

I modelli di simulazione per la previsione del potenziale di mitigazione delle foreste

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www.forest-modelling-lab.com



Viterbo (VT) - 21/10/2021

What is climate change?

“Climate change refers to a change in the state of the climate that can be identified by changes in the mean and/or the variability of its properties and that persists for an extended period, typically decades or longer.”
(IPCC – SR15, 2018)

Causes?

ENVIRONMENTAL RESEARCH
LETTERS

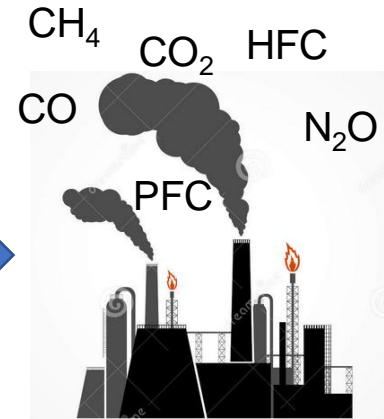
LETTER • OPEN ACCESS

Greater than 99% consensus on human caused climate change in the peer-reviewed scientific literature

Mark Lynas^{4,1}, Benjamin Z Houlton² and Simon Perry³

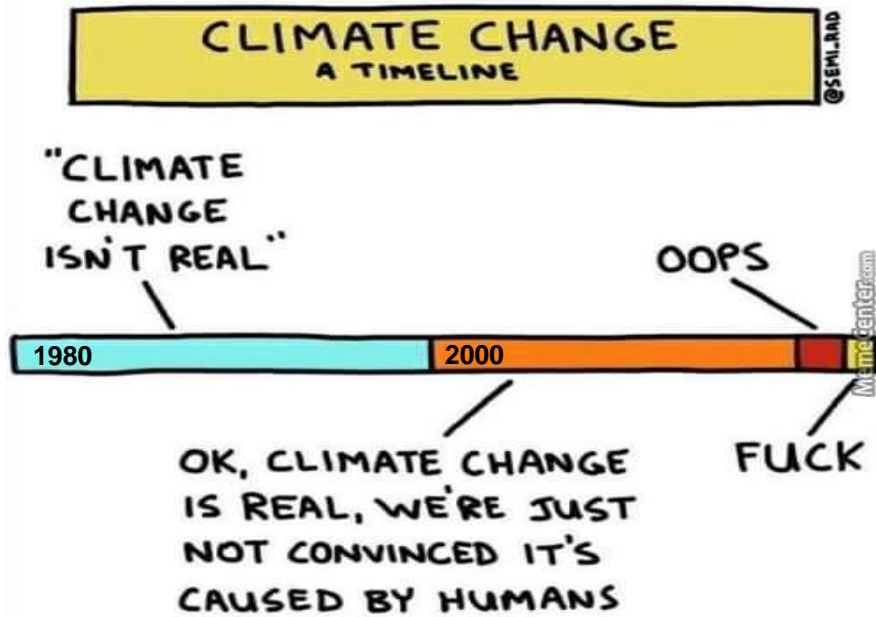
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[Environmental Research Letters, Volume 16, Number 11](#)



(not only from industries!)

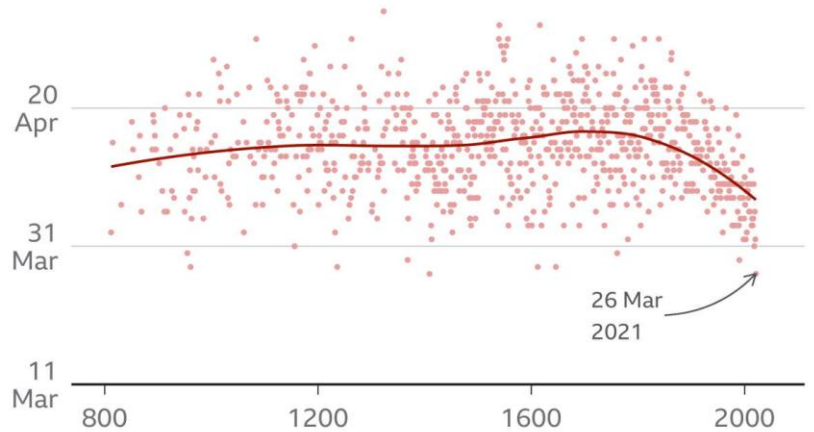
Is climate change really an evidence?



There is evidence of climate change

Cherry blossom: peak bloom day of the year

Kyoto, Japan, 812 to 2021



Source: Osaka Prefecture University

BBC



Methodologies for studying Carbon, Water and Nitrogen Cycles and Forest Dynamics

Eddy covariance



No predictive

Remote sensing



No predictive

Allometric equations and
biometric estimates



No predictive at varying site
conditions

Modelling



Predictive but highly uncertain

How (and why) study climate change and the mitigation/adaptation role of forests?



➤ MITIGATION

it acts on the **causes**, to drastically decrease the anthropogenic causes of climate warming (greenhouse gas emissions)

➤ ADAPTATION

it deals with the **effects**, i.e. the impacts that directly and indirectly affect humans and the environment

Can models deal with both??

But what is a “model”? (some definitions)

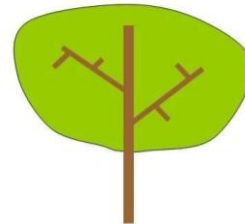
“A model is an informative representation of an object, person or system “
(Wikipedia 2021)

“A model can be considered as a synthesis of the knowledge elements of a system”
(Jørgensen 1997)

“Models are simplified representations of the real world”
(Wainwright and Mulligan 2004)



REALTÀ



MODELLO MATEMATICO

In its extreme essence a model is a tool:

(1) to describe a system (dynamic or not),

(2) to make useful predictions and

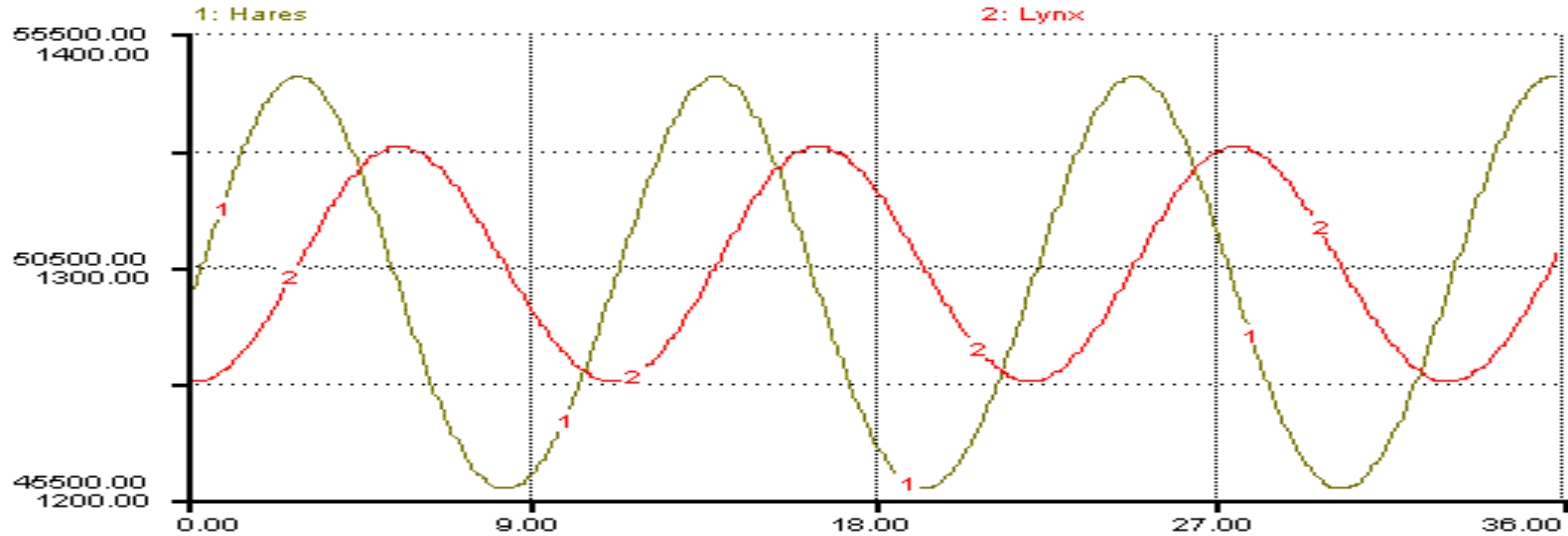
(3) to test hypotheses

(we will see same examples later)



The first and potentially the most known model...

The Lotka-Volterra model (1925) (aka “the Predator-Prey model”)



Growth rate for species 1

$$\frac{dN_1}{dt} = r_1 N_1 \left(1 - \frac{N_1}{K_1} - \frac{\alpha_{12} N_2}{K_1} \right)$$

Growth rate for species 2

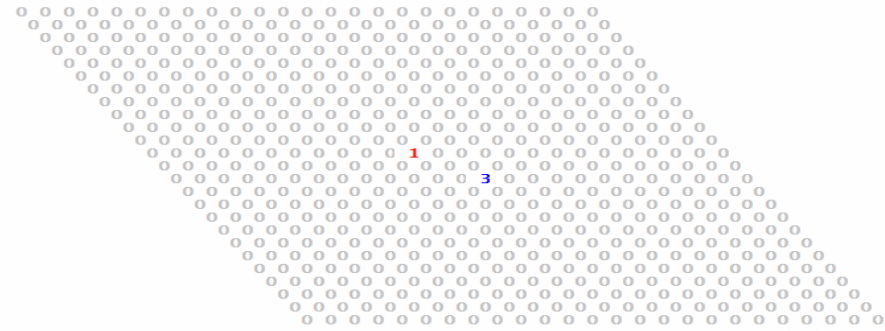
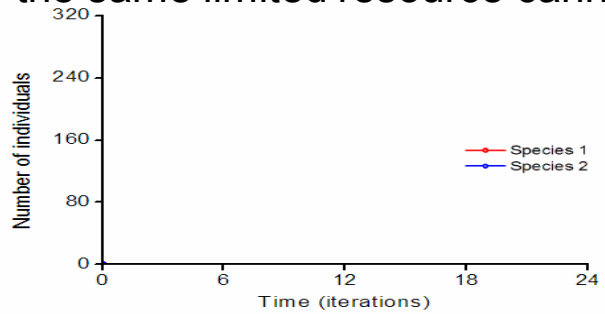
$$\frac{dN_2}{dt} = r_2 N_2 \left(1 - \frac{N_2}{K_2} - \frac{\alpha_{21} N_1}{K_2} \right)$$

