

# Land-surface processes in NWP: Vegetation and carbon

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# Outlines

- **Vegetation**
  - Role of vegetation in NWP
  - Tiled approach and current data
  - Evolution of vegetation parametrization and practical cases
- **Carbon**
  - Why are we interested in carbon?
  - Parametrization and feedback from the atmosphere
  - Comparison with Jarvis approach and interaction with the atmosphere

# **Vegetation state affects**

## **● Energy/water budgets**

- Evapotranspiration**
- Interception evaporation**
- Surface albedo (net radiation at the surface)**
- Aerodynamic exchange through surface roughness**

## **● Carbon budget**

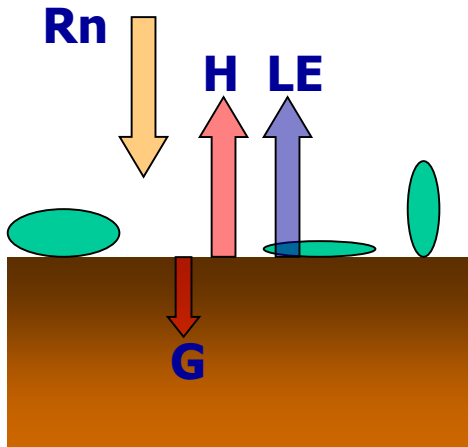
- Plant Respiration**
- photosynthesis**

# Vegetation role: some recaps

- Energy balance equation

$$(1 - a)R_S^\downarrow + \varepsilon_g R_T^\downarrow - \varepsilon_g \sigma T_{sk}^4 + H + \lambda E = G$$

→ **Albedo (a)** and **emissivity (ε)** depend on the surface/vegetation condition



**Table 3.1**

Radiative Properties of Natural Surfaces<sup>a</sup>

Surface type	Other specifications	Albedo (a)	Emissivity (ε)
Water	Small zenith angle	0.03–0.10	0.92–0.97
	Large zenith angle	0.10–0.50	0.92–0.97
Snow	Old	0.40–0.70	0.82–0.89
	Fresh	0.45–0.95	0.90–0.99
Ice	Sea	0.30–0.40	0.92–0.97
	Glacier	0.20–0.40	
Bare sand	Dry	0.35–0.45	0.84–0.90
	Wet	0.20–0.30	0.91–0.95
Bare soil	Dry clay	0.20–0.35	0.95
	Moist clay	0.10–0.20	0.97
	Wet fallow field	0.05–0.07	
Paved	Concrete	0.17–0.27	0.71–0.88
	Black gravel road	0.05–0.10	0.88–0.95
Grass	Long (1 m)	0.16–0.26	0.90–0.95
	Short (0.02 m)		
Agricultural	Wheat, rice, etc.	0.10–0.25	0.90–0.99
	Orchards	0.15–0.20	0.90–0.95
Forests	Deciduous	0.10–0.20	0.97–0.98
	Coniferous	0.05–0.15	0.97–0.99

<sup>a</sup> Compiled from Sellers (1965), Kondratyev (1969), and Oke (1978).

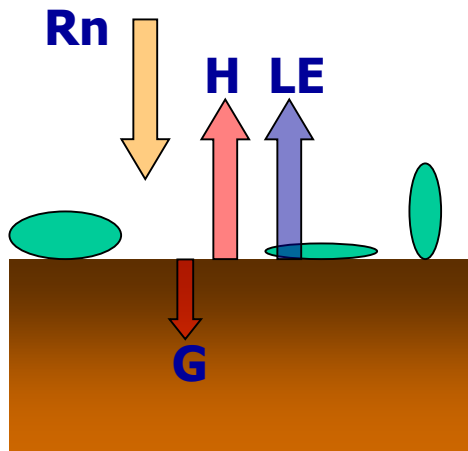
Arya, 1988

# Vegetation role: some recaps

- Energy balance equation

$$(1-a)R_S^\downarrow + \varepsilon_g R_T^\downarrow - \varepsilon_g \sigma T_{sk}^4 + \textcircled{H} + \lambda E = G$$

→ Sensible heat (H) is also related to vegetation through its relative partition with LE and the aerodynamic exchange specific to surface/vegetation type



Sensible heat flux

$$H = \rho C_h u_L (C_p T_L + gz - C_p T_{sk})$$

$$C_h = f(Ri_B, z_{oh}, z_{om})$$

$z_{oh}, z_{om}$  Roughness length for heat and momentum  
Dependent on surface/vegetation type

# Vegetation role: some recaps

- Energy balance equation

$$(1-a)R_S^\downarrow + \varepsilon_g R_T^\downarrow - \varepsilon_g \sigma T_{sk}^4 + H + \lambda E = G$$

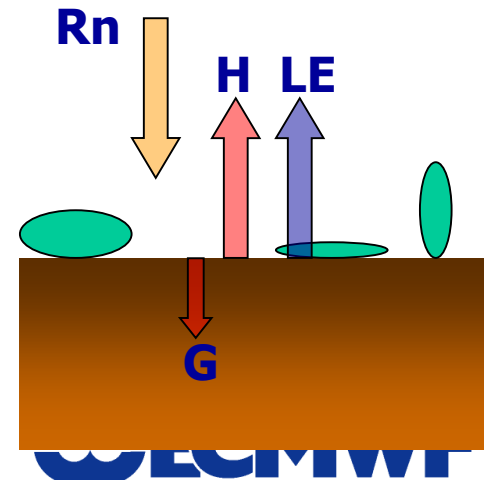
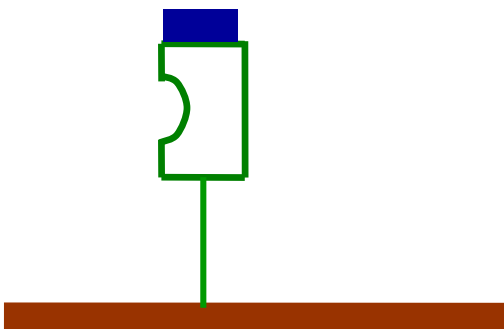
→ Latent heat (LE) is related to vegetation through:

Evapotranspiration and momentum exchange

Interception evaporation =  
f(Interception reservoir) → f(LAI))

$$\left\{ \begin{aligned} E &= \frac{\rho_a}{r_c + r_a} [q_a - q_{sat}(T_{sk})] \\ r_c &= \frac{r_{s,min}}{LAI} f_1(R_S^\downarrow) f_3(\bar{\theta}) f_4(D_a) \\ r_a &= \frac{1}{C_h u_L}, C_h = f(Ri_B, z_{oh}, z_{om}) \end{aligned} \right.$$

Wet vegetation



# Vegetation role: some recaps

- **Water balance equation**

$$\partial W/\partial t = P - E - R_o - I - D$$

$\partial W/\partial t$  = change in water storage

$P$  = precipitation

$E$  = evapotranspiration

$R_o$  = runoff

$I$  = Infiltration

$D$  = lateral diffusion

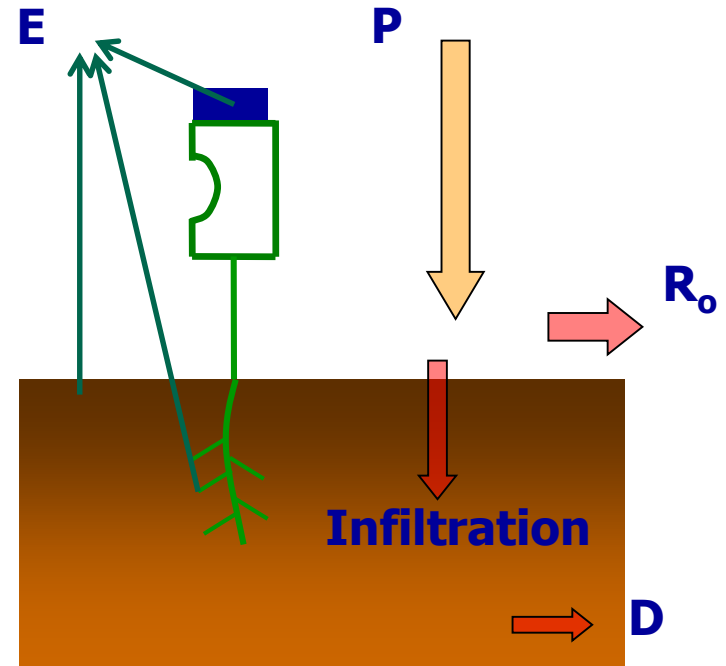
## Evaporation from:

*Bare soil*

*Interception layer*

*Root transpiration*

Infiltration also depend on **through fall** amount



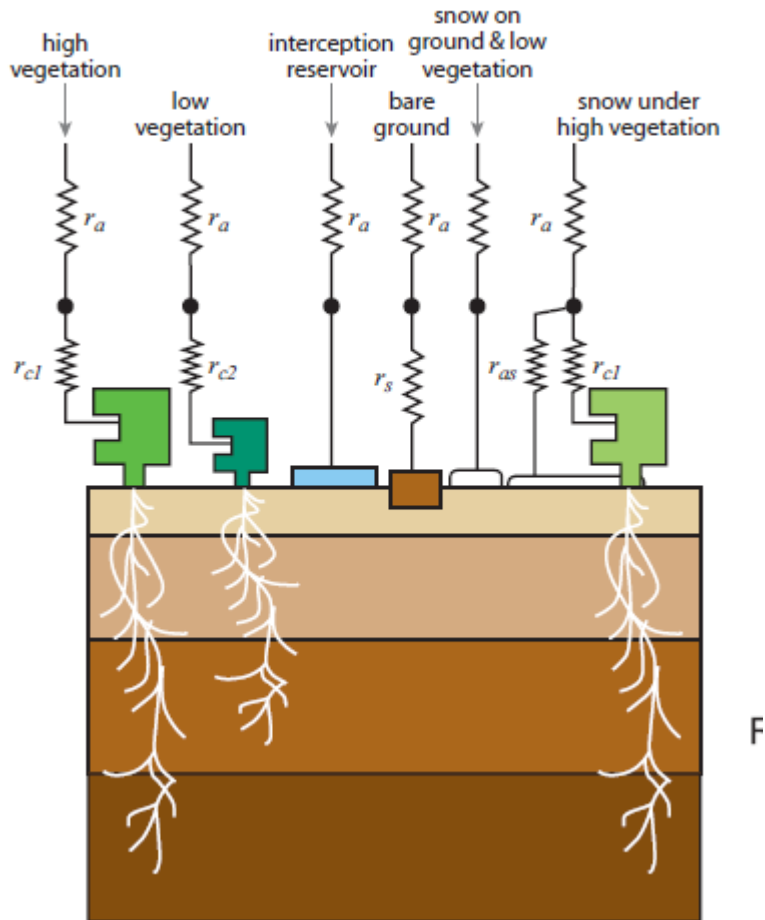
# Vegetation heterogeneity

- **Land surface is heterogeneous blend of vegetation at many scales**
  - forest/cropland/urban area
  - within forest: different trees/moss/understories
- **Most LSMs use set of parallel “plant functional types” (PFTs) with specific properties**
  - gridbox mean or tiled
  - Some ecological models treat species competition and dynamics within PFTs
- **Properties of PFTs**
  - LAI
  - rooting depth
  - roughness
  - albedo
  - emission/absorption of organic compounds



# CHTESSEL :a tiles approach

Schematics of the land surface



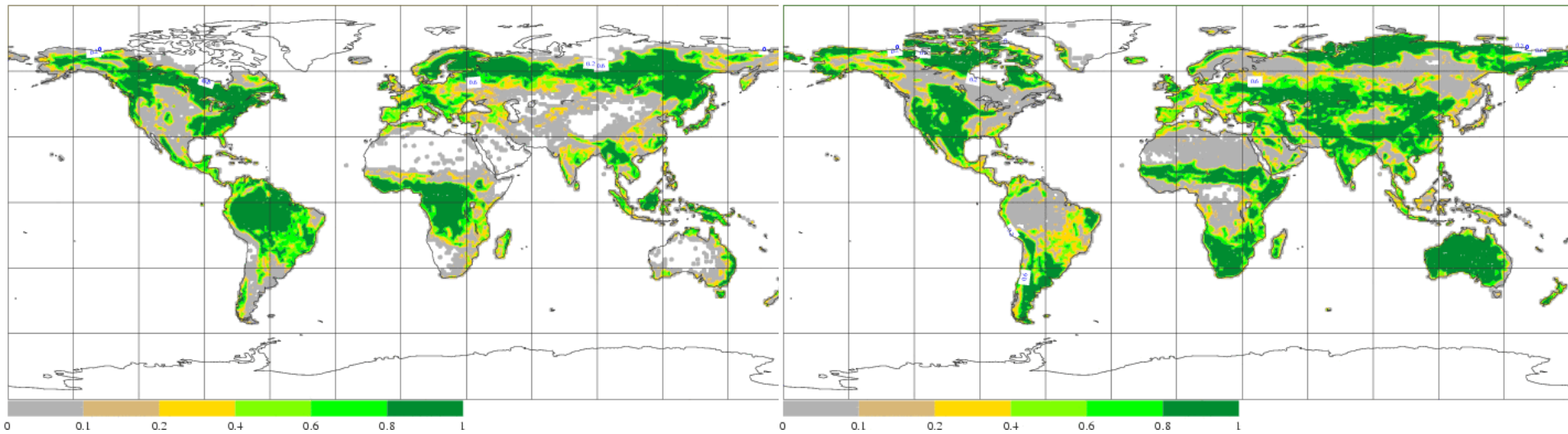
Land/vegetation	Sea and ice
High vegetation	Open sea / unfrozen lakes
Low vegetation	Sea ice / frozen lakes
High vegetation with snow	lakes
Snow on low vegetation	
Bare ground	
Interception layer	

