



Dynamic vegetation modelling and applications with CARAIB

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OUTLINE

- 1) Introduction**
- 2) The CARAIB model**
- 3) Example of results and model validation**
- 4) Interannual variability**
- 5) Climate change impacts on ecosystems**
- 6) Integrating crops and ecosystem services
(VOTES)**
- 7) Conclusions & perspectives: towards an
integrated tool for upscaling**

Introduction

VEGETATION DISTRIBUTION MODELS (biomes, species)

- equilibrium biome models
(Box, 1981; Prentice et al. 1992)
- forest succession models
(gap models)
- niche-based models
(Thuiller et al., 2005)
- species dispersal models

BIOGEOCHEMICAL MODELS (NPP, NEE, biomass, soil C)

- photosynthesis models
(Farquhar et al., 1980)
- terrestrial biosphere models
(Potsdam 1995 models)

(BIO)PHYSICAL MODELS (energy exchange, water cycle)

- « bucket models »
- SVAT (GCM surface schemes)

Dynamic vegetation models (DVM) are complex tools that can describe the response of vegetation (plant functional types or species) to climate change.

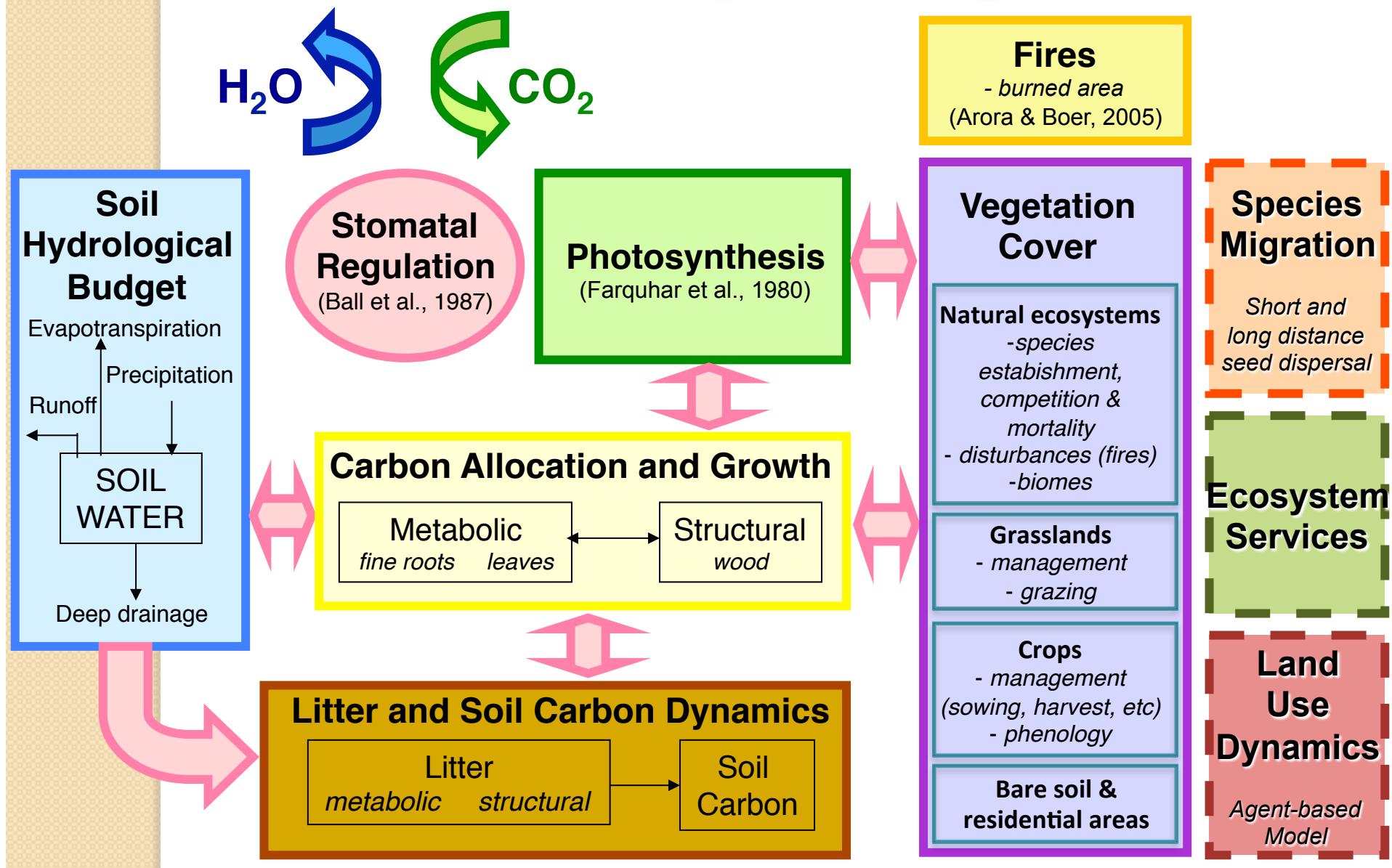
DYNAMIC (GLOBAL) VEGETATION MODEL, D(G)VM

- soil hydrology
- vegetation physiology
- vegetation phenology
- carbon budget
- nutrient budgets
- vegetation dynamics
(species establishment, competition & mortality)
- disturbances
(fires, storms, grazing)
- trace gas emission (VOC)
- ecosystem management
- ecosystem goods and services (EGS)

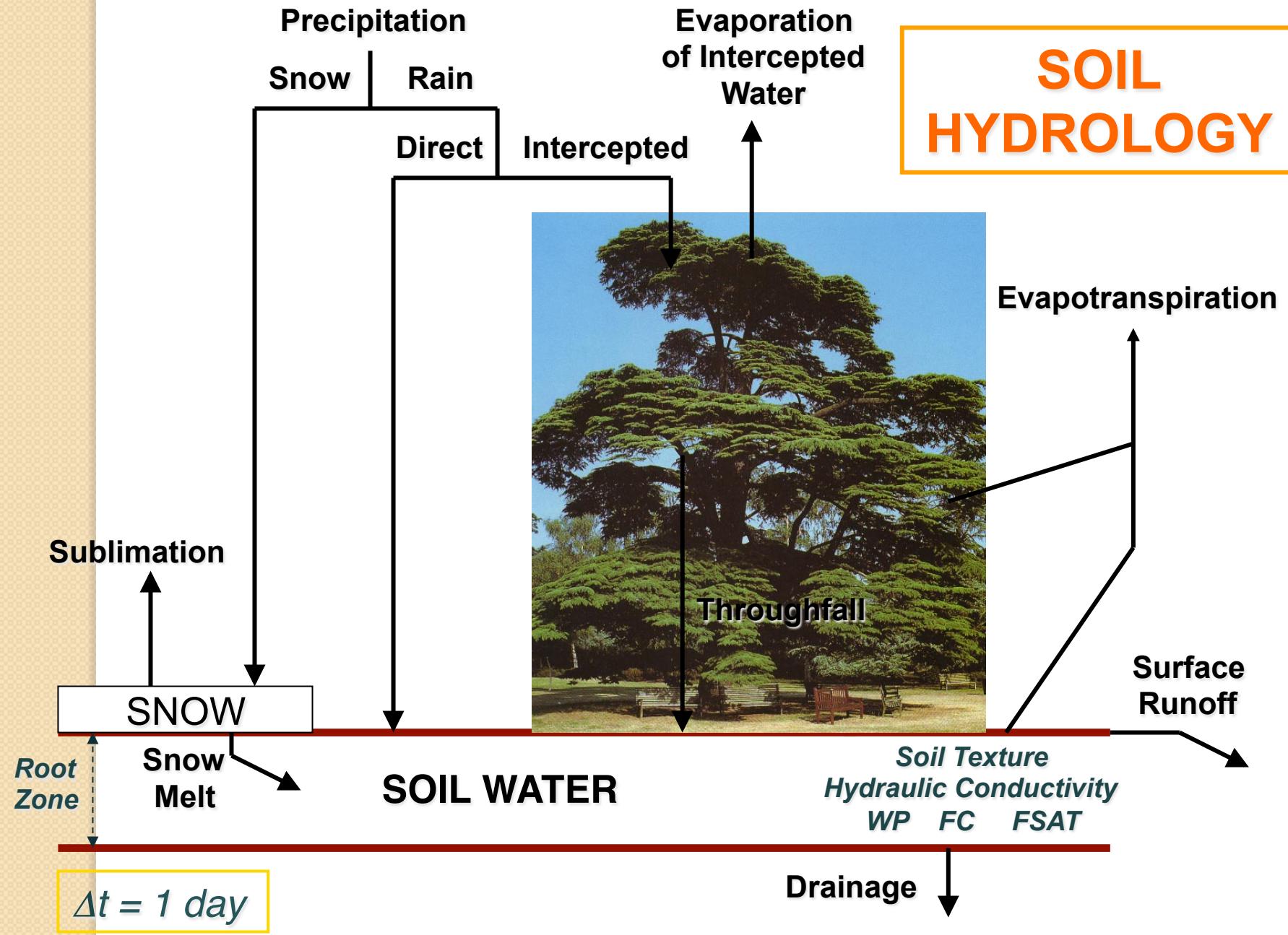
The CARAIB Model

CARAIB

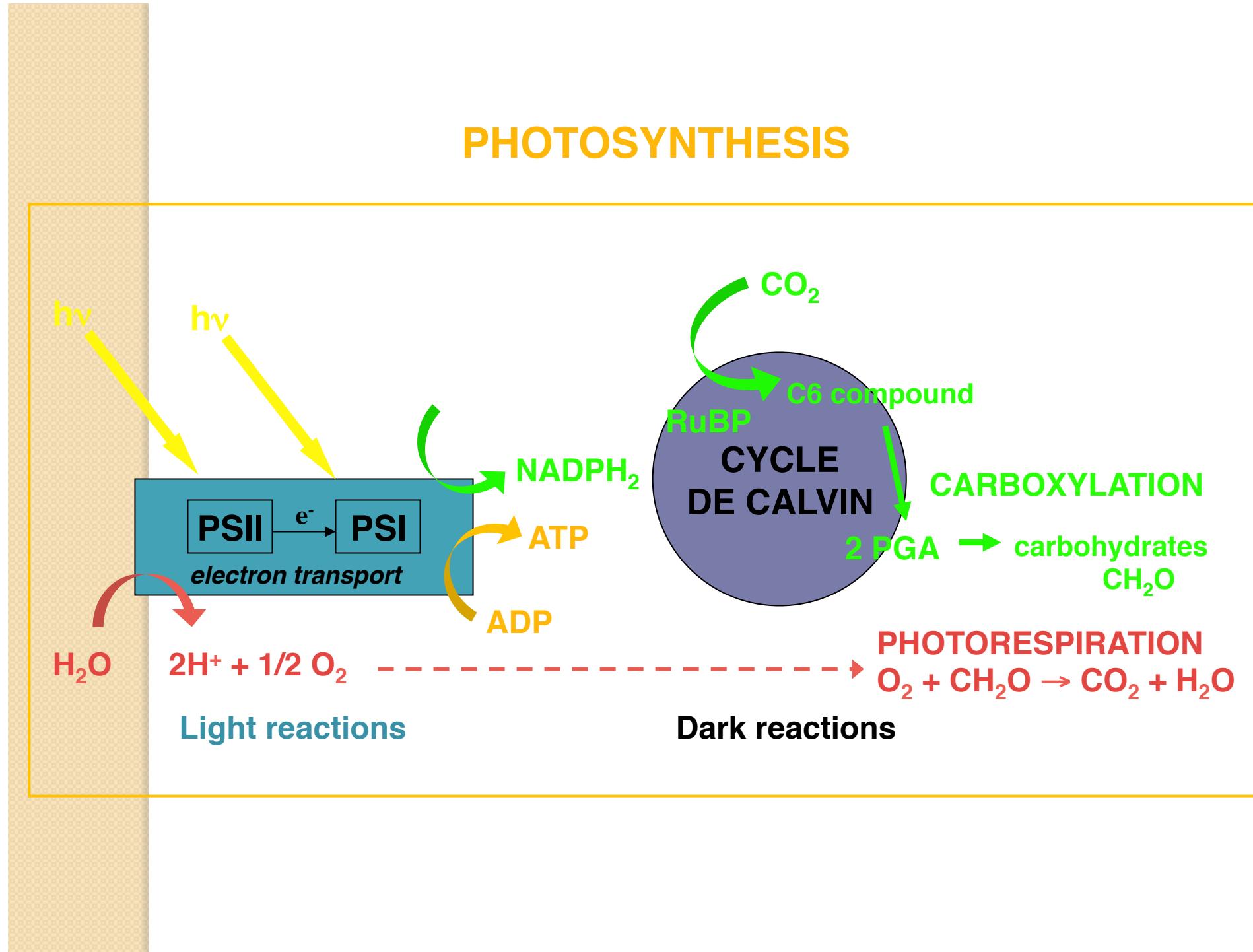
Dynamic Vegetation Model



SOIL HYDROLOGY



PHOTOSYNTHESIS



PHOTOSYNTHETIC ASSIMILATION MODEL (Farquhar et al., 1980)

$$A_1 = \frac{J(I_{APAR}, J_{\max})}{4} \cdot \frac{c_i - \Gamma_*}{c_i + 2\Gamma_*}$$

(limitation par le transport d' électrons
→ réactions claires)

$$A_2 = V_{c,\max} \cdot \frac{c_i - \Gamma_*}{c_i + K_c(1 + \frac{O_2}{K_o})}$$

(limitation par la Rubisco
→ réactions sombres)

$$A = \min (A_1, A_2)$$

(assimilation photosynthétique brute)

avec: $\Gamma_* = 0.21 K_c O_2 / (2 K_o) =$ compensation point in the absence of dark respiration

$c_i, O_2 =$ intercellular concentrations in CO_2 and O_2
 $K_c, K_o =$ Michaelis-Menten constants for CO_2 (carboxylation)
and O_2 (photorespiration)

$J(I_{APAR}, J_{\max}) =$ potential rate of electron transport (depends on absorbed PAR radiation I_{APAR} and limited to J_{\max})

$V_{c,\max} =$ Rubisco maximum synthesis capacity (dep. on T, C/N, SLA)

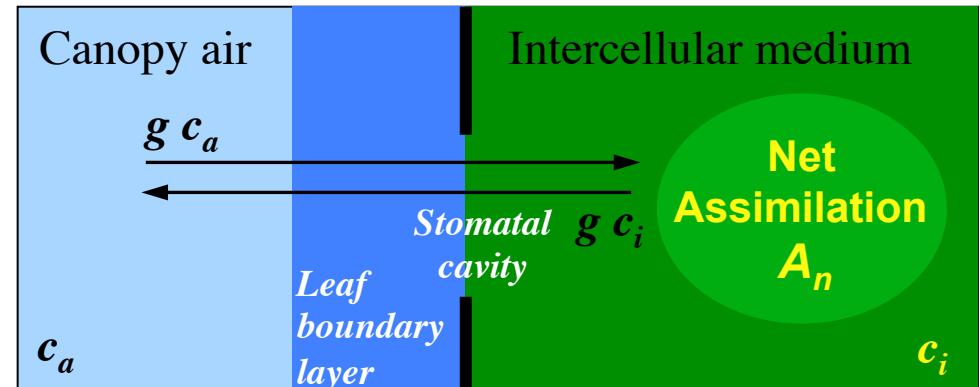
STOMATAL REGULATION AND CO₂ BUDGET OF THE LEAF

Leaf CO₂ budget:

$$g c_a = g c_i + A_n$$

Net assimilation (μmol C m_{leaf}⁻² s⁻¹):

$$A_n = A - R_d$$



Dark respiration (mitochondria):

$$R_d = R_d(T, C/N)$$

Conductances and resistances:

Conductance: $g^{-1} = g_b^{-1} + g_s^{-1}$

Resistance: $r = r_b + r_s$

$$g_s = g_0 + g_1 \cdot \Theta_{\text{strs}} \cdot A_n / [(c_a - \Gamma) \cdot (1 + VPD/VPD_0)]$$

→ a 3rd degree polynomial equation is obtained which can be solved analytically or numerically with the Newton-Raphson method

LEAF WATER FLUX: TRANSPiration

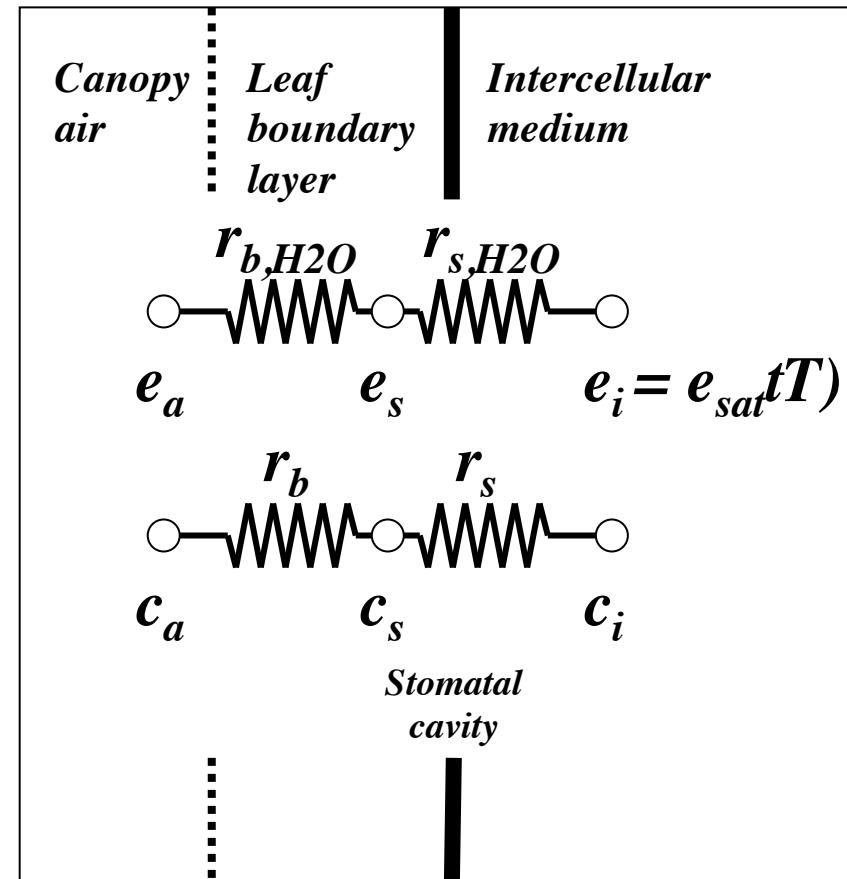
Transpiration flux per square meter of leaf:

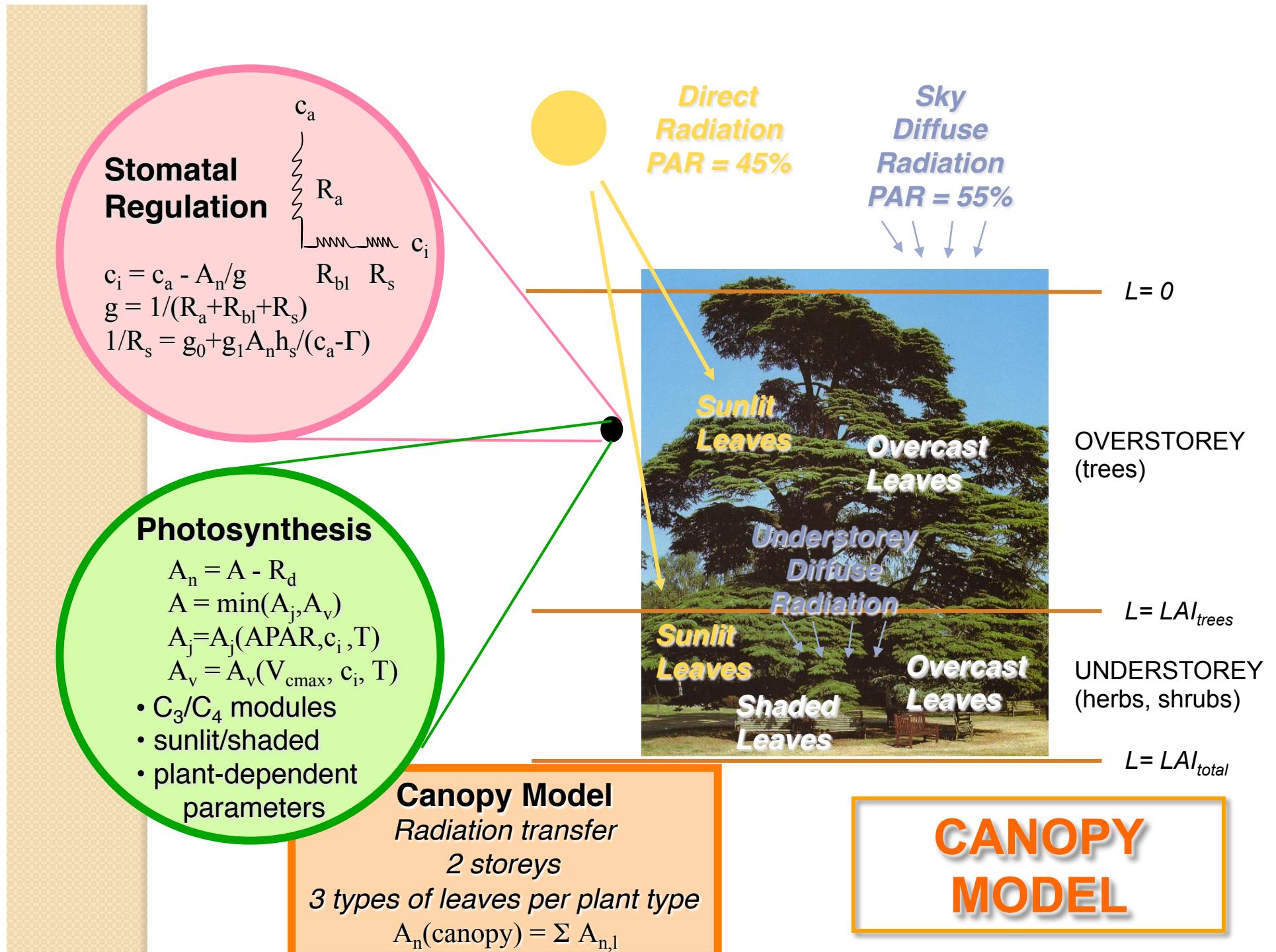
$$E_{tr} = g_{H2O} (e_{sat}(T) - e_a) / RT$$