System of derivatives

... a example of ecological model:

“The competitive exclusion principle” (aka Gause’s law):

“two species competing for the same limited resource cannot coexist at constant population values”



Cellular automaton model of interspecific competition for a single limited resource

Number of iterations: 0
 Number of red individuals of the species 1: 1
 Number of blue individuals of the species 2: 1

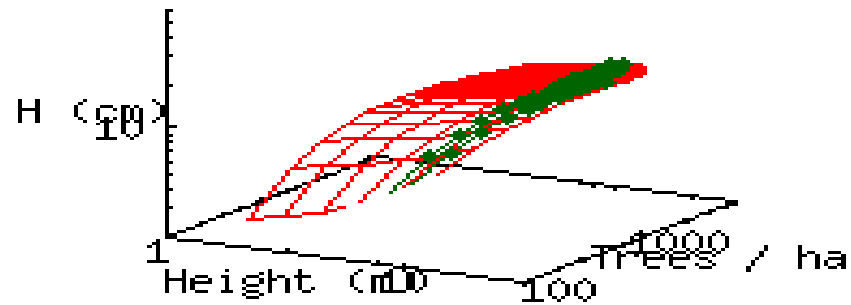
Lev Kalmykov, Vyacheslav Kalmykov. Verification and reformulation of the competitive exclusion principle. *Chaos, Solitons & Fractals* 56, 124-131, doi:10.1016/j.chaos.2013.07.006 (2013).



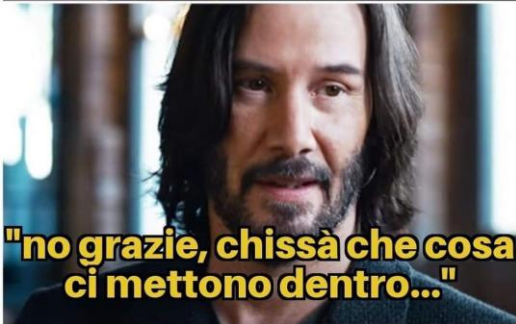
When one species has even the slightest advantage over another, the one with the advantage will dominate in the long term. This leads either to the extinction of the weaker competitor or to an evolutionary or behavioral shift toward a different ecological niche.

but there are, of course, also models in forestry:

DBH vs. Tree Height vs. Stand Density



What's inside a model?



"no grazie, chissà che cosa ci mettono dentro..."

Basically, a model is an equation or a chain of equations to describe something:

$$ASW = ASW - \Delta ASW$$

$$A = \Delta ASW = P \times \left(1 - \sum_{z=\text{layer index}}^N i_{R_{x,y,k}} \right) - \left(\sum_{z=\text{layer index}}^N i_{T_{x,y,k}} + E_s \right)$$

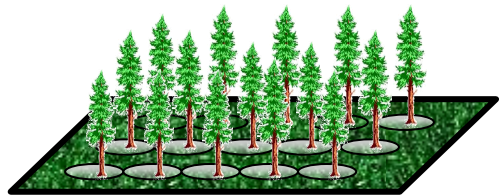
$$a_{s_{x,y,z,k}} = \frac{1}{1 + \omega_{x,y,k,z} (2 - L_{x,y,k,z} - f_{SW_{x,y,k,z}})}$$

$$a_{R_{x,y,z,k}} = \frac{\varepsilon_{R_x} + \omega_x (1 - f_{SW_{x,y,k,z}})}{1 + \omega_{x,y,k,z} (2 - L_{x,y,k,z} - f_{SW_{x,y,z,k}})}$$

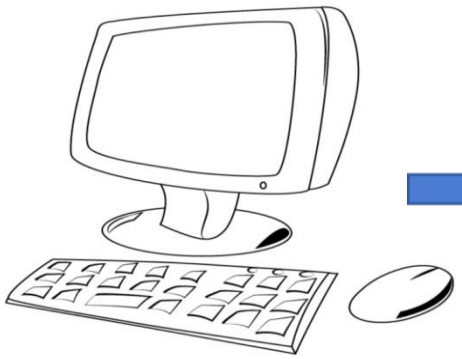
$$a_{L_{x,y,z,k}} = \frac{1}{1 + F_{AGE}} = \frac{1}{1 + \left(\frac{age}{r_{age} \cdot age_{max}} \right)^{n_{age}}}$$

$$e = \frac{s * RAD + \left(\frac{r}{r_{HR}} \right)}{\left(\frac{\rho * c_p * r_V}{AirPa * \varepsilon * r_{HR}} \right) + s} \cdot 3 * 10^5 * \exp(36(T - 25)/(298R(T + 273)))$$

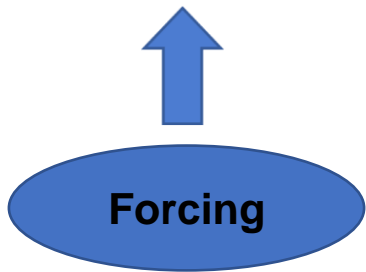
...and in practice



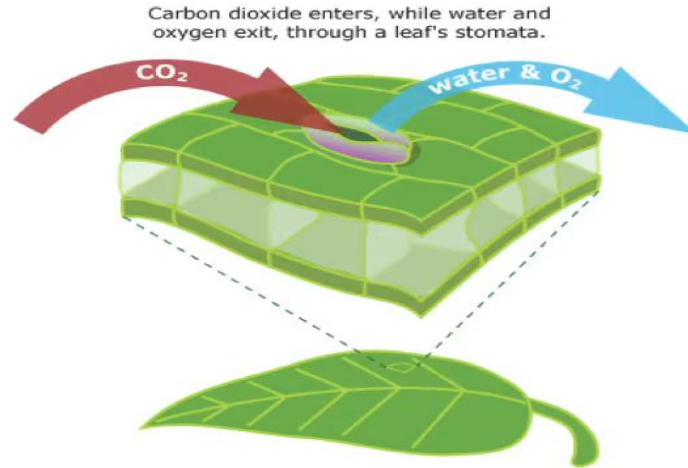
System at initial state



System at final state



Modelling means breaking down and representing the system in its main processes happening at different temporal and spatial scale



(e.g. *photosynthesis and stomatal transpiration*)

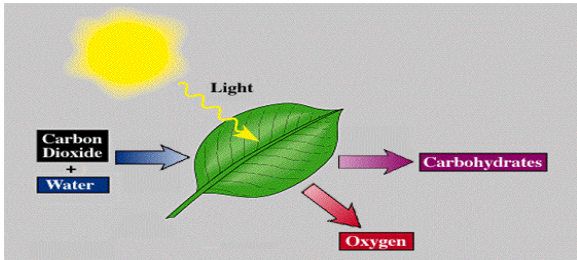
The scales

Spatial

Temporal



The spatial scale

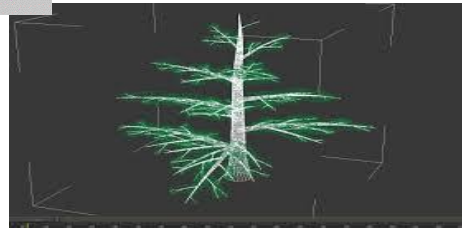


$$a_{S_{x,y,z,k}} = \frac{\epsilon_{Sx} + \omega_x(1 - L_{x,y,k,z})}{1 + \omega_{x,y,k,z}(2 - L_{x,y,k,z} - f_{SW_{x,y,k,z}})}$$

$$a_{R_{x,y,z,k}} = \frac{\epsilon_{Rx} + \omega_x(1 - f_{SW_{x,y,k,z}})}{1 + \omega_{x,y,k,z}(2 - L_{x,y,k,z} - f_{SW_{x,y,k,z}})}$$

$$a_{L_{x,y,z,k}} = \frac{\epsilon_{Lx}}{1 + \omega_x(2 - L_{x,y,z,k} - f_{SW_{x,y,z,k}})} = 1 - a_{R_{x,y,z,k}} - a_{S_{x,y,z,k}}$$

Cellular/Leaf level



$$A = \min\{A_v, A_j\} - MR_{leaf_{day}}$$

$$A_v = \frac{V_c \max(C_i - \Gamma^*)}{C_i + K_c \left(1 + \frac{O_2}{K_o}\right)}$$

$$A_j = \frac{J(C_i - \Gamma^*)}{4.5C_i + 10.5 *}$$

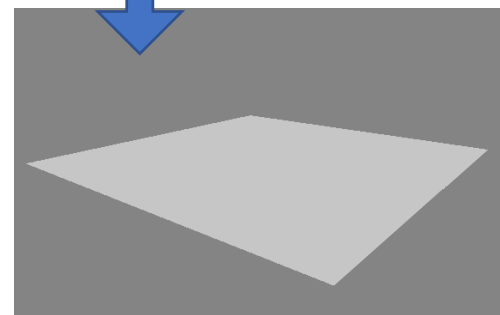
$$F_{AGE} = \frac{1}{1 + (age/r_{age} \text{ age}_{max})^{n_{age}}}$$

Canopy/Tree level



$$e = \frac{s * RAD + \left(\frac{\rho * c_p * VPD}{r_{HR}}\right)}{\left(\frac{\rho * c_p * r_V}{AirPa * \epsilon * r_{HR}}\right) + s}$$