# CHTESSEL geographic characteristics

Fields	ERA15	TESSEL	CHTESSEL
Vegetation	Fraction	Fraction of low Fraction of high	Fraction of low Fraction of high
Vegetation type	Global constant (grass)	Dominant low type Dominant high type	Dominant low type Dominant high type
Albedo	Annual	<b>Monthly</b>	Monthly
LAI	Global constants	<b>Annual, Dependent on vegetation type</b>	<b>Monthly</b>
$r_{smin}$ Root depth	1 m	<b>Annual, Dependent on vegetation type</b>	Annual, Dependent on vegetation type
Root profile	Global constant	<b>Annual, Dependent on vegetation type</b>	Annual, Dependent on vegetation type

## High vegetation fraction

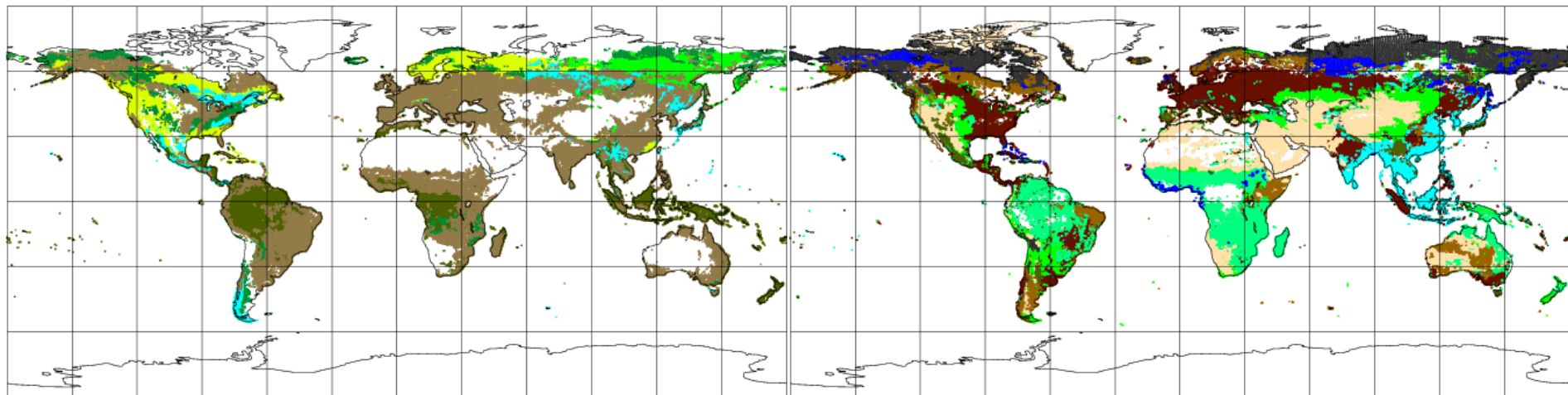
## Low vegetation fraction



## High vegetation Types

## Low vegetation Types

■ ever needle  
 ■ deci needle  
 ■ deci broad  
 ■ ever broad  
 ■ mix forest  
 ■ int forest  
 ■ crops  
 ■ sh grass  
 ■ ta grass  
 ■ tundra  
 ■ irr crops  
 ■ semidesert  
 ■ bog/marsh  
 ■ ever shrub  
 ■ deci shrub



Aggregated from GLCC 1km

# Vegetation types dependent parameters

Index	Vegetation type	H/L	$r_{s,min}$ ( $sm^{-1}$ )	<del>LAI</del> ( $m^2m^{-2}$ )	$c_{veg}$	$g^D$ ( $hPa^{-1}$ )	$a_r$	$b_r$
1	Crops, mixed farming	L	180	3	0.90	0	5.558	2.614
2	Short grass	L	110	2	0.85	0	10.739	2.608
3	Evergreen needleleaf trees	H	500	5	0.90	0.03	6.706	2.175
4	Deciduous needleleaf trees	H	500	5	0.90	0.03	7.066	1.953
5	Deciduous broadleaf trees	H	175	5	0.90	0.03	5.990	1.955
6	Evergreen broadleaf trees	H	240	6	0.99	0.03	7.344	1.303
7	Tall grass	L	100	2	0.70	0	8.235	1.627
8	Desert	-	250	-	-	-	-	-
9	Tundra	L	80	-	-	-	-	-
10	Irrigated crops	L	180	-	-	-	-	-
11	Semidesert	L	150	-	-	-	-	-
12	Ice caps and glaciers	-	-	-	-	-	-	-
13	Bogs and marshes	L	240	-	-	-	-	-
14	Inland water	-	-	-	-	-	-	-
15	Ocean	-	-	-	-	-	-	-
16	Evergreen shrubs	L	225	-	-	-	-	-
17	Deciduous shrubs	L	225	-	-	-	-	-
18	Mixed forest/woodland	H	250	-	-	-	-	-
19	Interrupted forest	H	175	-	-	-	-	-
20	Water and land mixtures	L	150	-	-	-	-	-

Current 41r1 cycle

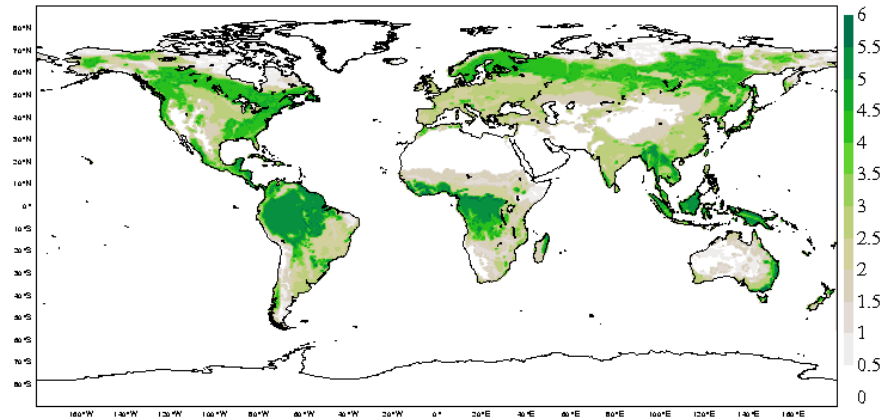
Index	Vegetation type	H/L	$r_{s,min}$ ( $sm^{-1}$ )	$c_{veg}$	$g^D$ ( $hPa^{-1}$ )	$a_r$	$b_r$
1	Crops, mixed farming	L	100	0.90	0	5.558	2.614
2	Short grass	L	100	0.85	0	10.739	2.608
3	Evergreen needleleaf trees	H	250	0.90	0.03	6.706	2.175
4	Deciduous needleleaf trees	H	250	0.90	0.03	7.066	1.953
5	Deciduous broadleaf trees	H	175	0.90	0.03	5.990	1.955
6	Evergreen broadleaf trees	H	240	0.99	0.03	7.344	1.303
7	Tall grass	L	100	0.70	0	8.235	1.627
8	Desert	-	250	0	0	4.372	0.978
9	Tundra	L	80	0.50	0	8.992	8.992
10	Irrigated crops	L	180	0.90	0	5.558	2.614
11	Semidesert	L	150	0.10	0	4.372	0.978
12	Ice caps and glaciers	-	-	-	-	-	-
13	Bogs and marshes	L	240	0.60	0	7.344	1.303
14	Inland water	-	-	-	-	-	-
15	Ocean	-	-	-	-	-	-
16	Evergreen shrubs	L	225	0.50	0	6.326	1.567
17	Deciduous shrubs	L	225	0.50	0	6.326	1.567
18	Mixed forest/woodland	H	250	0.90	0.03	4.453	1.631
19	Interrupted forest	H	175	0.90	0.03	4.453	1.631
20	Water and land mixtures	L	150	0.60	0	-	-

Era Interim cycle

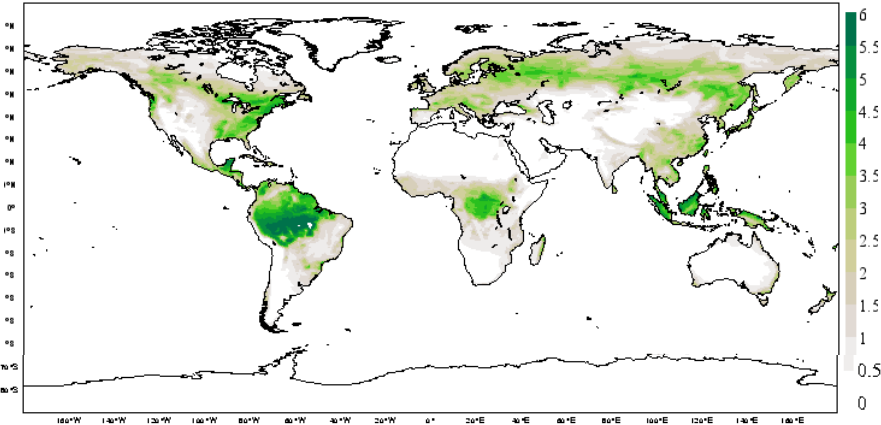
# More realistic vegetation dynamic: Seasonal varying Leaf Area Index

# Seasonal Varying Leaf Area Index

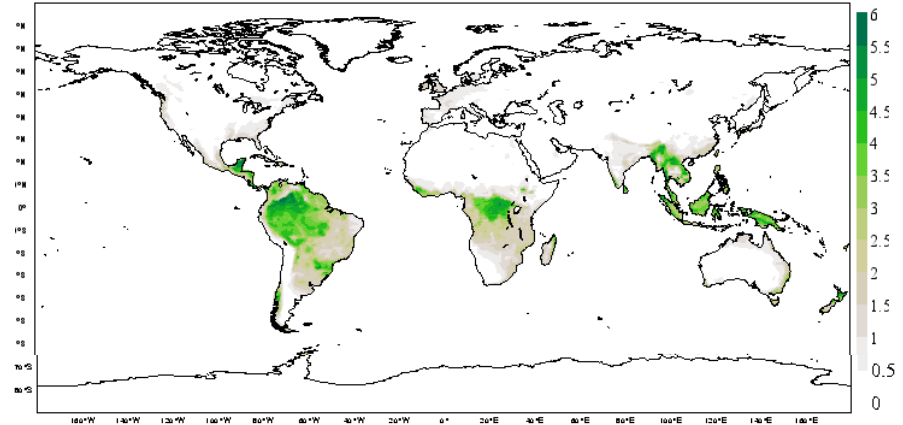
Total LAI [m<sup>2</sup> m<sup>-2</sup>] -Operational



Total LAI [m<sup>2</sup> m<sup>-2</sup>] -July MODIS



Total LAI [m<sup>2</sup> m<sup>-2</sup>] -January MODIS



Obtained by the inversion of a 3D radiative transfer model which compute the LAI and FPAR based on the biome type and an atmospherically corrected surface reflectance thanks to a look-up-table

→ derived 8years (2000-2008) climatological time serie

# Expected LAI impact on screen level Temperature

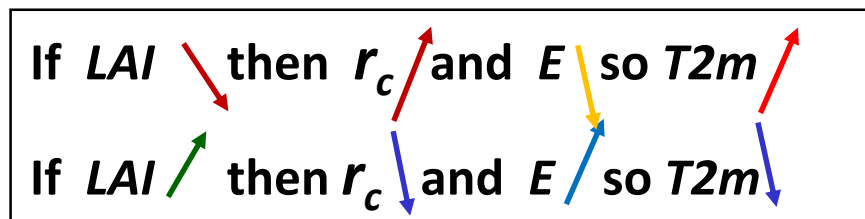
For vegetated area the evapotranspiration is parameterized as:

$$E_i = \frac{\rho_a}{r_a + r_c} [q_L - q_{\text{sat}}(T_{\text{sk},i})]$$

Where the canopy resistance  $r_c$  is defined following Jarvis(1976) as:

$$r_c = \frac{r_{s,\text{min}}}{LAI} f_1(R_s) f_2(\bar{\theta}) f_3(D_a)$$

Where  $r_{s,\text{min}}$  is the minimum stomatal resistance,  $LAI$  is the leaf area index and  $f_1$ ,  $f_2$ ,  $f_3$  are respectively function of the downward shortwave radiation  $R_s$ , soil moisture  $\theta$  and vapour deficit  $D_a$