Conductance with respect to water:

$$g_{H2O}^{-1} = r_{H2O} = r_{b,H2O} + r_{s,H2O}$$

$$r_{b,H2O} = r_b / 1.37 + r_s / 1.6$$





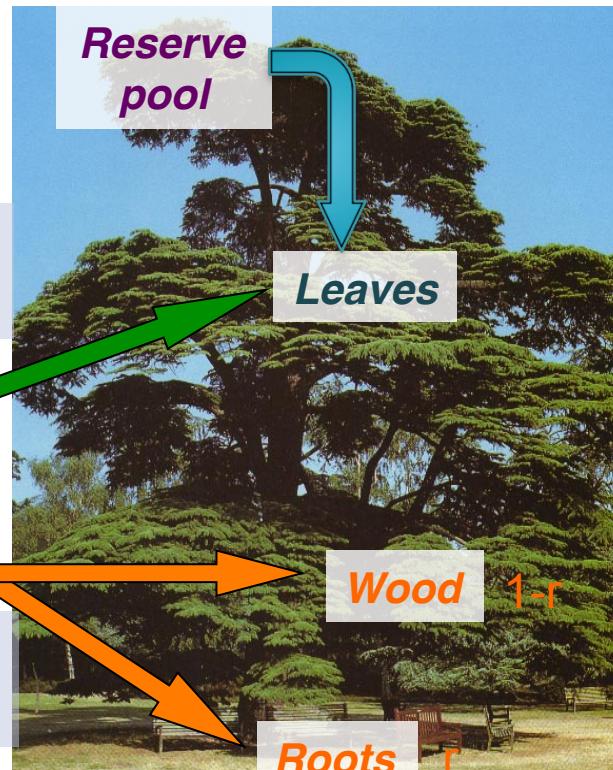
The allocation scheme in CARAIB

CARBON ALLOCATION

Metabolic carbon
 S

Photosynthetic
products

Structural carbon
 $1-S$



S = fraction of photosynthetic products allocated to leaves,
varies with phenological phase

r = fixed ratio of roots in the structural reservoir (*a posteriori*, not dynamic)
calculated from fixed root:shoot ratio for each species

AUTOTROPHIC RESPIRATION

Maintenance respiration

- proportional to carbon content of reservoir
- temperature-dependent

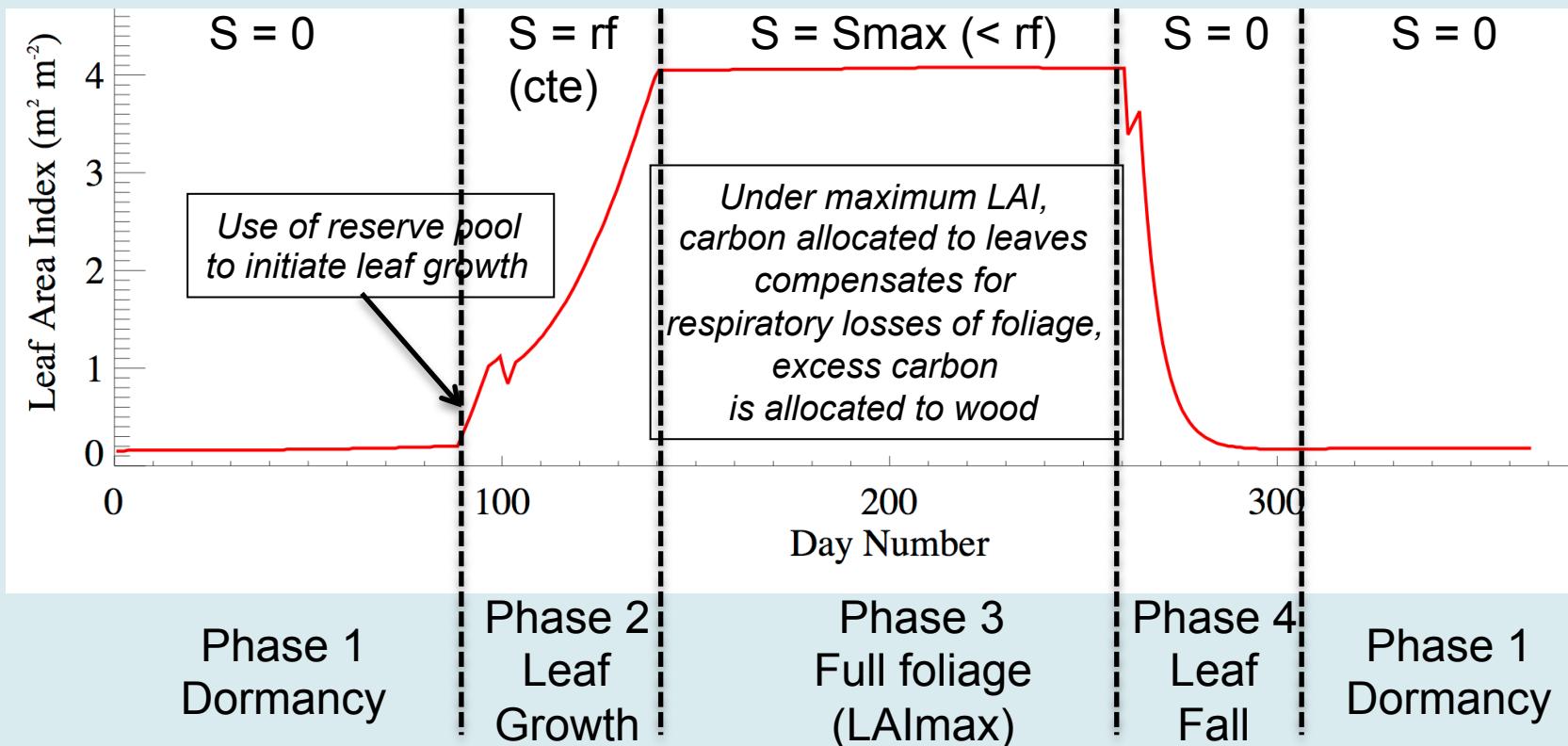
Growth respiration

20% of input
flux of reservoir

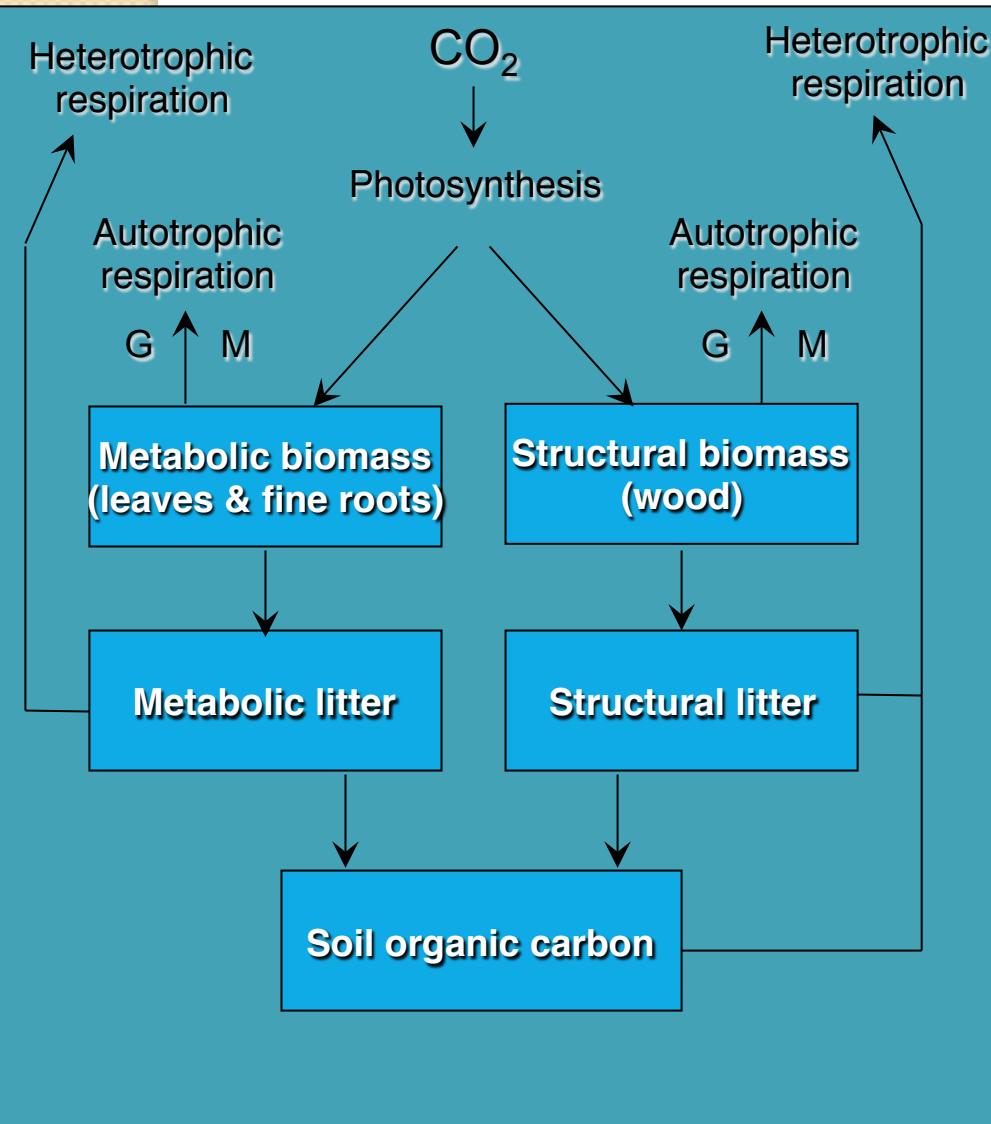
The allocation scheme in CARAIB

$$\text{LAI max} = \min (\text{LAImax_wood}, \text{LAImax_transpi})$$

- LAImax_wood = maximum LAI linked to wood biomass
- LAImax_transpi = maximum LAI allowed by average transpiration over vegetation period



RESERVOIRS AND FLUXES (for each PFT/BAG)



GPP = Gross Primary Productivity
(photosynthesis)

R_a = Autotrophic respiration
(plant respiration)

NPP = Net Primary Productivity
= $\text{GPP} - \text{R}_a$

R_h = Heterotrophic respiration
(animals, fungi, bacteria)

NEE = Net Ecosystem Exchange
= $\text{R}_h - \text{NPP} = \text{R}_h + \text{R}_a - \text{GPP}$

NEP = Net Ecosystem Productivity
= $\text{NPP} - \text{R}_h = -\text{NEE}$

NBP = Net Biome Productivity
= $\text{NEP} - D - F - H$

D = losses through rivers

F = losses due to fires

H = harvest losses

Plant Functional Types (PFTs)

- *photosynthesis & growth calculated for all PFTs*
- *stress/germination parameters evaluated from present-day distribution*
- *competition between PFTs to fill gaps produced by natural or stress-induced mortality*

Global Classification

1. C3 herbs (humid)
2. C3 herbs (dry)
3. C4 herbs
4. Broadleaved summergreen arctic shrubs
5. Broadleaved summergreen boreal/temperate cold shrubs
6. Broadleaved summergreen temperate warm shrubs
7. Broadleaved evergreen boreal/temperate cold shrubs
8. Broadleaved evergreen temperate warm shrubs
9. Broadleaved evergreen xeric shrubs
10. Subdesertic shrubs
11. Tropical shrubs
12. Needleleaved evergreen boreal/temperate cold trees
13. Needleleaved evergreen temperate cool trees
14. Needleleaved evergreen supra-mediterranean trees
15. Needleleaved evergreen meso-mediterranean trees
16. Needleleaved evergreen subtropical trees
17. Needleleaved summergreen boreal/temperate cold trees
18. Needleleaved summergreen subtropical swamp trees
19. Broadleaved evergreen meso-mediterranean trees
20. Broadleaved evergreen thermo-mediterranean trees
21. Broadleaved evergreen subtropical trees
22. Broadleaved summergreen boreal/temperate cold trees
23. Broadleaved summergreen temperate cool trees
24. Broadleaved summergreen temperate warm trees
25. Broadleaved raingreen tropical trees
26. Broadleaved evergreen tropical trees

PFT 01 : C3 herbs (« humid »)

PFT 02 : C3 herbs (« dry »)

PFT 03 : C4 herbs

PFT 04 : Broadleaved summergreen arctic shrubs

PFT 05 : Broadleaved summergreen boreal/temperate cold shrubs

PFT 06 : Broadleaved summergreen temperate warm shrubs

PFT 07 : Broadleaved evergreen boreal/temperate cold shrubs

PFT 08 : Broadleaved evergreen temperate warm shrubs

PFT 09 : Broadleaved evergreen xeric shrubs

PFT 10 : Subdesertic shrubs

PFT 11 : Tropical shrubs

PFT 12 : Needleleaved evergreen boreal/temperate cold trees

PFT 13 : Needleleaved evergreen temperate cool trees

PFT 14 : Needleleaved evergreen supra-Mediterranean trees

PFT 15 : Needleleaved evergreen meso-Mediterranean trees

PFT 16 : Needleleaved evergreen subtropical trees

PFT 17 : Needleleaved summergreen boreal/temperate cold trees

PFT 18 : Needleleaved summergreen subtropical swamp trees

PFT 19 : Broadleaved evergreen meso-Mediterranean trees

PFT 20 : Broadleaved evergreen thermo-Mediterranean trees

PFT 21 : Broadleaved evergreen subtropical trees

PFT 22 : Broadleaved summergreen boreal/temperate cold trees

PFT 23 : Broadleaved summergreen temperate cool trees

PFT 24 : Broadleaved summergreen temperate warm trees

PFT 25 : Broadleaved raingreen tropical trees

PFT 26 : Broadleaved evergreen tropical trees

Poaceae

Asteraceae

all C4 herbaceous plants

Alnus viridis, Betula nana, Salix nana, Arctostaphylos, A. alpinus, Hippophae rhamnoides

Sambucus, Frangula alnus, Lonicera, Prunus, Rubus, Sorbus, Vaccinium, Viburnum

Berberis vul., Crataegus, Euonymus europaeus, Genista, Rhamnus, R. catharticus

Artostaphylos uva-ursi, Calluna vul., Daphne

Buxus sempervirens, Hedera helix, Ilex aquifolium, Ligustrum vulgare, Viscum

Cistus, Myrtus

Nitraria

Aegiceras corniculatum, Ceriops tagal, Kandelia obovata, Rhizophora mucronata, Cassine

Cupressaceae, Juniperus, J. communis, Abies, A. alba, Picea abies, P. omorika, Pinus sylvestris

Taxus, Chamaecyparis, Pseudotsuga menziesi, Sequoia sempervirens, Thuja orientalis, Tsuga diversifolia, Pinus nigra

Cedrus

Pinus halepensis, Pinus pinaster, Cupressus, Tetraclinis

Sciadopitys, Cathaya, Keteleeria, Taiwania, Torreya, Athrotaxis

Larix

Taxodium, Glyptostrobus

Quercus ilex, Quercus suber, Phillyrea, Arbutus, Quercus troyana

Olea europaea, Pistacia

Alangium, Castanopsis, Fatsia japonica, Gordonia, Lindera, Neolitsea, Reevesia, Sassafras

Alnus, Alnus glutinosa, Corylus avellana, Quercus, Quercus robur, Populus, Tilia, Betula, Salix

Acer, A. campestre, Carpinus betulus, Fagus sylvatica, Tilia cordata, Tilia platyphyllos, Fraxinus excelsior, Ulmus, Aesculus rubicunda, Populus cathayana, Quercus castaneaefolia, Quercus lobata, Tilia japonica, Ulmus davidiana

Castanea, Juglans, Ostrya, Quercus pubescens, Q. benthamii, Craigia, Diospyros lotus, Halesia

Adansonia, Bursera, Dendropanax, Gironniera, Bombax

Annona, Bombax, Bursera, Cupania, Monotes, Sterculia, Zenkerella

Main taxa list used to define each PFT

Plant Functional Types (PFTs)

- *photosynthesis & growth calculated for all PFTs*
- *stress/germination parameters evaluated from present-day distribution*
- *competition between PFTs to fill gaps produced by natural or stress-induced mortality*

European Classification (BAGs)

1. Achillea, Alchemilla, Angelica, Campanula
2. Brassicaceae, Caltha, Cardamine, etc
3. Anthemis, Artemisia, Bidens, Calystegia, etc
4. Asteraceae asteroideae, Poaceae, etc
5. Anemone, Gypsophila, Helleborus, etc
6. Ephedra, Ulex
7. Alnus vir, Arctostaph., A.alpinus, B. nana
8. Sambucus, Frangula a, Prunus, Sorbus, Vaccinium
9. Berberis vul., Crataegus, Genista, Rhamnus
10. Artostaphylos uva-ursi, Calluna vul., Daphne
11. Buxus sempervirens, Hedera h., Ilex aquif.
12. Cistus, Myrtus
13. Betula, Salix
14. Alnus, A gl, Corylus, Q. robur, Populus, Tilia
15. Acer, Fraxinus, F excel, Tilia cordata, Ulmus
16. Acer campestre, Carpinus, Fagus syl, Tilia platyphyllos
17. Castanea, Juglans, Ostrya, Q. pubescens
18. Olea eur, Pistacia, Phillyrea, Q ilex, Q suber
19. Larix decidua
20. Picea abies, Pinus, Pinus sylvestris
21. Abies
22. Cupressaceae, Juniperus, Juniperus communis
23. Pinus Cembra
24. Abies Alba, Taxus
25. Cedrus, Pinus halepensis, Pinus pinaster

Overstorey

Trees

Global PFTs 12 – 26

Competition: $N_i^{\text{seeds}} = \alpha p_{\text{germ}}^i \cdot NPP_i$
(seeds fill gaps left by mortality)

COMPETITION OF PLANT FUNCTIONAL TYPES

Understorey

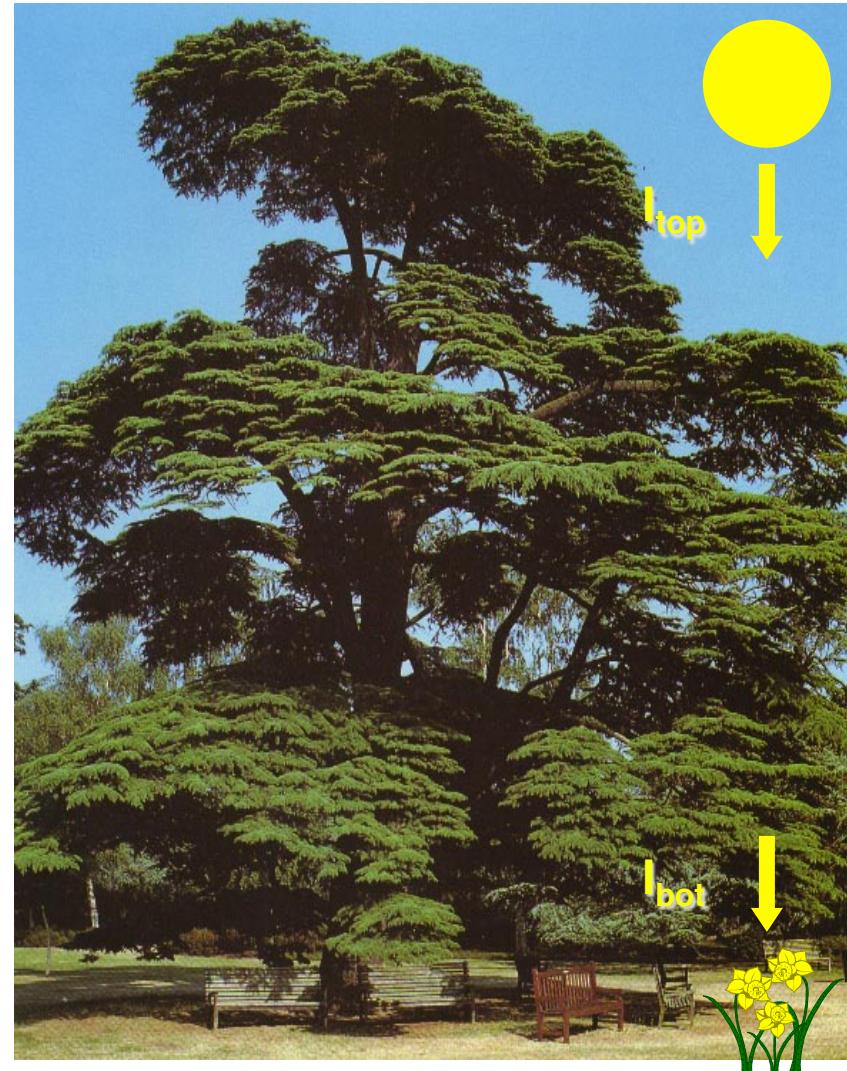
Herbs

Global PFTs 1 – 3

Shrubs

Global PFTs 4 – 11

Competition: $N_i^{\text{seeds}} = \alpha p_{\text{germ}}^i \cdot NPP_i$
(seeds fill gaps left by mortality)



Response to stress and mortality

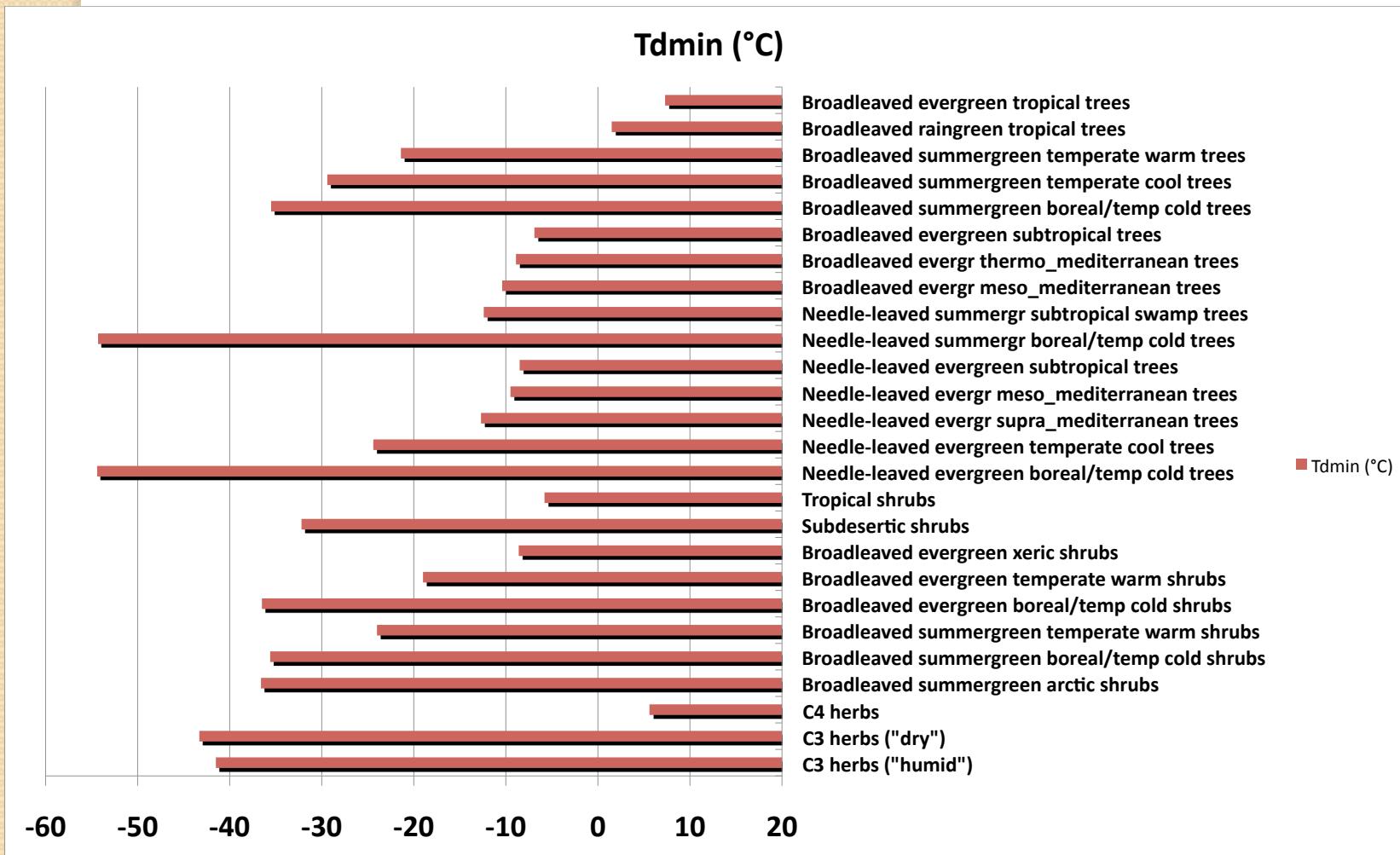
Temperature (T) stress

- effects on growth through change in **photosynthesis** and autotrophic **respiration**
- **mortality** occurs at **cold temperatures** ($T < T_{dmin}$)