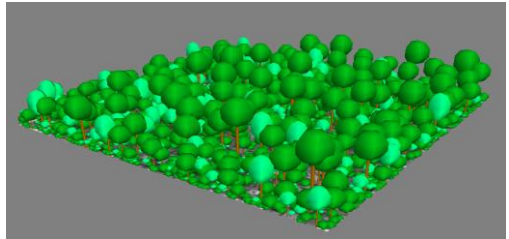
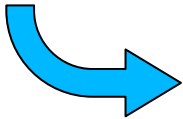
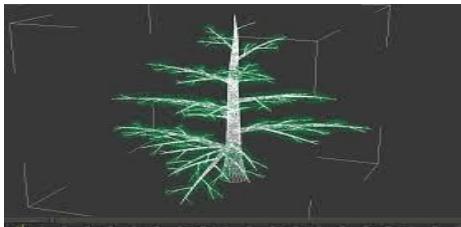
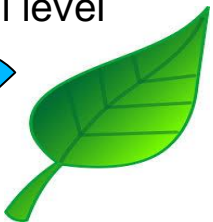
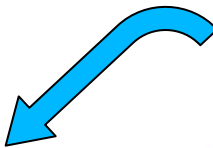
Big tree level



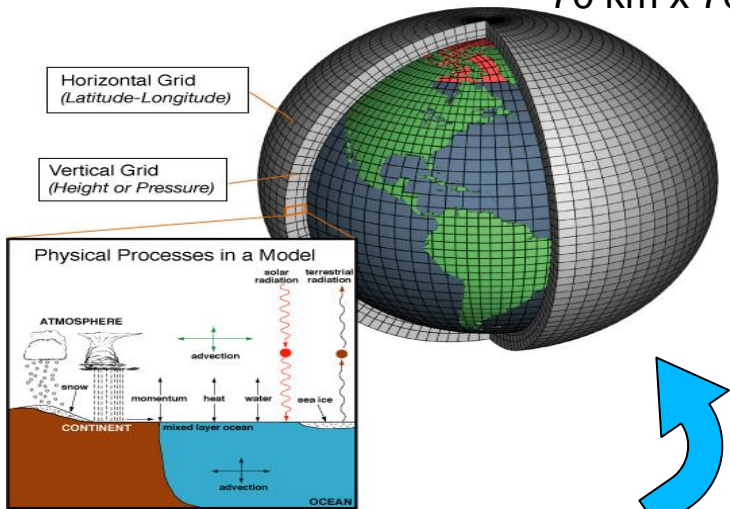
Stand level

The spatial scale

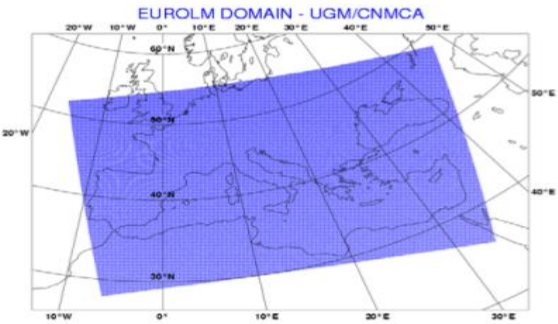
Cell level



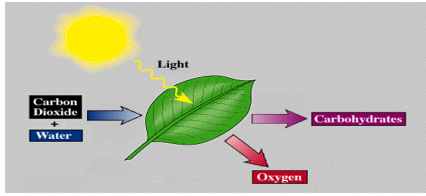
70 km x 70 km



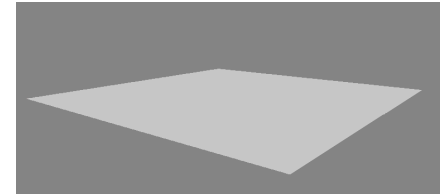
From single cell to 70 km x 70 km



The temporal scale



Semi-hourly
(e.g. photosynthesis)

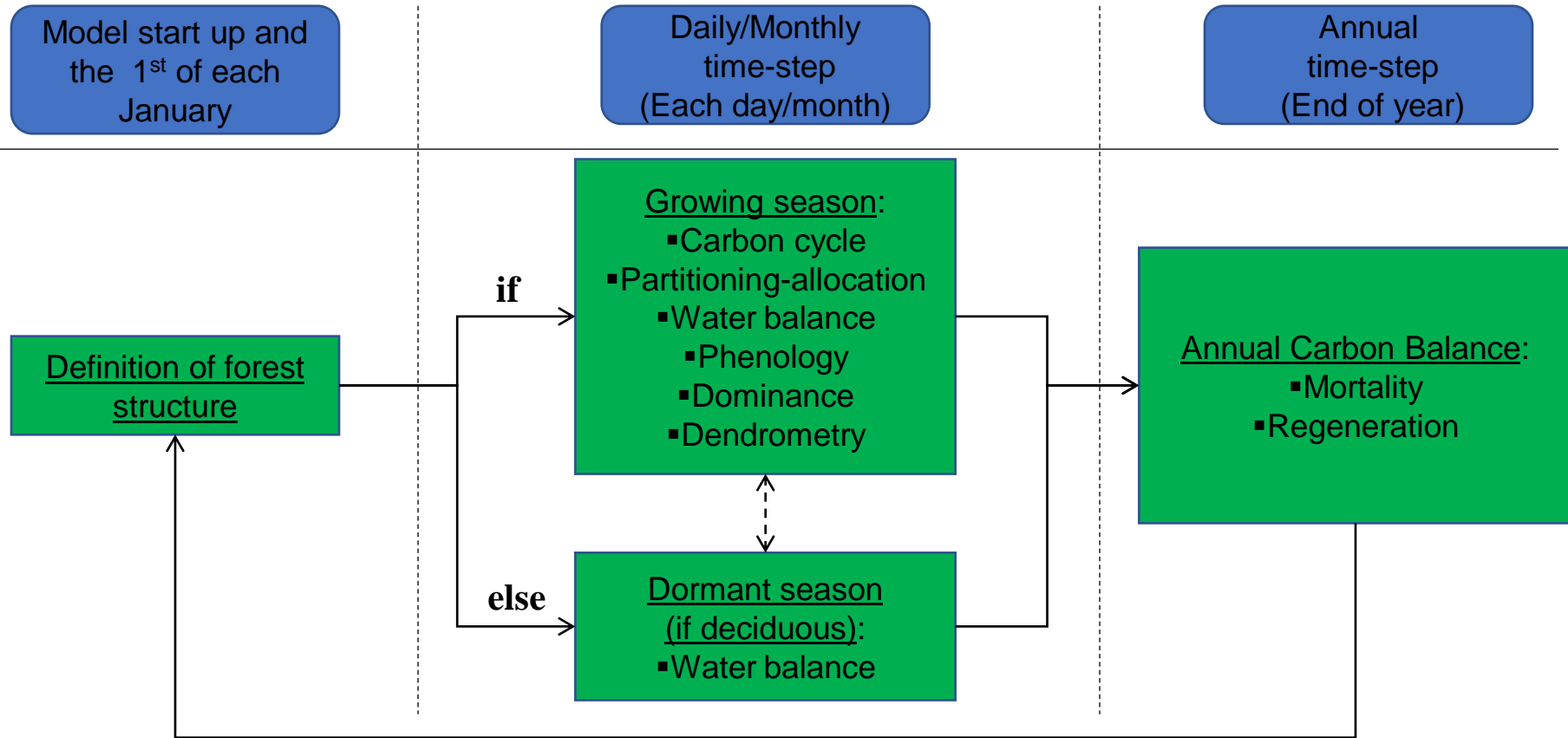


Multi-decadal
(e.g. forest succession)

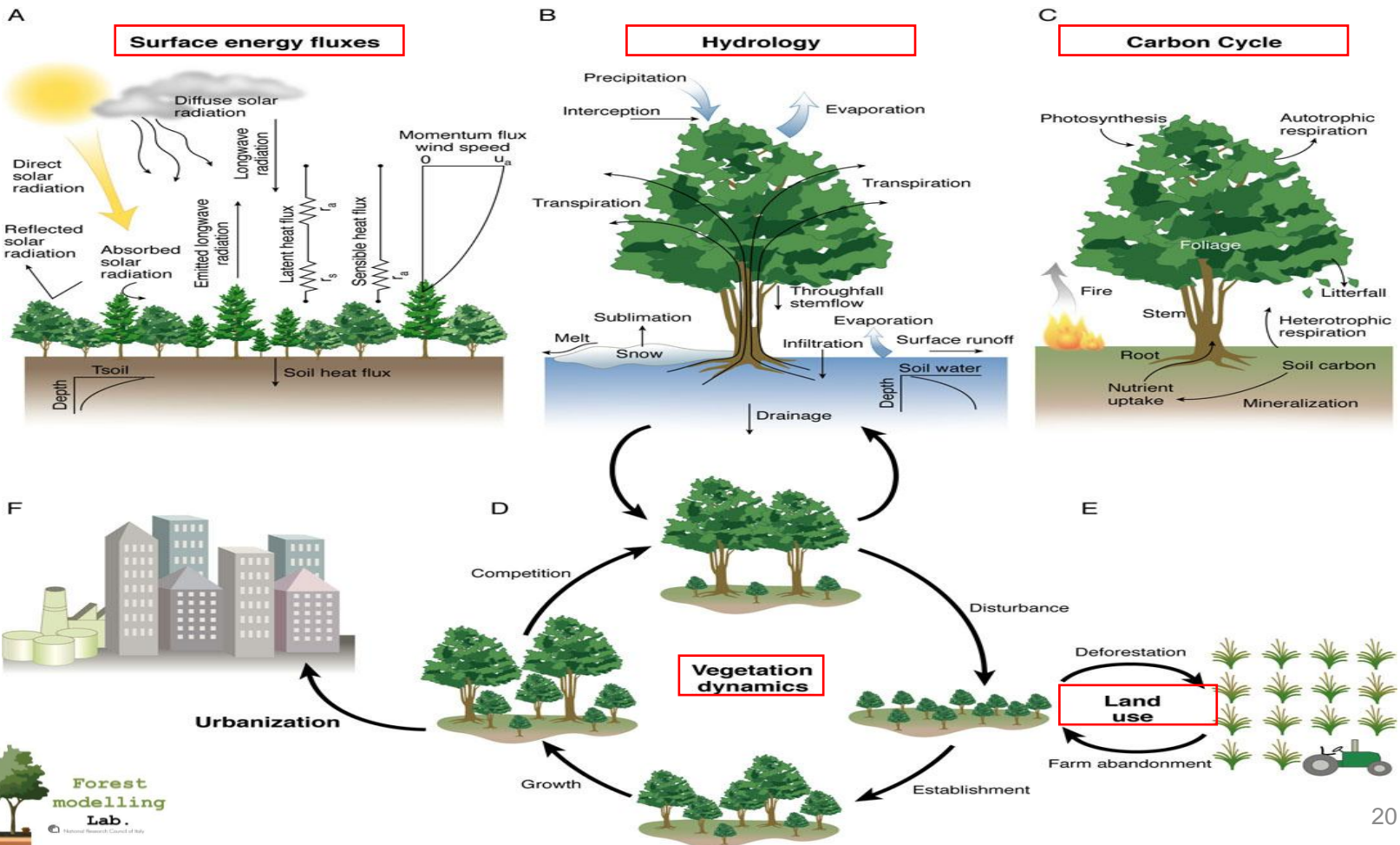


Different temporal representations for different processes
(e.g. radiative fluxes, water fluxes, carbon allocation)