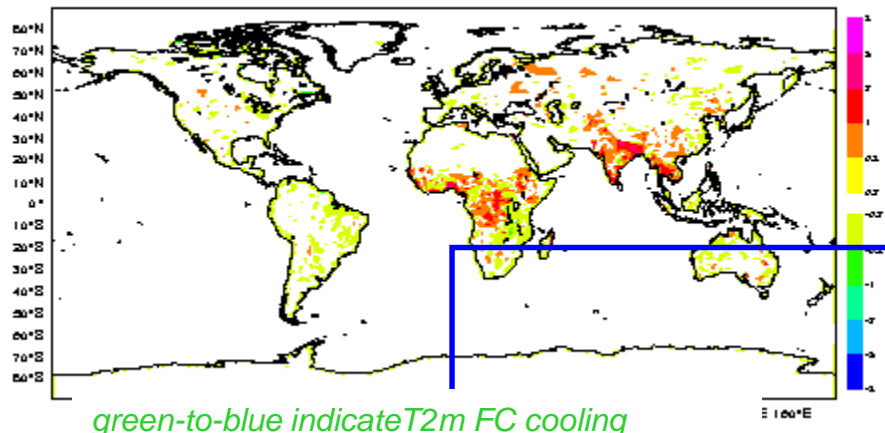


## Sensitivity

T 2m

Setup: T255  
14/02/2008 - 1/09/2008  
Seasonal LAI vs fixed LAI

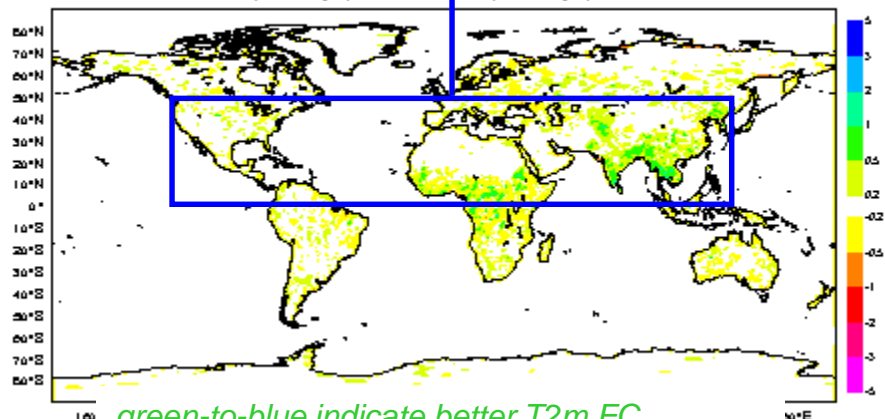
2T difference [CY35R3\_LAI(185f)-CY35R3\_CTL(185e), FC+36 valid 12 UTC, K]MAM 2008



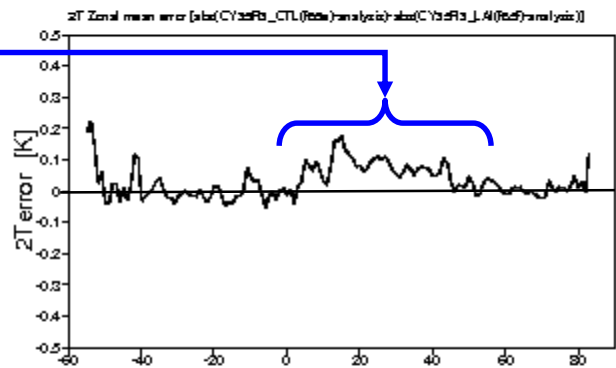
green-to-blue indicate T2m FC cooling

## Impact

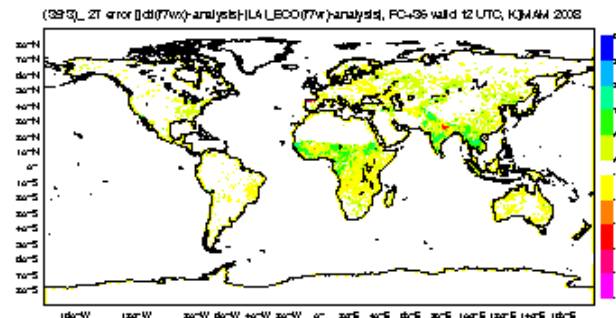
2T error [abs(CY35R3\_CTL(185e)-own\_analysis)-abs(CY35R3\_LAI(185f)-own\_analysis), FC+36 valid 12 UTC, K]MAM 2008



green-to-blue indicate better T2m FC



Zonal mean impact



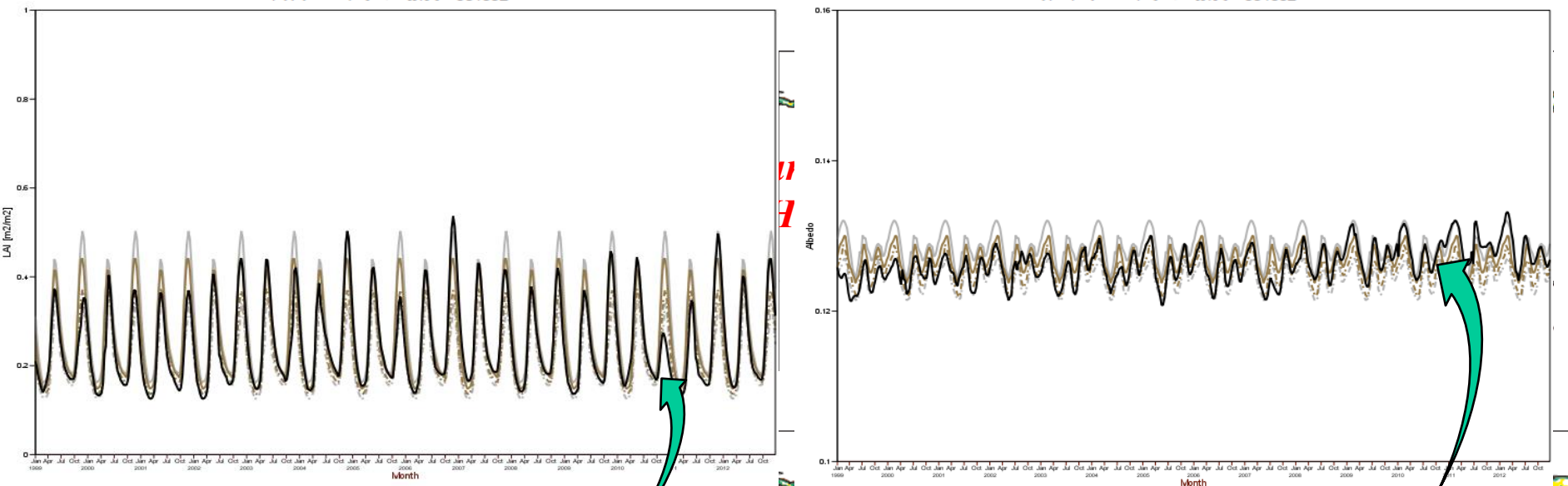
Fc impact

The MODIS LAI introduces a consistent warming seen in FC36h (12UTC) due to reduction of LAI in spring, (increasing vegetation resistance to ET).

This has beneficial impact on near surface temperature forecast (green being positive impact in reducing t2m bias by ~0.5degree)



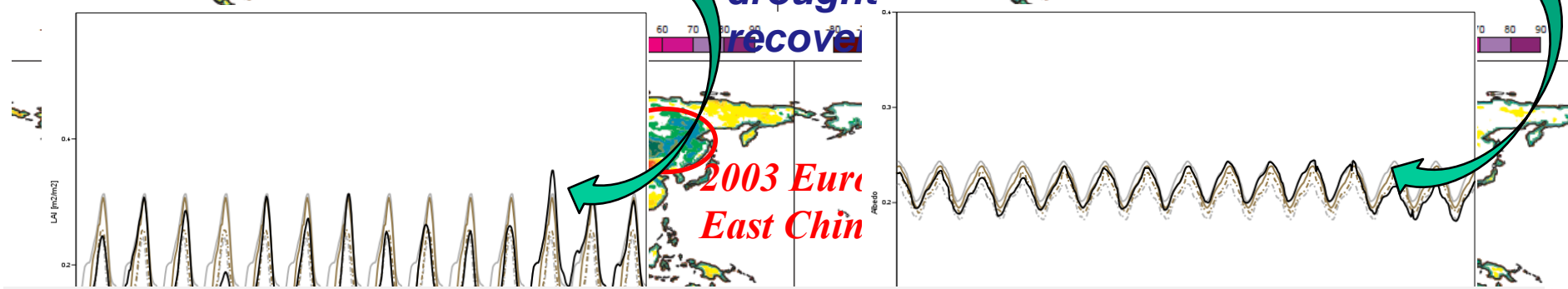
# More and more realistic vegetation dynamic: Assimilation of Near Real Time LAI/Albedo



*Horn of Africa drought  
November 2010*

**Australia  
drought  
recovery**

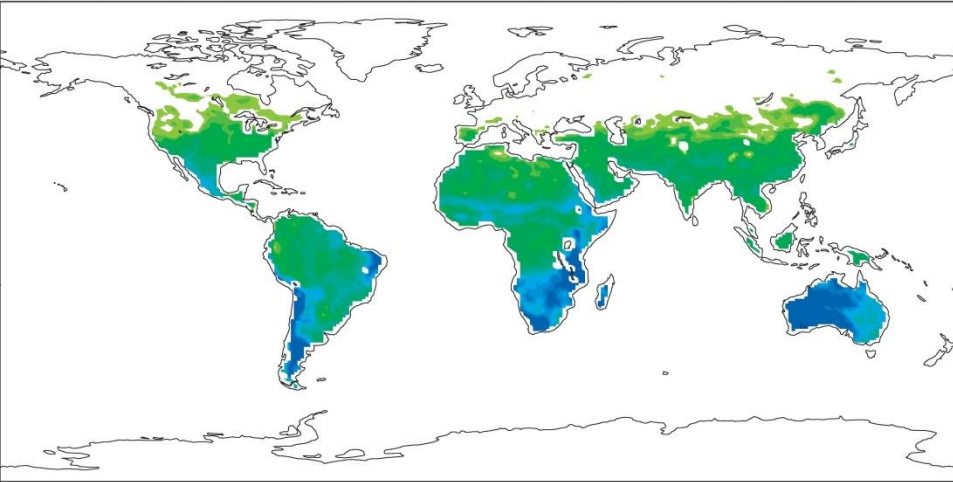
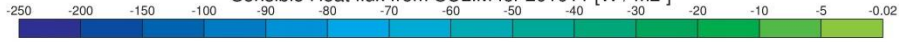
*2003 Euro  
East Chin*



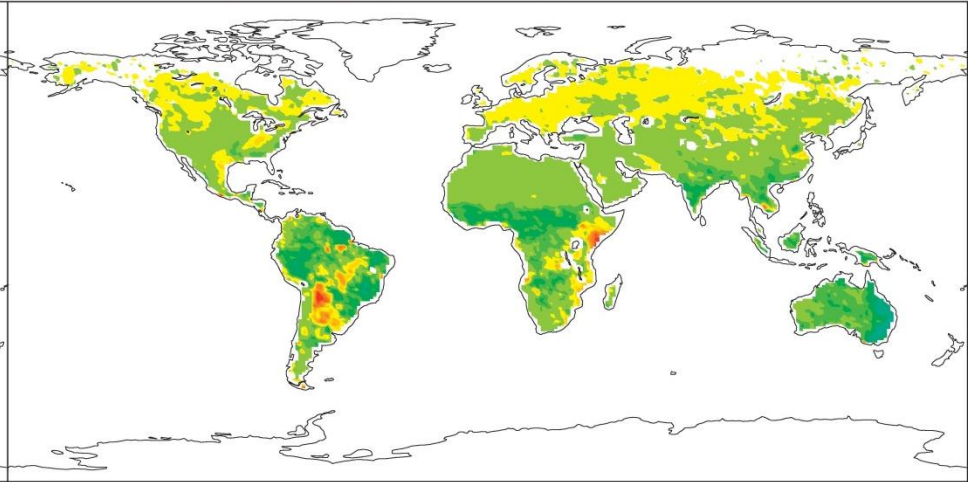
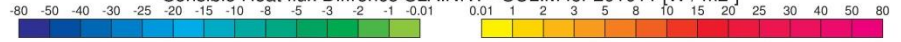
➔ NRT analysed LAI is able to fairly detect/monitor anomalous year  
 ➔ The analysed LAI and albedo signal can be covariant mainly during wet year.