Soil water (SW) stress

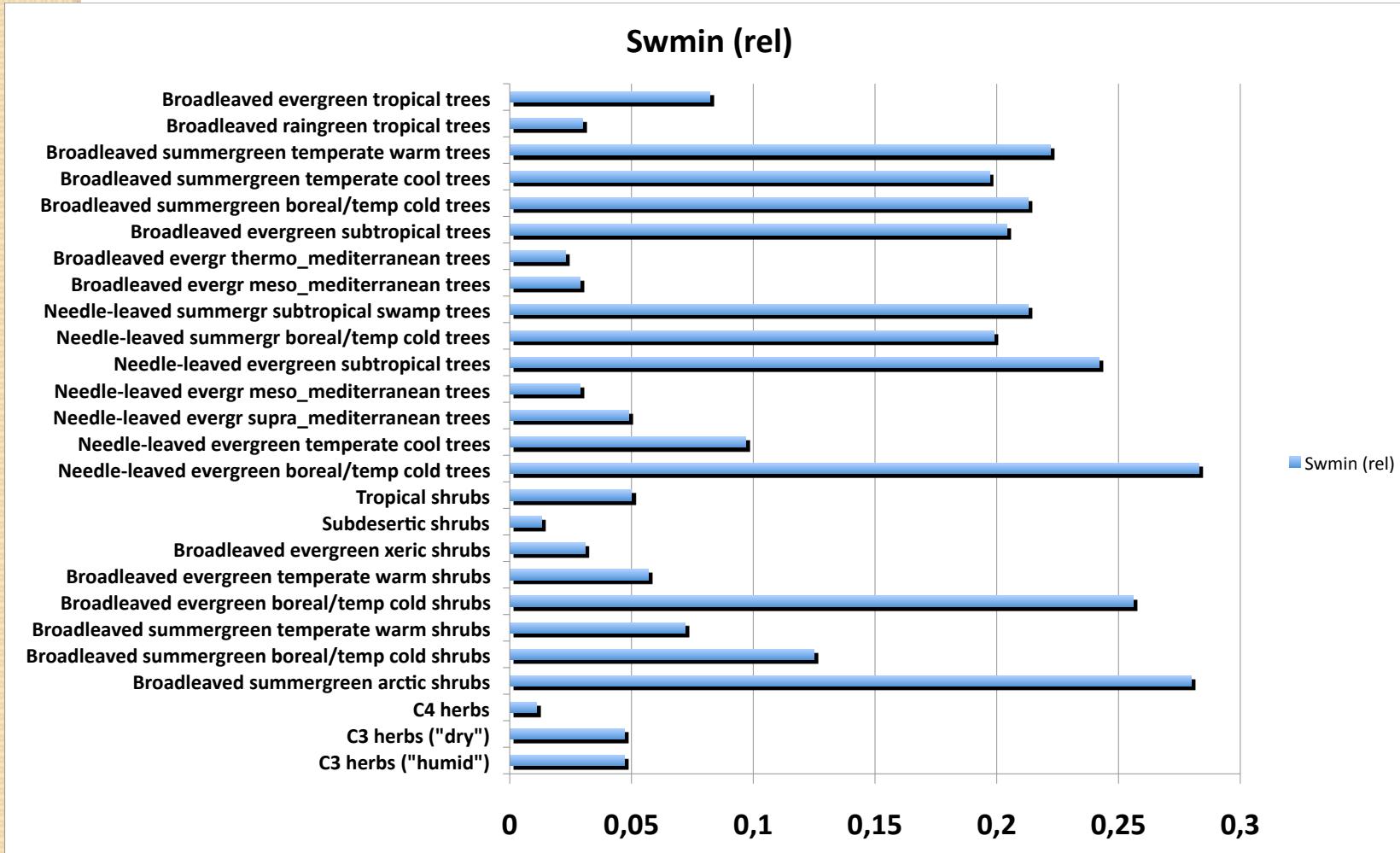
- reduced growth through **stomatal resistance**
- **leaf fall** if **evaporation** is too large with respect to the amount of water that can be taken from the soil
- **mortality** occurs under critical soil water ($SW < SW_{min}$)
- **fires** can burn some part of the pixel at low SW

Temperature stress : Tdmin



Quantile: 1% (C3 grasses), 5% (other PFTs)

Soil water stress : SWmin



Quantile: 10% (all PFTs)

Germination

In the standard version of CARAIB (without seed dispersal), germination is assumed to occur for each PFT on any grid cell when the following criteria are met (full dispersion):

Temperature of the coldest month (T_c)

→ need of cold winter: $T_c < T_{\max, \text{germ}}$

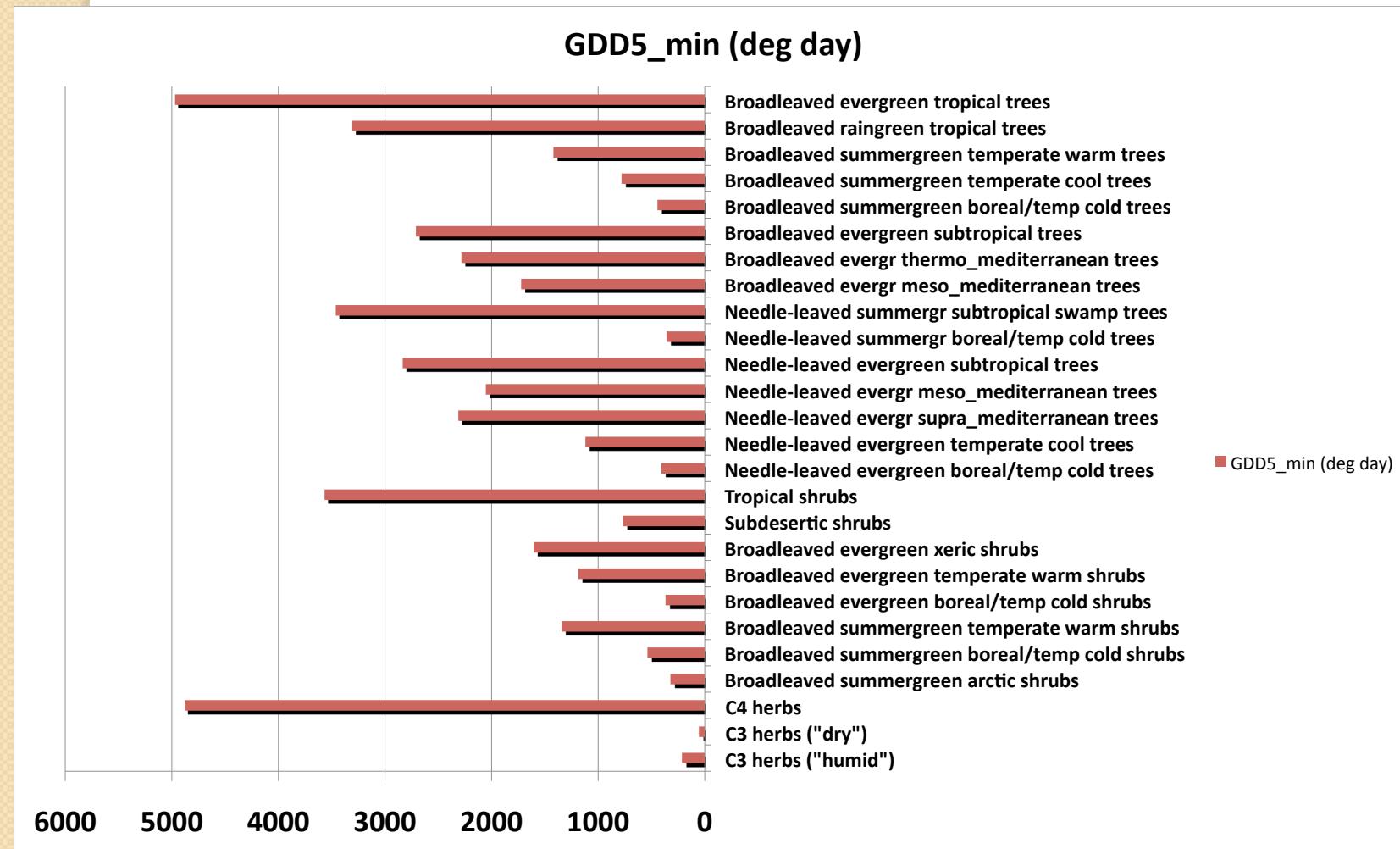
Growing degree days above 5°C (GDD5)

→ need of long enough vegetation season: $\text{GDD5} > \text{GDD5}_{\min}$

Soil water of the driest month (SW_d)

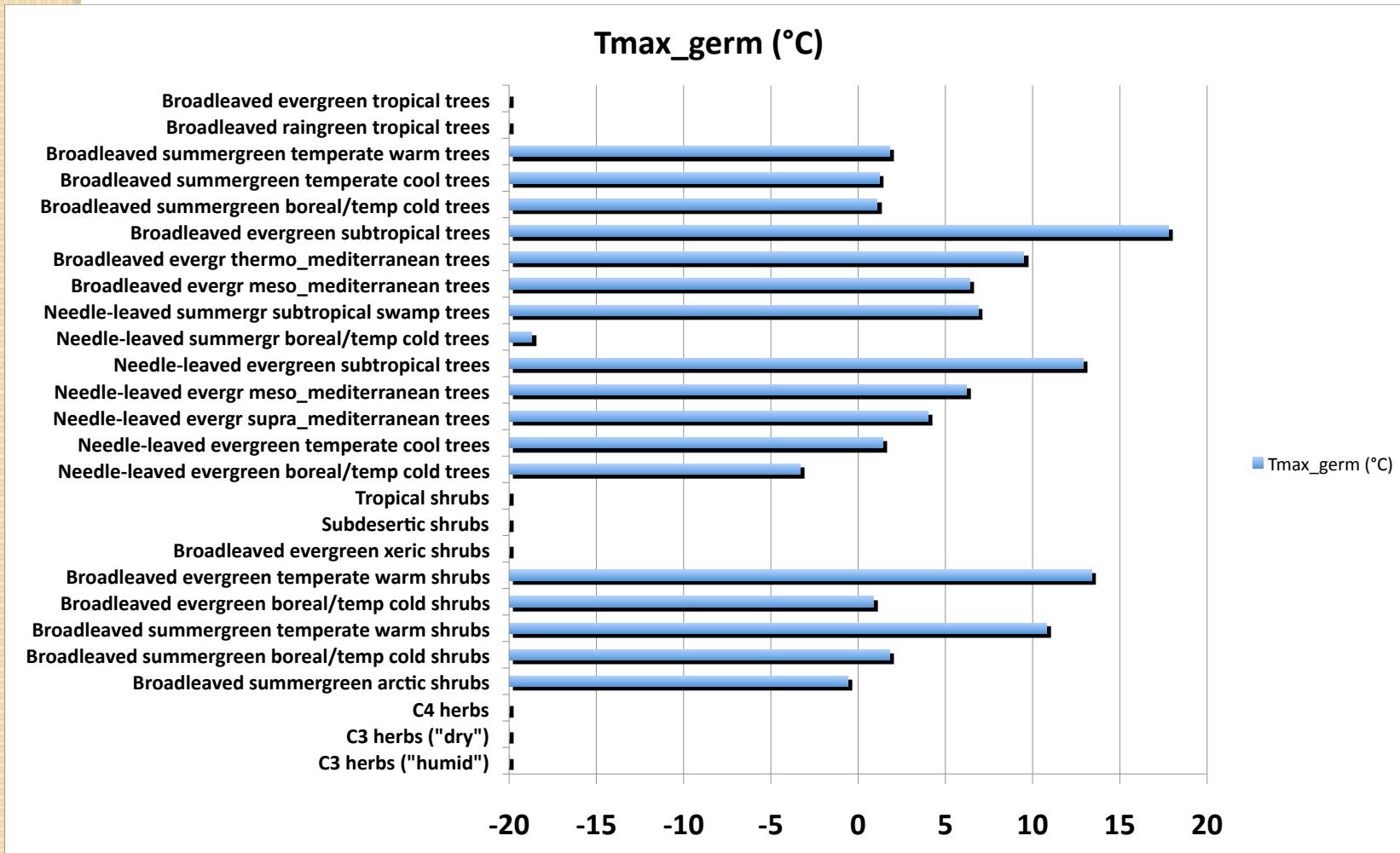
→ need of dry period: $SW_d < SW_{\max}$
(for Mediterranean BAGs)

Germination requirements : GDD5



Quantile: 1% (C3 grasses), 5% (other PFTs)

Germination requirements : Tmax_germ



Quantile: 10% (all PFTs)

BIOMES

Assemblage of plant types predicted for each grid cell



- [Grey Box] Boreal/montane forest
- [Green Box] Cool temperate mixed forest
- [Dark Green Box] Cool temperate conifer forest
- [Light Green Box] Temperate broadleaved deciduous forest
- [Light Blue Box] Warm temperate mixed forest
- [Teal Box] Warm temperate conifer forest
- [Yellow Box] Warm temperate broadleaved evergreen forest
- [Red Box] Sub-tropical forest
- [Orange Box] Tropical seasonal forest
- [Brown Box] Tropical rainforest
- [Olive Green Box] Cold temperate/boreal open woodland
- [Light Olive Green Box] Warm temperate open woodland (Mediterranean)
- [Orange Box] Tropical savanna
- [Yellow Box] Temperate grassland
- [Orange Box] Tropical grassland
- [Purple Box] Tundra
- [Yellow Box] Semi-desert
- [Yellow Box] Desert
- [White Box] Ice

Main model inputs

- Climatic data (monthly → diurnal: stochastic generator)

- Air temperature (T_{\min} , T_{\max})
- Precipitation
- Sunshine hours (cloudiness) / Solar flux
- Air relative humidity
- Wind speed

Present-day: CRU climatology

Past/Future: GCM anomalies combined with present-day climatology

- Soil data

- texture (%sand, %silt, %clay)
- soil colour (dark to bright)

- Elevation (→ average pressure)

Main model PFT/species parameters

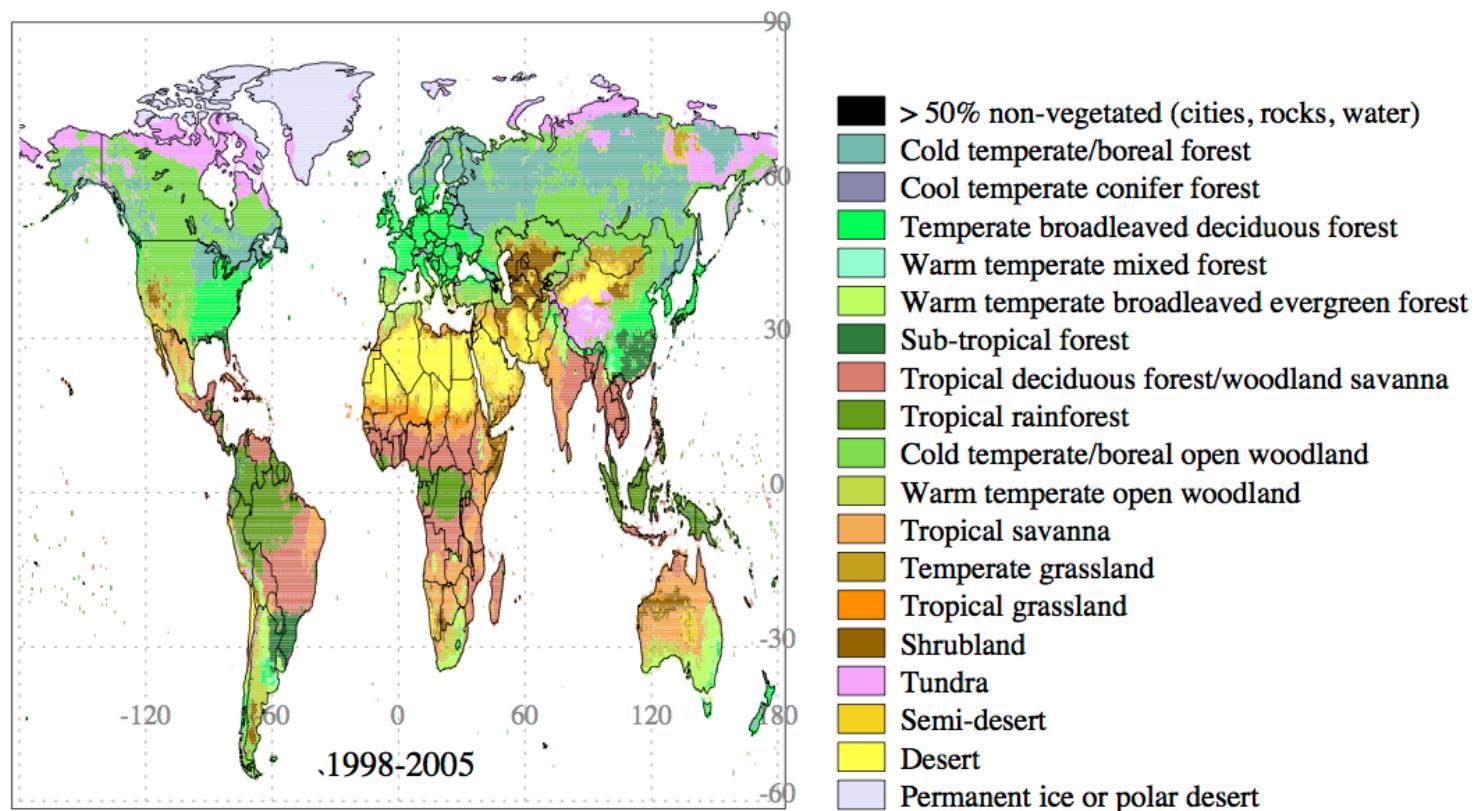
- Climatic thresholds**
 - Stress conditions: T_{min} , SW_{min}
 - Germination requirements: $GDD5min$, T_{max_germ} , SW_{max_germ}
 - Phenology: Temp, SW for bud burst or leaf fall
- Aerodynamic and hydrological parameters**
 - roughness length, displacement height (-> tree height)
 - root depth
- Photosynthesis and respiration**
 - specific leaf area
 - leaf and wood C:N ratios
 - stomatal resistance parameters
- Reservoir turnover times**
 - leaf/wood turnover (background value, under T stress, under SW stress)
 - litter/soil organic C turnover

Standard model outputs

- Soil hydrology (monthly)**
 - Reservoirs: soil water amount, snow depth
 - Fluxes: PET, AET, RUNOFF (surf, deep drainage), snow melt/evap
- Surface energy budget (monthly)**
 - albedo
 - surface soil temperature
 - latent and sensible heat exchanges
 - solar radiation / downward IR / net radiation
- Vegetation (monthly)**
 - GPP, NPP, NEP, LAI
- Vegetation (annual per plant type)**
 - NPP, GPP, LAI
 - biomass, soil carbon
 - burned area, probability of fire
 - ^{13}C discrimination

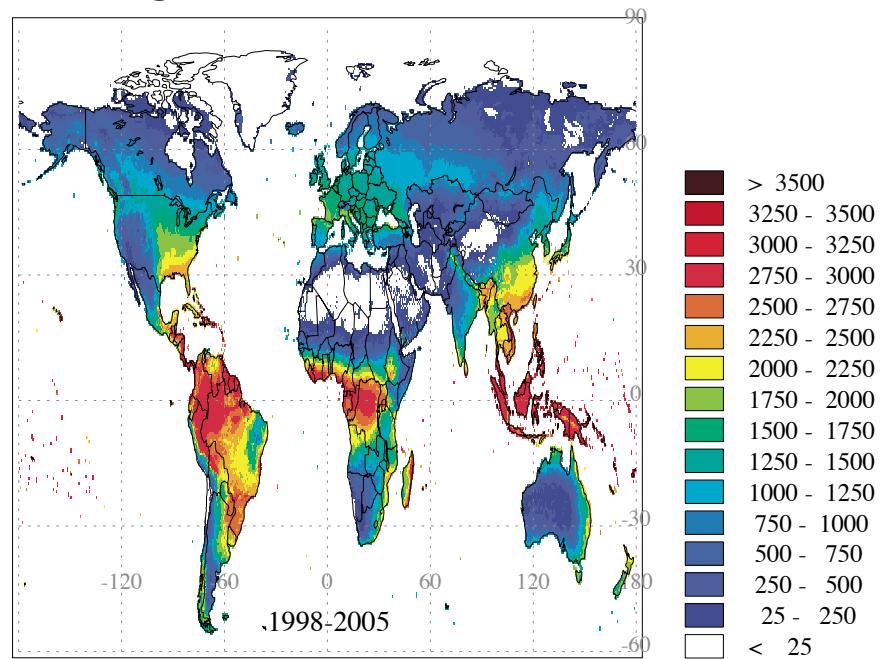
Examples of Results and Model Validation

Biome Distribution

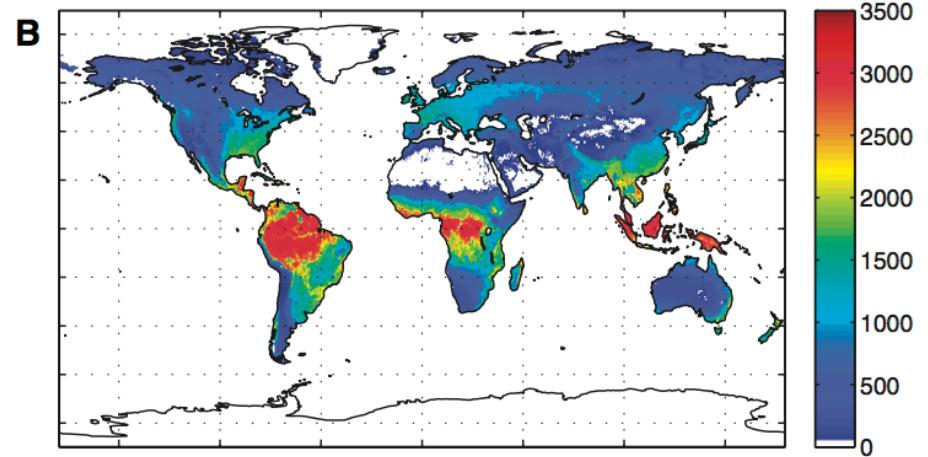


Mean 1998-2005 annual Gross Primary Productivity ($\text{g C m}^{-2} \text{ yr}^{-1}$)