How to simulate forest dynamic temporally

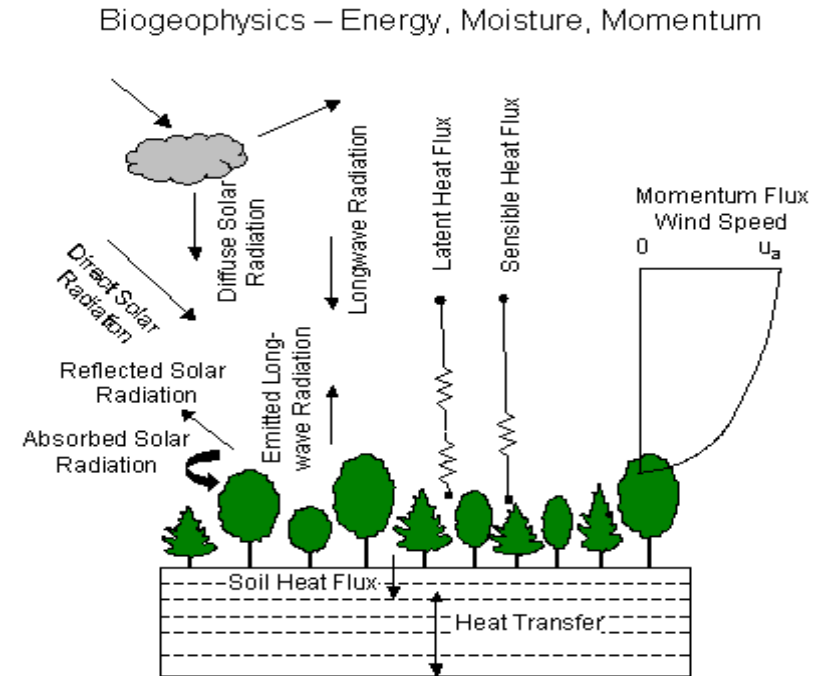


The main processes represented in vegetation models



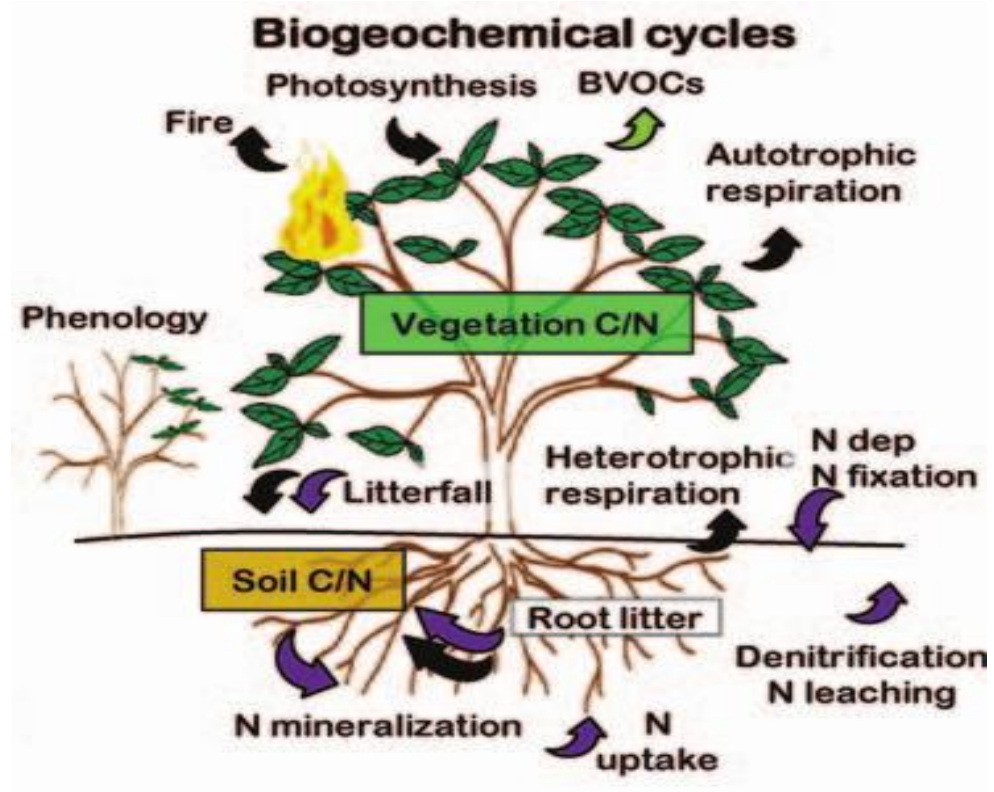
The main processes represented in vegetation models – Biophysical processes

- SURFACE ALBEDOS
- Canopy radiative transfer
- Ground albedos
- Solar zenith angle
- RADIATIVE TRANSFER
- Solar fluxes
- Longwave fluxes
- SENSIBLE HEAT AND LATENT HEAT FLUXES
- Sensible and latent heat fluxes for vegetated and not
- Saturation vapor pressure
- SOIL AND SNOW TEMPERATURE

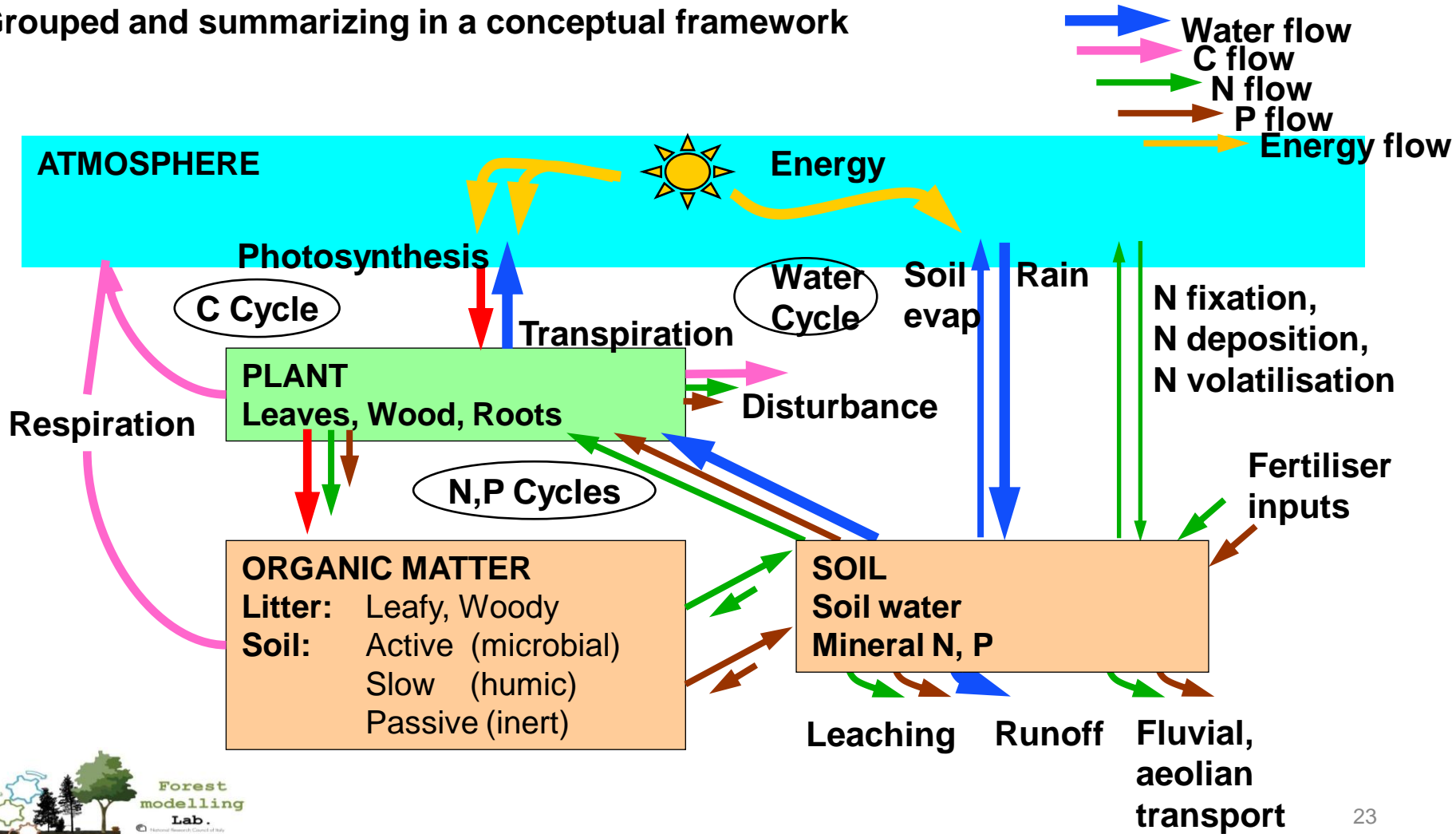


The main processes represented in vegetation models – Biogeochemical processes

- CANOPY PHOTOSYNTHESIS
- AUTOTROPHIC RESPIRATION
- Heterotrophic respiration
- C-N ALLOCATION
- PHENOLOGY
- Fire and mortality
- Vegetation structure
- Litterfall
- “CARBON CYCLE”
- “NITROGEN CYCLES”



Grouped and summarizing in a conceptual framework



A simple model in vegetation science. How to simulate a process (e.g. photosynthesis)

The process: photosynthesis.