# Sensible Heat flux

Sensible Heat flux from SCLIM for 201011 [W / m<sup>2</sup>]

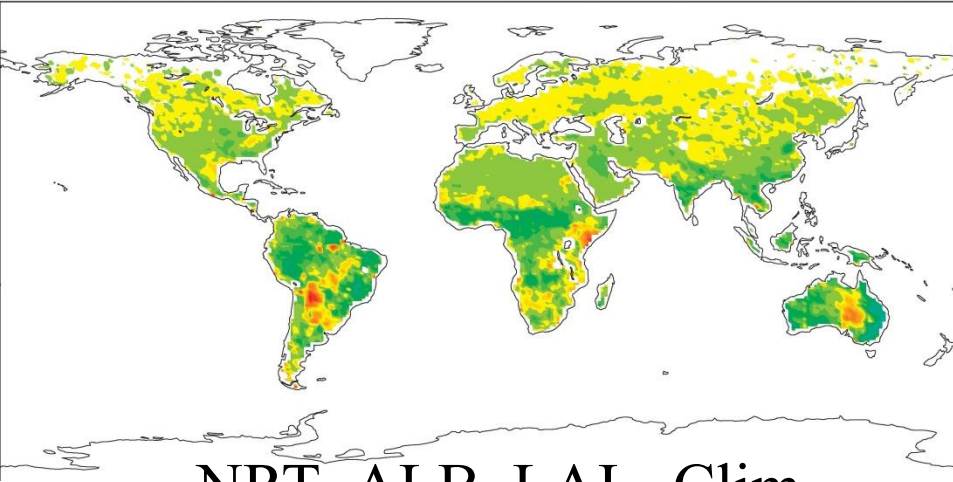


Sensible Heat flux Difference SLAINRT - SCLIM for 201011 [W / m<sup>2</sup>]



## Clim

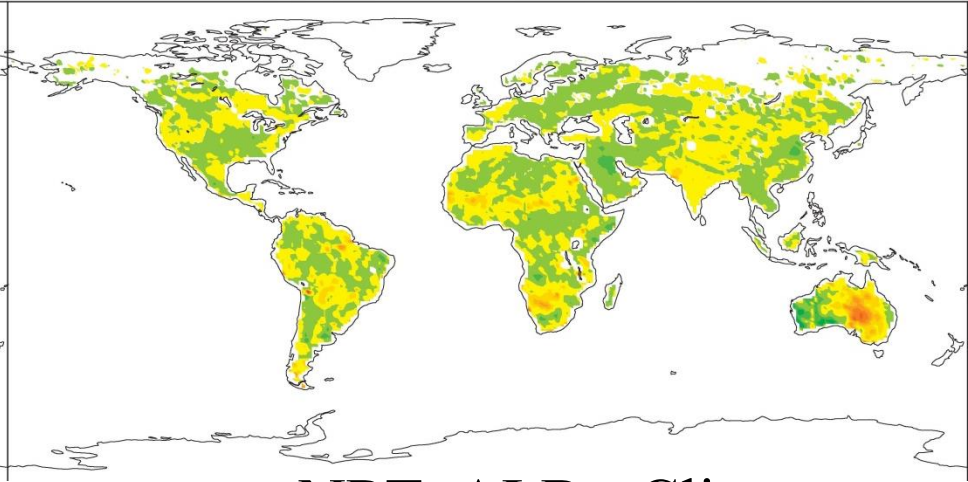
Sensible Heat flux Difference SNRT - SCLIM for 201011 [W / m<sup>2</sup>]



## NRT\_ALB\_LAI - Clim

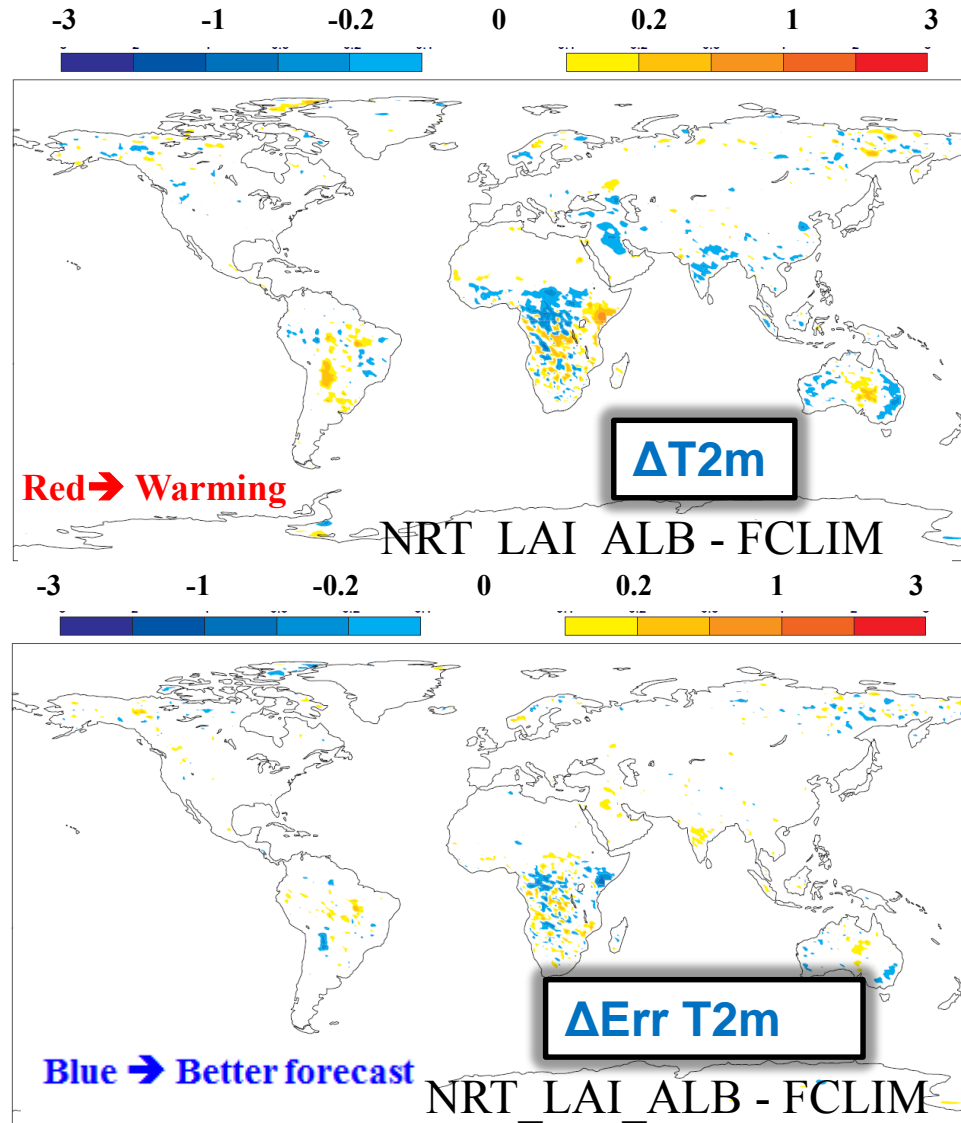
## NRT\_LAI - Clim

Sensible Heat flux Difference SALBNRT - SCLIM for 201011 [W / m<sup>2</sup>]



## NRT\_ALB - Clim

# 2m temperature sensitivity in coupled run



# Even more realistic vegetation dynamic: Variable vegetation cover

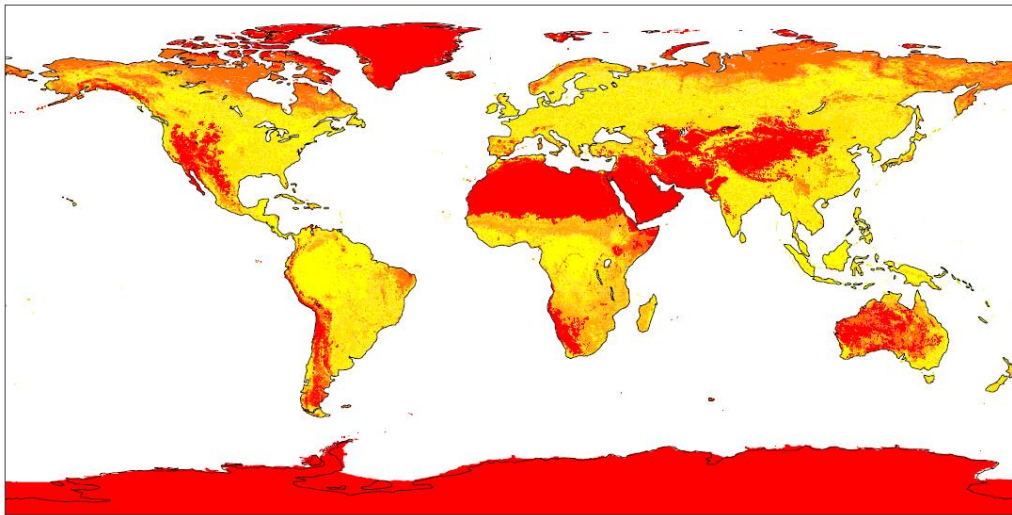
Februar

May

July

October

y



**Bare-ground/snow cover  
(1- Vegetation fraction)**

→ vegetation cover variation based on satellite observation of Leaf Area Index according to a modified Beer-Lamber law with clumping

$$C_{veg} = 1 - e^{0.5\omega LAI}$$

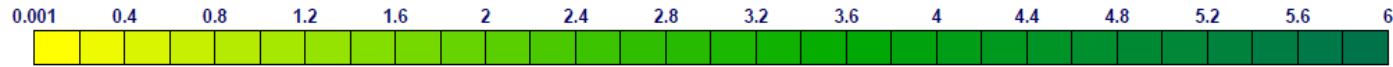
Februar

May

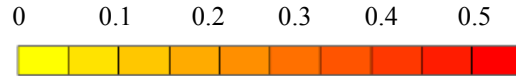
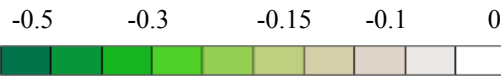
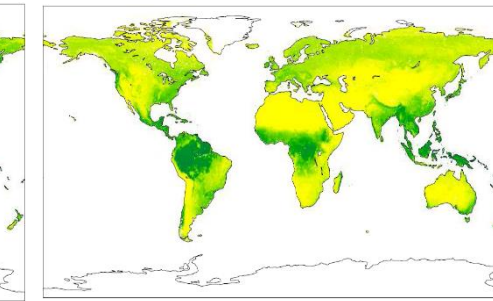
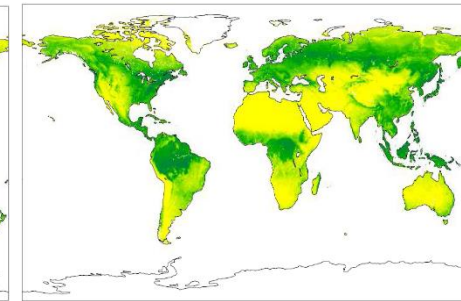
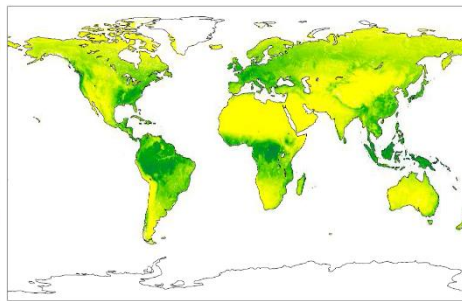
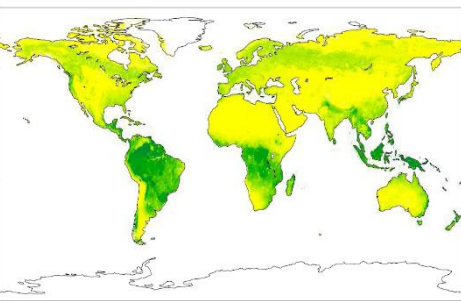
July

October

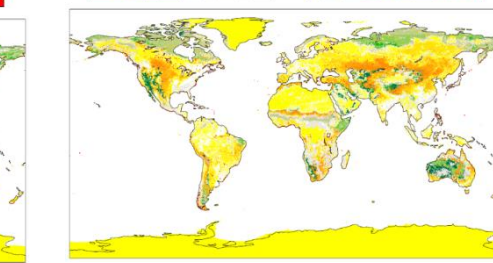
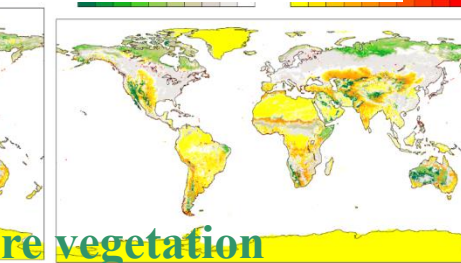
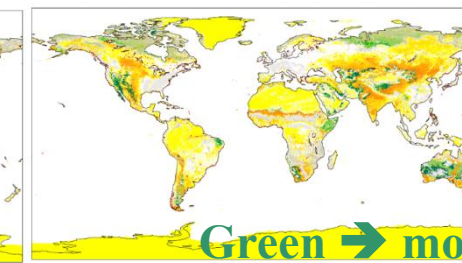
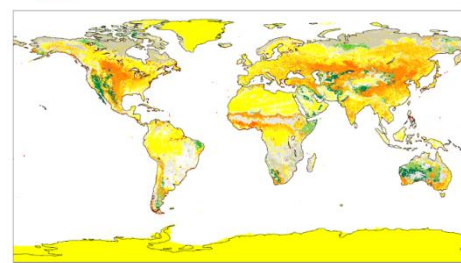
y



