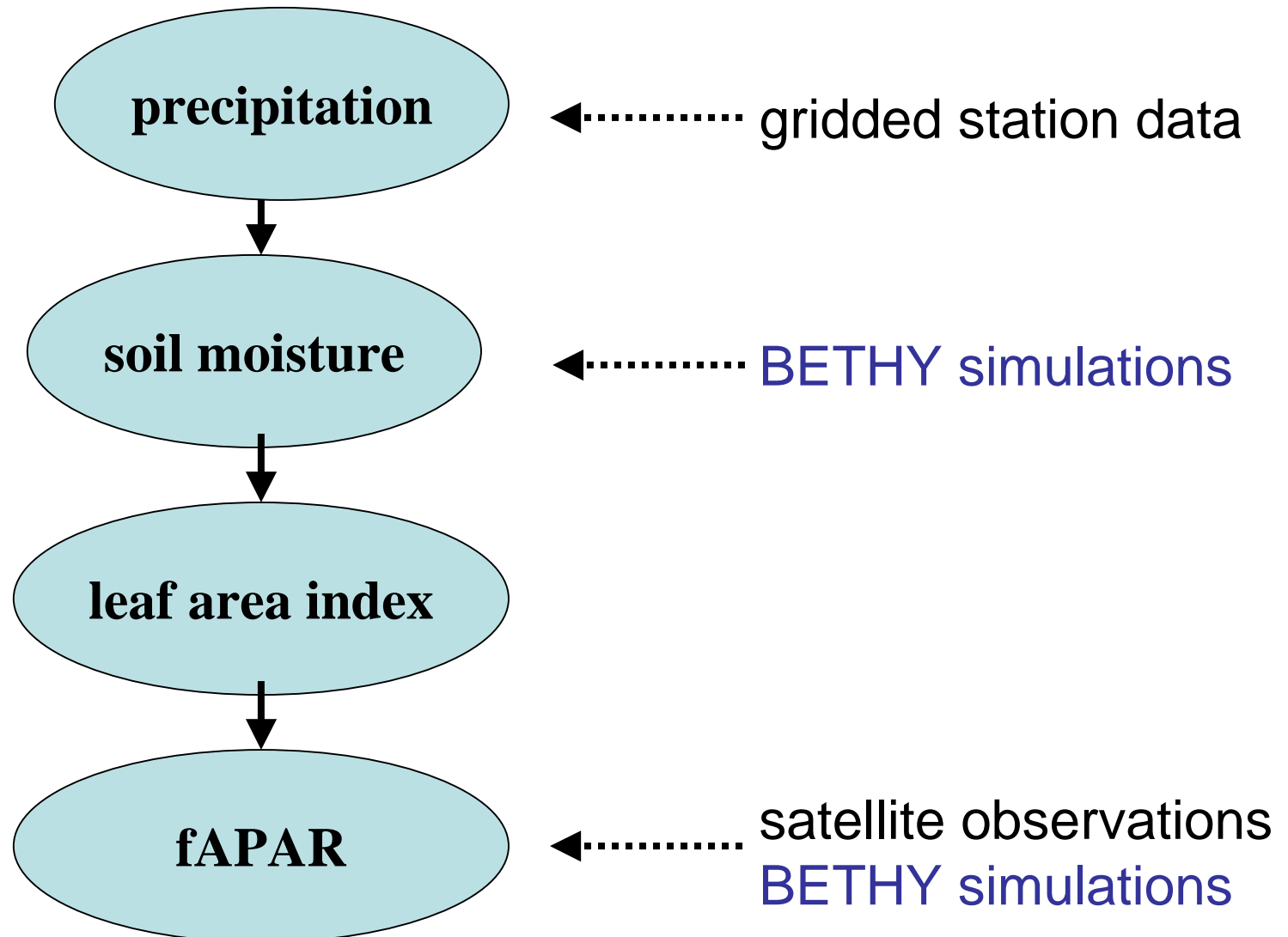
Remotely Sensed Vegetation Activity



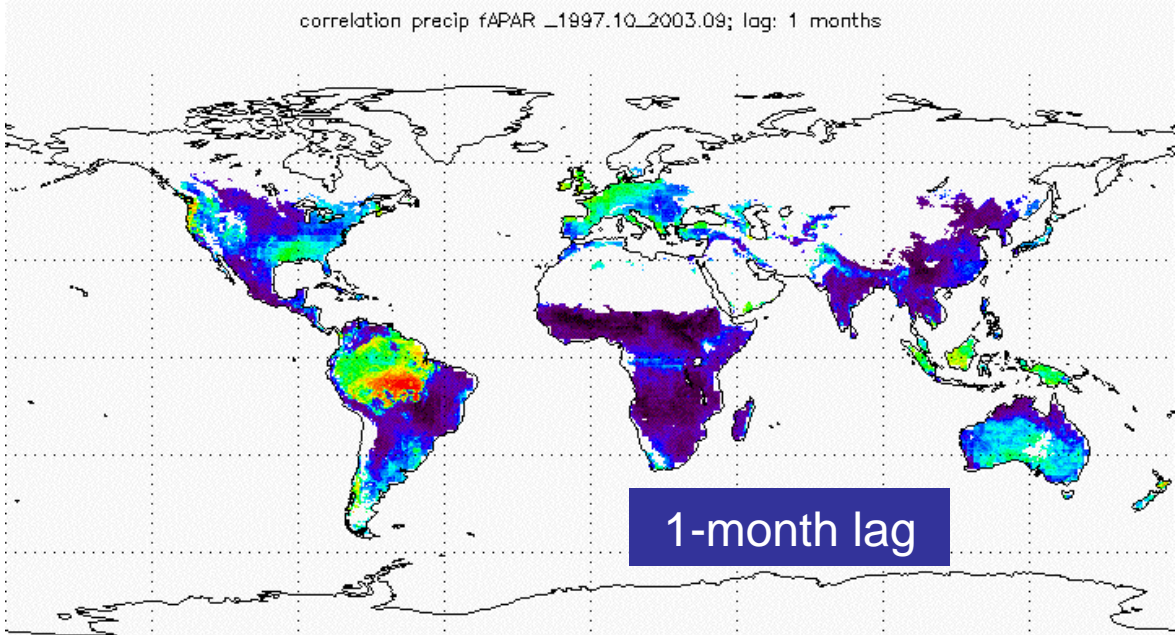
SeaWiFS fAPAR archive

- developed by Nadine Gobron, Bernard Pinty, Frédéric Melin, IES/JRC, Ispra
- 3-channel algorithm tailored to SeaWiFS ocean color instrument (blue, red, near-infrared)
- cloud screening algorithm
- requires no atmospheric correction
- starts 10/1997, continuing...
- being extended by same product for MERIS

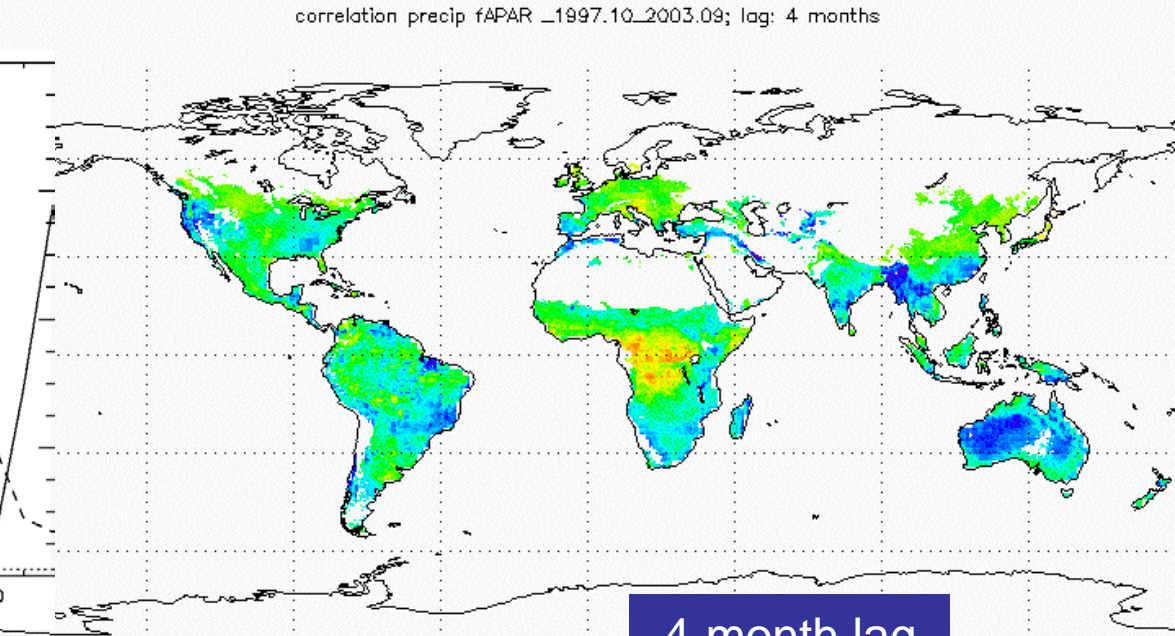
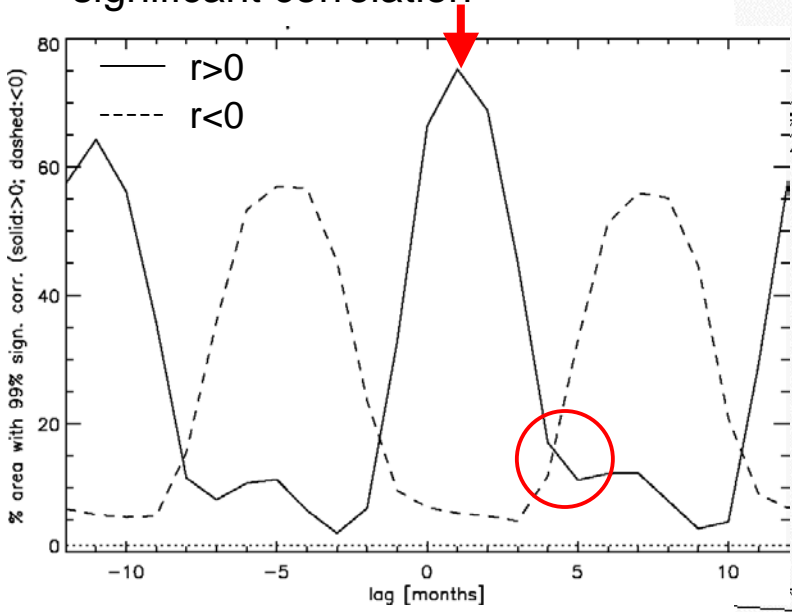
Precipitation – fAPAR



precipitation vs.
fAPAR from
SeaWiFS satellite
obs.