Observations (roughly) say: *photosynthesis increases linearly at increasing absorbed light and is limited by environment*

$$\text{GPP} = \alpha_X * \text{environment} * \text{PAR} * (1 - e^{-K + \text{LAI}})$$

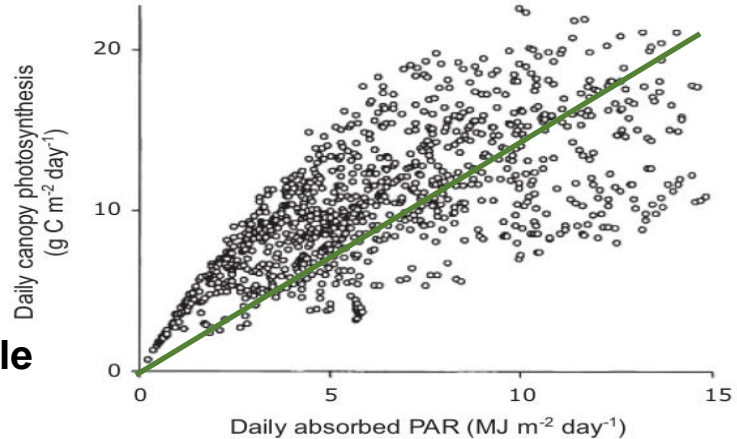
Parameter (green arrow pointing to α_X)

Driver/forcing (red arrows pointing to environment and PAR)

Constant (blue arrow pointing to $-K$)

Variable (yellow arrow pointing to LAI)

Waring et al. (2016), Tamm Review



GPP = photosynthesis

α_X = maximum canopy quantum efficiency (optimum photosynthesis *per* absorbed PAR)

PAR = Photosynthetically Active Radiation

LAI = Leaf Area Index

K = coefficient of extinction

Environment = environmental modifiers (0–1) that limit optimum photosynthesis



A simple model in vegetation science. How to simulate a process (e.g. productivity)

The process: productivity.

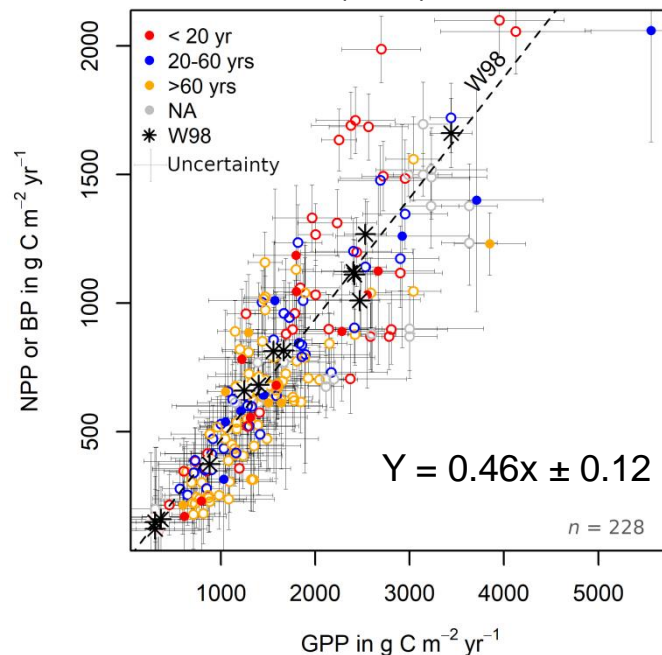
Observations (roughly) say: the existence of pervasive acclimation mechanisms that tend to stabilize the NPP:GPP ratio

$$\text{NPP} = \text{GPP} * \text{Y}$$

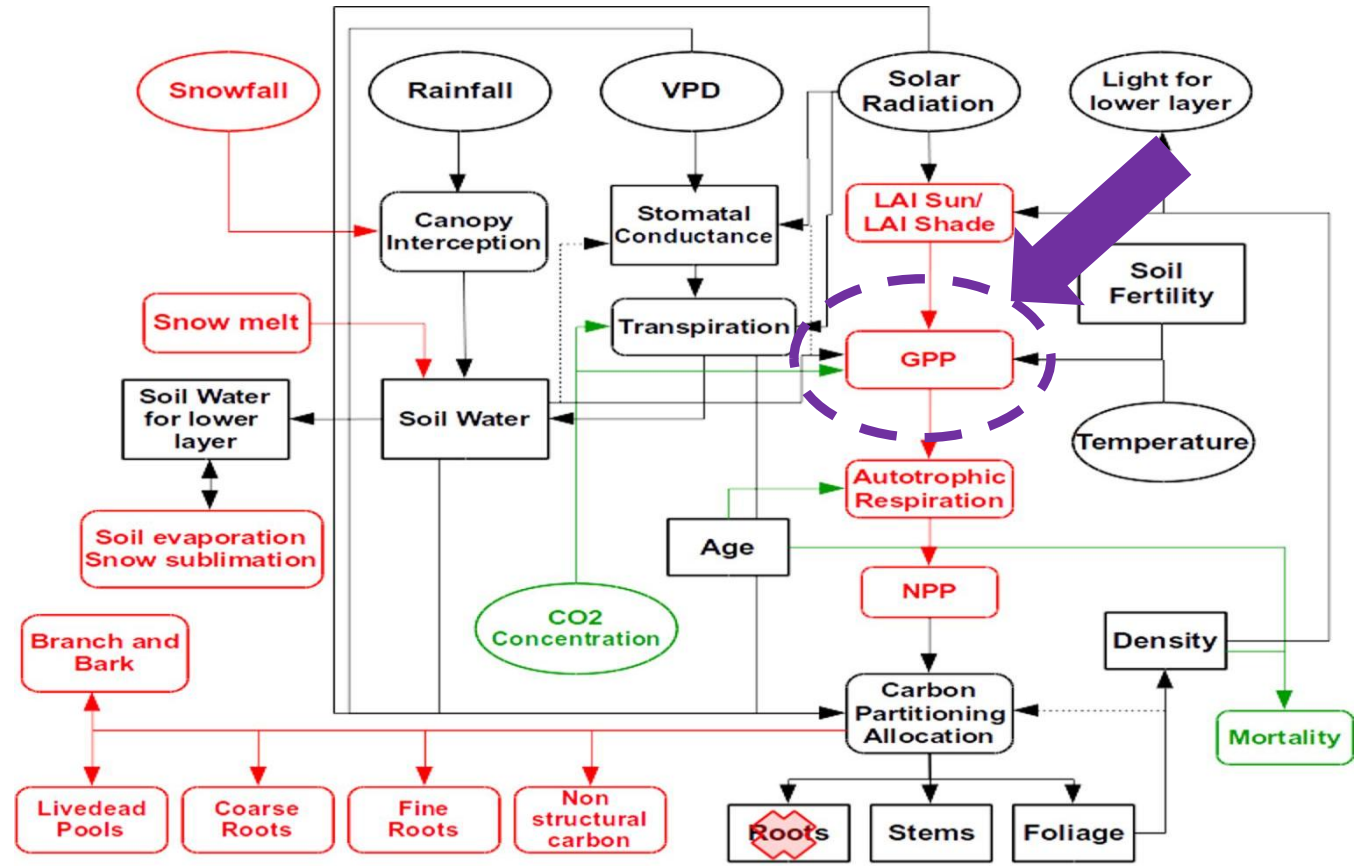
Variable Constant

NPP= Net Primary Production
Y = coefficient of extinction

Collalti et al. (2020), Nature Comm.



A complex model in vegetation science. How to simulate all process



...and models and codes can become very complex....

Margaret Hamilton , computer scientist,
director of the Software Engineering Division
of the MIT Instrumentation Laboratory, which
developed on-board flight software for
NASA's Apollo program



...but more practically the GPP (a code)

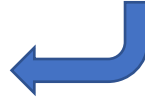
```
14 void photosynthesis_LUE(cell_t *const c, const int layer, const int height, const int dbh, const int age, const int species, const meteo_annual_t *const meteo_annual)
15 {
16     double Alpha_C;
17     double Epsilon_C;
18     double GPPmolC;
19     double GPP_sun_molC;
20     double GPP_shade_molC;
21     double Lue;
22     double Lue_max;
23     double Lue_sun;
24     double Lue_sun_max;
25     double Lue_shade;
26     double Lue_shade_max;
27
28     species_t *s;
29     s = &c->heights[height].dbhs[dbh].ages[age].species[species];
30
31     /*-----*/
32
33     if ( s->value[ALPHA] != NO_DATA )
34     {
35         /* compute actual light use efficiency from potential one */
36         //FIXME use or not s->value[F_CO2_TR]??????
37         Alpha_C = s->value[ALPHA] * s->value[F_CO2] * s->value[F_NUTR] * s->value[F_T] * s->value[PHYS_MOD] /* * s->value[F_CO2_TR] */;
38
39         /* molC/molPAR/m2/day --> gC/MJ/m2/day */
40         Epsilon_C = Alpha_C * MOLPAR_MJ * GC_MOL;
41     }
42     else
43     {
44         /* compute actual light use efficiency from potential one */
45         //FIXME use or not s->value[F_CO2_TR]??????
46         Epsilon_C = s->value[EPSILONgCMJ] * s->value[F_CO2] * s->value[F_NUTR] * s->value[F_T] * s->value[PHYS_MOD] /* * s->value[F_CO2_TR] */;
47
48         s->value[ALPHA] = s->value[EPSILONgCMJ] / (MOLPAR_MJ * GC_MOL);
49
50         /* gC/MJ/m2/day --> molC/molPAR/m2/day */
51         Alpha_C = Epsilon_C / (MOLPAR_MJ * GC_MOL);
52     }
53
54     /* note: special case when fSW <= WATER_STRESS_LIMIT for coupling with canopy transpiration */
55     /* to be fixed once */
56     if ( s->value[F_SW] <= WATER_STRESS_LIMIT )
57     {
58         if ( ! s->value[CANOPY_TRANSP] )
59         {
60             Alpha_C = 0.;
61         }
62         else
63         {
64             Alpha_C *= s->value[F_SW];
65         }
66     }
67 }
```



...but more practically (some model inputs)

```
Year, x, y, Age, Species, Management, N, Stool, AvDBH, Height
1950, 0, 0, 29, Fagussylvatica, T, 1326, 0, 5.961357466, 8.814479638
```