LAI



(Vegetation cover difference)

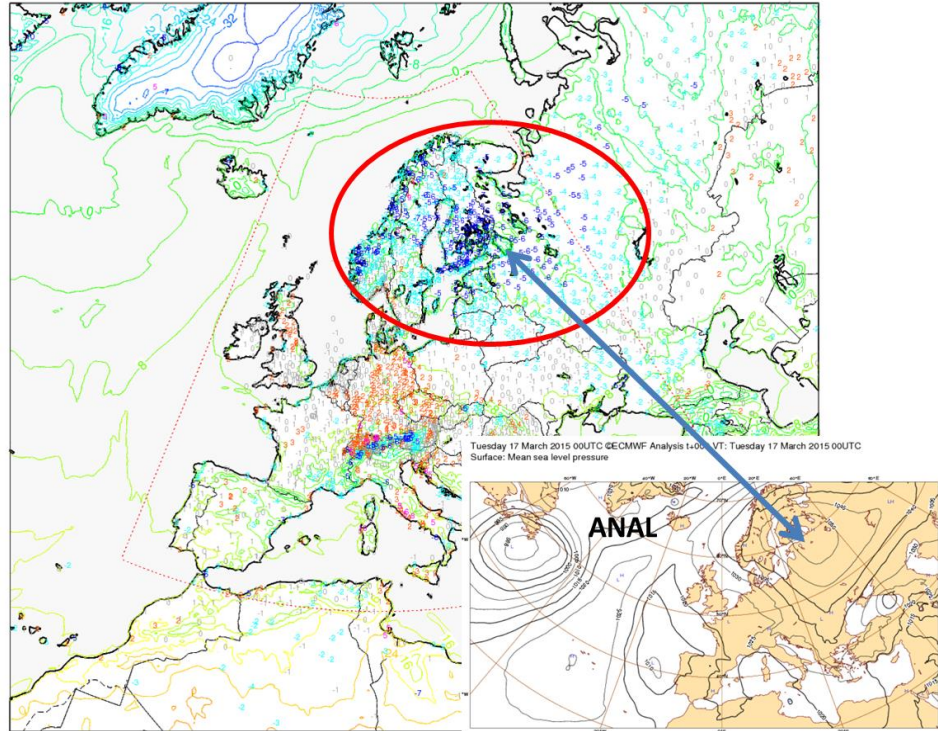


Green → more vegetation

➔ Physically-based seasonal variability of the vegetation cover

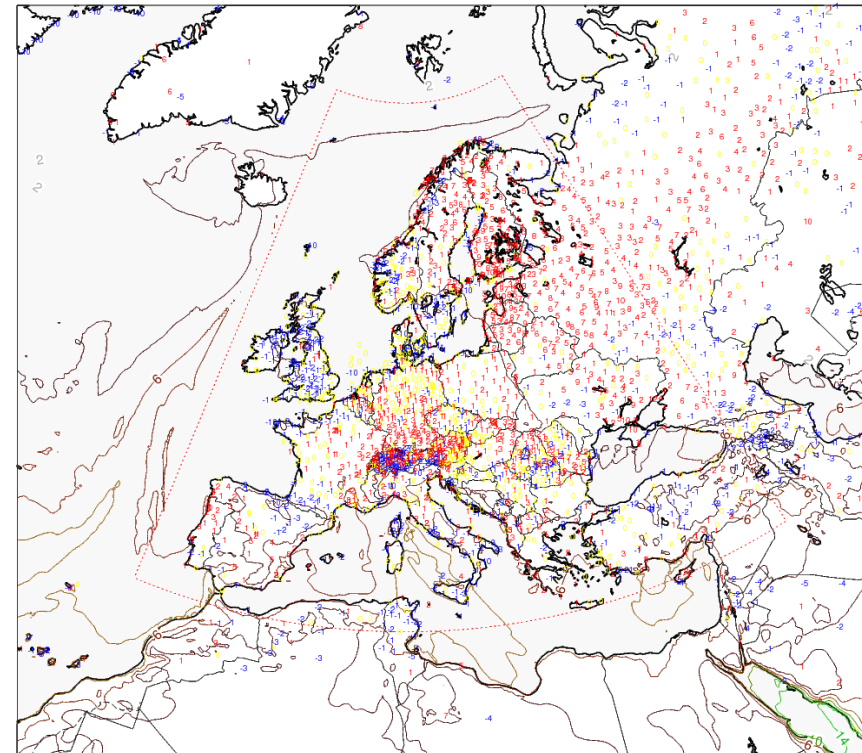
# Impact in weather forecast mode

2m temperature [°C] NUMBERS: FC-OBS errors [K]  
FC:2015-03-13 12:00:00 STEP 72 VT: 2015-03-16 12:00:00  
N=2768 BIAS= -0.7K STDEV= 2.5K MAE= 2.0K  
errors for [north=75.00, west=-12.50, south=35.00, east=42.50]



Cold bias on 2m Temperature  
4K on average

2m specific humidity [g/kg] NUMBERS:  $10^*(FC-OBS)/OBS$  norm.errors [10s of %]  
FC:2015-03-13 12:00:00 STEP 72 VT: 2015-03-16 12:00:00  
N=2436 BIAS= 8.4% STDEV= 24.5% MAE= 16.6%  
errors for [north=75.00, west=-12.50, south=35.00, east=42.50]

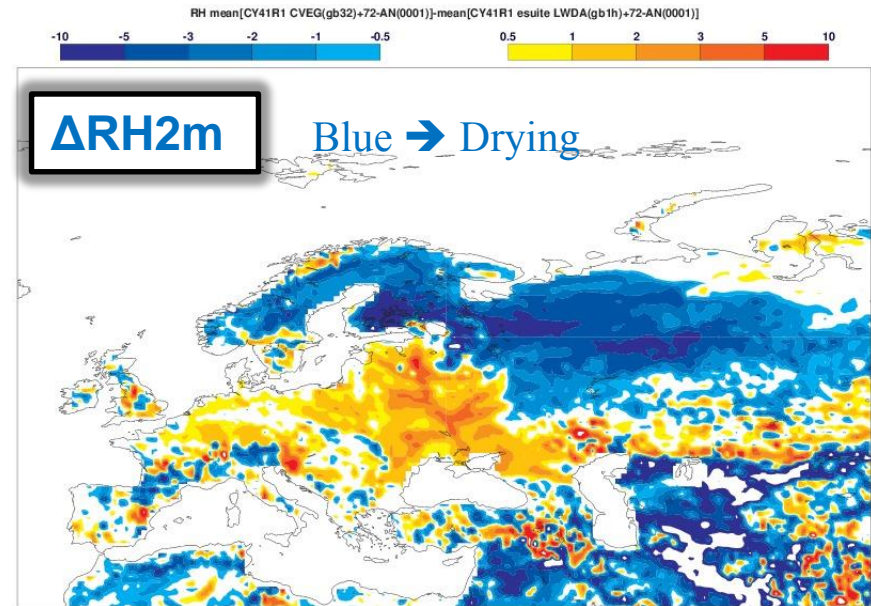
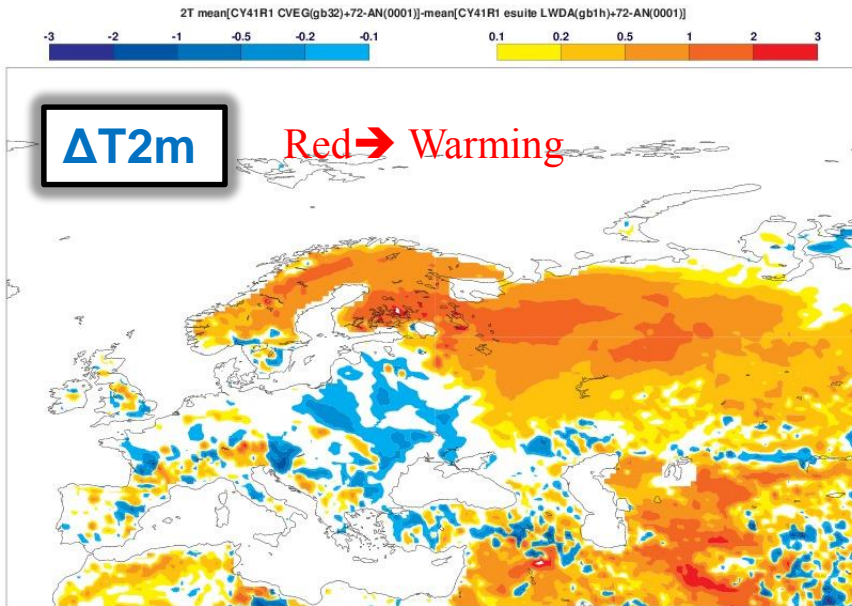


Moist bias on 2m specific  
humidity 1g/kg on average



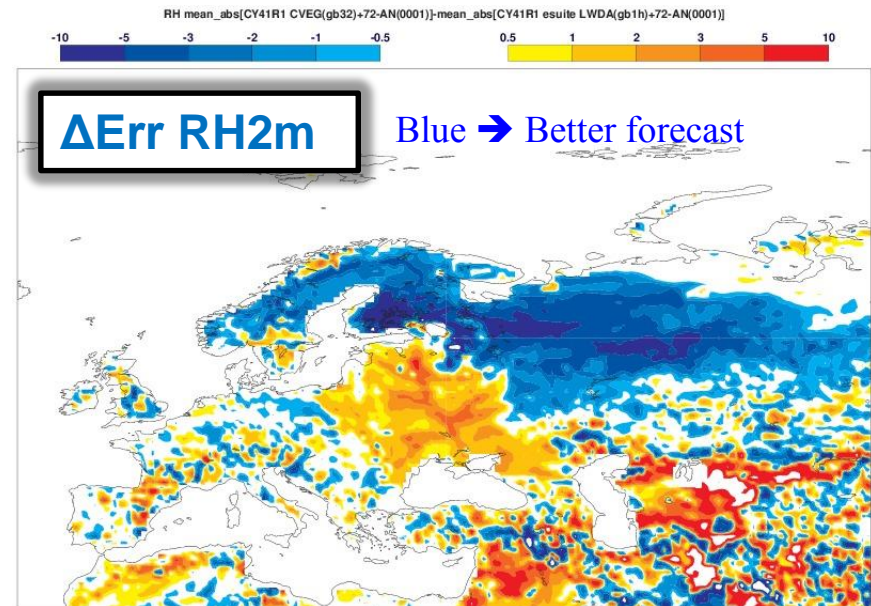
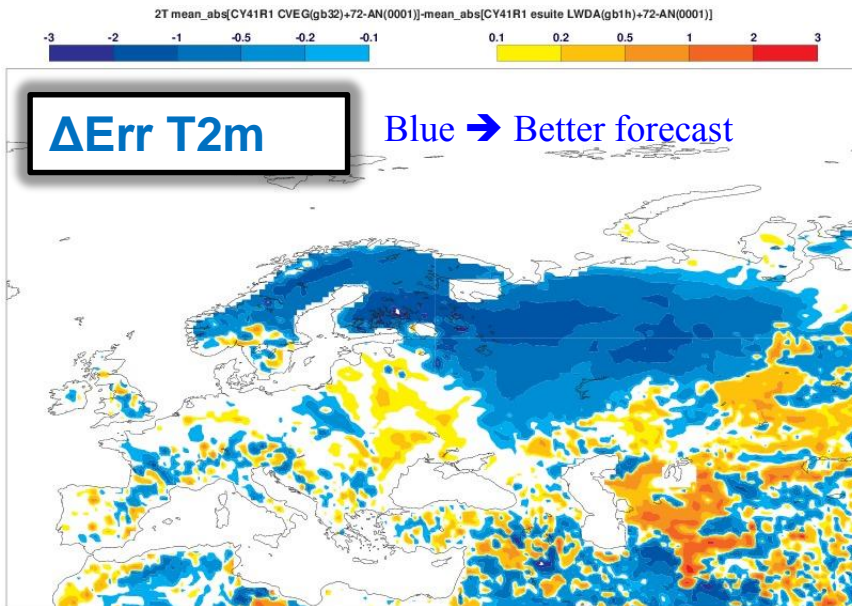
# Weather forecasts sensitivity