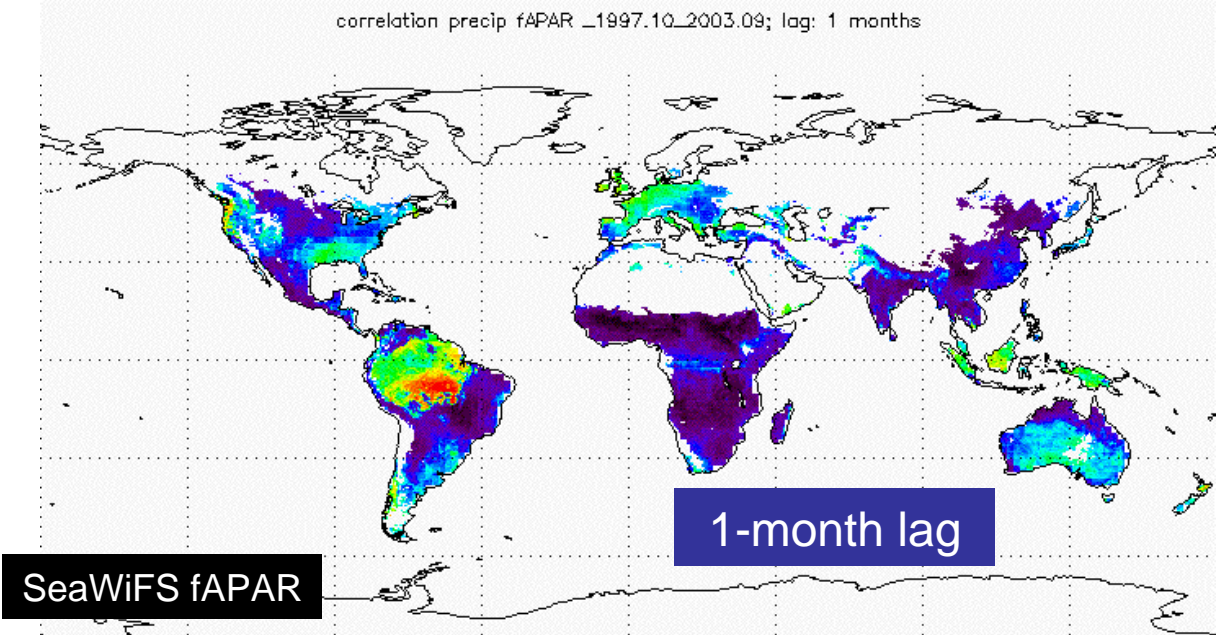
percent area with 99%
significant correlation



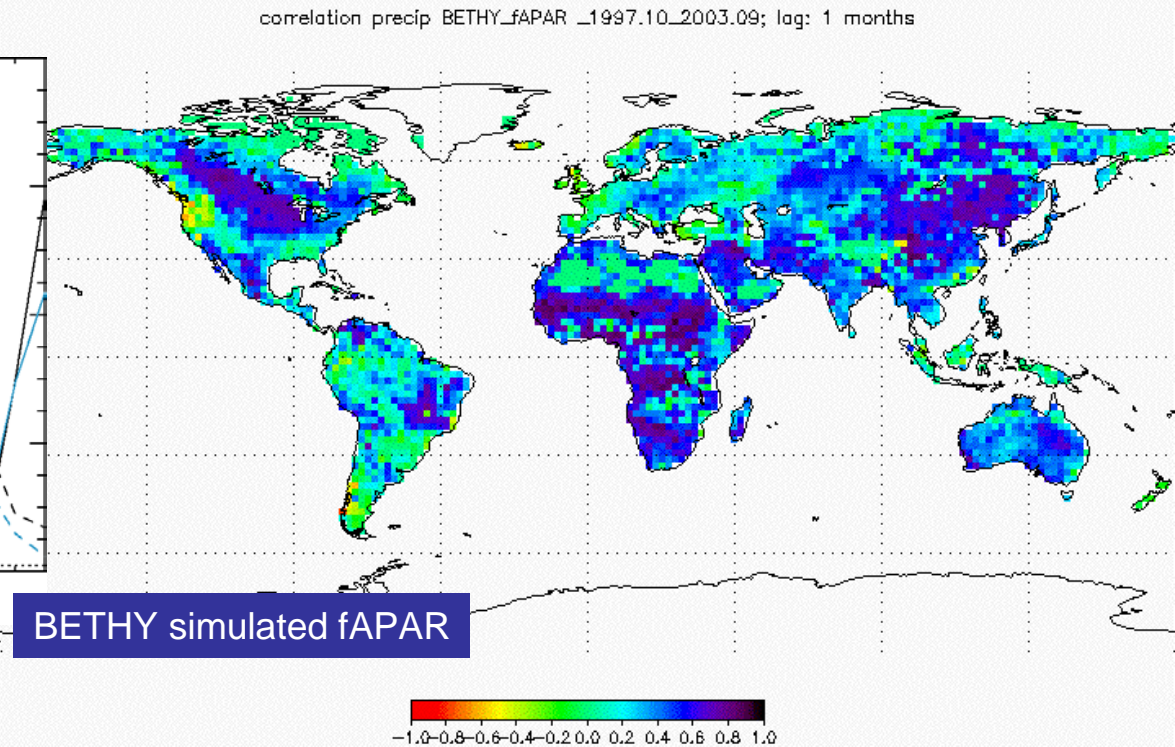
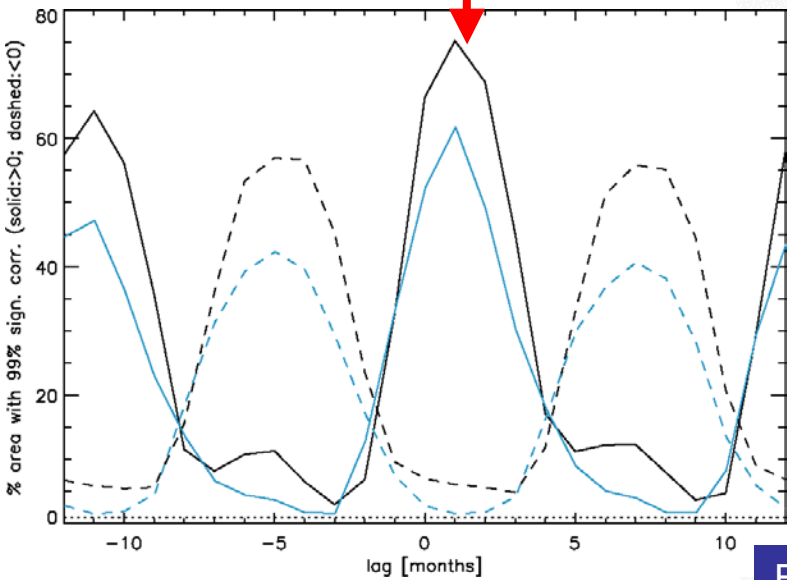
0.5°x0.5°, ≥50% cloud free, ≥75% temporal coverage



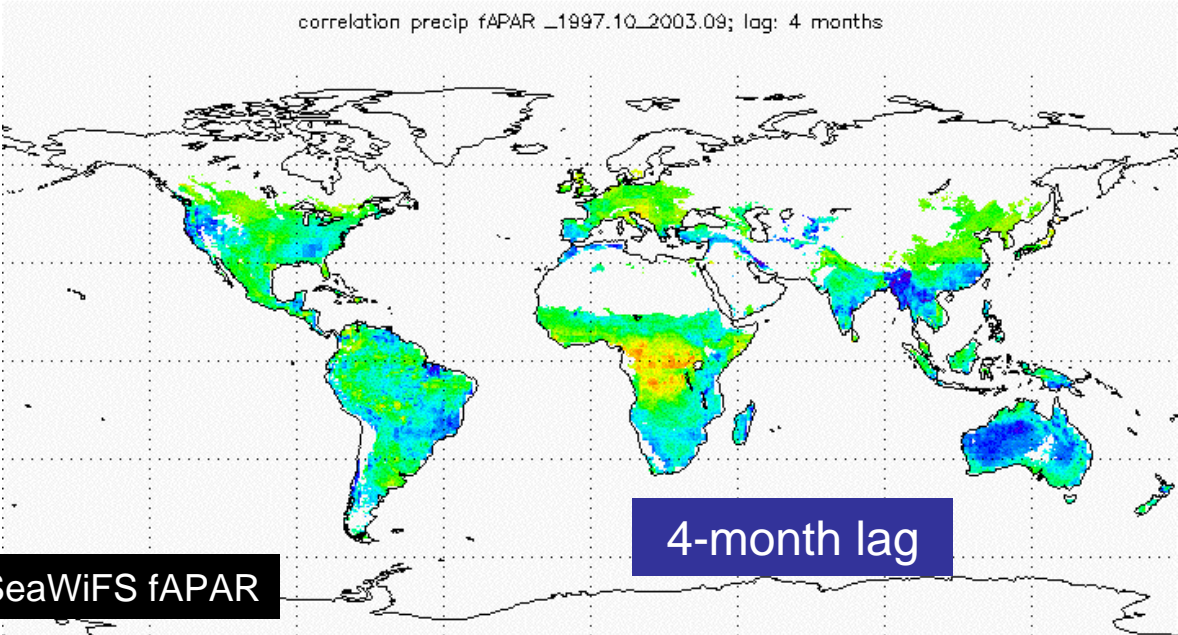
precipitation vs.
fAPAR:
satellite and
model