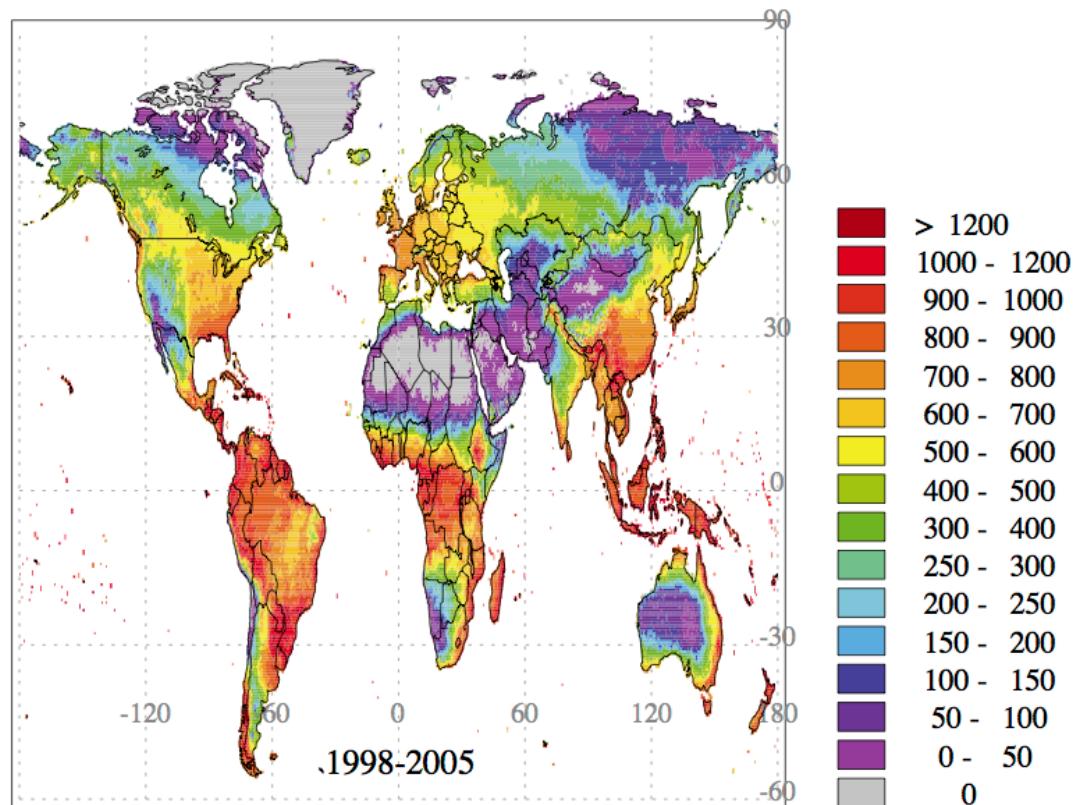
CARAIB



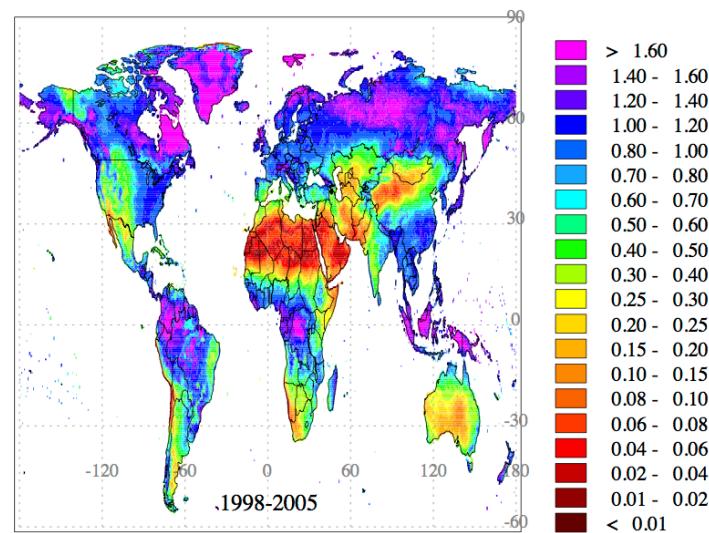
Beer et al. (2010) (data-based)



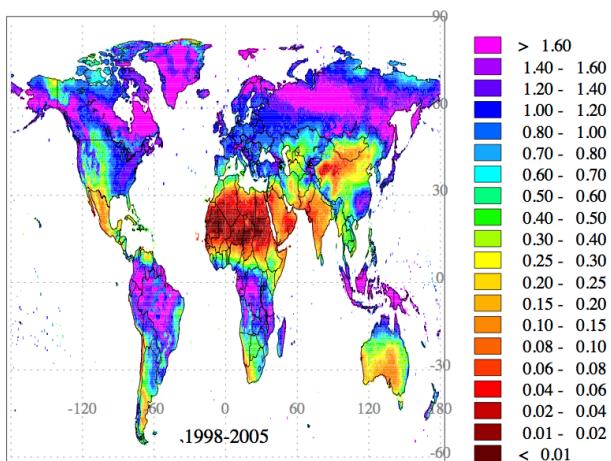
NPP ($\text{g C m}^{-2} \text{ yr}^{-1}$) [Annual]



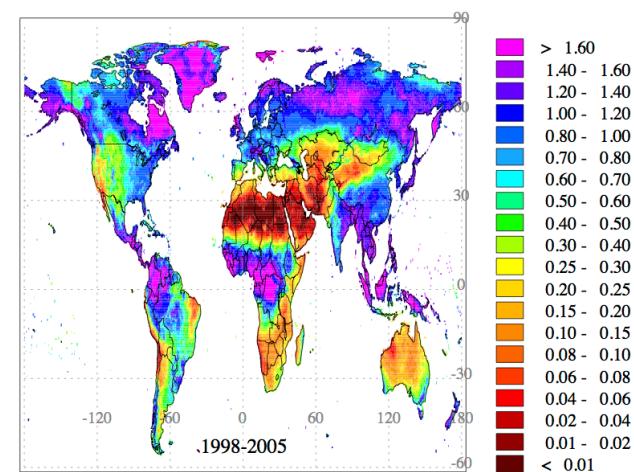
Soil Water (SW-WP)/(FC-WP) [Annual Mean]



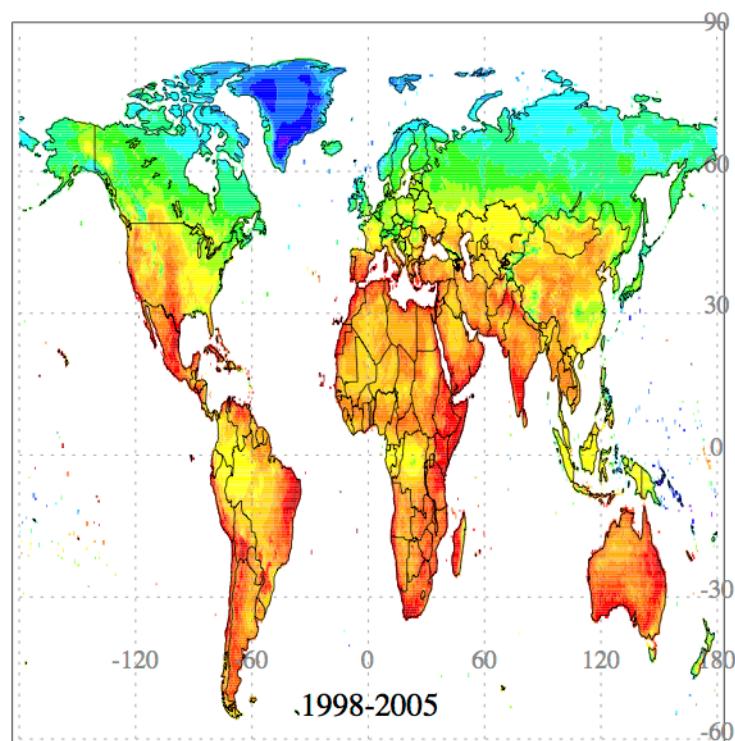
Soil Water (SW-WP)/(FC-WP) [MAM]



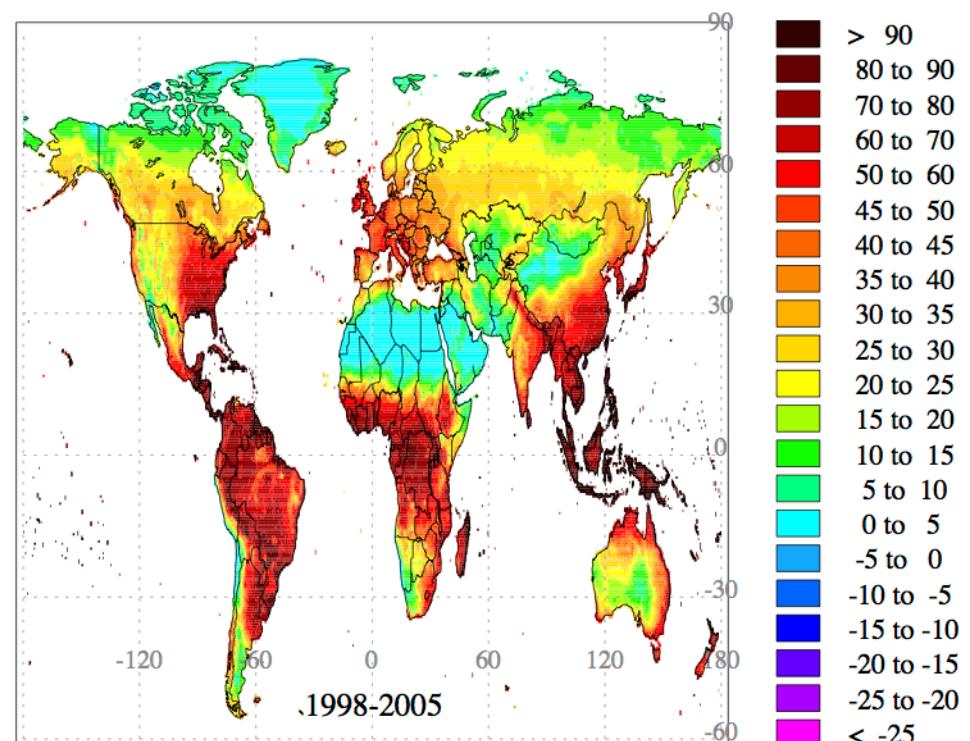
Soil Water (SW-WP)/(FC-WP) [SON]



Sensible Heat Flux (W m^{-2}) [Annual Mean]

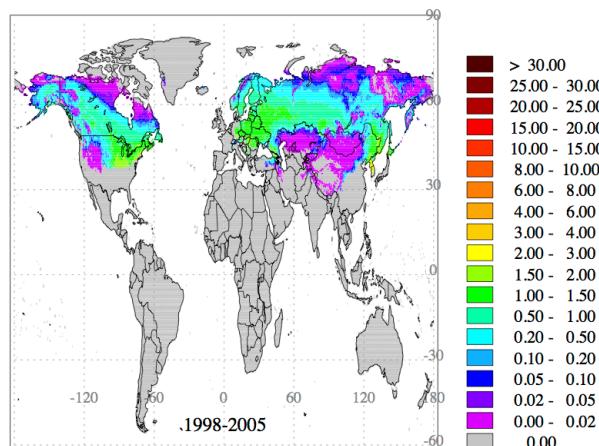


Latent Heat Flux (W m^{-2}) [Annual Mean]

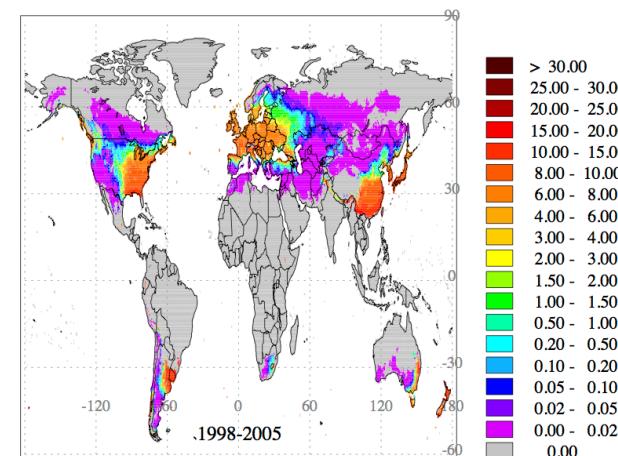


DISTRIBUTION OF PLANT FUNCTIONAL TYPES

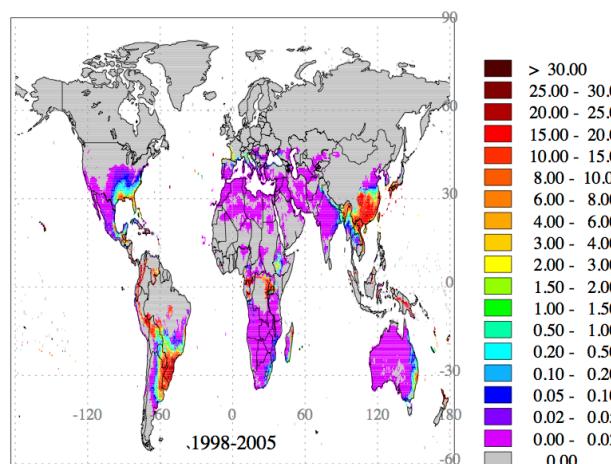
PFT Biomass (kg C m^{-2})
[17 Needleleaved summergr boreal/temp cold trees]



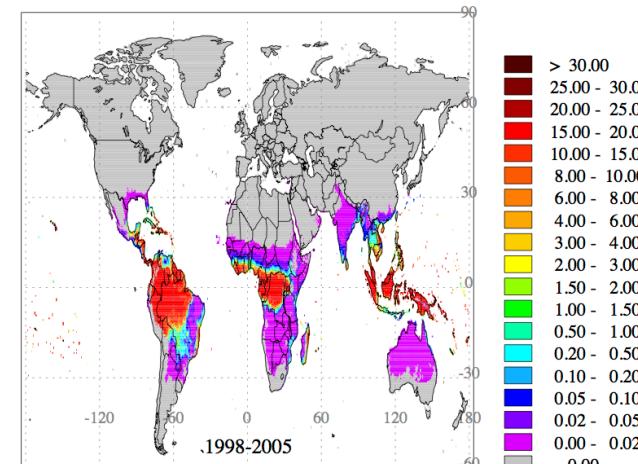
PFT Biomass (kg C m^{-2})
[23 Broadleaved summergreen temperate cool trees]



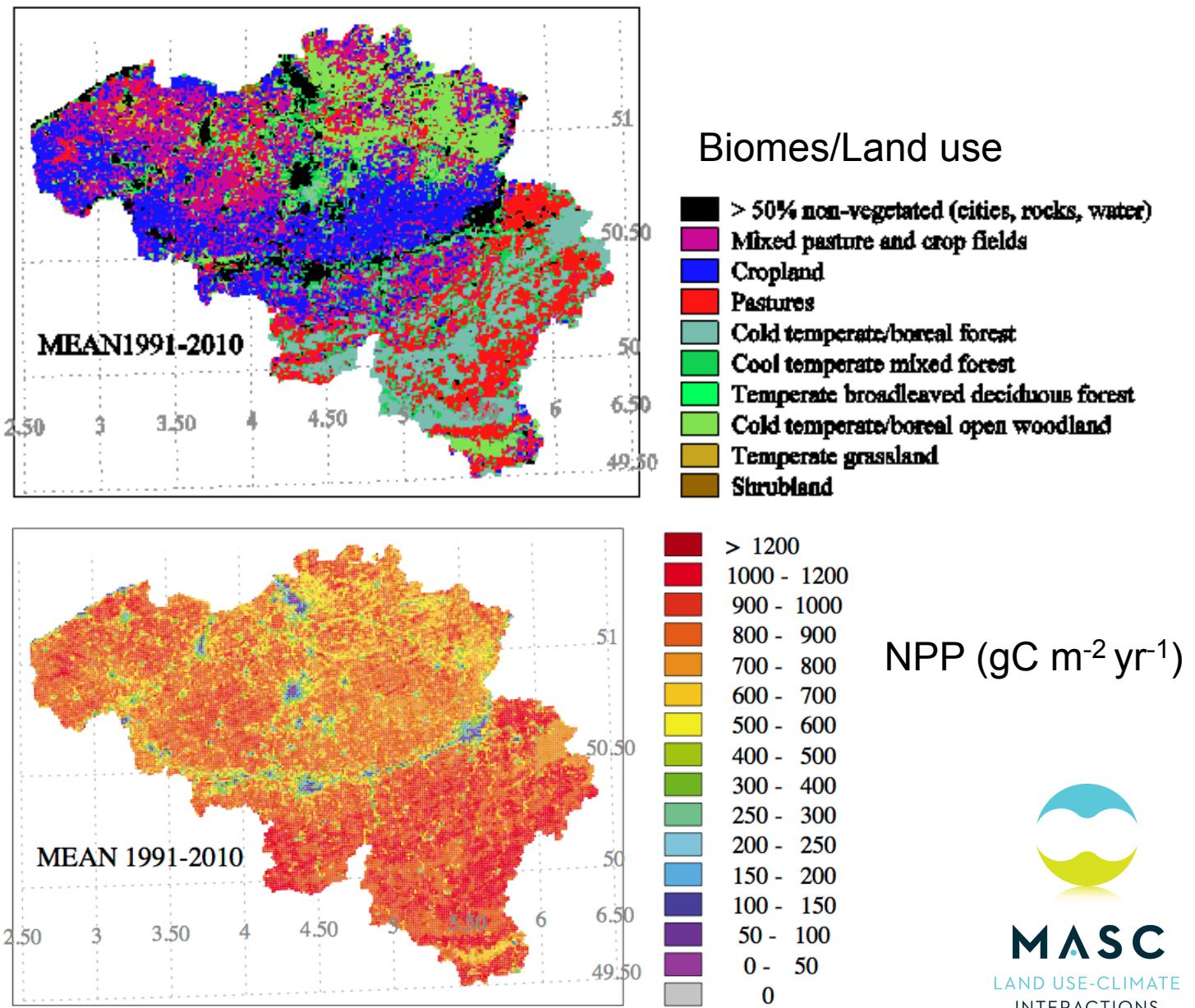
PFT Biomass (kg C m^{-2})
[21 Broadleaved evergr subtrop drought-int trees]



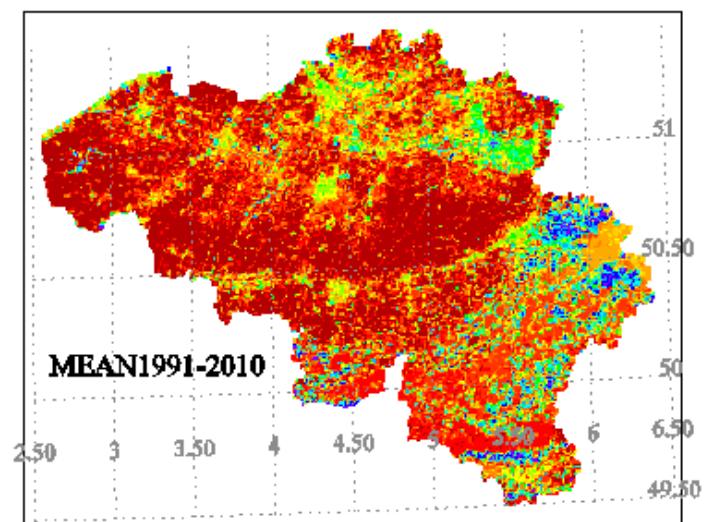
PFT Biomass (kg C m^{-2})
[26 Broadleaved evergreen tropical trees]



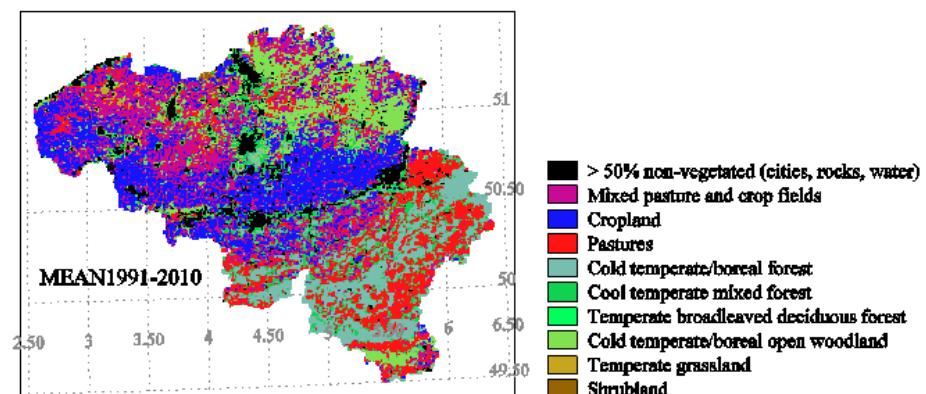
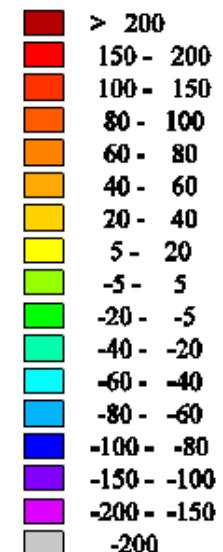
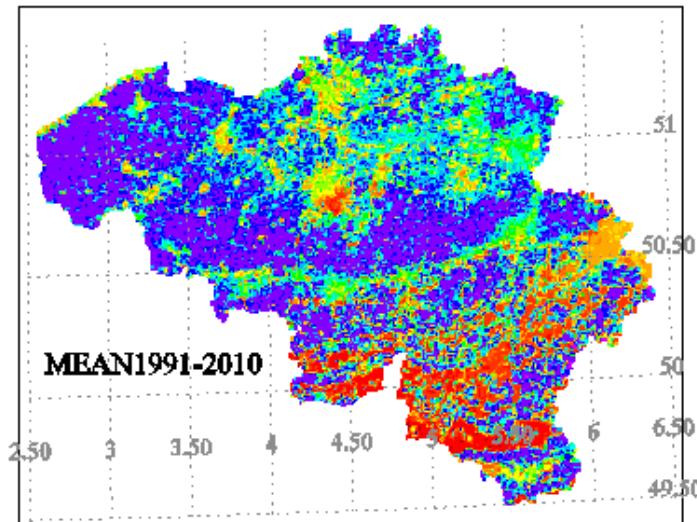
SIMULATIONS WITH LAND USE OVER BELGIUM (1 km²)