→ Check the T 2m and RH on short term forecast fc+72 valid 12 UTC, March 2015



*Sensitivity* = *CVEG* - *CTL* ,  
if >0 => **Warming** / **adding moisture**  
if <0 => **Cooling** / **removing moisture**

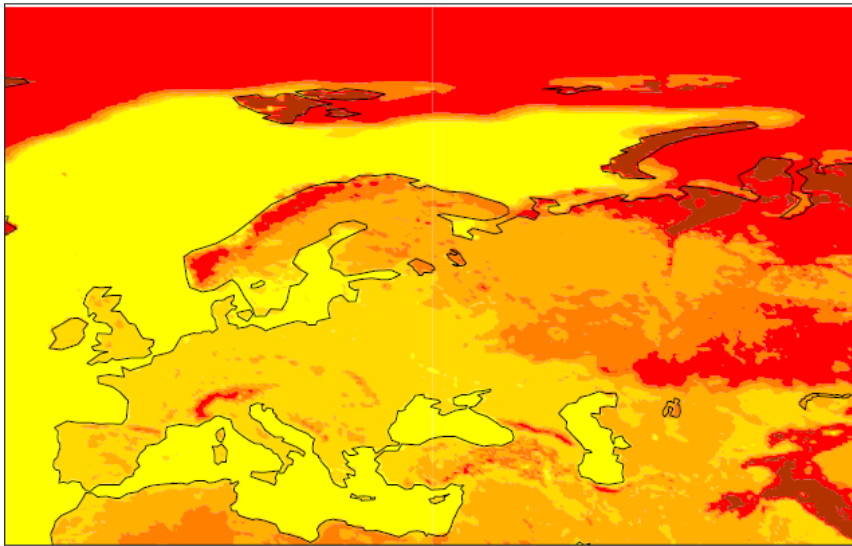
# Weather forecasts impact



$Impact = |CTL - analysis| - |CVEG - analysis|$  ,  
if  $>0$   $\Rightarrow$  relative error reduction from the analysis (positive impact) ,  
if  $<0$   $\Rightarrow$  relative error increase from the analysis (negative impact)

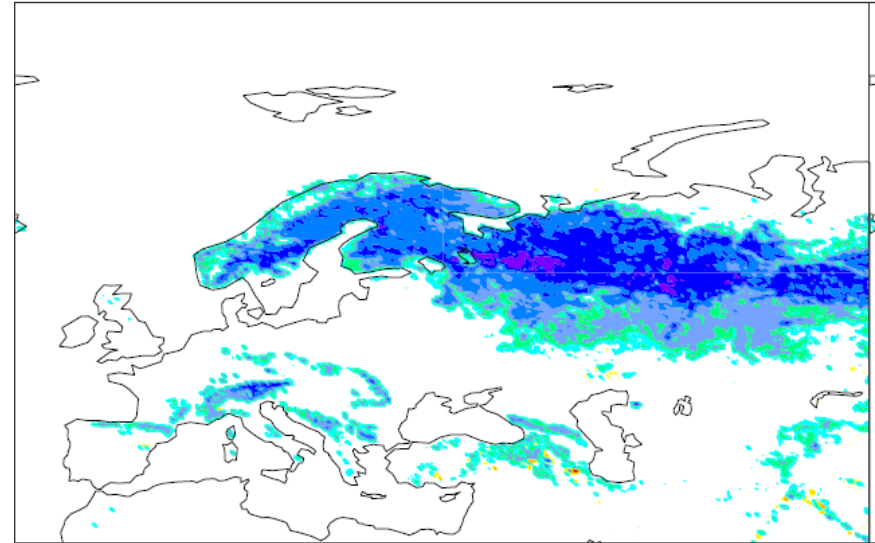
# Behind the scene

Forecast Albedo from CTL for 2015031372 -



Forecast Albedo for CTL

Forecast Albedo Difference VegCLUM - CTL for 2015031372 -

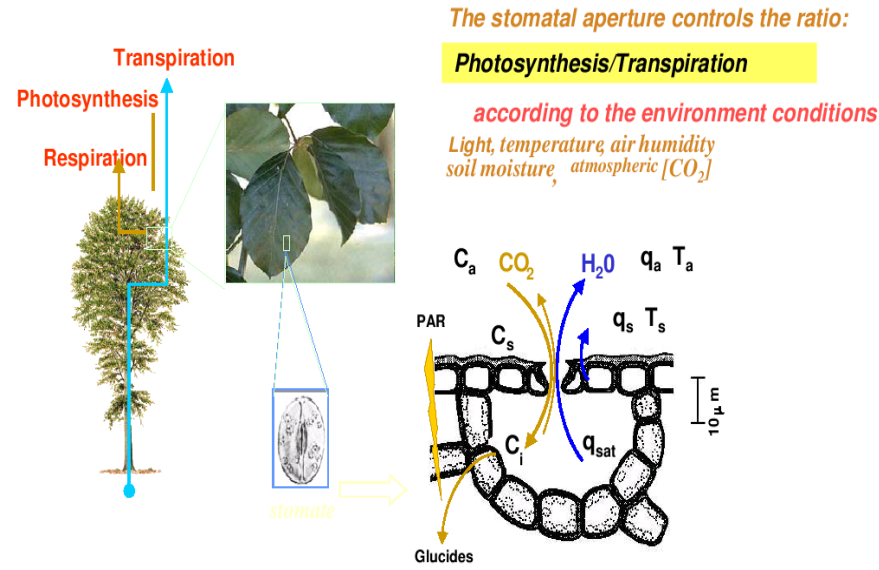
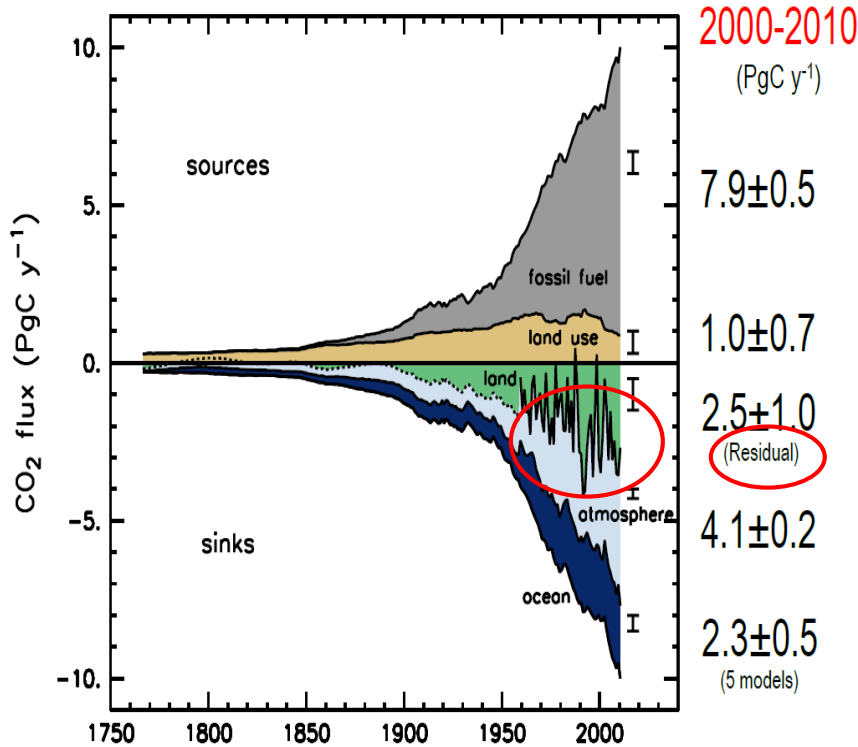


CVeg albedo - CTL albedo

→ Change in the vegetation cover is linked with a change in the forest albedo in presence of snow (in this case)

# Introducing Land Carbon parametrisation

# Why increasing complexity?



**CO<sub>2</sub> and water vapour share the same pathway**

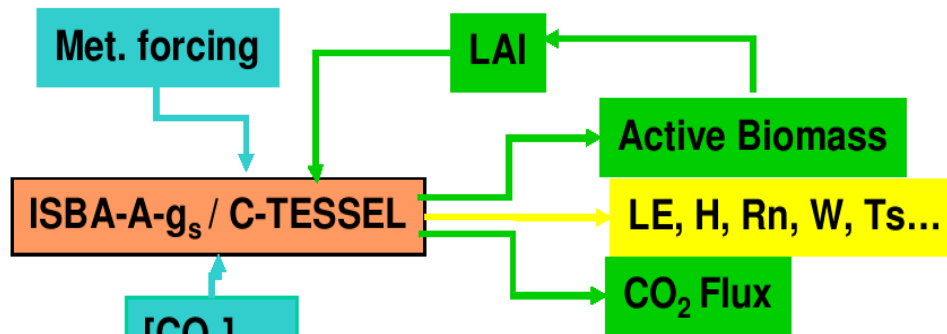


Global Carbon Project 2011; Updated from Le Quéré et al. 2009, Nature G; Canadell et al. 2007, PNAS

**The land surface natural contribution to the global carbon budget is still highly uncertain**

- A better representation of the vegetation processes
- And also attempt to reduce uncertainties from the global carbon budget

# Land carbon/photosynthesis-based canopy resistance parameterisation



$$A_n = \frac{\alpha}{r_{cc}} (C_s - C_i)$$

$$E = \frac{\beta}{r_c + r_a} (q_a - q_{sat}), r_c = f(r_{cc})$$

$$\square A_n = \rho f(\text{soil } m) \Delta\text{CO}_2 / r_c$$

→  $r_c$  back-calculated from

- Empirical soil moisture dependence
- $\text{CO}_2$ -gradient  $\Delta\text{CO}_2$  is also  $f(q_{sat} - q)$
- Net photosynthetic rate  $A_n$ 
  - $A_{n,\max}$
  - Photosynthetic active Radiation (PAR)
  - temperature
  - $[\text{CO}_2]$

**CTESSEL combines HTESSEL (Balsamo et al. 2009) with the A-gs model used within the ISBA-Ags (Calvet et al. 1998) and developed by Jacobs et al. (1996);**

→ Account for the effect of  $\text{CO}_2$  concentration and the interactions between all environment factors on the stomatal aperture.

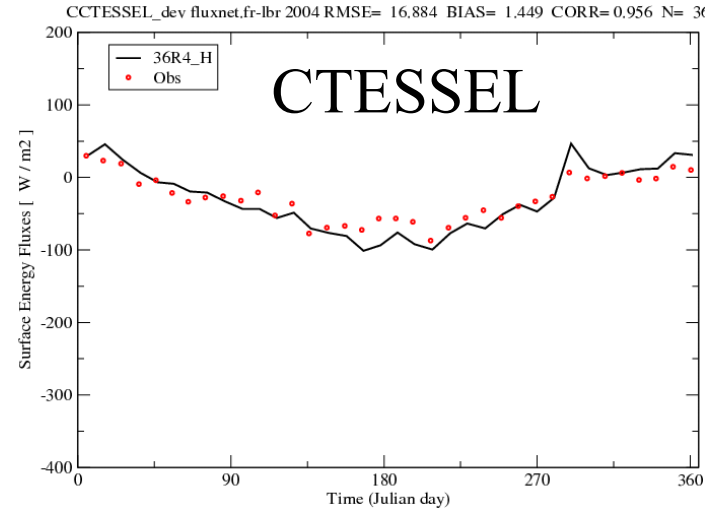
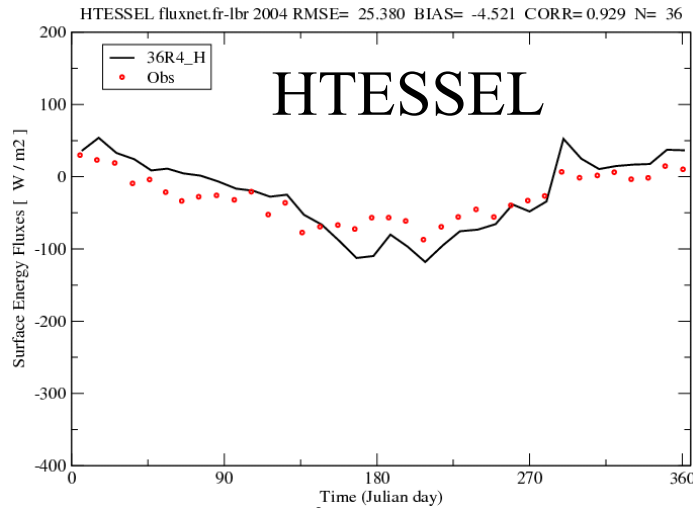
→ Replaces the Jarvis-type stomata conductance by a photosynthesis dependant-type stomata conductance (Jacobs et al. 1996)

→ The model can account for the vegetation response to the radiation at the surface, temperature, soil moisture stress

→ Vegetation Assimilation of  $\text{CO}_2$  can be used to drive a vegetation growth module to simulate LAI