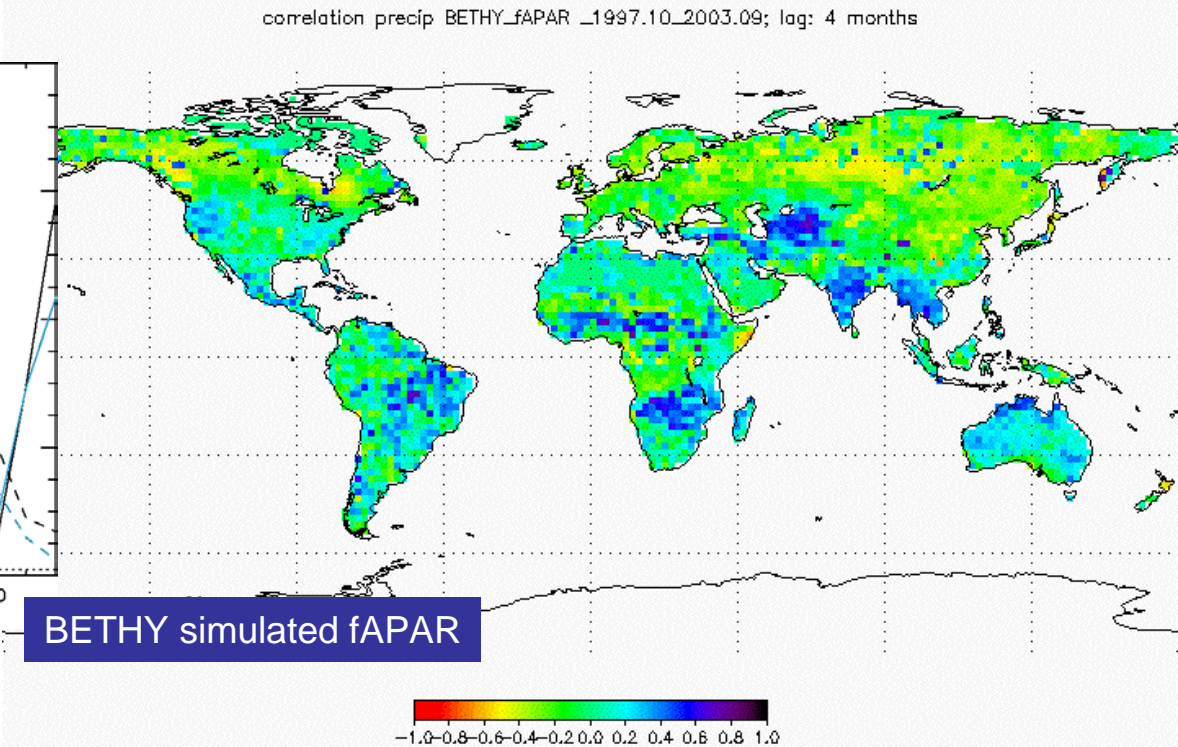
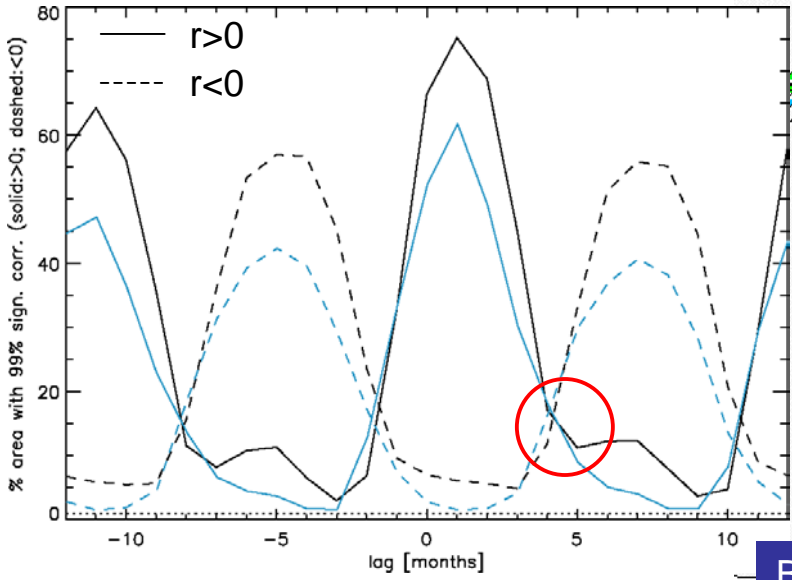
percent area with 99%
significant correlation



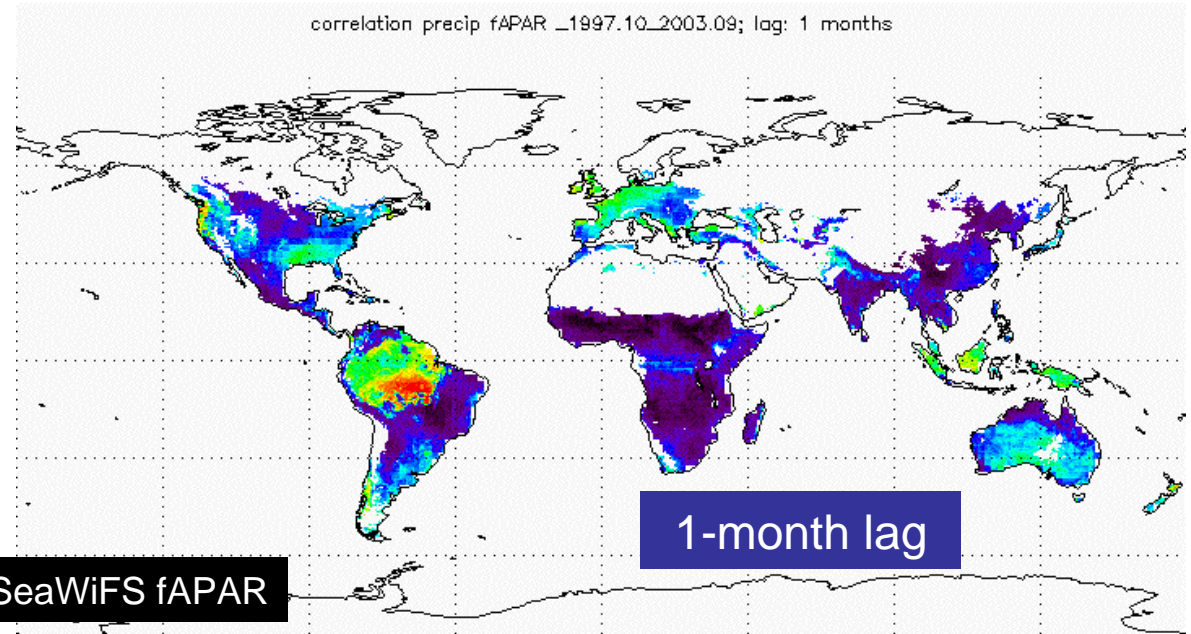
precipitation vs. fAPAR:
satellite and model



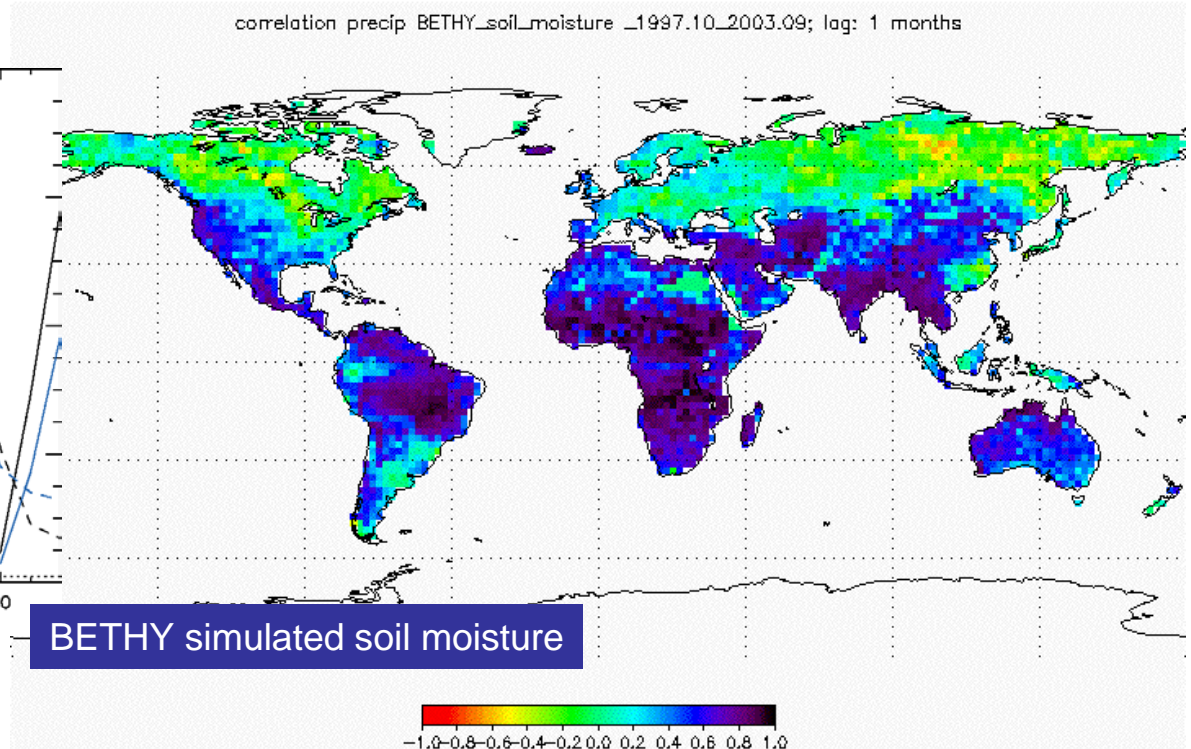
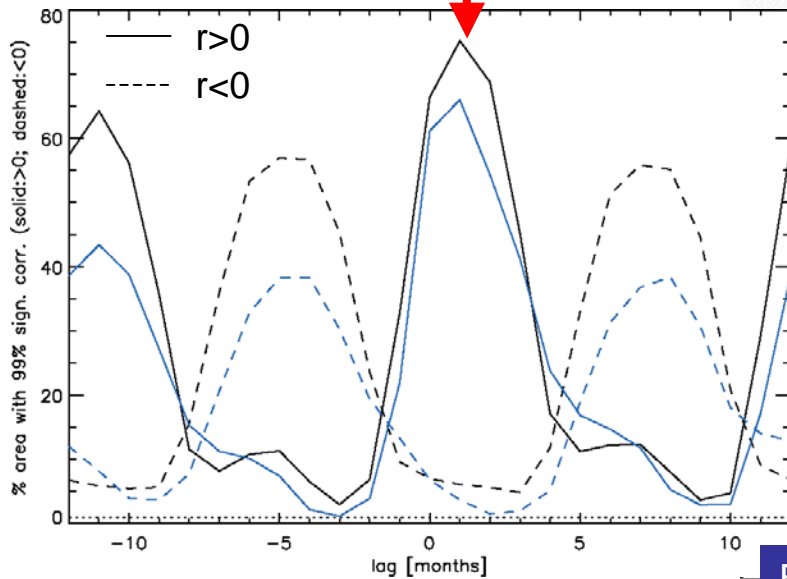
percent area with 99% significant correlation