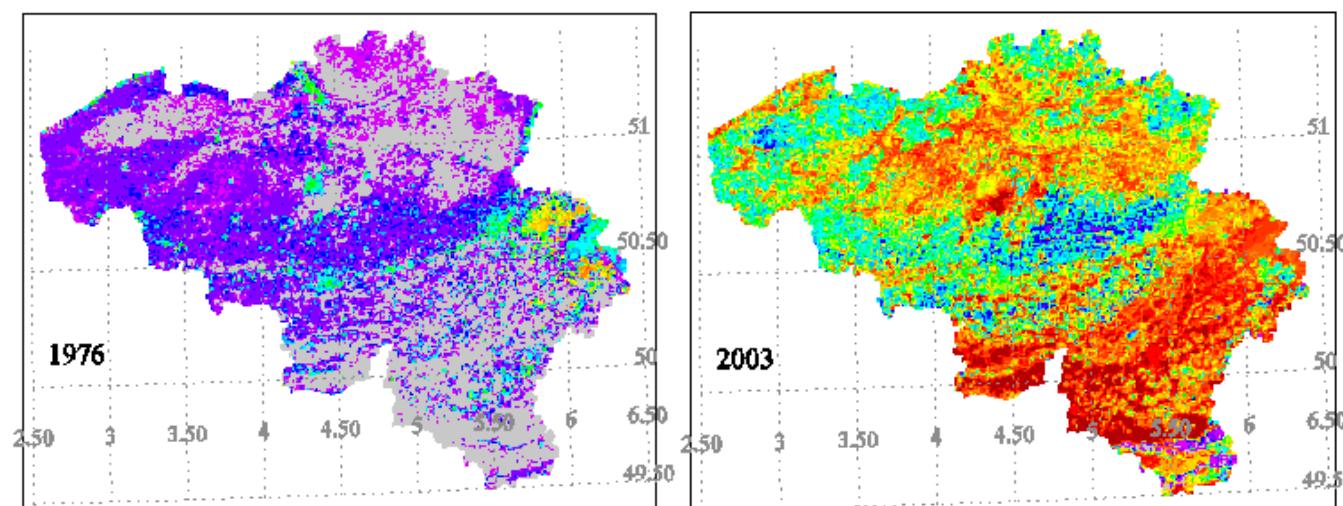
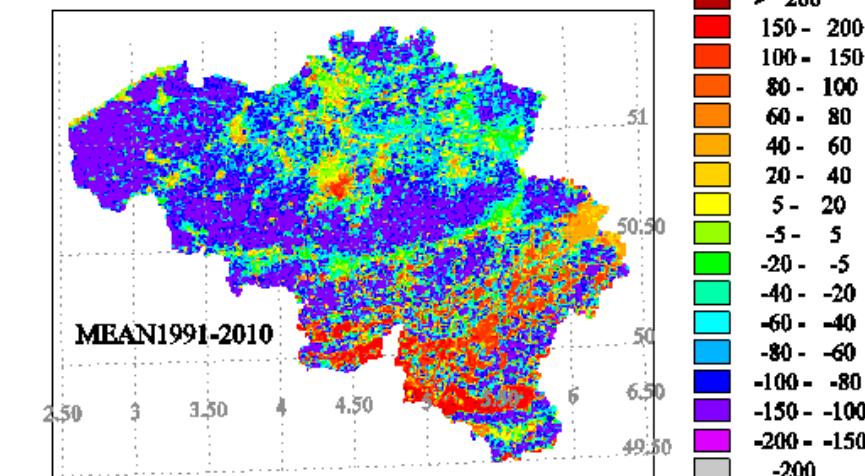
Net Ecosystem Productivity
($\text{g C m}^{-2} \text{ yr}^{-1}$)



Net Biome Productivity
($\text{g C m}^{-2} \text{ yr}^{-1}$)



Net Biome Productivity ($\text{g C m}^{-2} \text{ yr}^{-1}$)



ISIMIP2a intercomparison

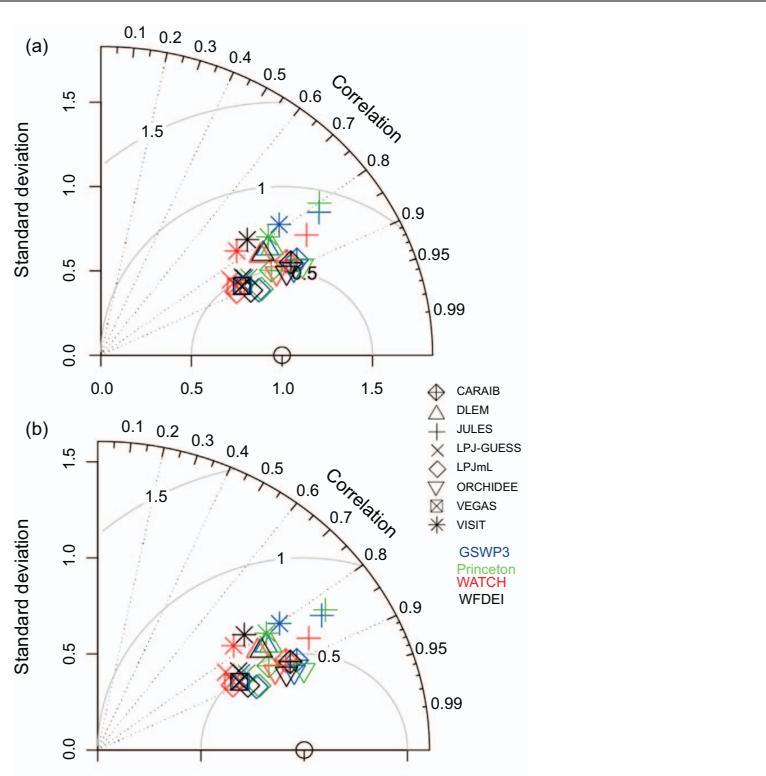


Figure 3. Taylor diagrams of annual gross primary production (GPP) simulated by eight biome models using four meteorological forcing datasets relative to (a) MODIS GPP and (b) flux up-scaled GPP. The correlation and standard deviation were calculated for the period 2000–2010 for the GSWP3, Princeton, and WFDEI cases. In the WATCH cases, the simulated GPP in 1990–2000 was used due to the limitation of the simulation length.

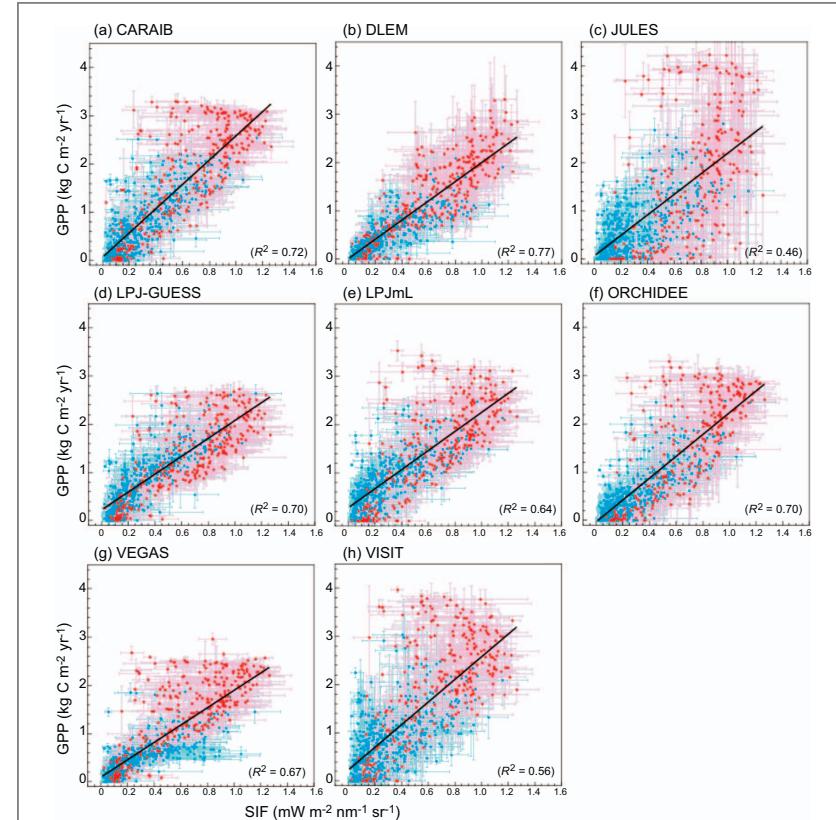
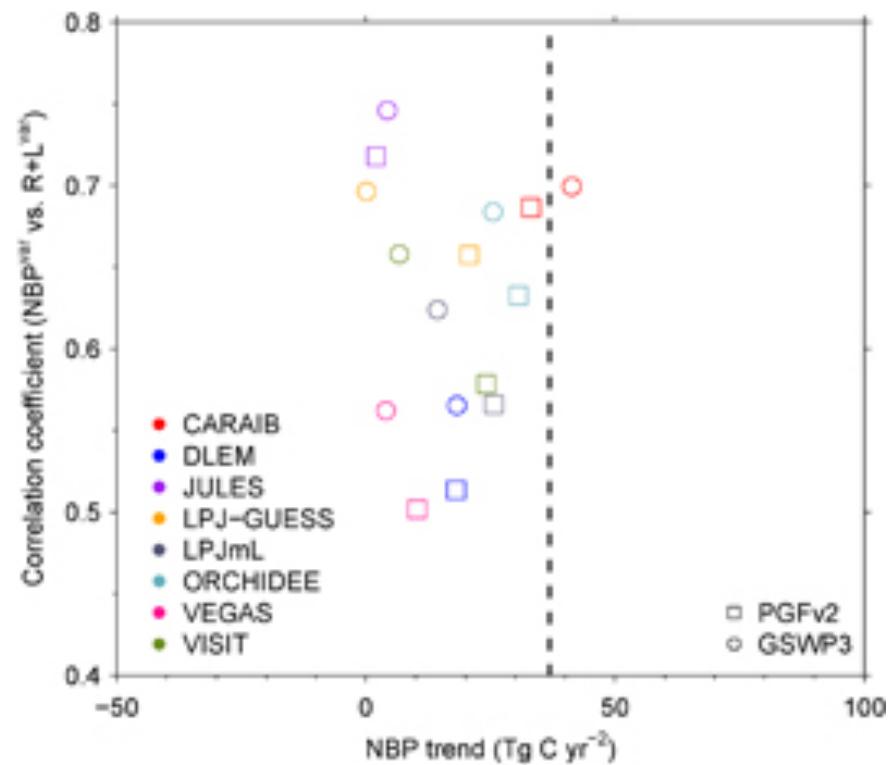
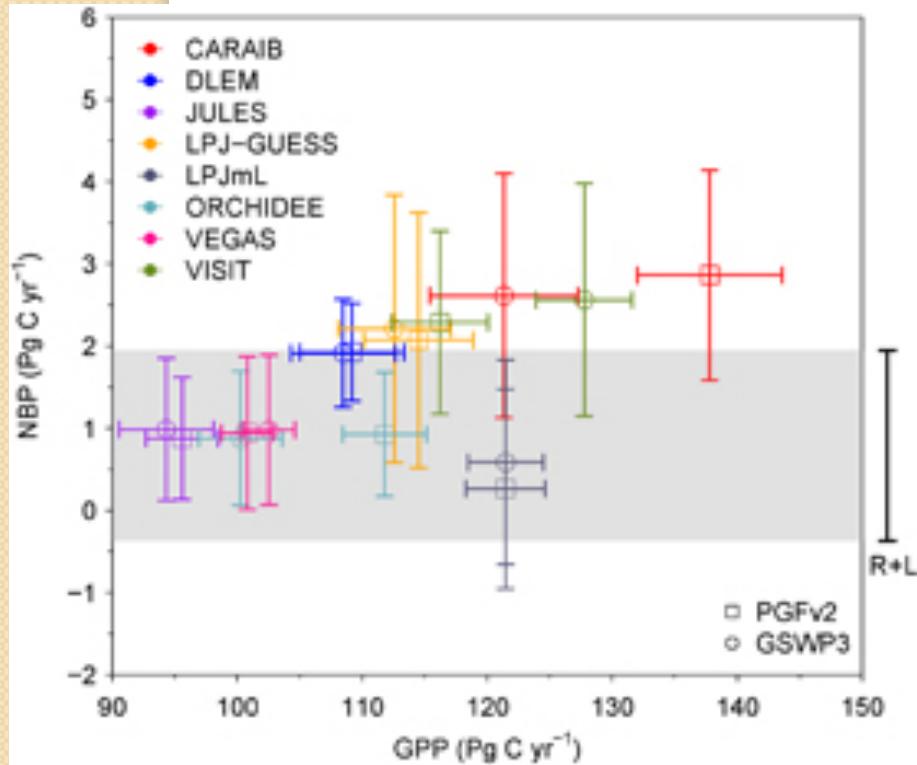


Figure 4. Global relationship between sun-induced chlorophyll fluorescence (SIF) from GOME-2 and gross primary production (GPP) simulated by the eight biome models (a-h), during the period 2007–2010 using the GSWP3 forcing dataset. Black lines show linear regression (R^2 in parentheses). Both SIF and GPP data were aggregated into 5°-mesh to reduce the influence of observational noise; bars show the standard deviation within the 5°-grids. Red dots show tropical areas (25°N–25°S), and blue dots show temperate and boreal areas.

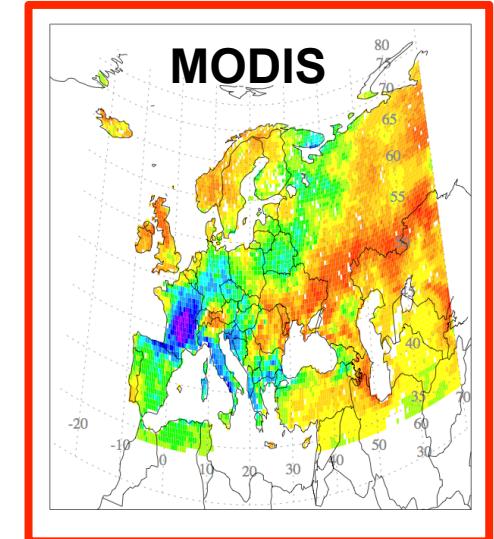
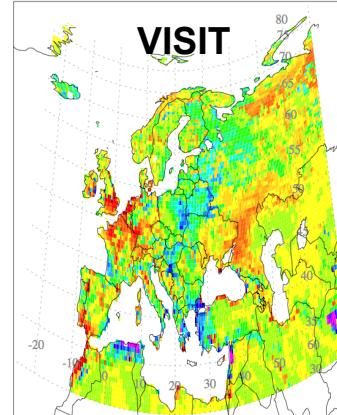
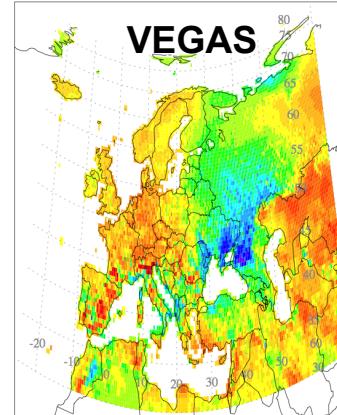
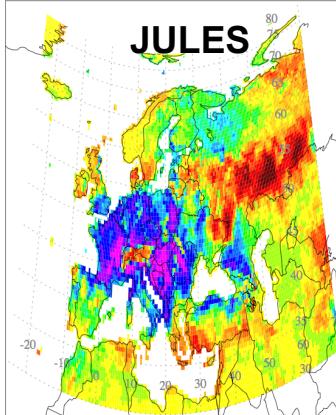
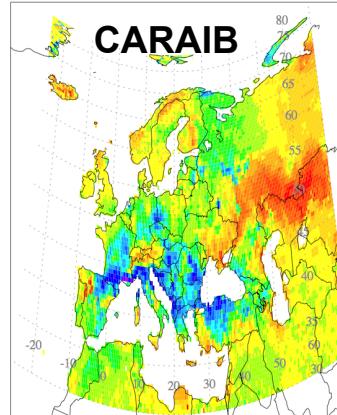


Chang et al. (2017)

$R+L$ = interannual variability in global Residual Land Sink (RLS) plus land use change emissions (ELUC) ($R + L$; Le Quéré et al 2015). Dashed line indicates the trend derived from $R + L$ (Le Quéré et al 2015).

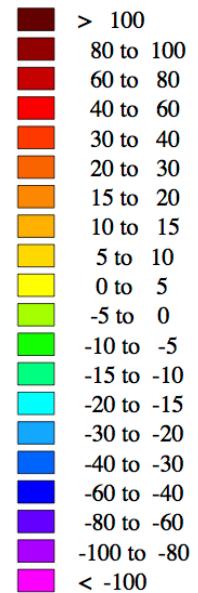
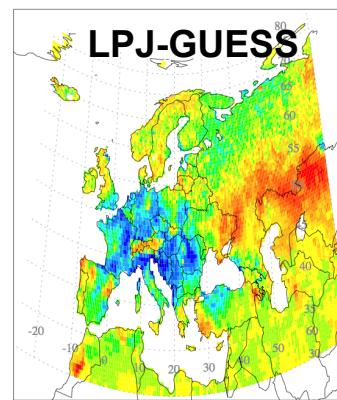
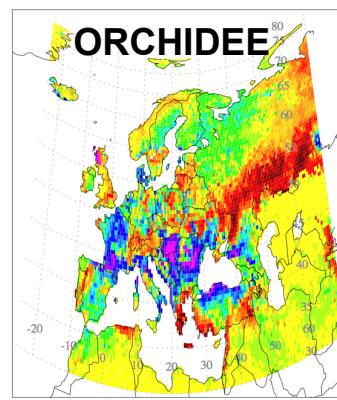
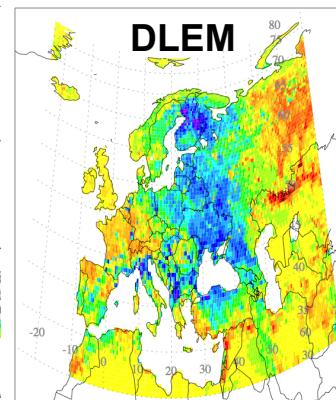
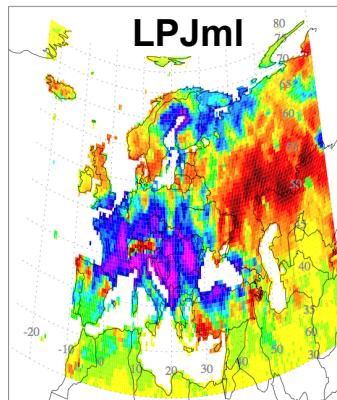


2003 Summer drought in Europe: Models vs MODIS



Gross Primary Productivity summer (JJA) anomaly
(reference period 2001-2010)

Princeton PGFv2 climatic data, « natural » simulations



2003

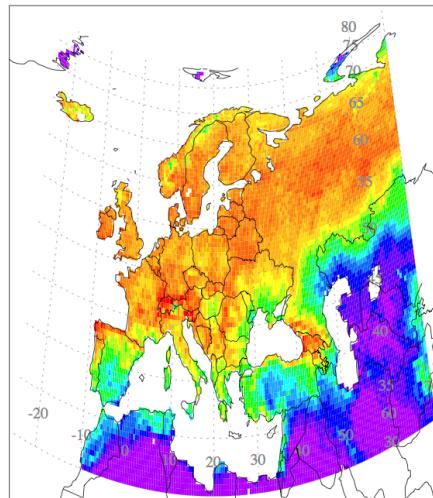
($\text{gC m}^{-2} \text{ month}^{-1}$)



2003 Summer drought in Europe: Model ensemble

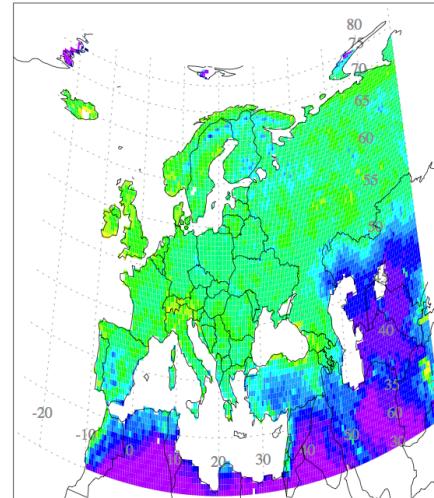
GPP ($\text{g C m}^{-2} \text{ mo}^{-1}$) [JJA]

MODEL ENSEMBLE PGFv2 NAT 2003



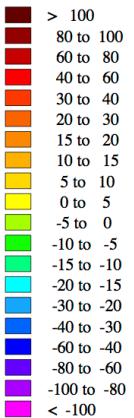
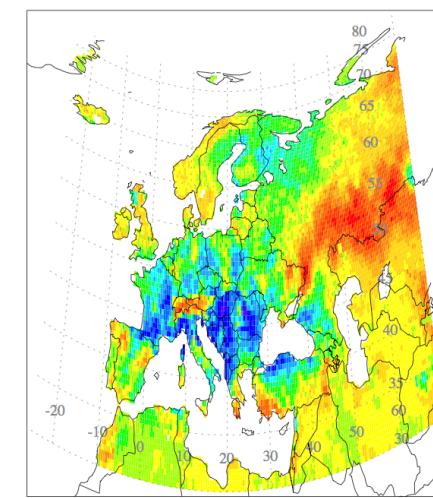
GPP Standard Deviation ($\text{g C m}^{-2} \text{ mo}^{-1}$) [JJA]

MODEL ENSEMBLE PGFv2 NAT 2003



Anomalies of GPP ($\text{g C m}^{-2} \text{ mo}^{-1}$) [JJA]