Stand data
for model initialization



```
X, Y, LANDUSE, LAT, LON, CLAY PERC, SILT PERC, SAND PERC, SOIL DEPTH, FR, FN0, FNN, M0, LITTERC
0, 0, F, 55.29, 11.38, 15.33, 21.59, 63.08, 180, 0.90, 0.5, 0.5, 0.2, -9999, -9999, -9999, -9999, -
```

Year	Month	n_days	Rg_f	Ta_f	Tmax	Tmin	RH_f	Ts_f	Precip	SWC	LAI	ET	WS_f
1996	1	1	1.011096	-3.6090625	-3.302	-4.086	93.6399526015545	-9999	1.332	-9999			
1996	1	2	1.0734138	-3.331708333333333	-2.63	-3.723	90.3779847933055	-9999	1.13	-9999			
1996	1	3	1.4199408	-5.3066875	-3.492	-6.291	99.2751001746145	-9999	0.032	-9999			
1996	1	4	1.5142032	-6.815020833333333	-6.18	-7.298	99.7222269427755	-9999	0	-9999			
1996	1	5	1.3848732	-4.58025	-2.718	-6.599	98.1872053425175	-9999	0.291	-9999			
1996	1	6	1.2437874	-2.4601875	-1.469	-2.993	95.4609050296131	-9999	1.118	-9999			
1996	1	7	0.6736788	-1.724375	1.154	-3.356	94.7818497205114	-9999	2.373	-9999			
1996	1	8	1.583577	0.2525625	1.565	-0.911	100	-9999	0.906	-9999			
1996	1	9	0.8853246	-0.02877083333333333	0.503	-0.553	100	-9999	0.474	-9999			
1996	1	10	0.5837922	-0.6285416666666667	0.331	-1.098	100	-9999	0.804	-9999			
1996	1	11	0.8660754	-0.5542083333333333	-0.068	-0.967	100	-9999	1.092	-9999			
1996	1	12	0.6812334	0.1785416666666667	0.731	-0.333	99.9784985124904	-9999	0.969	-9999			
1996	1	13	1.8782874	0.9939791666666667	2.341	-0.122	99.6951326527565	-9999	0.833	-9999			
1996	1	14	1.6573896	-0.5615208333333333	1.371	-1.415	100	-9999	0.295	-9999			
1996	1	15	1.2636	-2.434666666666667	-1.468	-2.884	100	-9999	0.545	-9999			
1996	1	16	1.0278684	-2.7741875	-2.341	-3.236	100	-9999	0.522	-9999			
1996	1	17	0.6174108	-2.302979166666667	-2.059	-2.661	100	-9999	0.4	-9999			
1996	1	18	1.1812914	-2.0171458333333333	-1.443	-2.544	100	-9999	0.515	-9999			
1996	1	19	1.3088088	-1.6066875	-0.724	-2.72	100	-9999	0.786	-9999			
1996	1	20	2.2823964	-2.5606875	-1.34	-3.6	90.4072451907435	-9999	0.728	-9999			
1996	1	21	2.1834018	-2.7654375	-2.265	-3.224	86.5034915790072	-9999	0.637	-9999			
1996	1	22	2.281104	-3.4424375	-2.481	-4.566	90.1515955744099	-9999	0.753	-9999			
1996	1	23	2.3972112	-5.200083333333333	-4.615	-5.805	94.265959601704	-9999	0.796	-9999			
1996	1	24	2.3097006	-5.1308125	-4.634	-5.77	94.0612062814829	-9999	0.89	-9999			
1996	1	25	2.2666446	-4.963229166666667	-4.443	-5.717	85.415256828771	-9999	2.428	-9999			
1996	1	26	2.4256368	-4.837541666666667	-3.634	-6.285	85.3798298986317	-9999	1.974	-9999			
1996	1	27	3.5293662	-4.072645833333333	-3.344	-5.031	89.21212150099884	-9999	0.256	-9999			
1996	1	28	3.7351908	-6.225583333333333	-5.098	-7.232	100	-9999	0	-9999			
1996	1	29	3.573513	-5.643229166666667	-4.296	-7.248	100	-9999	0	-9999			
1996	1	30	2.7856098	-4.234229166666667	-3.258	-4.93	100	-9999	0.199	-9999			
1996	1	31	2.8225296	-5.129958333333333	-4.656	-5.515	98.2368807949429	-9999	0.293	-9999			
1996	2	1	3.913029	-6.175104166666667	-5.163	-7.516	99.8886247872708	-9999	0.048	-9999			
1996	2	2	2.6451648	-6.824604166666667	-5.346	-7.825	99.8809831068128	-9999	0.47	-9999			

Climate forcing data



but more practically (some model inputs)...

```
1 //Fagus sylvatica parameterization file
2 LIGHT_TOL 1 //4 = very shade intolerant (cc = 90%), 3 = sh
3 PHENOLOGY 0.1 //PHENOLOGY 0.1 = deciduous broadleaf, 0.2 = d
4 ALPHA 0.057 //Canopy quantum efficiency (molC/molPAR) (0.0
5 EPSILONGCMJ 0.69 //Light Use Efficiency (gC/MJ)(used if ALPHA
6 GAMMA_LIGHT 0 //Empirical parameter for Light modifiers
7 K 0.5 //Extinction coefficient for absorption of PAR
8 ALBEDO 0.15 //Albedo, 0.15 (varying from 0.13-0.17) from 0
9 INT_COEFF 0.3 //precip interception coefficient for F. sylv
10 SLA_AVG0 40 //Average Specific Leaf Area m^2/KgDM (juvenil
11 SLA_AVG1 20 //Average Specific Leaf Area m^2/KgDM (mature)
12 TSLA 35 //Age at which SLA_AVG = (SLA_AVG1 + SLA_AVG0
13 SLA_RATIO 2.3 //(DIM) ratio of shaded to sunlit projected SL
14 LAI_RATIO 2 //(DIM) all-sided to projected leaf area ratio
15 FRACBB0 0.20 //Branch and Bark fraction at age 0
16 FRACBB1 0.125 //Branch and Bark fraction for mature stands (
17 TBB 20 //Age at which fracBB = (FRACBB0 + FRACBB1) /
18 RH00 0.64 //Minimum Basic Density for young Trees tDM/m^
19 RH01 0.64 //Maximum Basic Density for young Trees tDM/m^
20 TRHO 100 //Age at which rho = (RHOMIN + RHOMAX) /2
21 FORM_FACTOR 0.433 //Form factor Seidl et al., 2012
22 COEFFCOND 0.08 //Define stomatal response to VPD in mbar see
23 BLCOND 0.01 //Canopy Boundary Layer conductance see 0.01 f
24 MAXCOND 0.003 //Maximum Stomatal Conductance in m/sec 0.005
25 CUTCOND 6e-05 //Cuticular conductance in m/sec for F sylvati
26 MAXAGE 400 //Determines rate of "physiological decline" o
27 RAGE 0.95 //Relative Age to give fAGE = 0.5
28 NAGE 10 //Power of relative Age in function for Age
29 GROWTHMIN 0 //Minimum temperature for growth 5 Rasse et a
30 GROWTHMAX 40 //Maximum temperature for growth 40 from Willi
31 GROWTHOPT 20 //Optimum temperature for growth 19.4 Rasse et
32 GROWTHSTART 60 //(5 °C)average temperature or (GDD) thermic s
33 MINDAYLENGTH 12 //minimum day length for fagus from etto
34 SWPOPEN -0.34 //Leaf water potential: start of reduction for
35 SWPCLOSE -2.2 //Leaf water potential: complete reduction for
36 OMEGA_CTEM 0.8 //ALLOCATION PARAMETER control the sensitivity
37 SOCTEM 0.10 //0.35 //PARAMETER CONTROLLING ALLOCATION TO S
38 ROCTEM 0.55 //0.35 //PARAMETER CONTROLLING ALLOCATION TO R
39 FOCTEM 0.35 //PARAMETER CONTROLLING ALLOCATION TO LEAVES s
40 FRUIT_PERC 0.2 //fraction of NPP allocated for reproduction d
41 CONES_LIFE_SPAN 0 //Life span for cones (yr)
42 FINE_ROOT_LEAF 1.2 //allocation new fine root C:new leaf (ratio)
43 STEM_LEAF 3.8 //allocation new stem C:new leaf (ratio) 3.8 p
44 COARSE_ROOT_STEM 0.36 //allocation new coarse root C:new stem (ratio)
45 LIVE_TOTAL_WOOD 0.13 //new live C:new total wood (ratio) 0.15 for d
```

Species-specific parameters
(species ecophys. traits)