precipitation vs. satellite fAPAR and simulated soil moisture

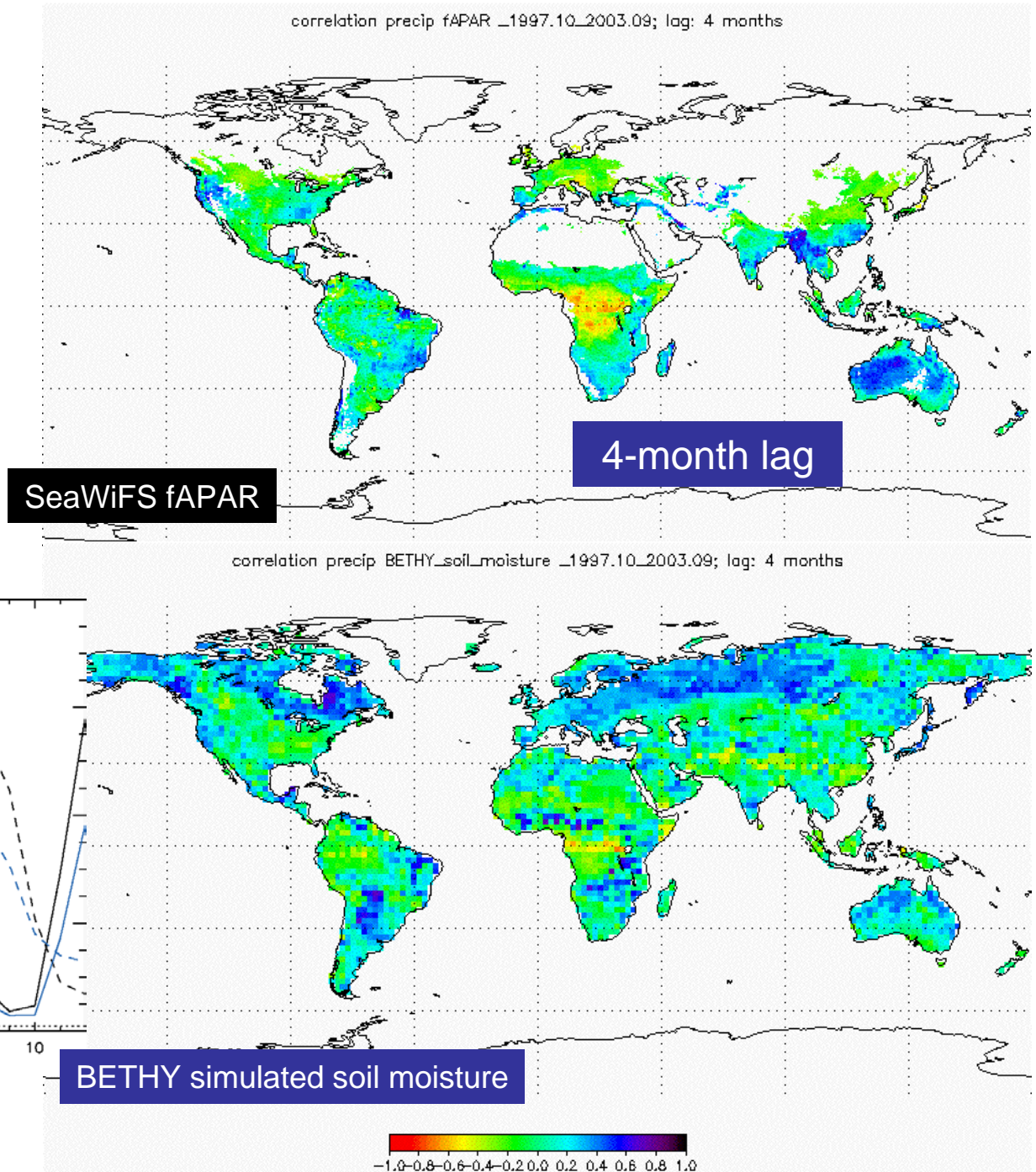
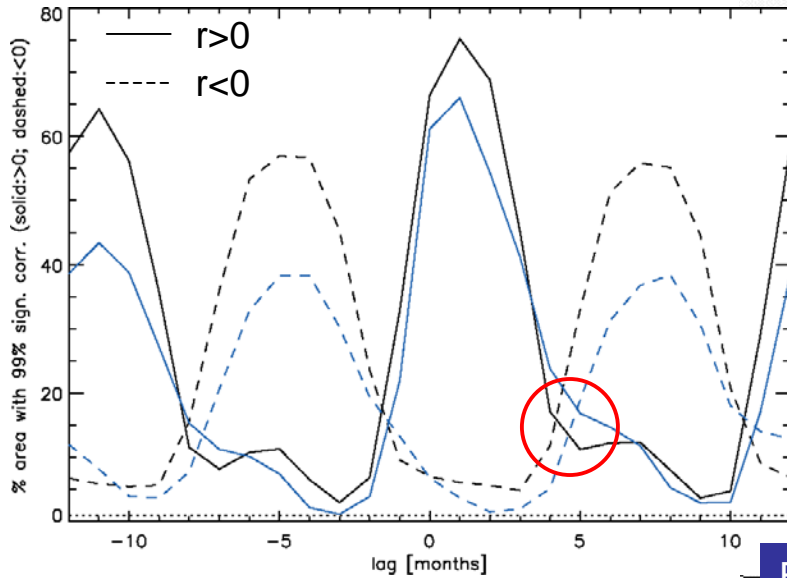