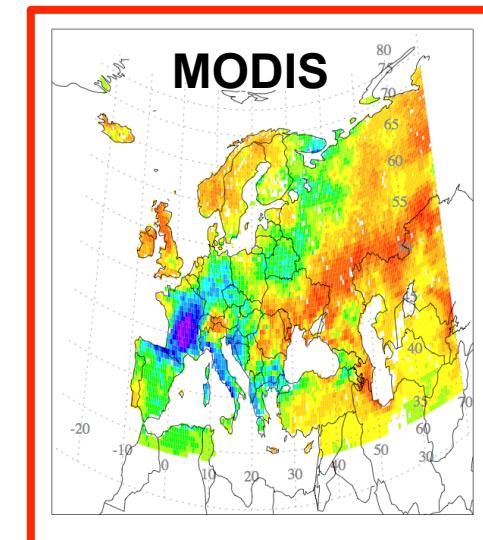
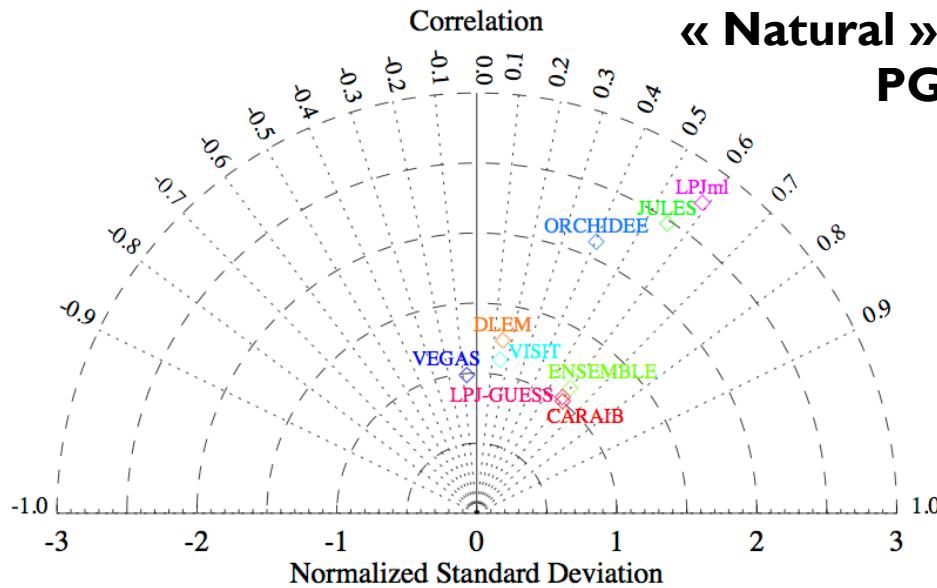
MODEL ENSEMBLE PGFv2 NAT 2003



Correlation

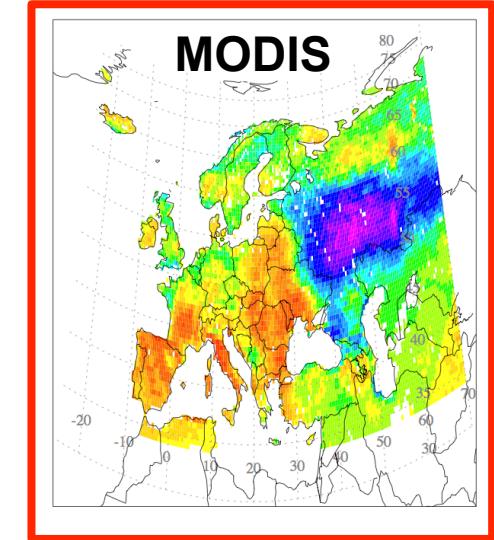
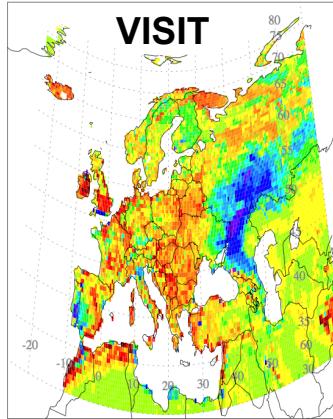
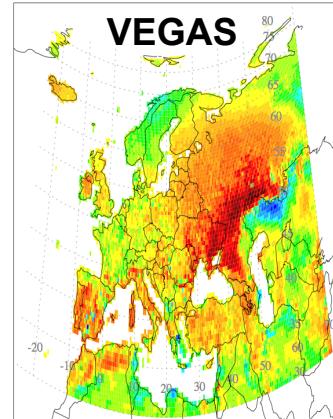
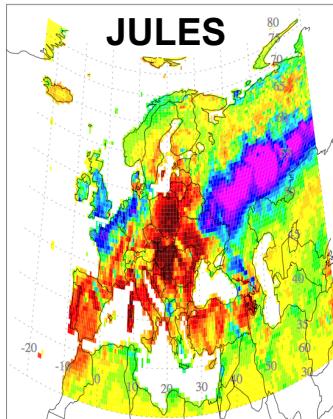
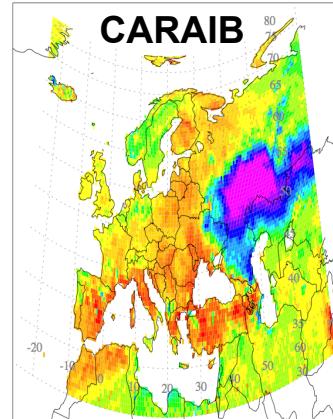
« Natural » simulations
PGFv2 climate

2003



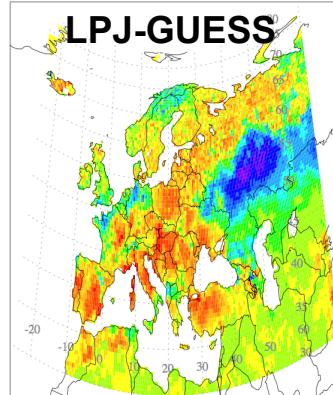
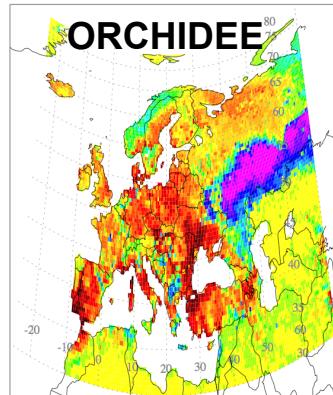
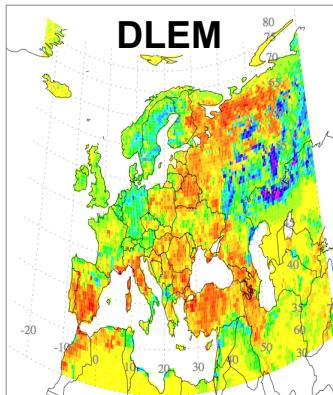
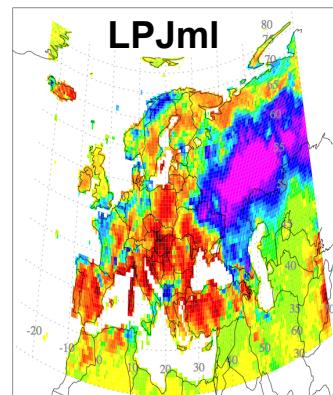


2010 Summer drought in Europe: Models vs MODIS



Gross Primary Productivity summer (JJA) anomaly
(reference period 2001-2010)

Princeton PGFv2 climatic data, « natural » simulations



> 100
80 to 100
60 to 80
40 to 60
30 to 40
20 to 30
15 to 20
10 to 15
5 to 10
0 to 5
-5 to 0
-10 to -5
-15 to -10
-20 to -15
-30 to -20
-40 to -30
-60 to -40
-80 to -60
-100 to -80
< -100

2010

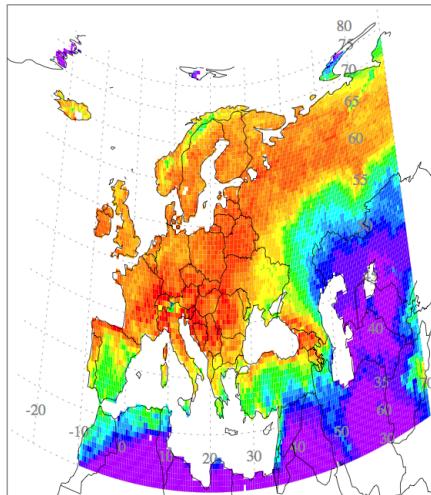
(gC m⁻² month⁻¹)



2010 Summer drought in Europe: Model ensemble

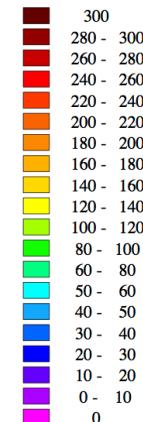
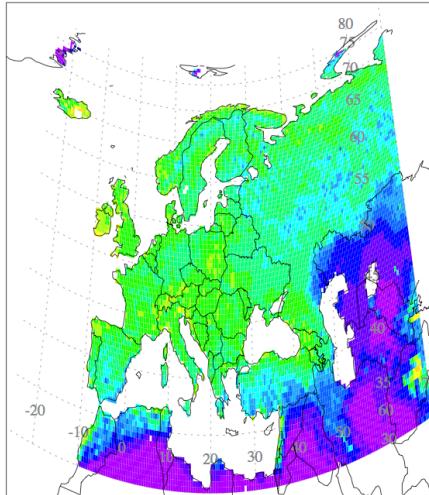
GPP ($\text{g C m}^{-2} \text{ mo}^{-1}$) [JJA]

MODEL ENSEMBLE PGFv2 NAT 2010



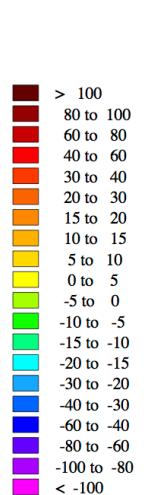
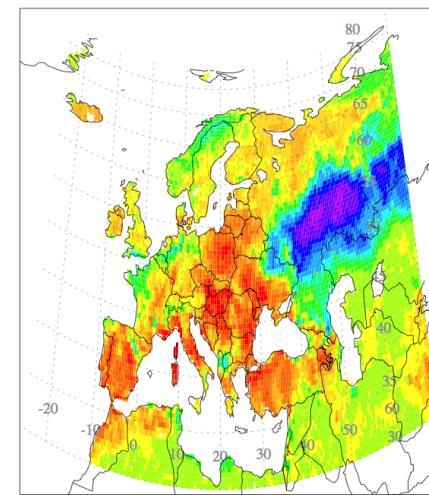
GPP Standard Deviation ($\text{g C m}^{-2} \text{ mo}^{-1}$) [JJA]

MODEL ENSEMBLE PGFv2 NAT 2010



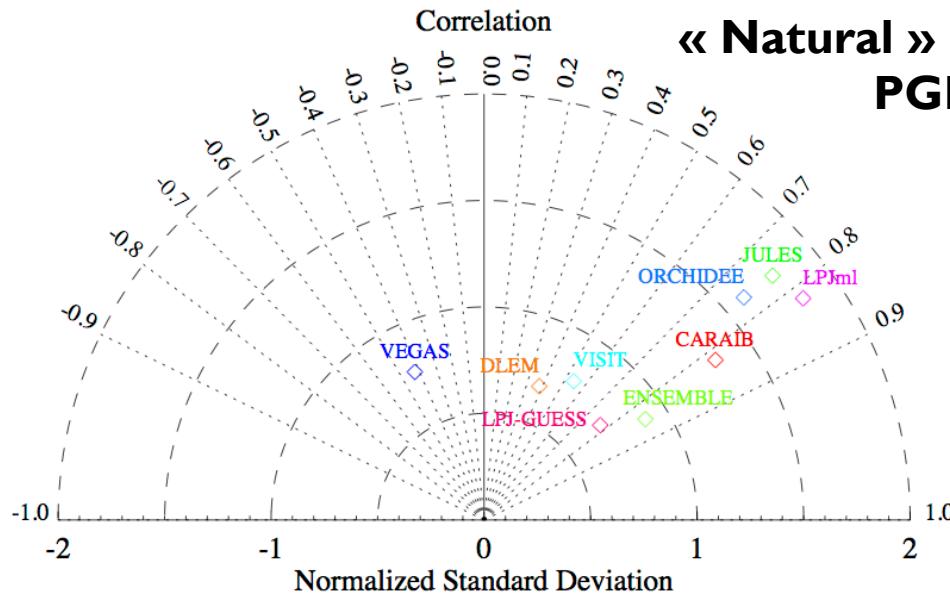
Anomalies of GPP ($\text{g C m}^{-2} \text{ mo}^{-1}$) [JJA]

MODEL ENSEMBLE PGFv2 NAT 2010

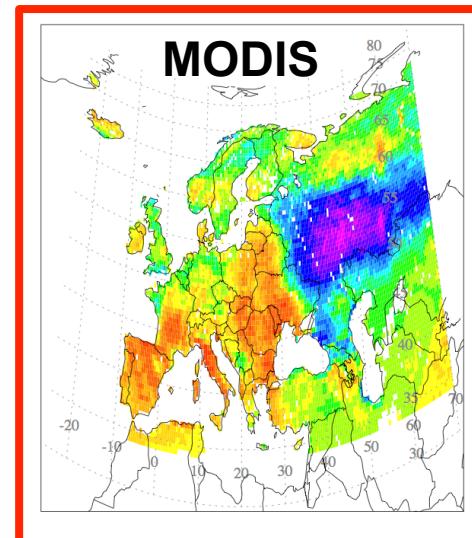


Correlation

« Natural » simulations
PGFv2 climate

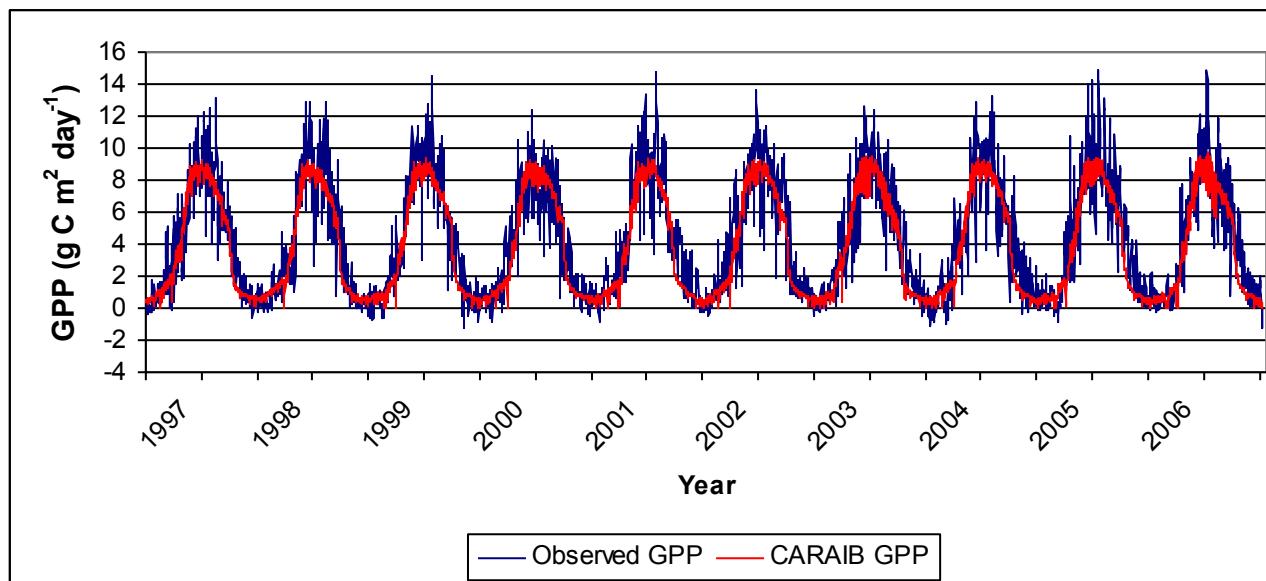


2010



Site Level Simulations (GPP)

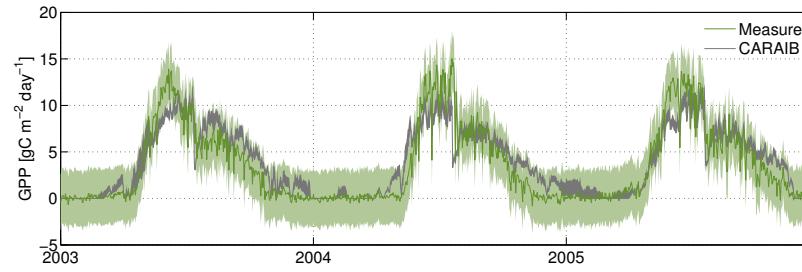
- Vielsalm, Belgium (CarboEuroflux site, 50°N, 6°E)
mixed forest: *Fagus sylvatica*, *Pseudotsuga menziesii*
 - simulations with CRU monthly climatic data at 0.5°x0.5° (1997-2006)
 - model vegetation : BAG 16 + BAG 20 (European classification)
 - no specific adaptation of soil parameters to the site



Site Level Simulations

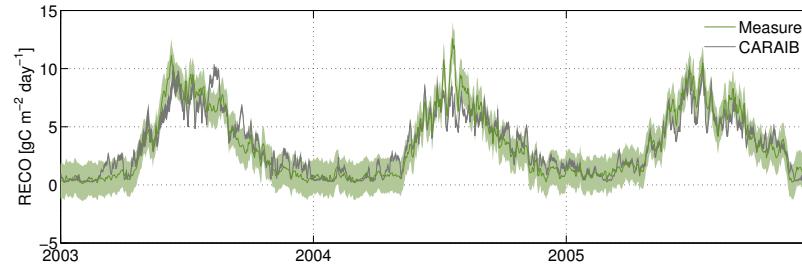
Monte Bondone (Italy)
Grassland site.
Eddy covariance data with
error bar (green)
assimilated in the CARAIB
model (1200 runs; grey)

GPP



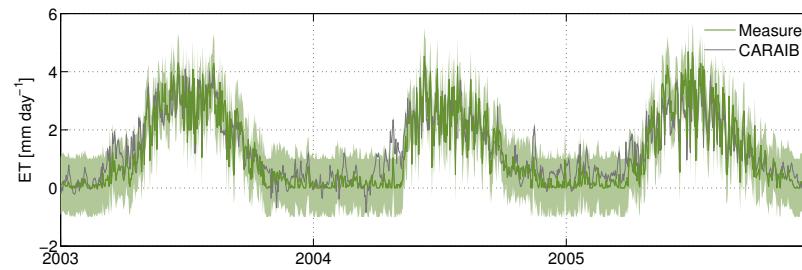
(a)

Ecosystem
Respiration



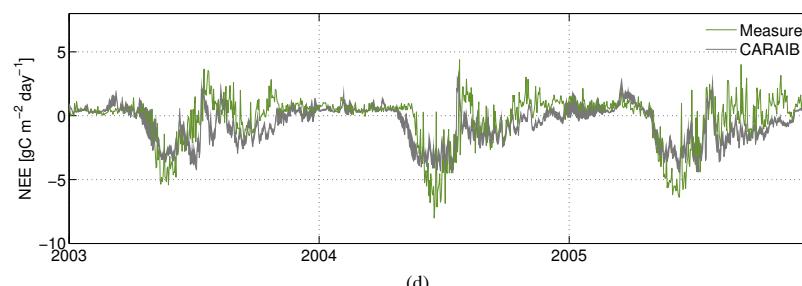
(b)

Evapotranspiration



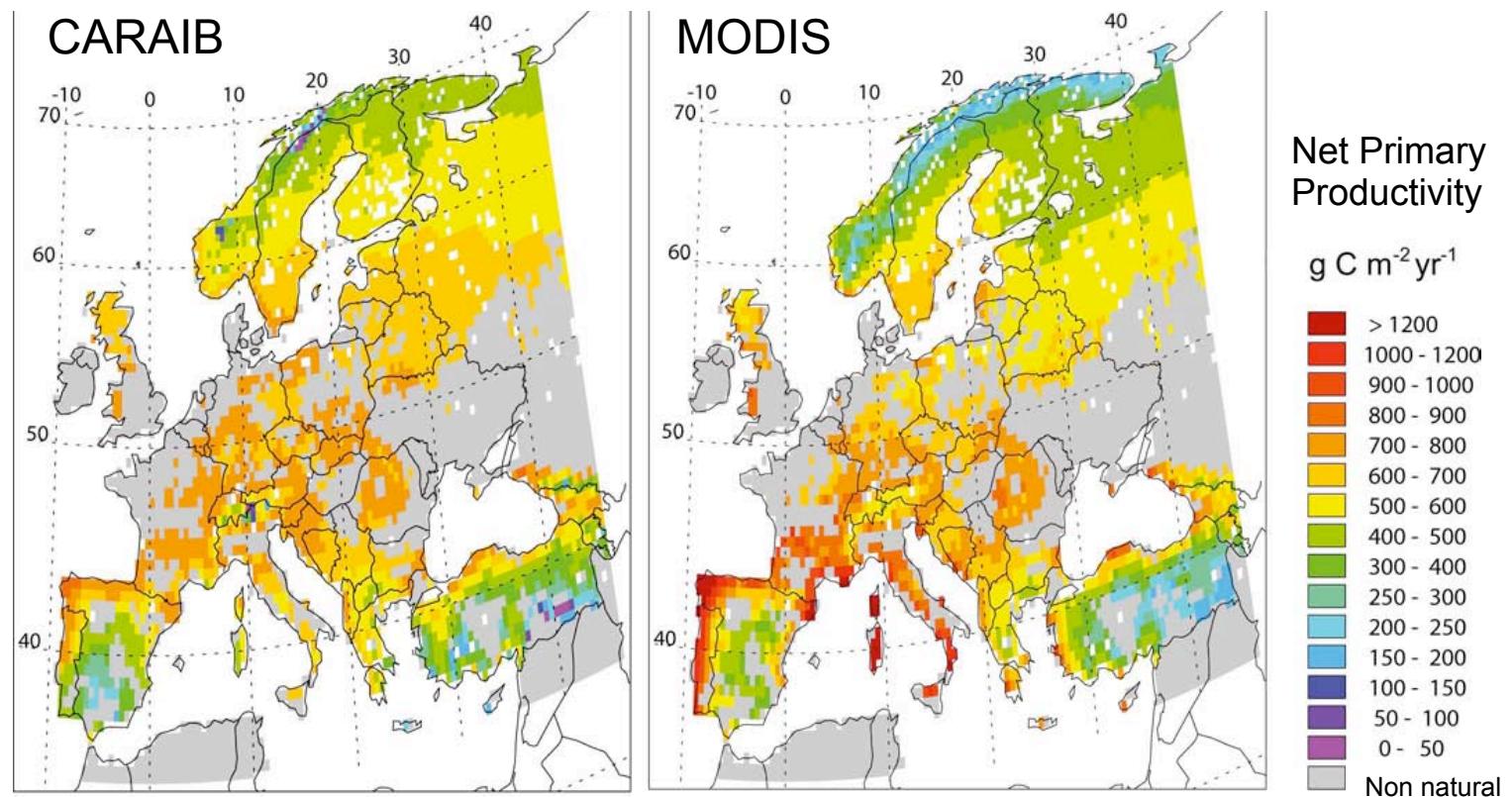
(c)

Net Ecosystem Exchange



(d)

Simulations at European Scale (NPP)

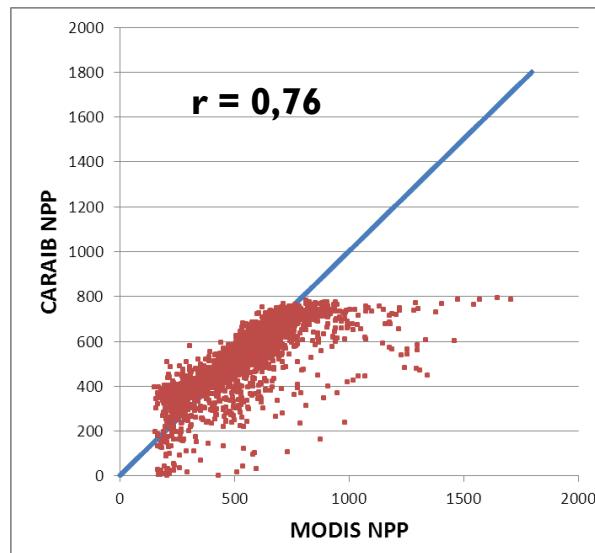


- simulations with CRU monthly climatic data at $0.5^\circ \times 0.5^\circ$ (2000-2006)
- grid cells with > 30 % (semi-)natural vegetation (mostly forests)
- comparison with MODIS NPP for the same period over