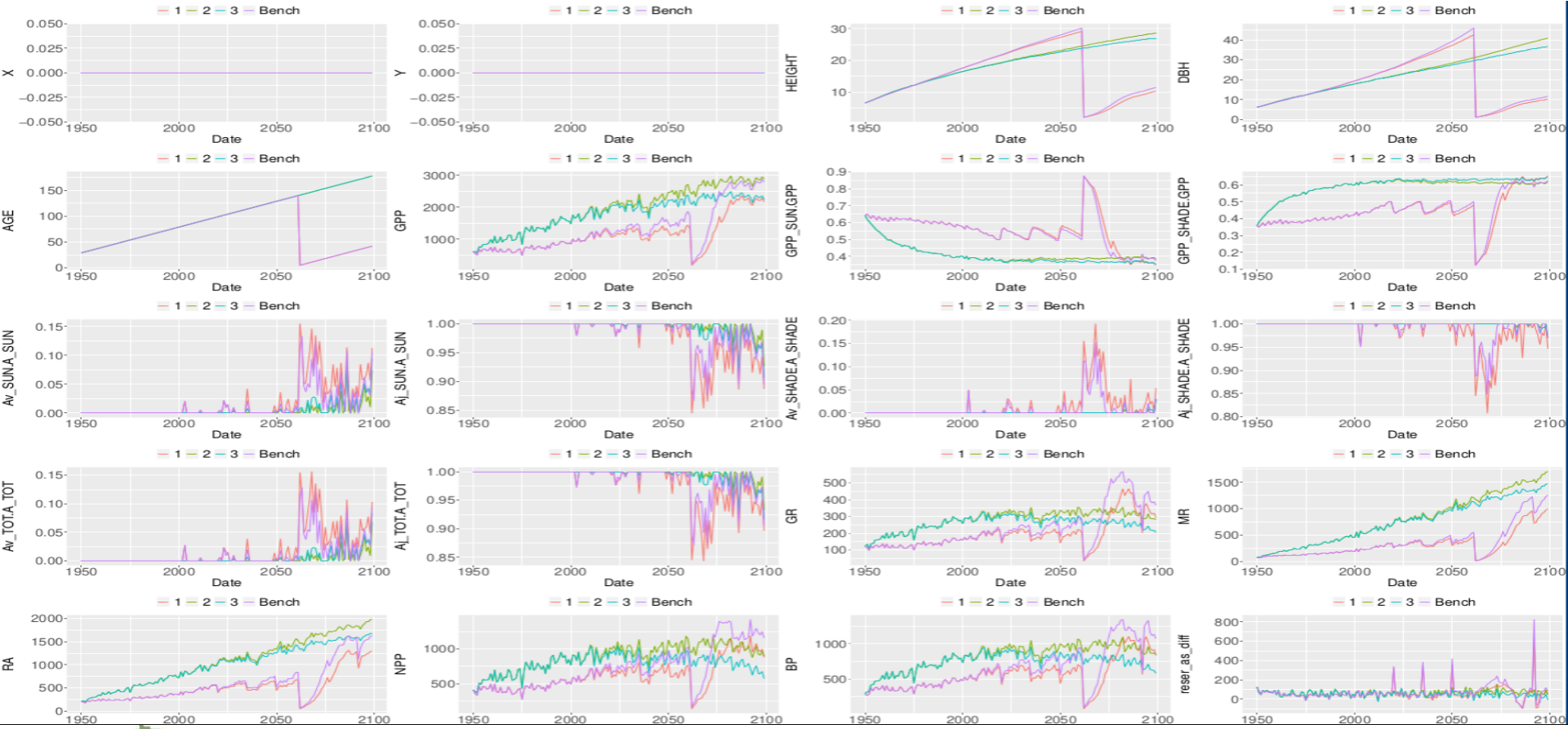


...to produce model daily output

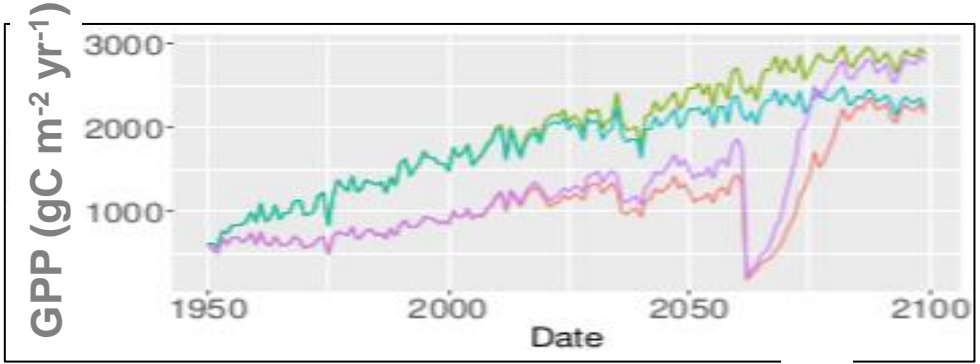
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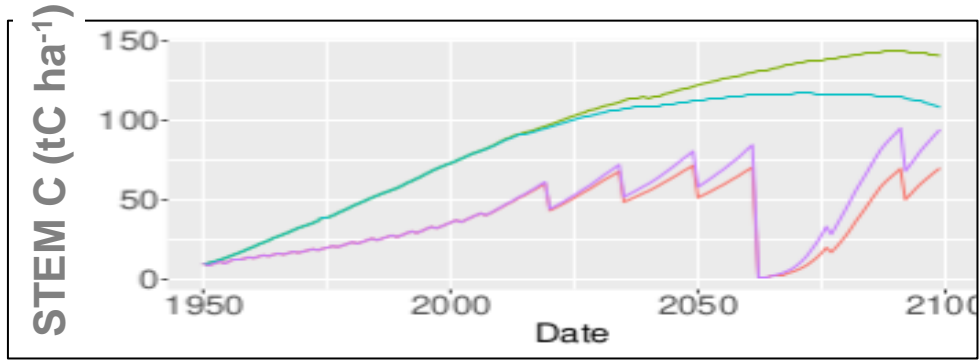
...but more practically (an understandable annual model output)



...but more practically (an understandable annual model output)



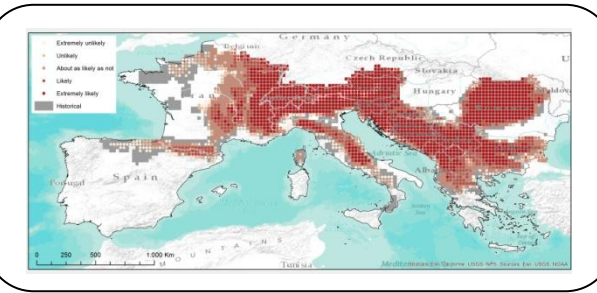
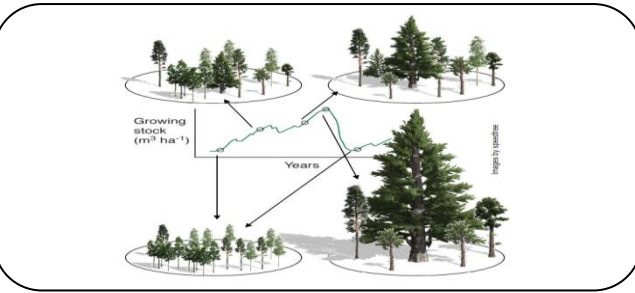
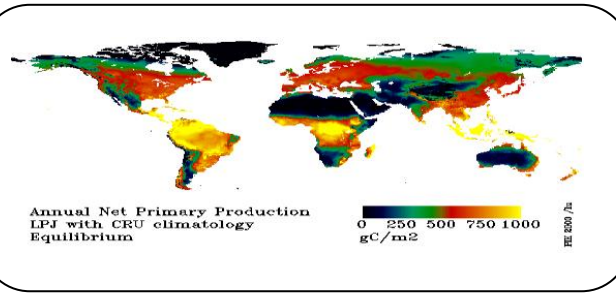
- [CO₂] on; No Management
- [CO₂] off; No Management
- [CO₂] on; Management
- [CO₂] off; Management



Climate forcing: MIROC-ESM-CHEM rcp8.5



Different models for different purposes (and some examples with strengths and limitations)



Dynamic Global Vegetation Models

Gap Models

Species Distribution Models

LPJ

ForClim

BIOMOD

- from regional to global (0,5° * 0,5°)
- PFT's
- Process-Based Model
- Low spatial and temporal resolution

- stand level (1/12ha ca. 833m²)
- Few numbers of input data
- Low process resolution representation
- Low computational demand

- No biological explanation
- Statistical model
- Wide applicability
- Black box

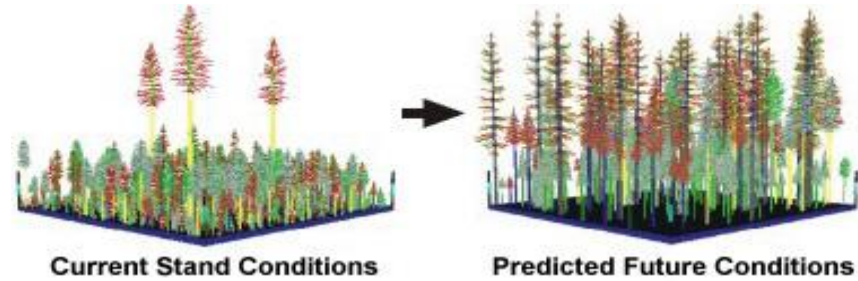
Limited applicability to species level and low processes' resolution representation

Limited applicability to regional and potentially impossible to global level

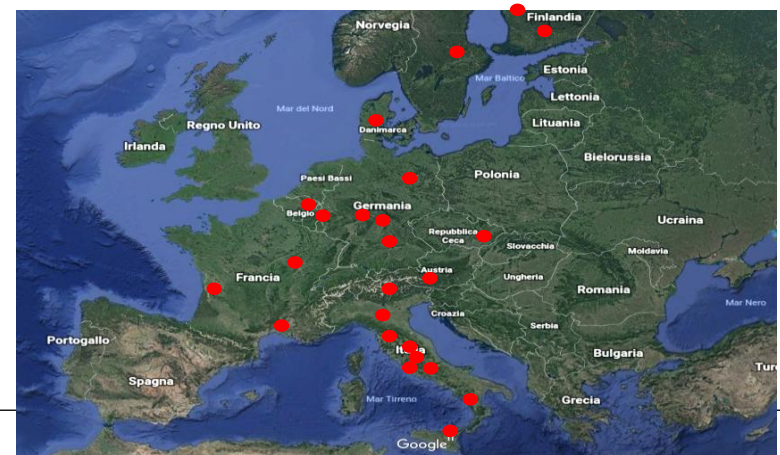
No explanation of the behaviour observed



What about the Forest Modelling Lab. (the 3D-CMCC-FEM)



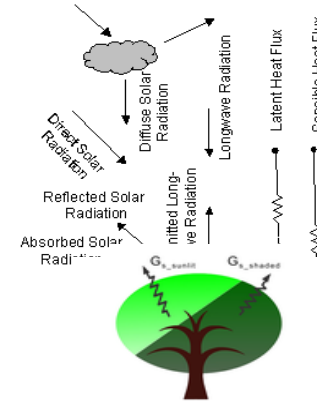
- Simulate **stand growth and development** under current and future environmental conditions
- **Bio-chemical, Bio-physical, Process-Based Model**
- Couple the **Process-Based** models' **robustness** of the layer and cohort models
- Variable **temporal** scale(daily to annual)
- Variable **spatial** scale (1ha to x Km²)
- Management (thinning, harvest, replanting)