percent area with 99%
significant correlation

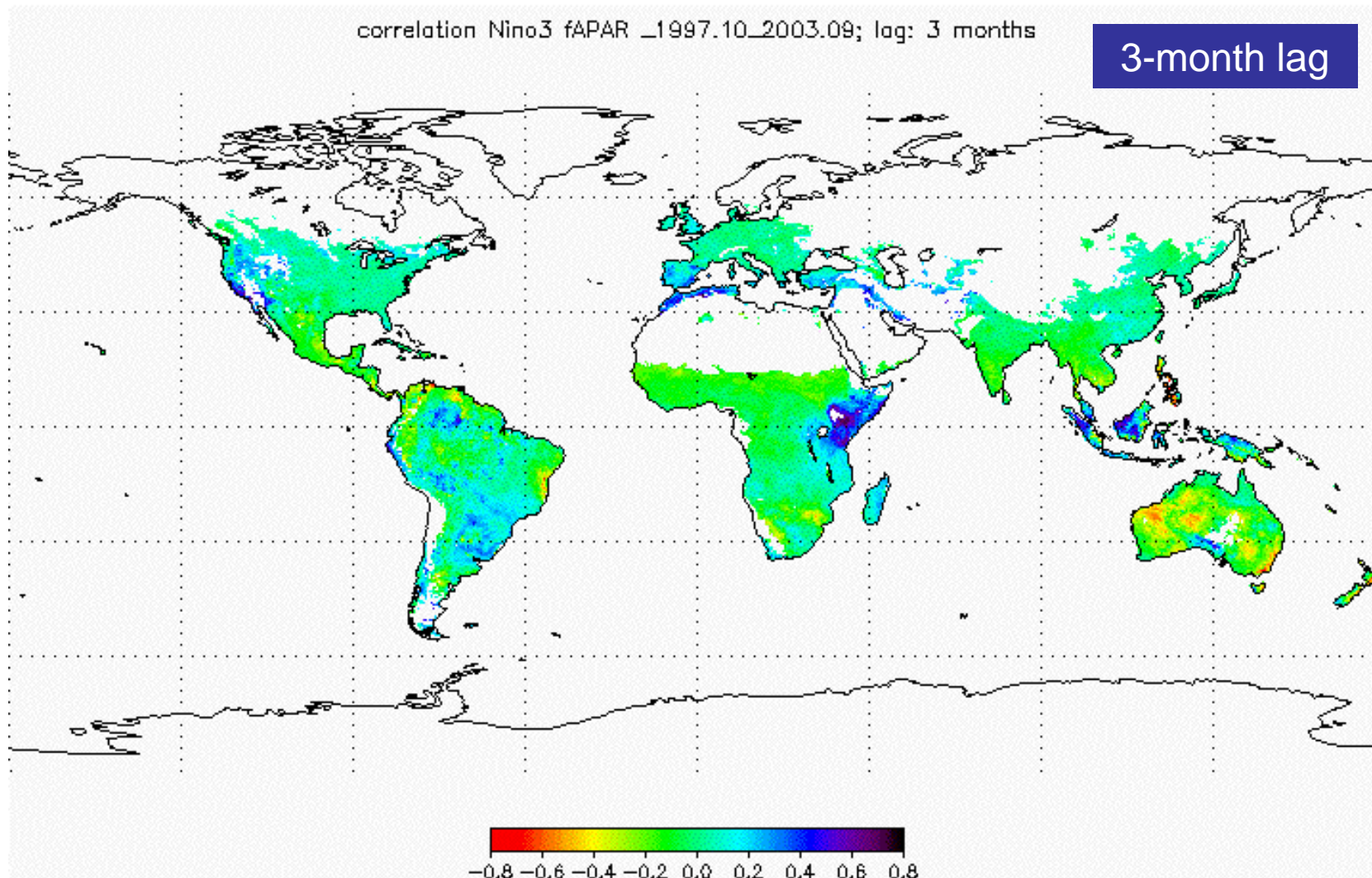


precipitation vs. satellite fAPAR and simulated soil moisture

percent area with 99%
significant correlation



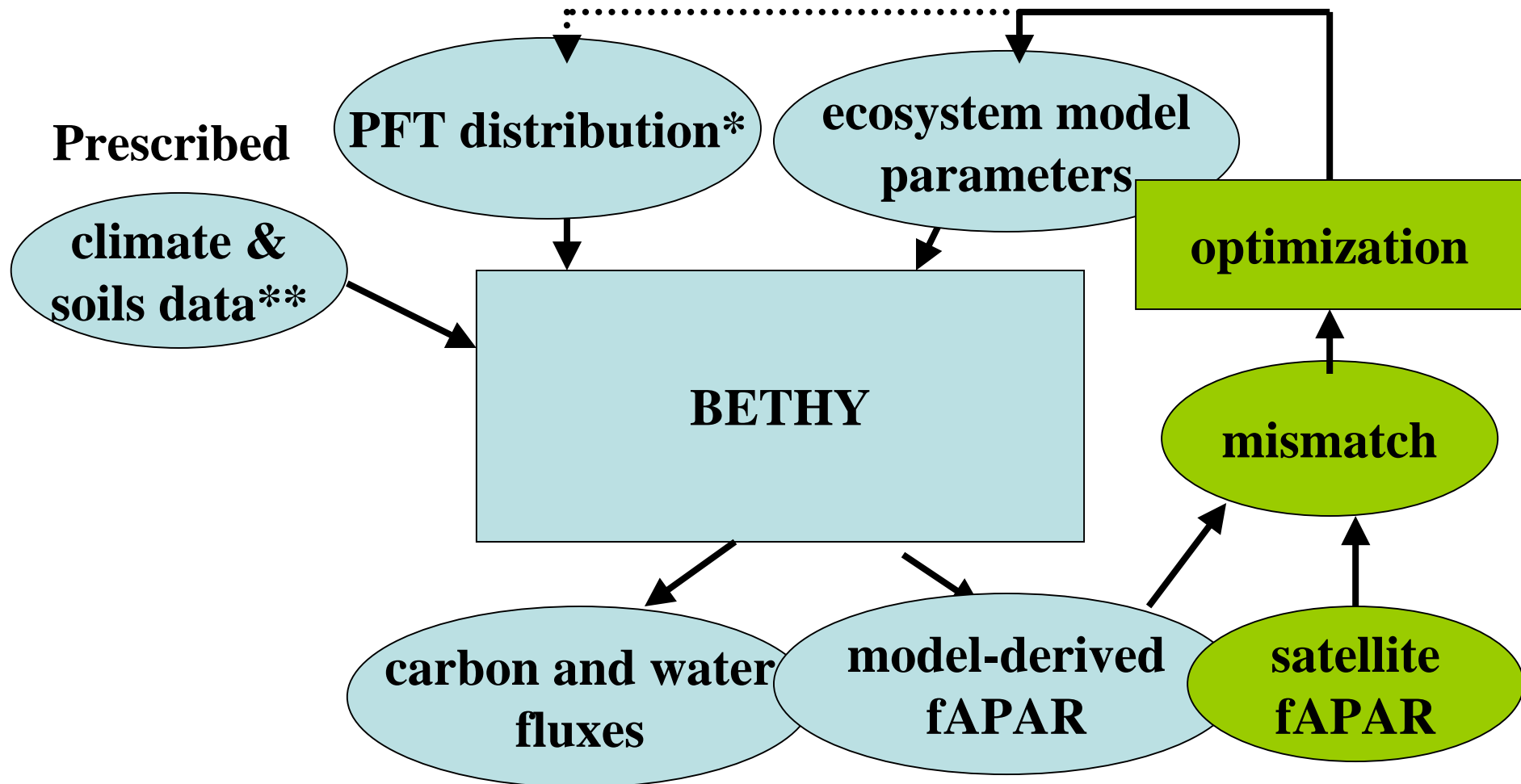
ENSO – SeaWiFS fAPAR lagged correlation



Overview

- CO₂ – climate linkages
- Satellite fAPAR as soil moisture indicator
- **Assimilation of fAPAR**

fAPAR Assimilation



The Cost Function

Measure of the mismatch (cost function):

$$J(\vec{m}) = \frac{1}{2} [\vec{m} - \vec{m}_0] \mathbf{C}_{m_0}^{-1} [\vec{m} - \vec{m}_0]^T + \frac{1}{2} [\vec{y}(\vec{m}) - \vec{y}_0] \mathbf{C}_y^{-1} [\vec{y}(\vec{m}) - \vec{y}_0]^T$$

The equation is annotated with arrows pointing to various terms:

- \vec{m} : assumed model parameters
- \vec{m}_0 : a priori parameter values
- $\mathbf{C}_{m_0}^{-1}$: a priori error covariance matrix of parameters
- $\vec{y}(\vec{m})$: model diagnostics
- \vec{y}_0 : measurements
- \mathbf{C}_y^{-1} : error covariance matrix of measurements

aim: minimize $\mathbf{J}(\vec{m})$

[for each grid point separately]

The Parameters

parameter vector $\vec{m}=\{m_1, m_2, m_3\}$:

represents:

vector of prior
parameter
values m_0 :

m_1

ΔT_ϕ

shift of leaf
onset/shedding
temperature

temperature
limitation

$\Delta T_{\phi,0}=0$

m_2

W_{max}

maximum soil water
holding capacity

water limitation

$W_{max,0}$
(derived from
FAO soil map)

m_3

f_c

fraction of grid cell
covered with
vegetation

residual,
unmodelled
limitations (nitrogen,
land use)

$f_{c,0}$
(function of
P/PET and
Temp. of
warmest
month)

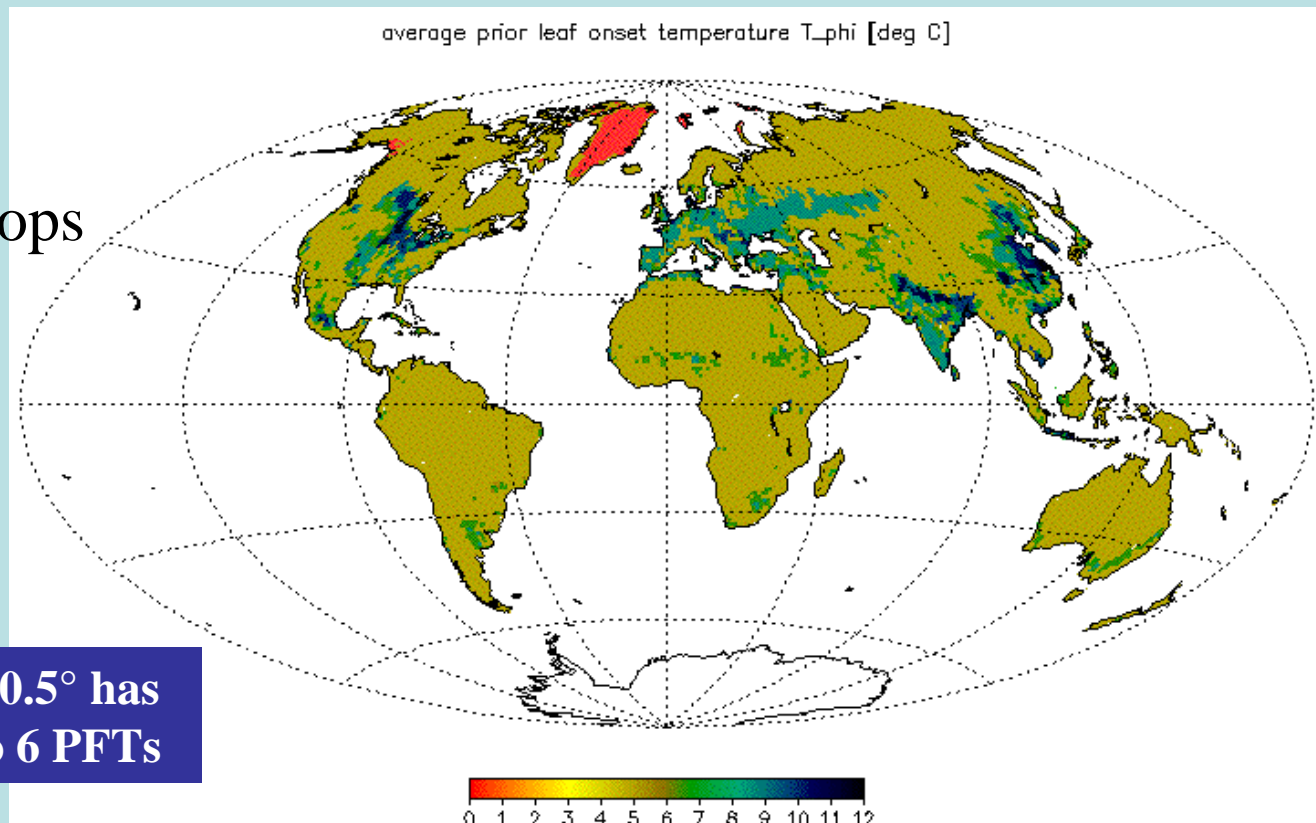
Prior Parameter 1

prior values:

$$T_{\phi} = 5^{\circ}\text{C}$$

$$T_{\phi} = 12^{\circ}\text{C} \text{ for crops}$$

$$\hat{T}_{\phi} = 15^{\circ}\text{C}$$

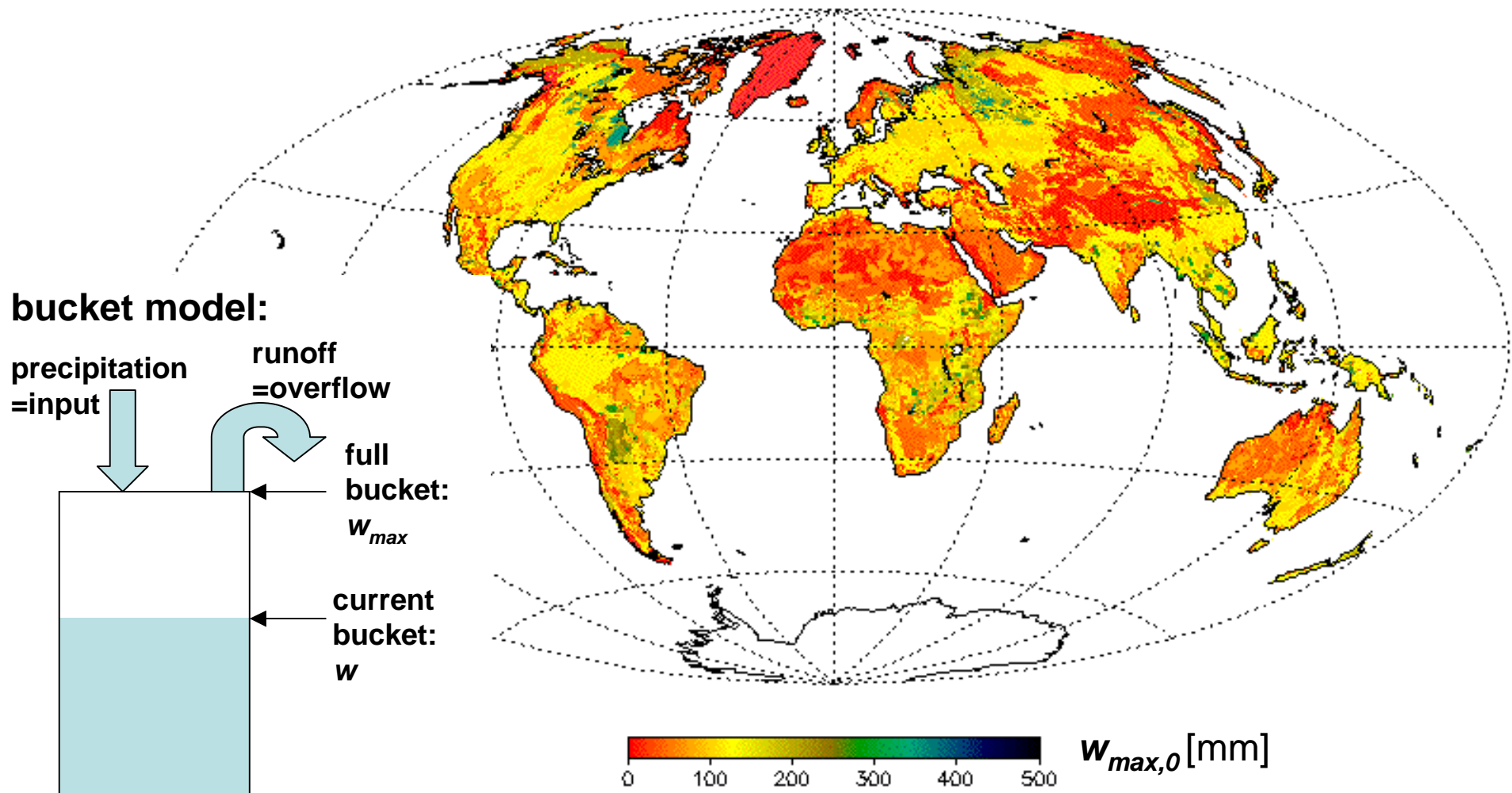


**note: each $0.5^{\circ}\times 0.5^{\circ}$ has
mixture of up to 6 PFTs**

map reflects presence of crops; **red: unvegetated**

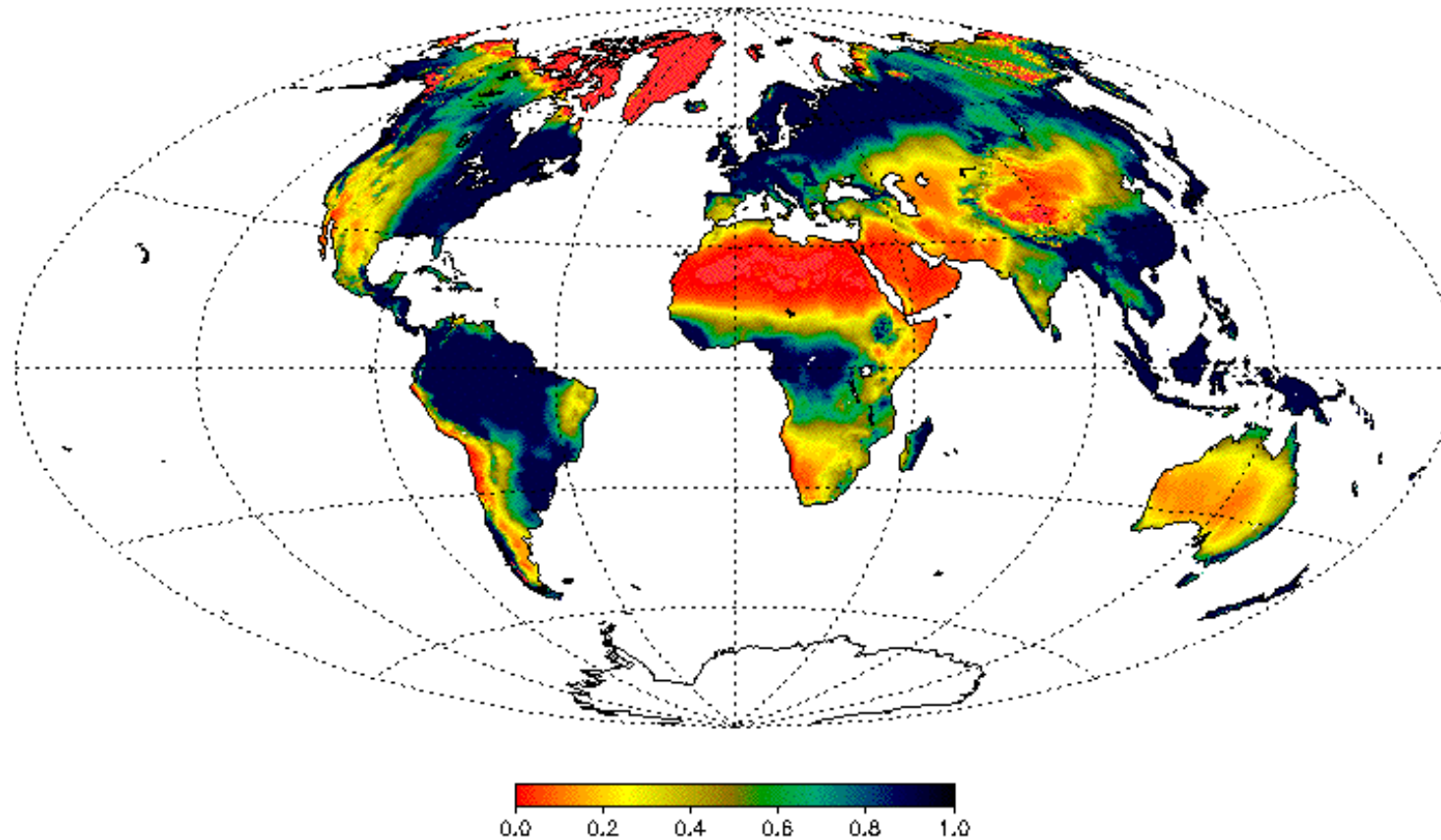
Prior Parameter 2

maximum soil water holding capacity [mm] prior



Prior Parameter 3

fractional vegetation cover, prior



$$f_{c,0} = P_{\text{annual}} / \text{PET}_{\text{annual}} * \Lambda_W(T_{\text{warmest month}}) / \hat{\Lambda}$$

Prior Parameter Errors

error covariance matrix of parameters \mathbf{C}_{m0} :

$$\mathbf{C}_{m0} = \begin{pmatrix} 1\text{K}^2 & 0 & 0 \\ 0 & (2w_{\max,0})^2 & 0 \\ 0 & 0 & 0.25^2 \end{pmatrix}$$

⇒ off-diagonal elements assumed 0 here

= no prior correlation between errors of different parameters

The Assimilated Data

model diagnostics vector $\vec{y} = \{y_1, y_2, \dots, y_{12}\}$:

y_i modelled fAPAR of month i

satellite-derived diagnostics vector $\vec{y}_0 = \{y_{0,1}, y_{0,2}, \dots, y_{0,12}\}$:

$y_{0,i}$ SeaWiFS derived fAPAR of month i

Prior Errors of Measurements

error covariance matrix of measurements C_y :

$$C_{y,i,j} = \begin{cases} 0.05^2 & \text{if valid measurement} \\ \infty & \text{if data gap} \end{cases}$$

$$= \sigma_{y,i}^2$$

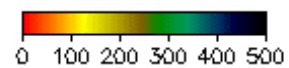
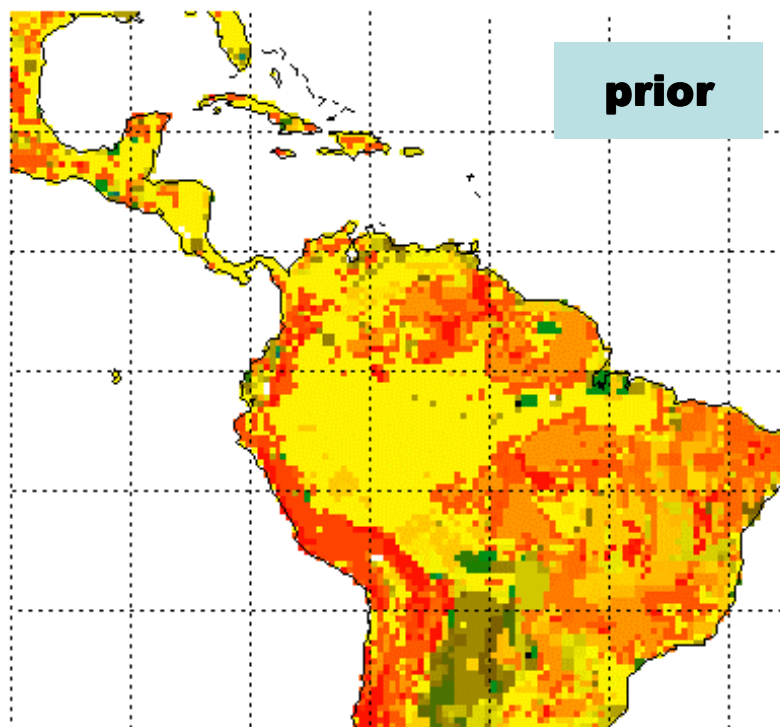
⇒ off-diagonal elements again 0

= no prior correlation between errors of different months

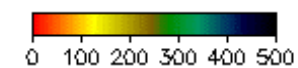
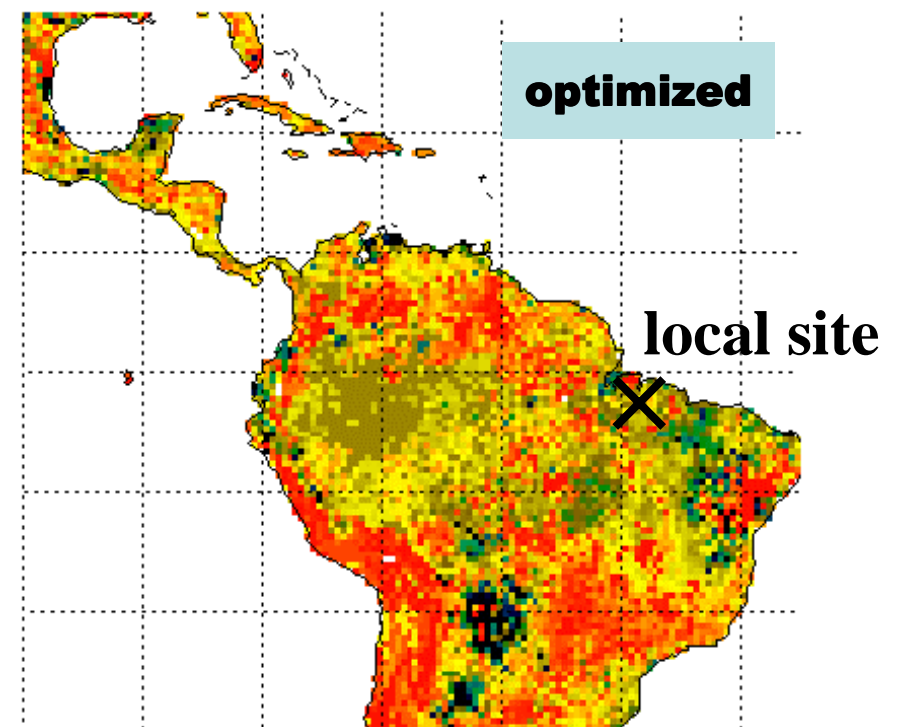
Parameter 2 (regional)

soil water-holding capacity

maximum soil water holding capacity [mm] prior



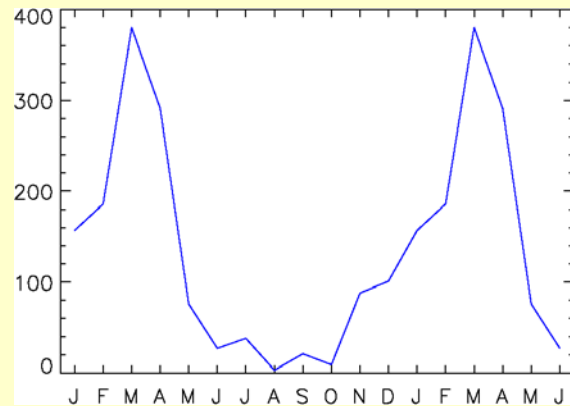
maximum soil water holding capacity [mm] optimized



Local Simulations

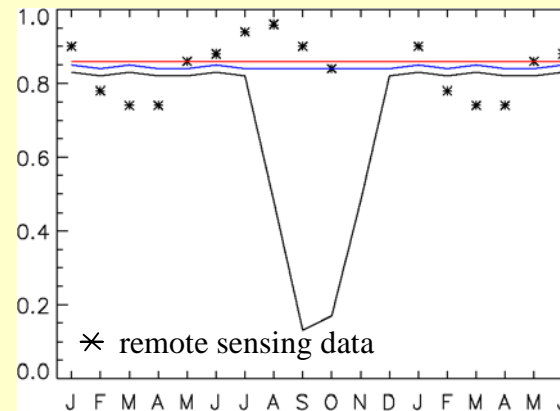
Paragominas
3°S 48°W 63 m

precipitation [mm/month]



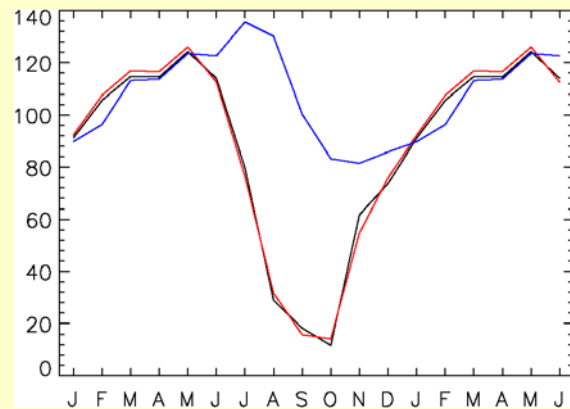
1992

fAPAR

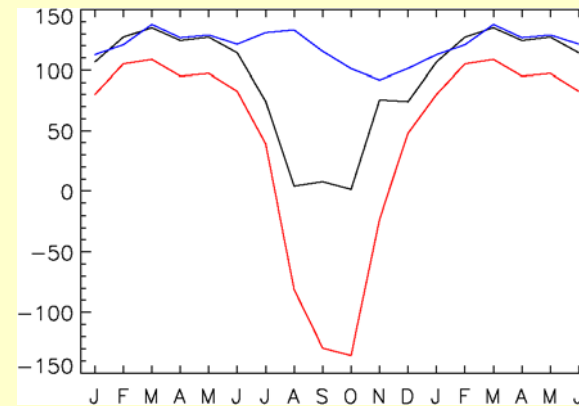


* remote sensing data

evapotranspiration [mm/month]



NPP [gC/(m² month)]

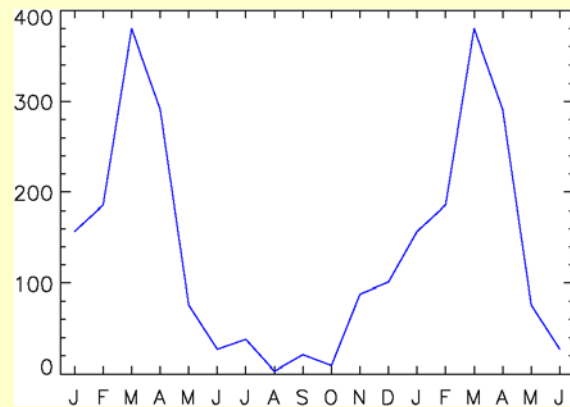


- no remote sens. data
- fAPAR prescribed
- fAPAR assimilated

Measured Soil Moisture

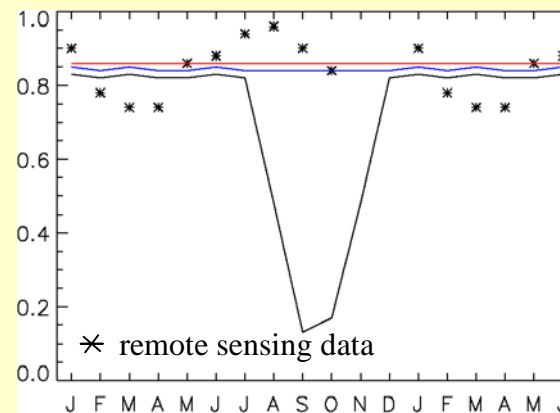
Paragominas
3°S 48°W 63 m

precipitation [mm/month]