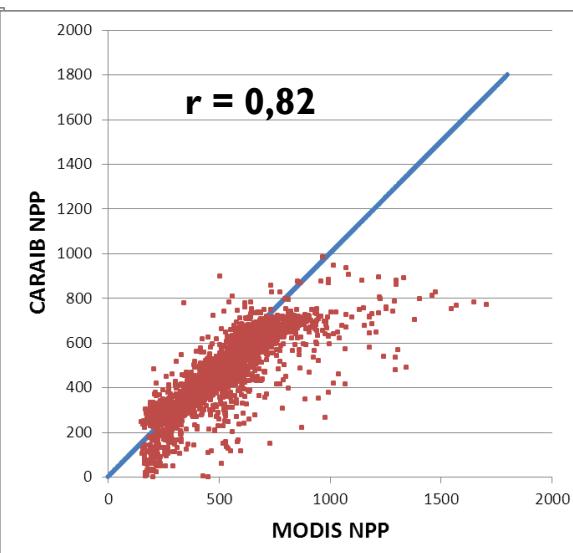
Dury et al. (2011)

Species-based simulations (Europe)

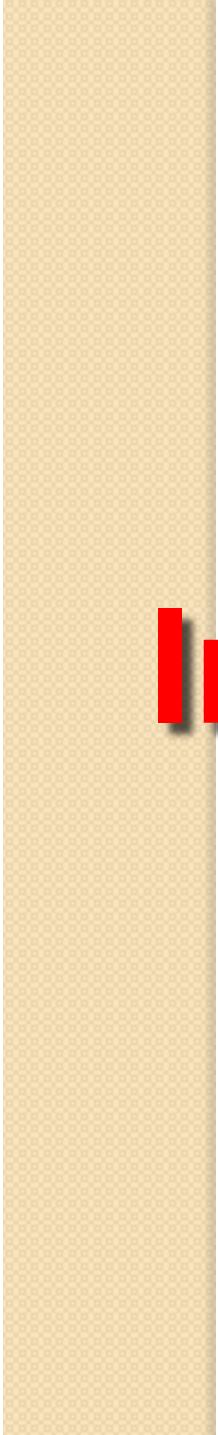
- simulations performed with species rather than BAGs or PFTs
- common European species representative of each BAG
 - 47 herbaceous species
 - 12 shrub species
 - 40 trees



Simulations with BAGs
(shown before)



Simulations with species

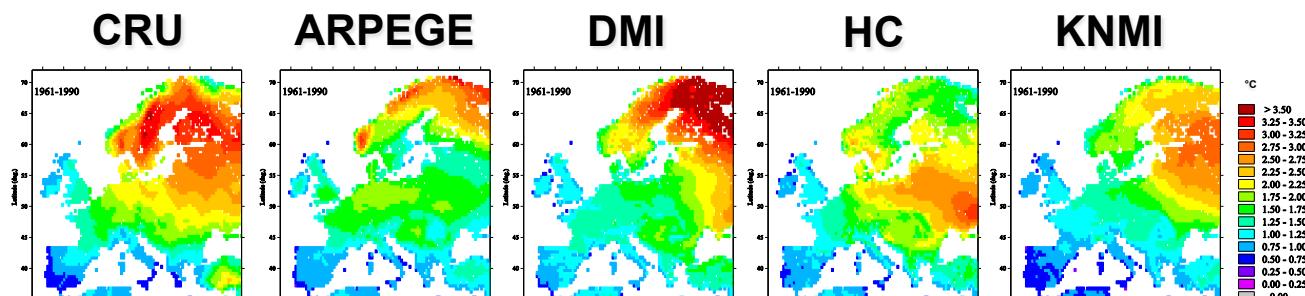


Interannual Variability

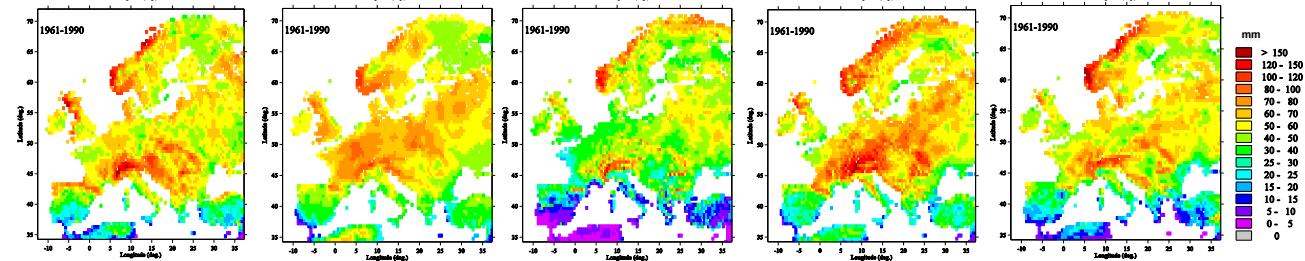
Interannual variability of climate and NPP (Models of ENSEMBLES project)

1961-1990

Winter temperature
standard deviation

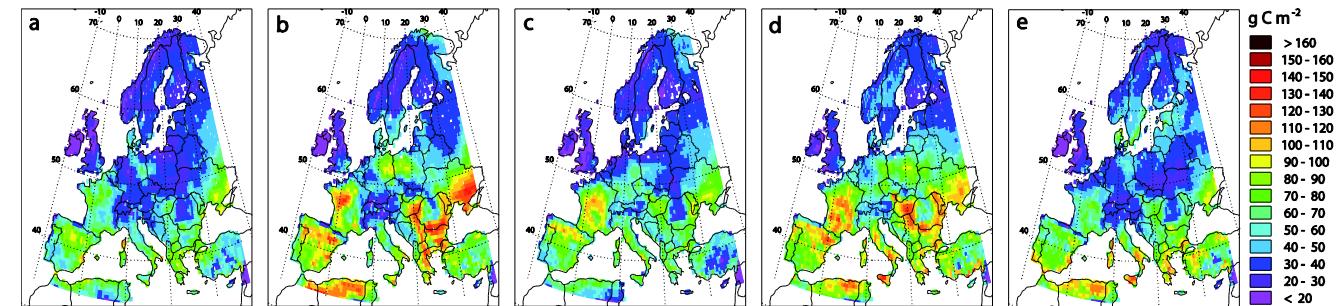


Summer precipitation
standard deviation



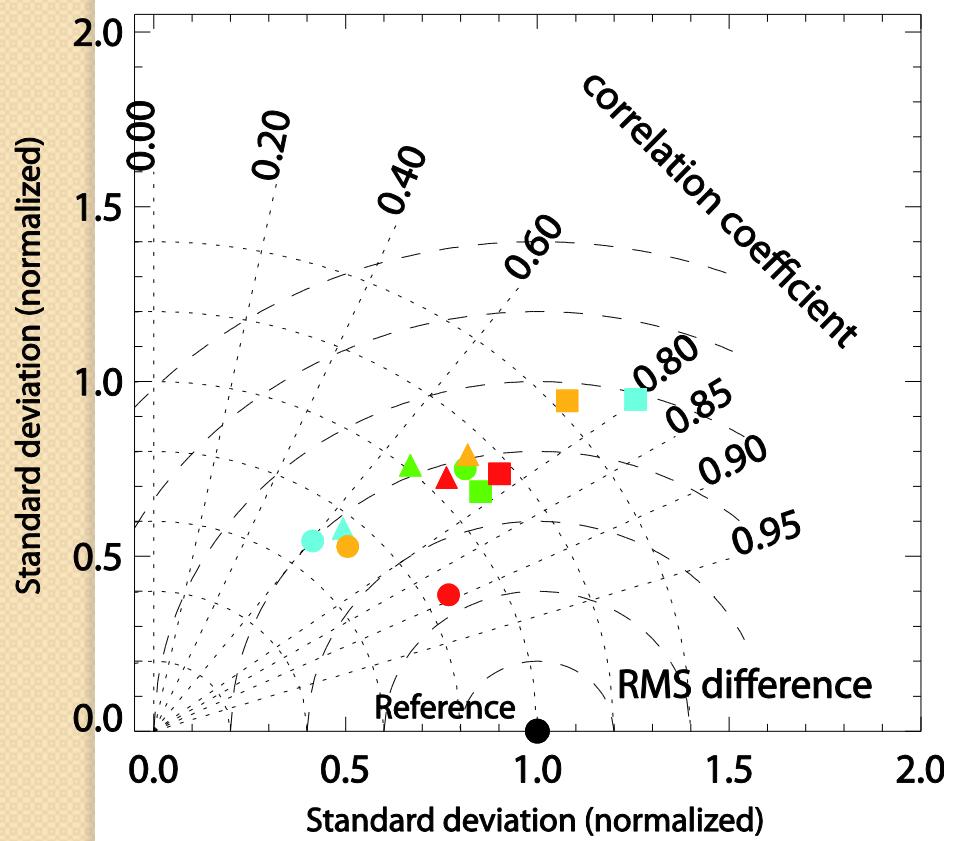
CARAIB

Annual NPP
standard deviation



Dury et al., in prep.

Model performance to reproduce the 1961-1990 interannual variability (Taylor diagram / reference = CRU)



ARPEGE/Climate
DMI-HIRHAM5
HC-HadRM3Q0
KNMI-RACMO2

Reference CRU

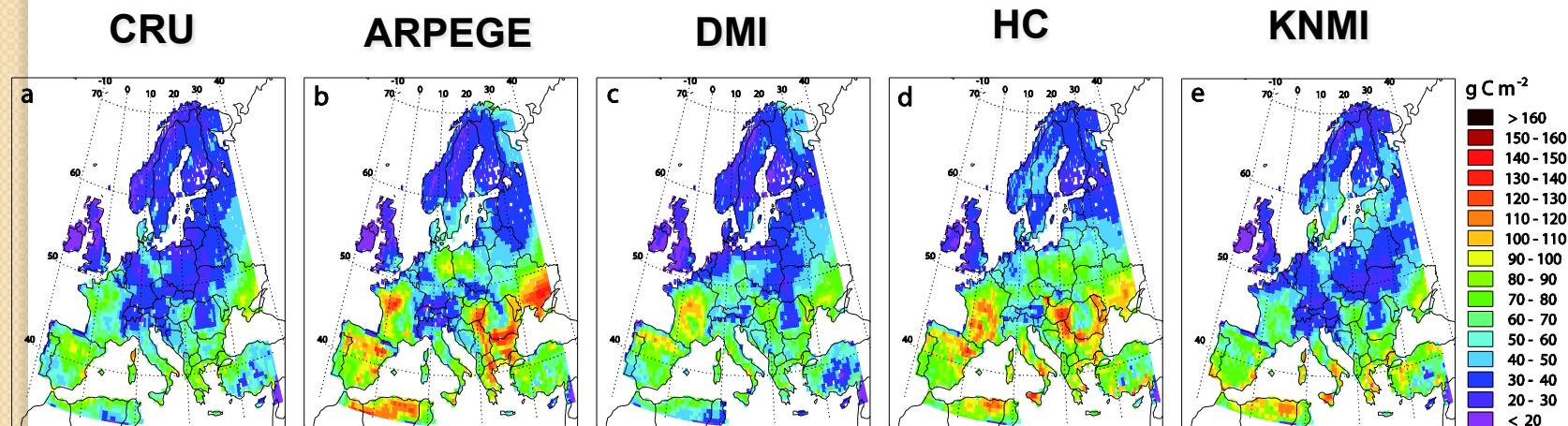
- Winter temperature
- ▲ Summer precipitations
- Net primary productivity



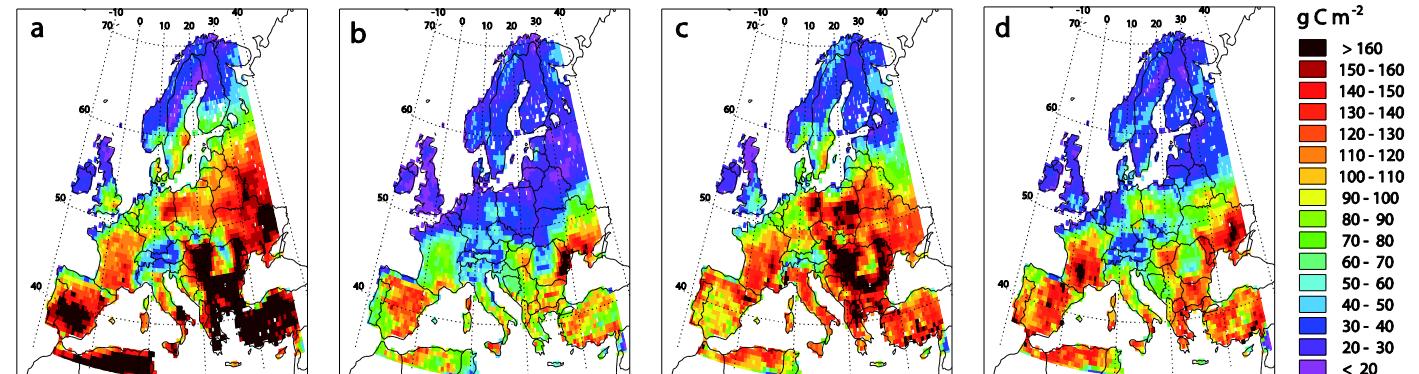
Future Impacts on Ecosystems

Future interannual variability of NPP

Annual NPP standard deviation
1961-1990



2071-2100 (A1B)



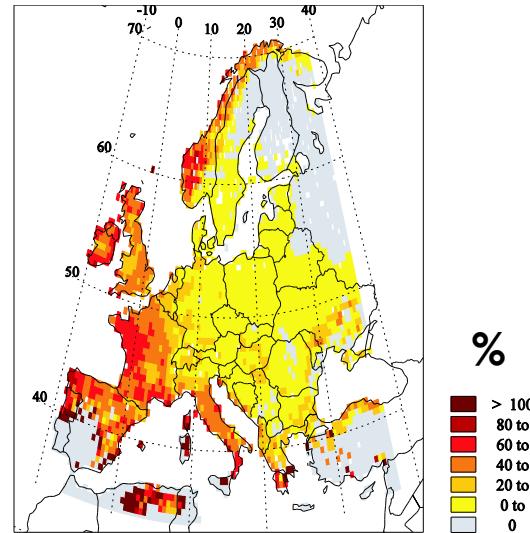
Dury et al., in prep.

Species distribution

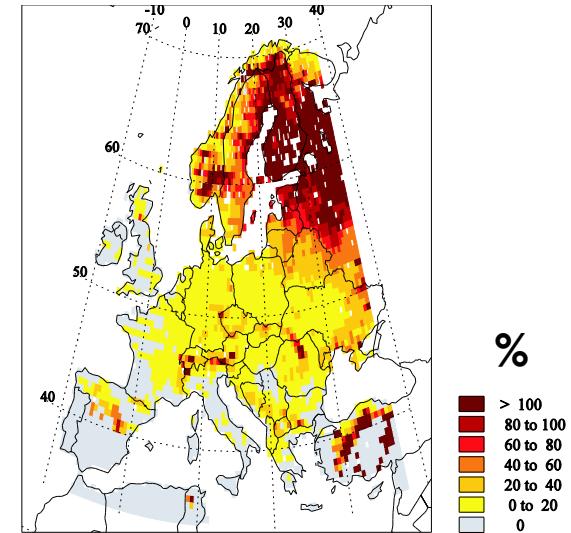
Percentages of species disappearance and potential appearance of new species between 1961-1990 and 2071-2100 (**KNMI-RACMO2 with A1B SRES**)

HERB and SHRUB SPECIES

DISAPPEARANCE

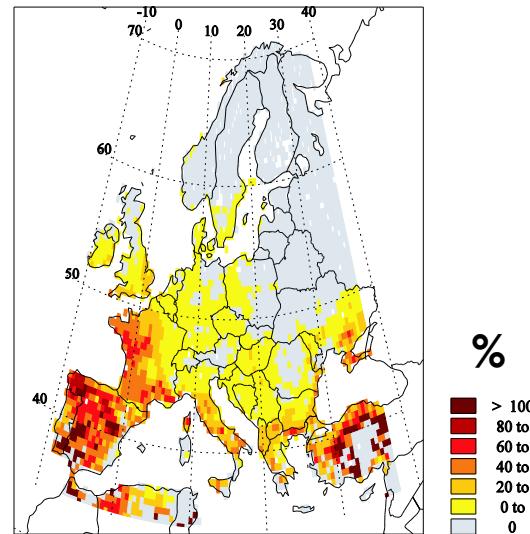


APPEARANCE

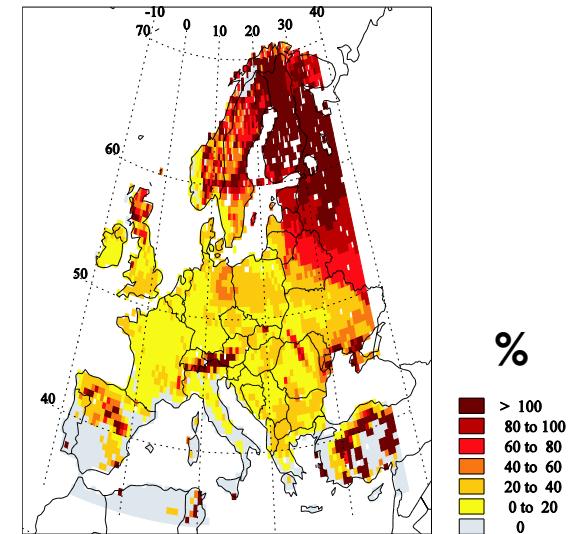


TREE SPECIES

DISAPPEARANCE



APPEARANCE

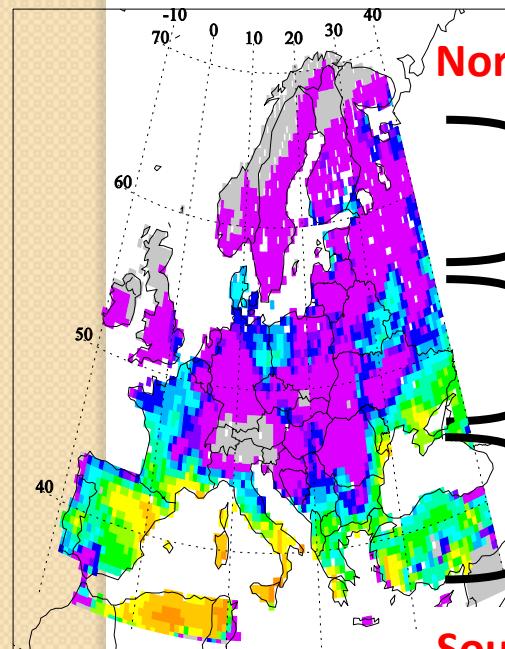


Natural fires

2071-2100

1961-1990

Percentage of pixel area burned per year



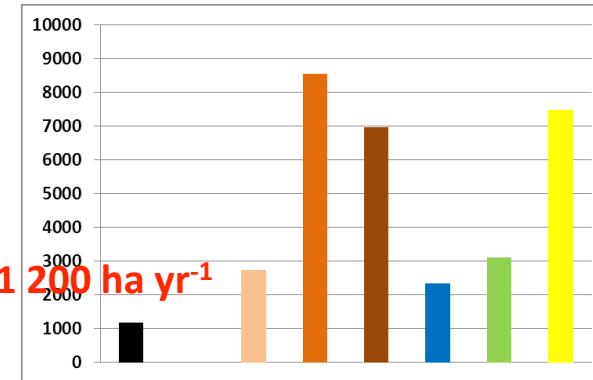
%	
■	100,000
■	50,000 - 100,000
■	20,000 - 50,000
■	10,000 - 20,000
■	5,000 - 10,000
■	2,000 - 5,000
■	1,000 - 2,000
■	0,500 - 1,000
■	0,200 - 0,500
■	0.000