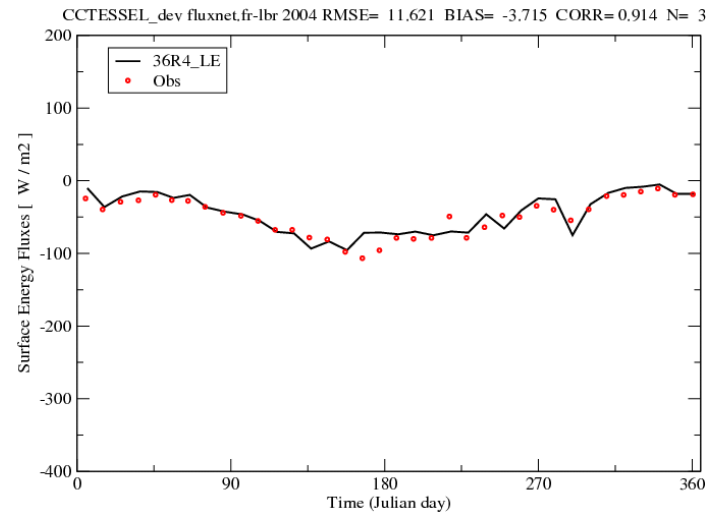
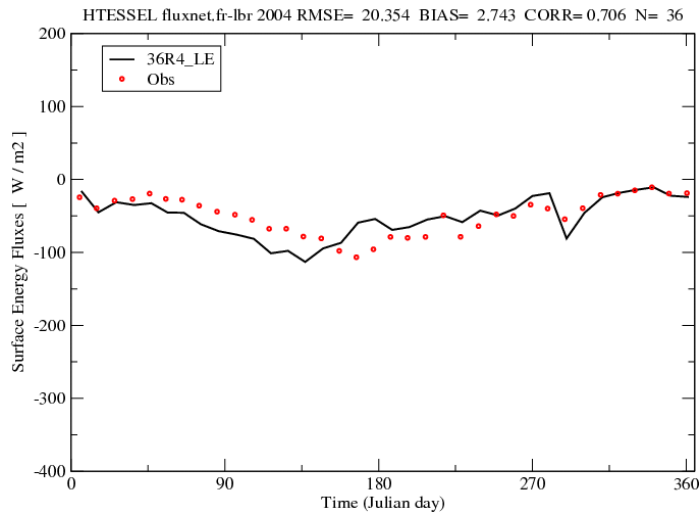
→ The Ecosystem Respiration is parameterized as a function of soil temperature, soil moisture and biome type via a reference respiration parameter

# Jarvis Vs photosynthesis-based evapotranspiration (offline run)



H

Surface sensible heat flux ( $W/m^2$ ) compared with flux-tower observations over Fr-LBr for HTESSEL (left panel) and CCTESSEL (right panel)



LE

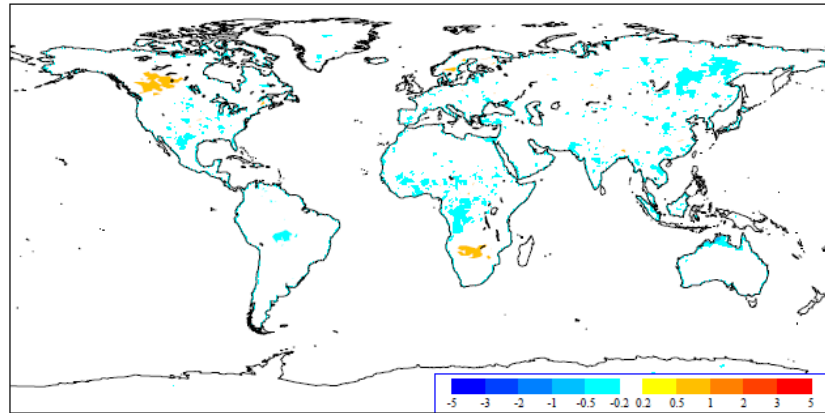
Surface latent heat flux ( $W/m^2$ ) compared with flux-tower observations over Fr-LBr for HTESSEL (left panel) and CCTESSEL (right panel).

- **CCTESSEL improves the LE/H simulations (Photosynthesis-based vs Jarvis approach).**

# LE/H: When “good” is not enough? (Interaction with the atmosphere)

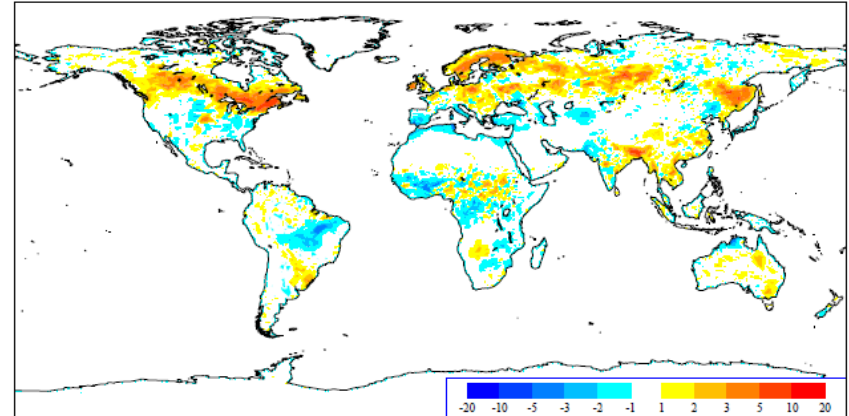
2m T Error differences from the CTL

T925 mean\_abs[CY37R1\_CTESSEL(ficd)+36-AN(ficd)]-mean\_abs[CY37R1(fhrrd)+36-AN(fhrrd)]



2m Rh Error differences from the CTL

RH mean\_abs[CY37R1\_CTESSEL(ficd)+36-AN(ficd)]-mean\_abs[CY37R1(fhrrd)+36-AN(fhrrd)]



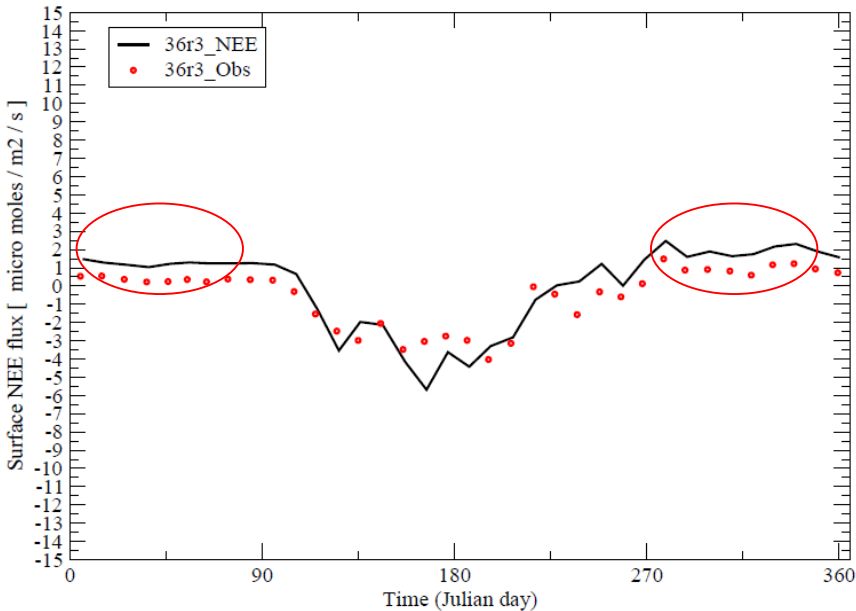
Having better LE/H heat flux from the surface does not always lead to a better atmospheric prediction → interaction with other processes and compensating errors?



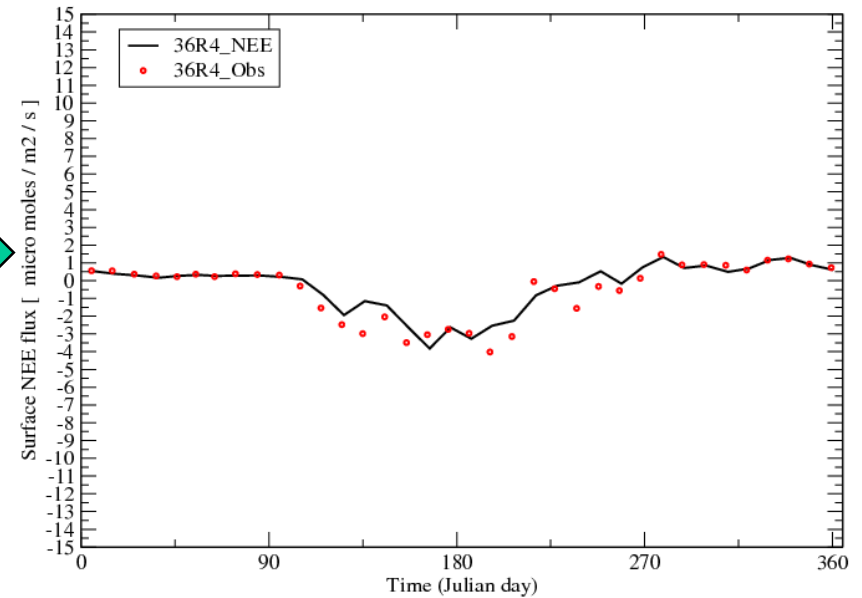
# Soil Respiration improvement for winter season

$$NEE = A_n - R_{soil}$$

CETESSEL fi-hyy 2006 RMSE= 1.040 BIAS= -0.512 CORR= 0.945 N= 36



CCTESSEL\_dev fluxnet.fi-hyy 2006 RMSE= 0.620 BIAS= -0.221 CORR= 0.934 N= 36



Example of NEE (micro moles /m<sup>2</sup>/s) predicted over the site Fi-Hyy taking the cold process into account (right) and previous simulation (left) by CETESSEL (black line) and observed (red dots)

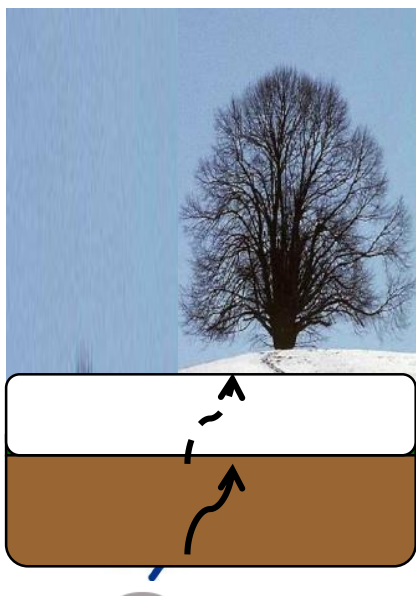
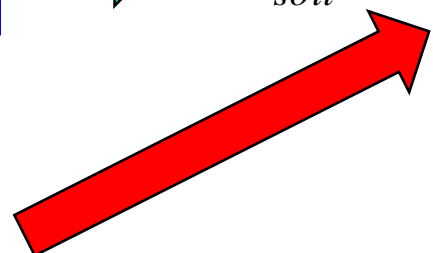
Feedback from the atmosphere can contribute to improve the physical understanding and adjust the contribution from the surface

# Soil Respiration and winter improvement

$$R_{soil} = R_0 Q_{10}^{(0.1(T_{soil} - 25))} f_{sm}$$

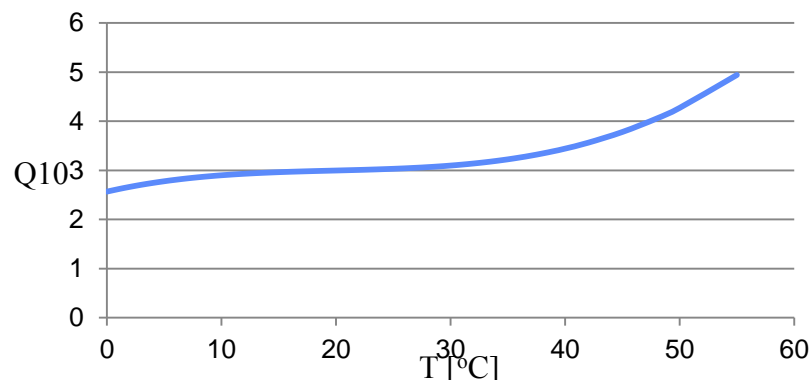


$$R_{soil} = R_0 e^{-\alpha \cdot Z_{snow}} Q_{10}^{(0.1(T_{soil} - 25))} f_{sm}$$