1992

fAPAR



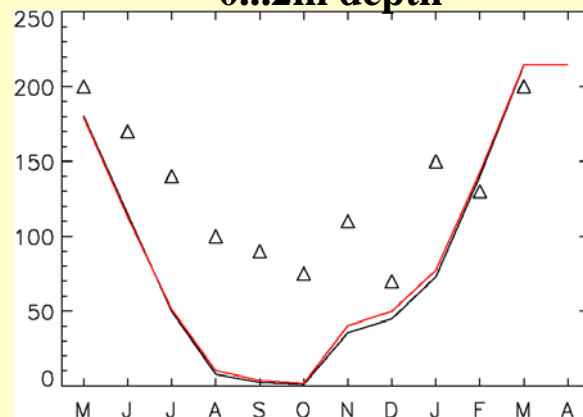
* remote sensing data

— no remote sens. data

— fAPAR prescribed

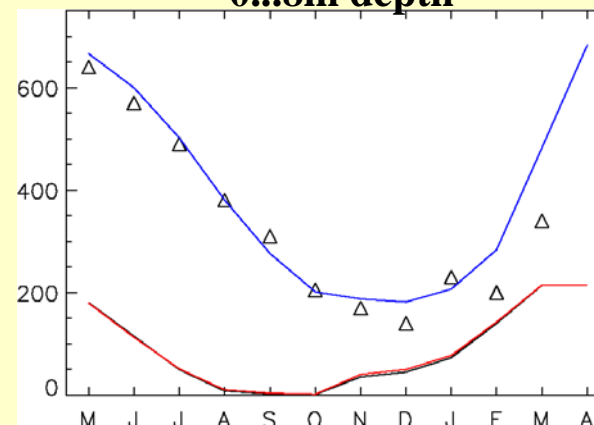
— fAPAR assimilated

0...2m depth



1992

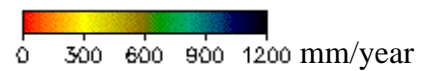
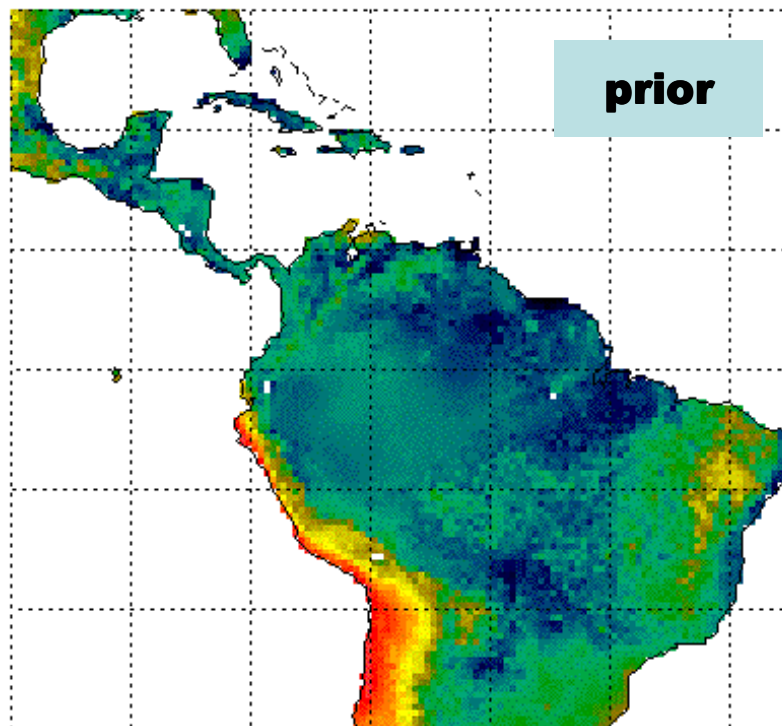
0...8m depth



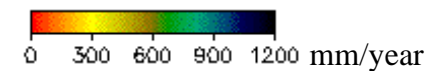
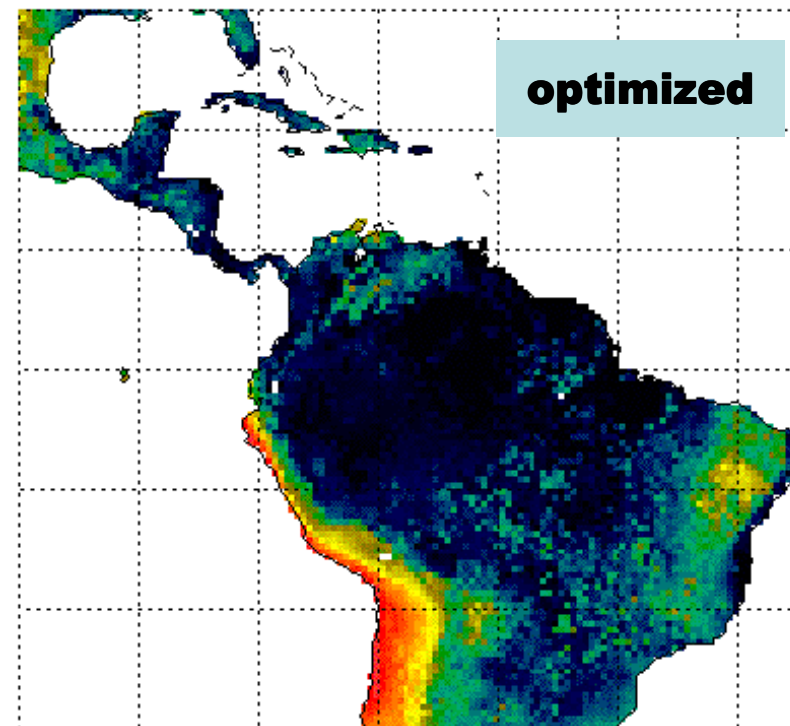
1992

evapotranspiration (regional)

annual AET 2000 [mm] prior

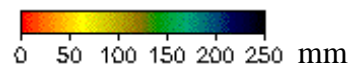
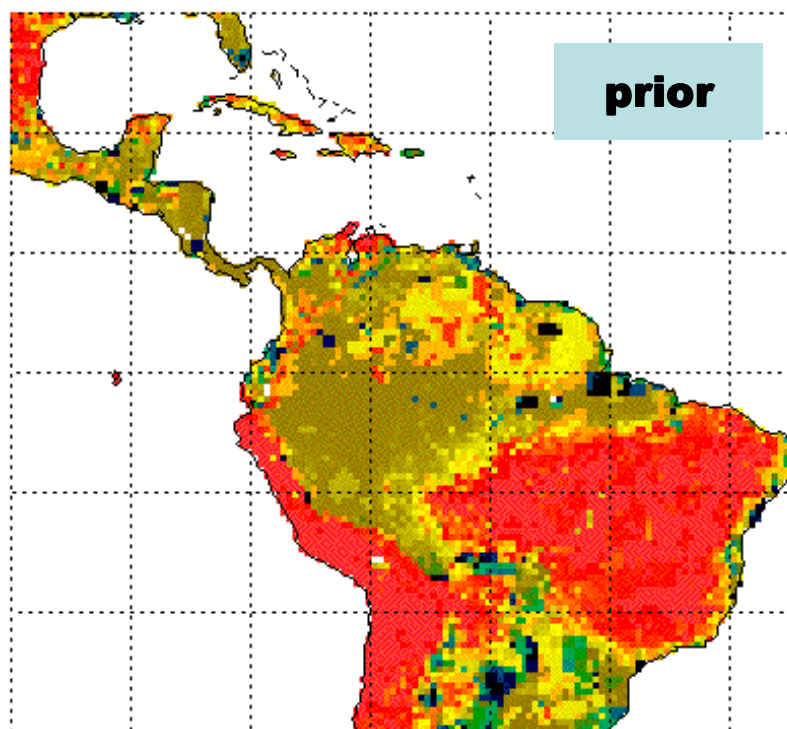


annual AET 2000 [mm] optimized

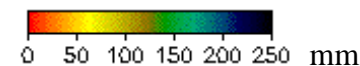
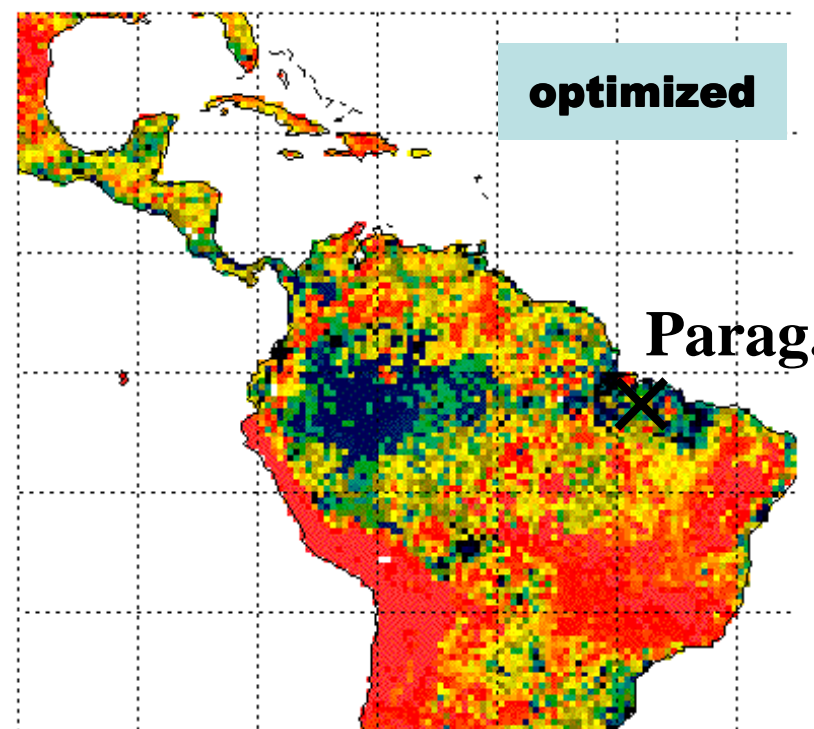


July soil moisture (regional, dry season)

BETHY soil moisture 7/2000 prior



BETHY soil moisture 7/2000 optimized



Conclusions

- The carbon cycle is highly sensitive to climate fluctuations
- Vegetation can be quantified *reliably* from space
- fAPAR lags precipitation by ~1–4(?) months
- seems to behave similar to soil moisture
- assimilation of fAPAR can deliver valuable information on soil moisture status

Conclusions

- Need to improve *phenology* model
- Implement *sequential* 2-D var assimilation scheme
- Assimilate fAPAR into *coupled* ECHAM5-BETHY model

(hope not too distant) goal: make fAPAR what SST is for ocean-atmosphere interactions... and improve seasonal forecasts

Thank You For Your Attention!