Northern Europe

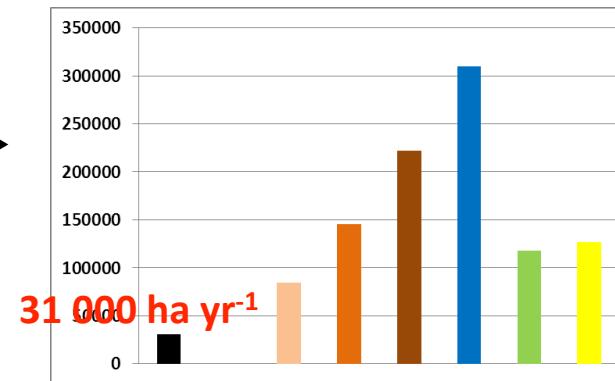
Central Europe

Southern Europe

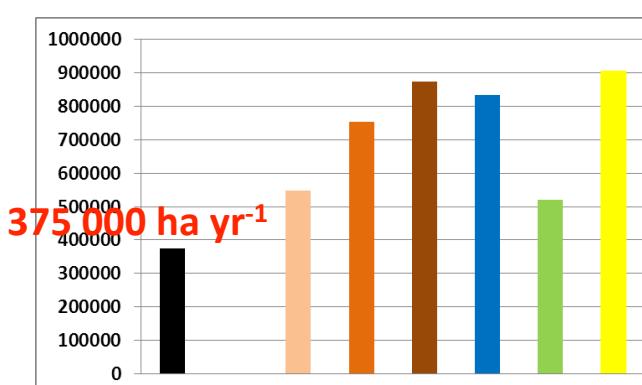
Area burned (ha) per year



1200 ha yr⁻¹



31 000 ha yr⁻¹

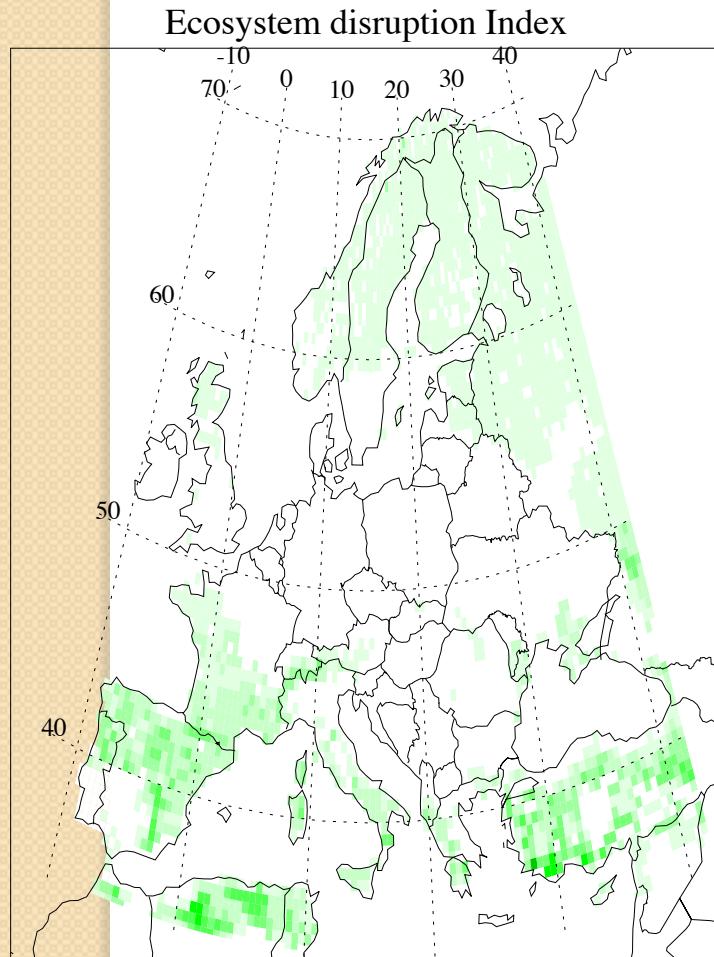


375 000 ha yr⁻¹

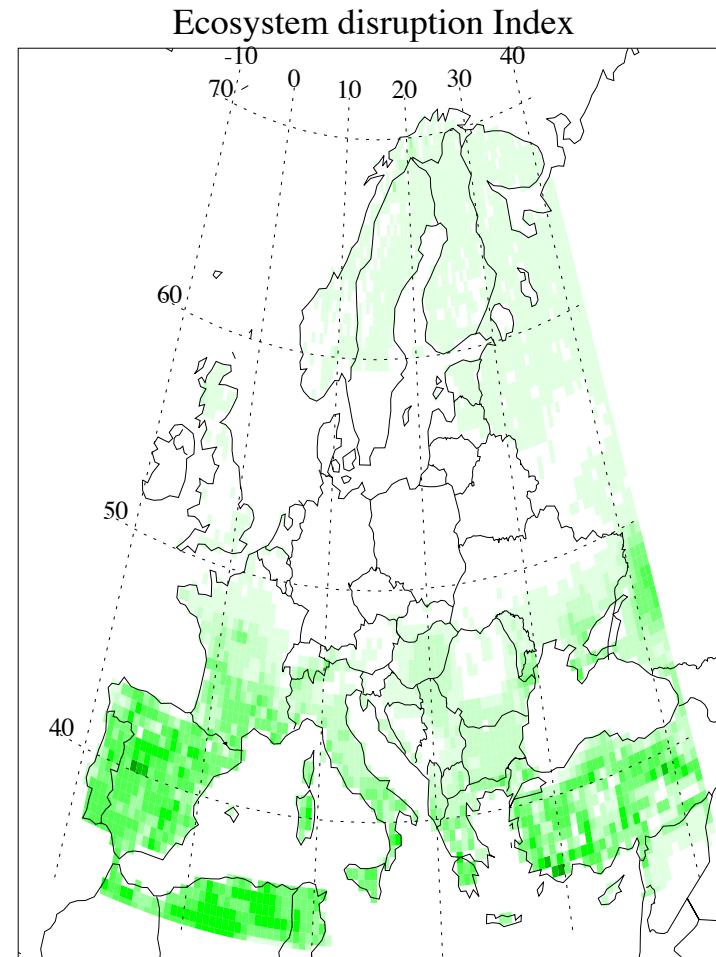
- 1961-1990
- ARPEGE B1
- ARPEGE A1B
- ARPEGE A2
- KNMI A1B
- DMI A1B
- HC A1B

Risk index for severe perturbation of ecosystems

-includes: runoff, NPP, fires, soil turnover, species disappearance, new species



With CO₂ fertilization



Without CO₂ fertilization

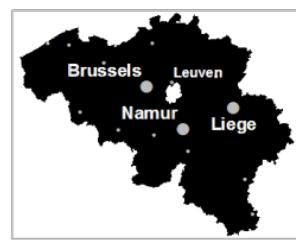
(KNMI-RACMO2 with A1B SRES)



Integrating Crops and Ecosystem Services (VOTES)



VALUATION OF
TERRESTRIAL
ECOSYSTEM
SERVICES



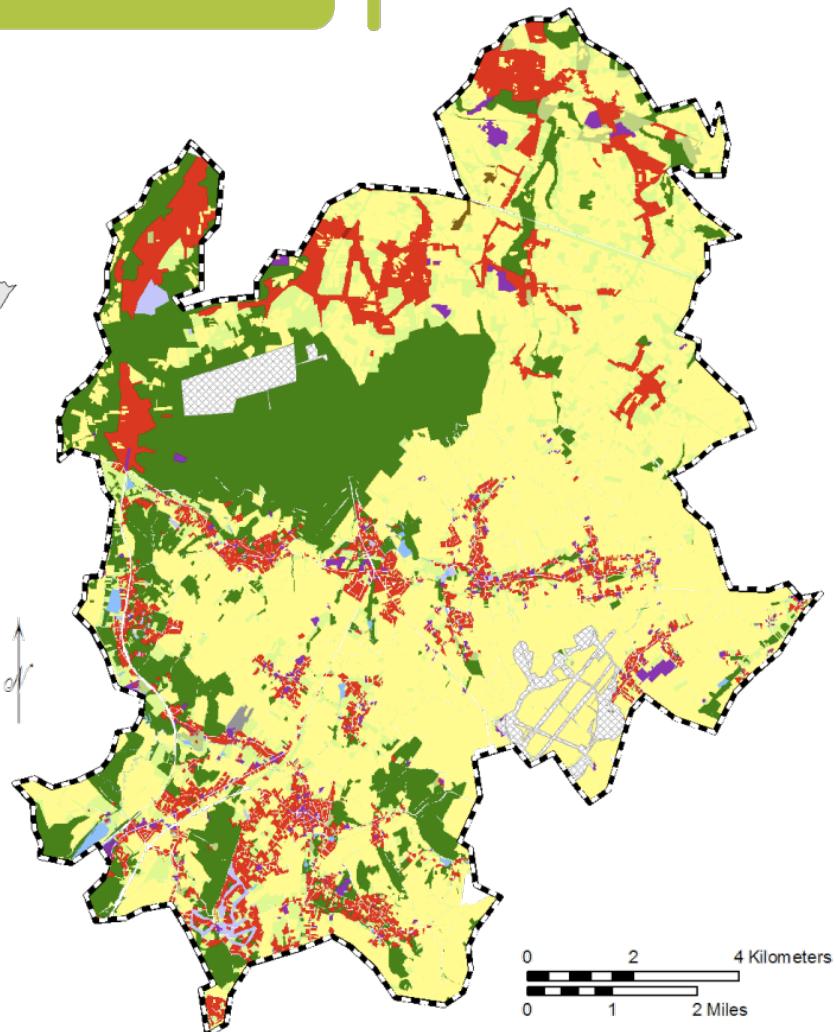
Municipalities

- in Flanders
- in Wallonia



Main Land uses

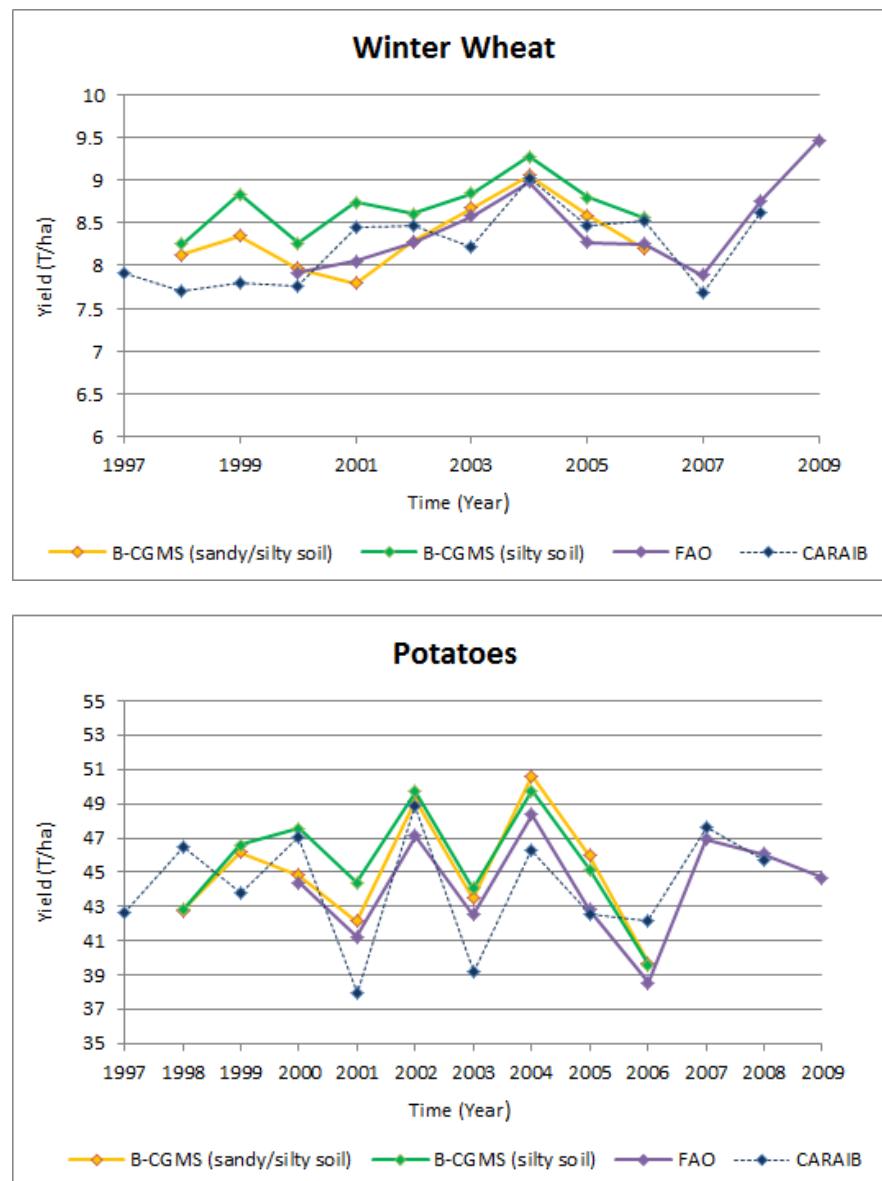
- Woodland
- Farmland
- Greenfield
- Residential areas
- Urban green area
- Economic area
- Sport and outdoor activities area
- Brownfield
- Extraction site
- Military
- Other artificial surface
- Water bodies



The main land uses in the four municipalities included in the Case Study Area for the VOTES project

Development of a crop sub-model

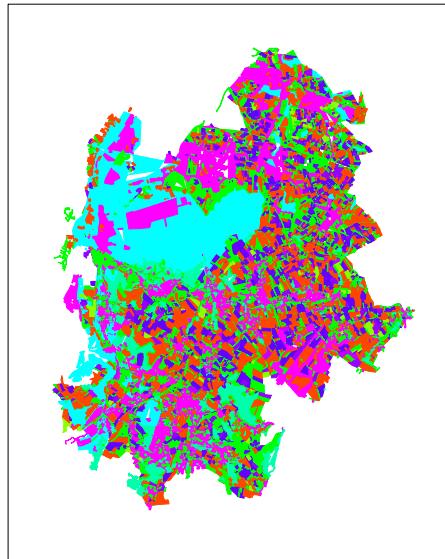
Variation of yields between 1997 and 2008 calculated by CARAIB for two crops (winter wheat and potatoes) growing in the VOTES case study area and compared to estimates from FAO and B-CGMS



Valuating Ecosystem Services

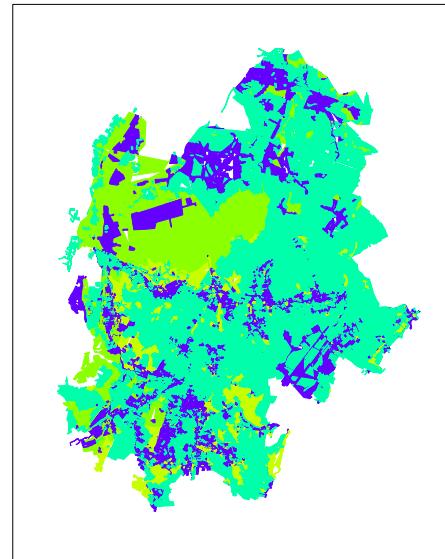
*Simulation at
plot scale*

Yield ($t \text{ ha}^{-1} \text{ yr}^{-1}$)



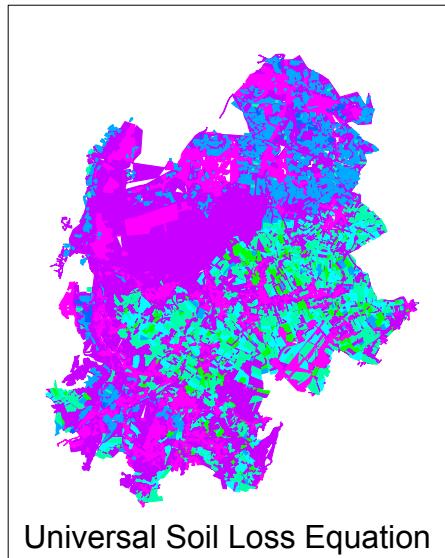
> 85.0
80.0 - 85.0
75.0 - 80.0
70.0 - 75.0
65.0 - 70.0
60.0 - 65.0
55.0 - 60.0
50.0 - 55.0
45.0 - 50.0
40.0 - 45.0
36.0 - 40.0
32.0 - 36.0
28.0 - 32.0
24.0 - 28.0
20.0 - 24.0
16.0 - 20.0
12.0 - 16.0
8.0 - 12.0
4.0 - 8.0
0.0 - 4.0
0.0

Runoff (mm/mo) [Maximum]



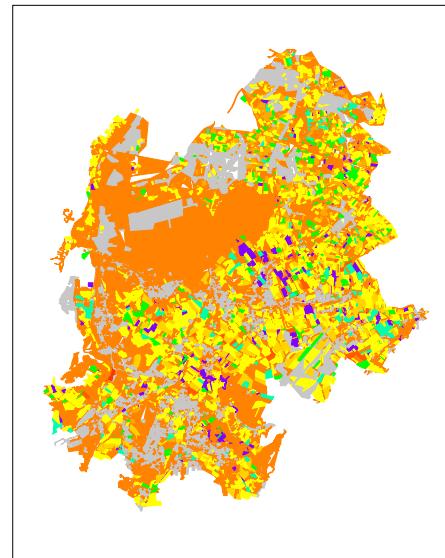
> 72
68 - 72
64 - 68
60 - 64
56 - 60
52 - 56
48 - 52
44 - 48
40 - 44
36 - 40
32 - 36
28 - 32
24 - 28
20 - 24
16 - 20
12 - 16
12

Soil loss ($t \text{ ha}^{-1} \text{ yr}^{-1}$)



> 18.0
17.0 - 18.0
16.0 - 17.0
15.0 - 16.0
14.0 - 15.0
13.0 - 14.0
12.0 - 13.0
11.0 - 12.0
10.0 - 11.0
9.0 - 10.0
8.0 - 9.0
7.0 - 8.0
6.0 - 7.0
5.0 - 6.0
4.0 - 5.0
3.0 - 4.0
2.0 - 3.0
1.0 - 2.0
0.0 - 1.0
0.0

Soil Carbon (kg C m^{-2})



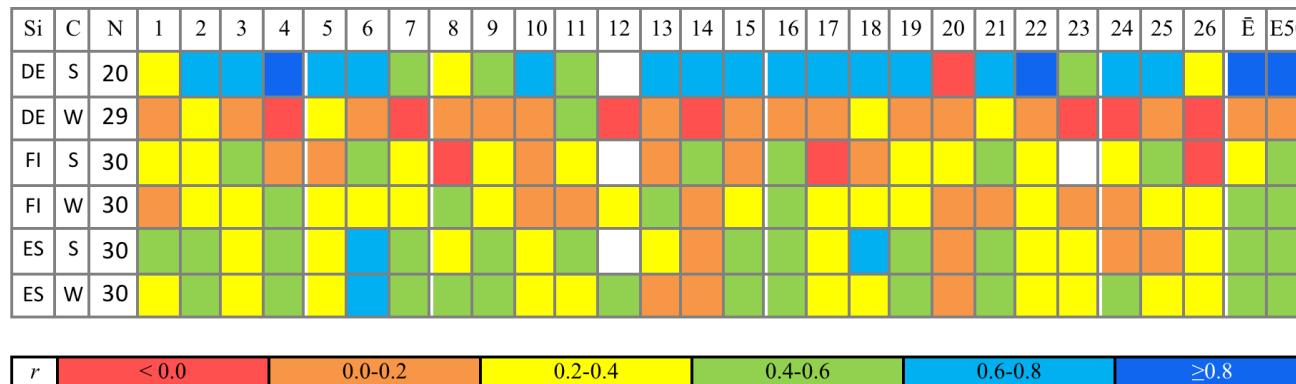
> 40.0
38.0 - 40.0
36.0 - 38.0
32.0 - 36.0
30.0 - 32.0
28.0 - 30.0
26.0 - 28.0
24.0 - 26.0
22.0 - 24.0
20.0 - 22.0
18.0 - 20.0
16.0 - 18.0
14.0 - 16.0
12.0 - 14.0
8.0 - 12.0
4.0 - 8.0
0.0 - 4.0
0.0

Universal Soil Loss Equation



FACCE-JPI – MACSUR intercomparison of crop yields

Pirttioja et al. (in prep.)



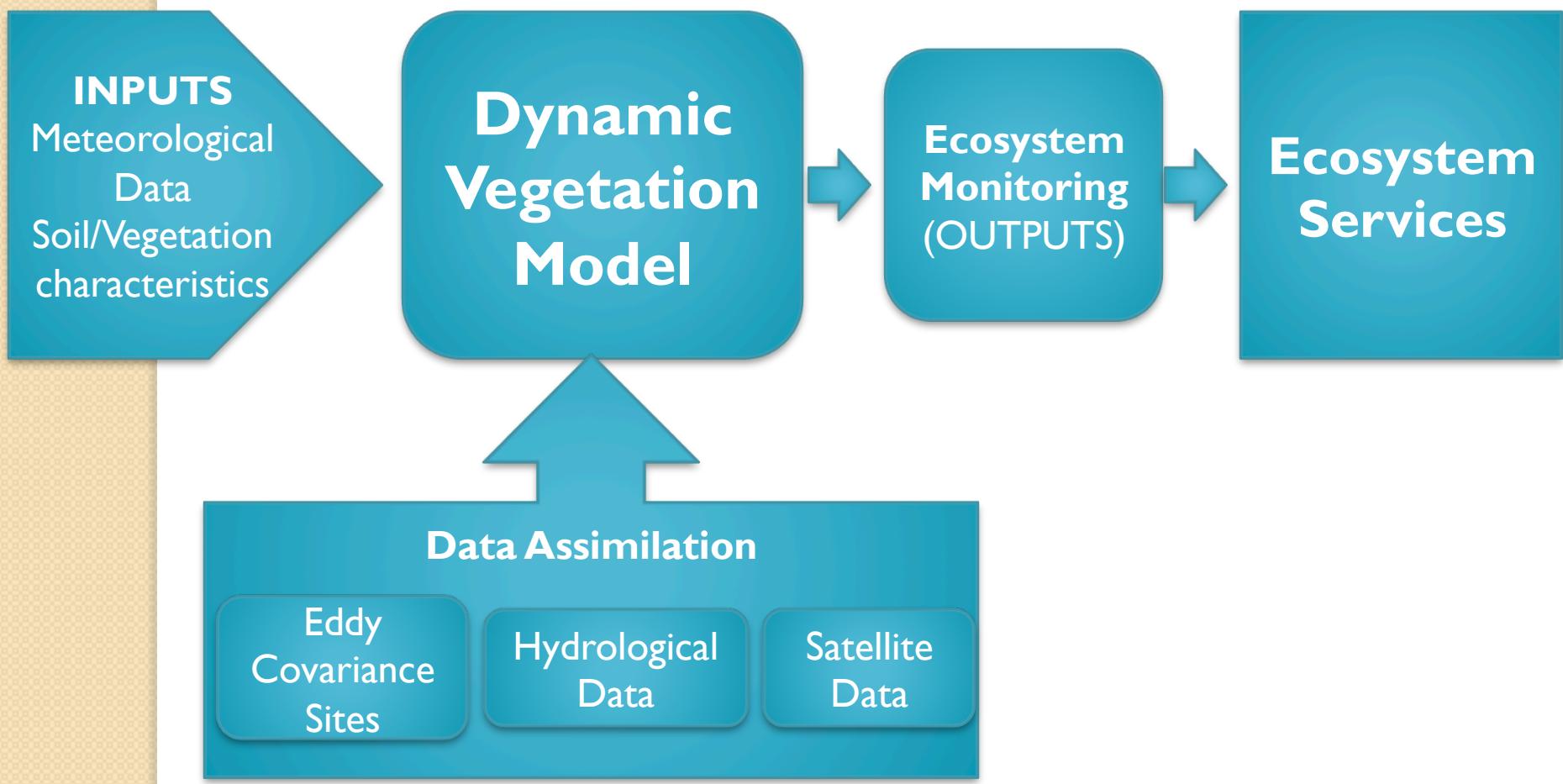
Correlation coefficients (r) for simulated versus observed yields over periods of N years during 1981-2010. Sites with spring (S) and winter (W) wheat are simulated in Germany (DE), Finland (FI) and Spain (ES) by 26 different models. Ē and E50 are the model ensemble mean and median, respectively. Colours in cells denote the magnitude of r .

ID	Model
1	AFRCWHEAT2
2	APSIM-Nwheat 1.55
3	APSIM-Wheat (modified) 7.5
4	AquaCrop 4.0
5	ARMOSA13.04
6	CARAIB Crop
7	CERES-wheat DSSAT v.4.5
8	CERES-wheat DSSAT v.4.5
9	CERES-wheat DSSAT v.4.6
10	CropSyst 3.02
11	DNDC 9.5
12	Fasset 2.5
13	HERMES V 4.26
14	LINTUL-4 v6
15	LPJ-GUESS
16	LPJml
17	MCWLA-Wheat 2.0
18	MONICA 1.2.5
19	SALUS
20	SIMPLACE<Lintul2, Slim>
21	Sirius 2010
22	SiriusQuality 2.0
23	SPACSYS 5.0
24	STICS V6.9
25	WOFOST 7.1
26	WOFOST 7.1

Conclusions and Perspectives

Towards an integrated tool for upscaling

CARAIB is a dynamic vegetation model able to represent ecosystem heterogeneity at **different scales**. It includes both **natural and crop ecosystems**. It could be used in data assimilation mode, as an **upscaling tool**, towards **monitoring of ecosystems and ecosystem services**.



Thank you