Including a snow attenuation effect on the soil CO2 emission

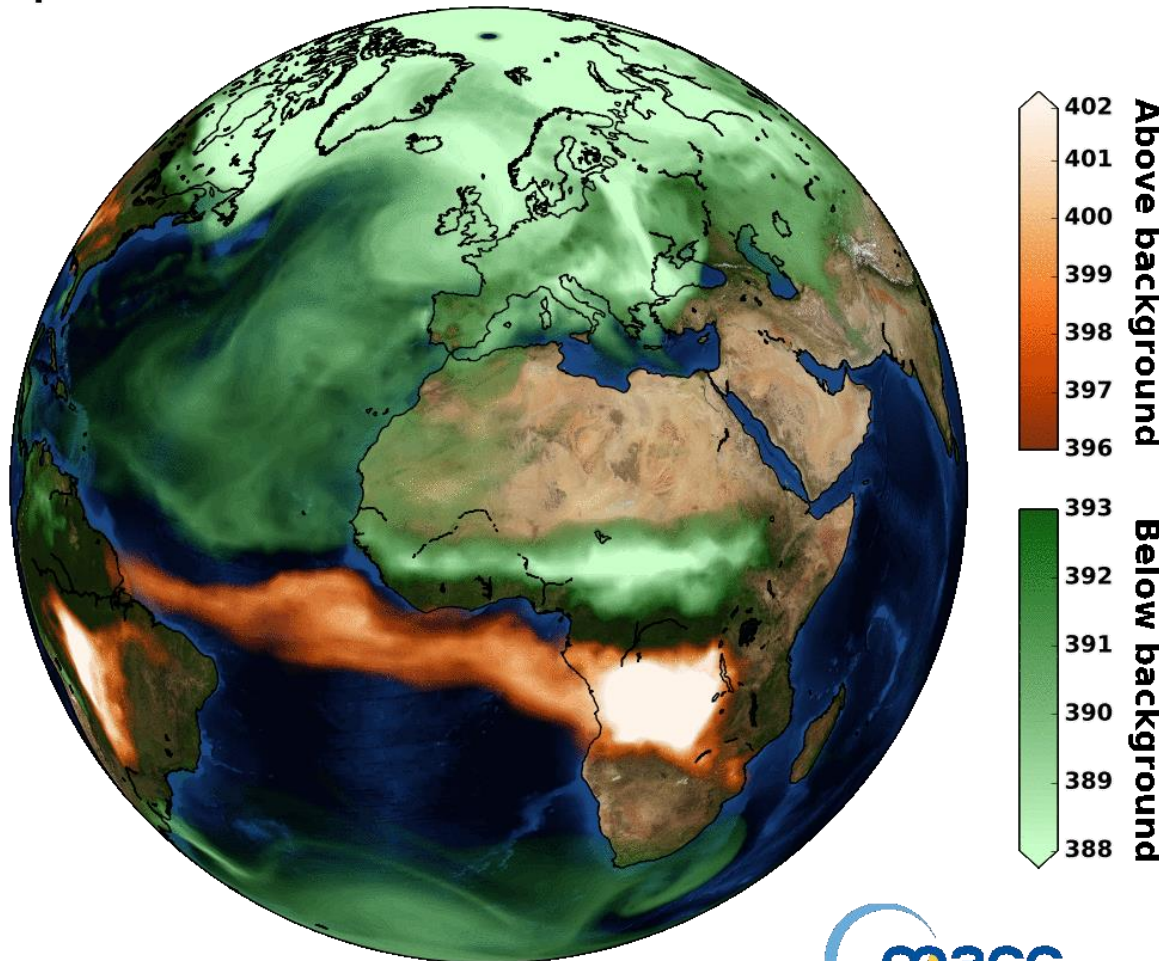
Q10 dependance on Temperature regime



Including a temperature dependency on the Q10 parameter (McGuire et al., 1992)

# Near Real Time CO<sub>2</sub> concentration modelled in MACC-II

MACC column-averaged dry-air mole fraction of CO<sub>2</sub> [ppm]  
September 2013











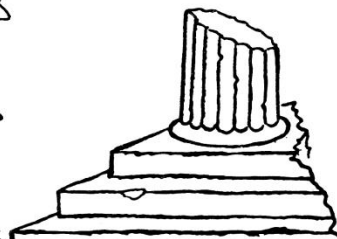
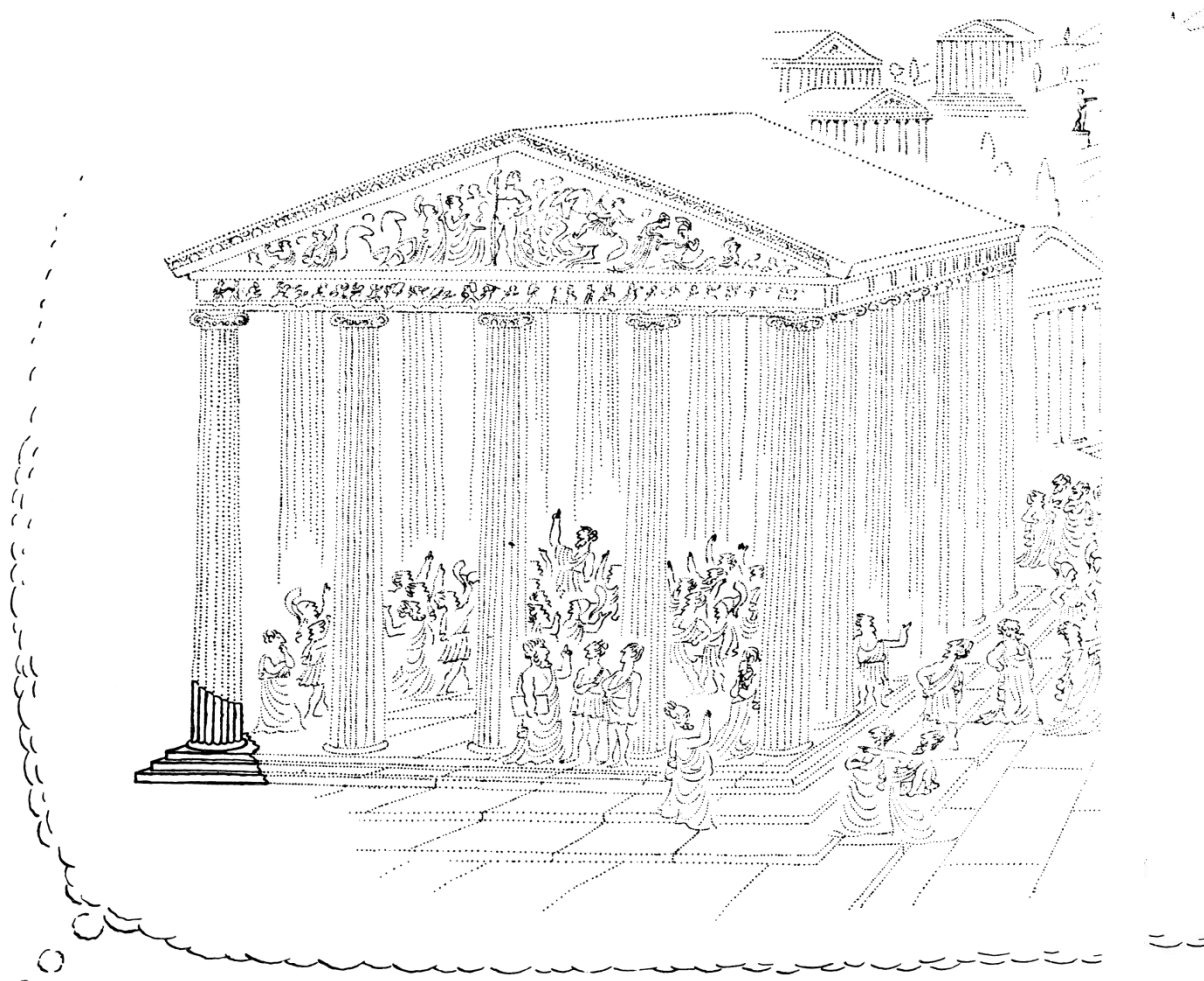
- CHTESSEL fluxes used in MACC-II (CAM5) to forecast CO<sub>2</sub> atmospheric concentrations (16 km global simulation)
- Green colours highlight effects of photosynthetic uptake by vegetation
- Diurnal cycle (fluxes driven) and Synoptic variability (Weather driven) are crucial elements for simulating the CO<sub>2</sub> of the Earth system.



Agusti-Panareda et al. (2014, ACP), Boussetta et al. (2013 JGR)

# Some thoughts

-  Taking into account realistic vegetation dynamics is important for accurate representation of surface fluxes and eventually better atmospheric predictability.
-  Carbon, Hydrology and Energy cycles are tightly coupled and an integrated treatment of these processes is a challenge to achieve the necessary accuracy in simulating Net Ecosystem Exchange (CO<sub>2</sub> flux) in global models (and as a component of the global carbon budget).
-  Enhanced connections between albedo, LAI (and roughness) in Earth System Models (ESMs) will most likely increase the sensitivity to vegetation dynamics, and with increased surface related satellite observation products there is potential for further improvements of NWP systems linked with land surface. (better initialisation/ better process description/ possibility to better tune non-observable model parameters)
-  With increased resolution ESMs will have to take into account additional layer of physical complexity such as
  -  vegetation interaction with snow/frozen soil,
  -  better vegetation dynamics
  -  surface- atmosphere coupling and the link with satellite LST,
  -  CO<sub>2</sub>/evapo-transpiration coupled processes and satellite fluorescence observation



Thank you

*SEMPÉR.*

Knowledge BUT also Imagination & Creativity

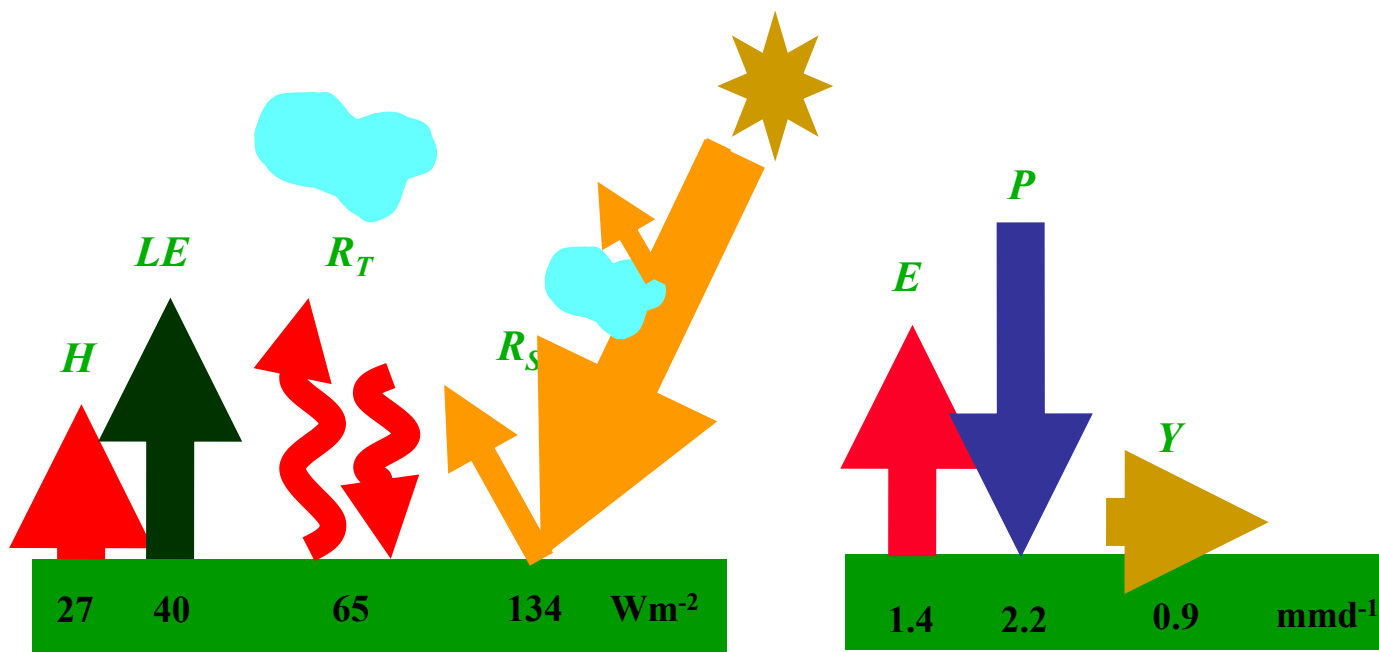
# Land surface within GCMs

- Land surface schemes in general circulation models provides **boundary conditions** for the enthalpy, moisture (and momentum), and recently carbon dioxide equations, and it also enable budget studies

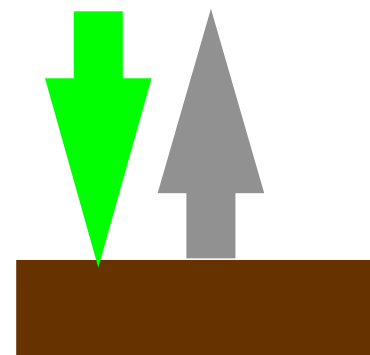
## Energy budget

## Water budget

## Carbon budget (natural)



*NEE*  
(2.5±1. PgC/yr)



ERA40 land-averaged values 1958-2001

GCP averaged values 2000-2011