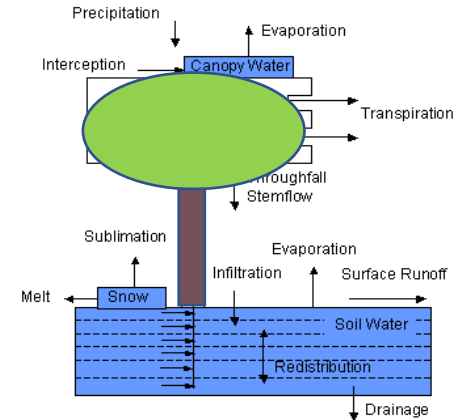
3D-CMCC-FEM Biophysical processes:

- SURFACE ALBEDOS
- RADIATIVE TRANSFER
- SENSIBLE HEAT (under development) AND LATENT HEAT FLUXES
- SOIL AND SNOW TEMPERATURE
- CANOPY TRANSPIRATION
- CANOPY INTERCEPTION
- SOIL EVAPORATION
- SNOW
- SURFACE RUNOFF AND INFILTRATION
- SOIL WATER CONTENT

Biogeophysics – Energy, Moisture, Momentum

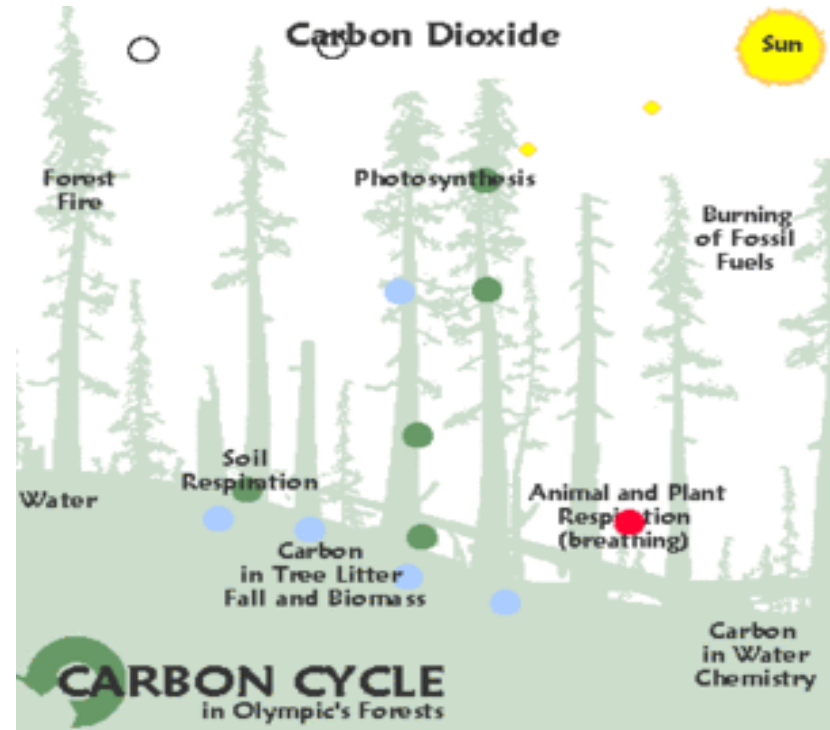


The two-big-leaf scheme

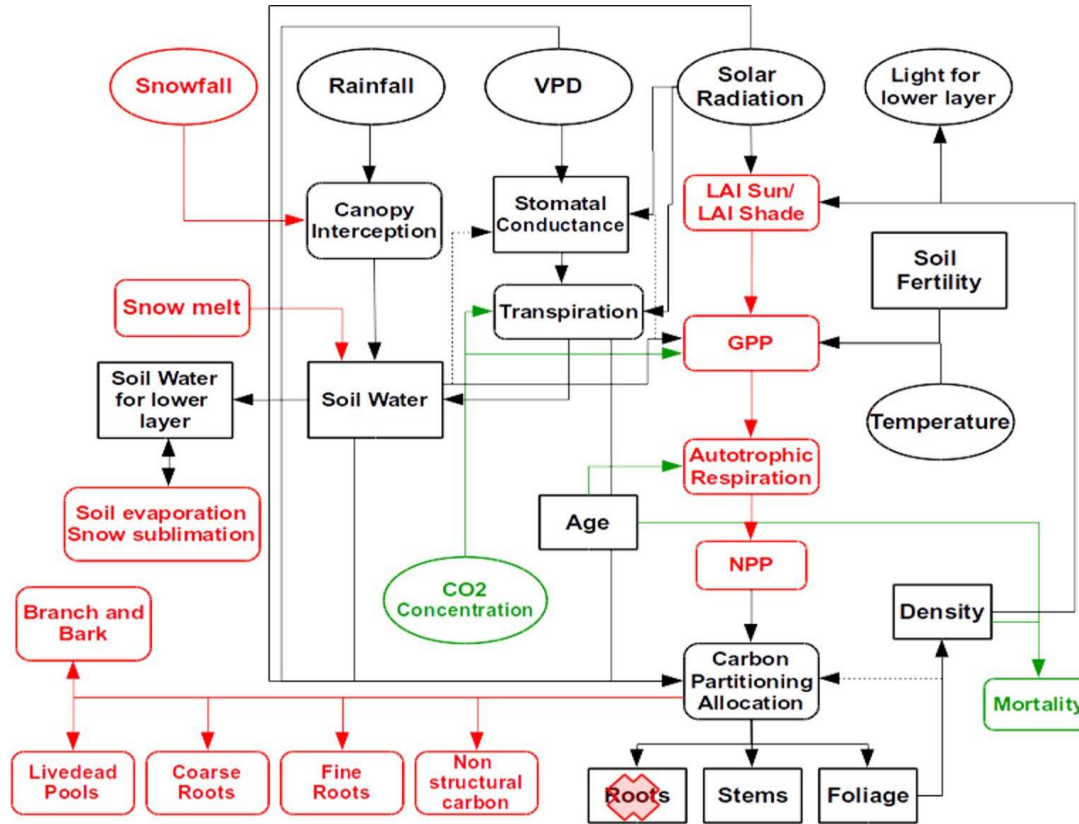


3D-CMCC-FEM Biochemical processes:

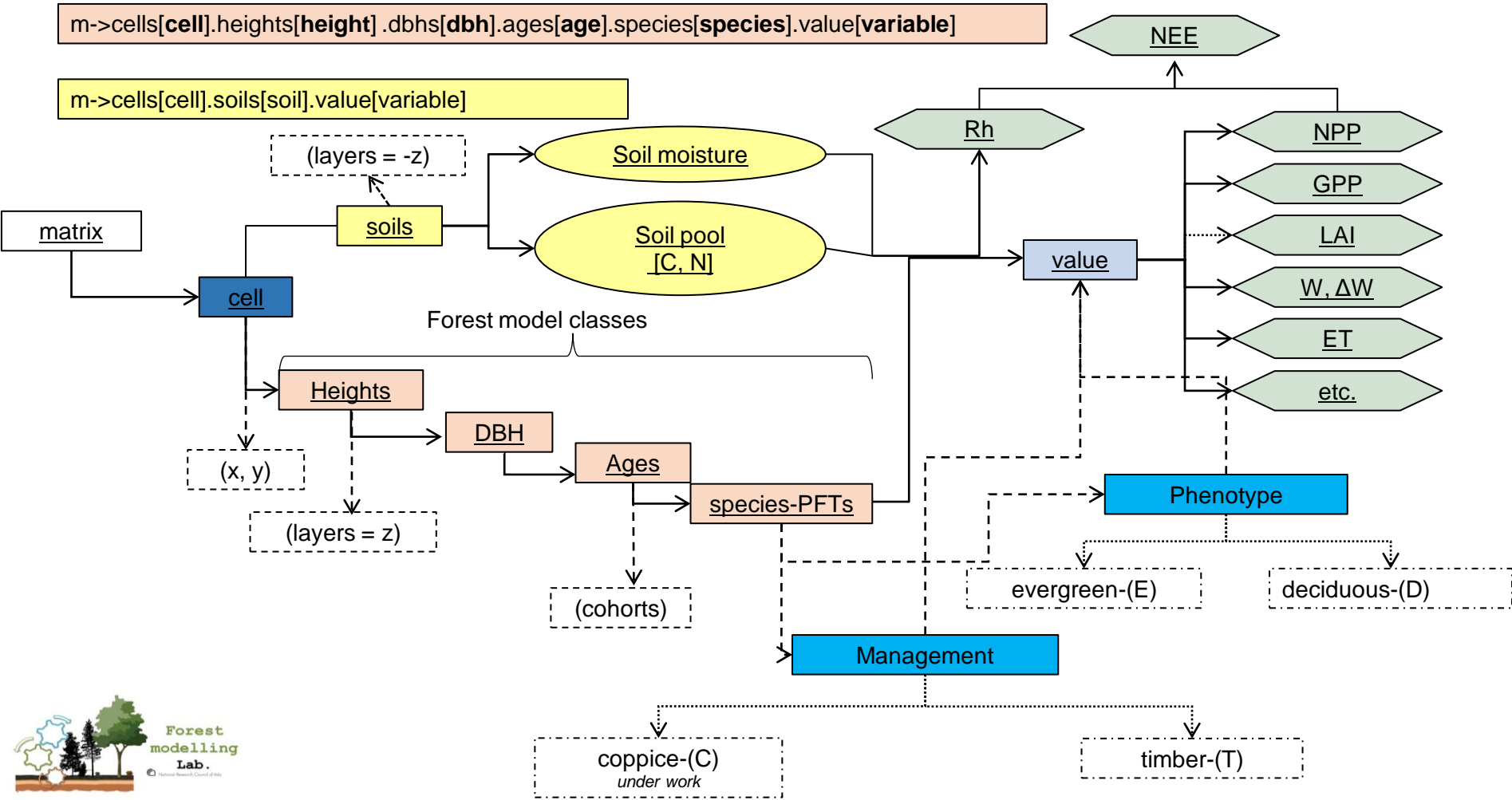
- CANOPY PHOTOSYNTHESIS
- AUTOTROPHIC RESPIRATION
- HETEROTROPHIC RESPIRATION
- CARBON ALLOCATION
- NSC-Dynamic
- WOOD PRODUCTION
- PHENOLOGY
- Changes in Forest STRUCTURE
- LITTERFALL production
- ...



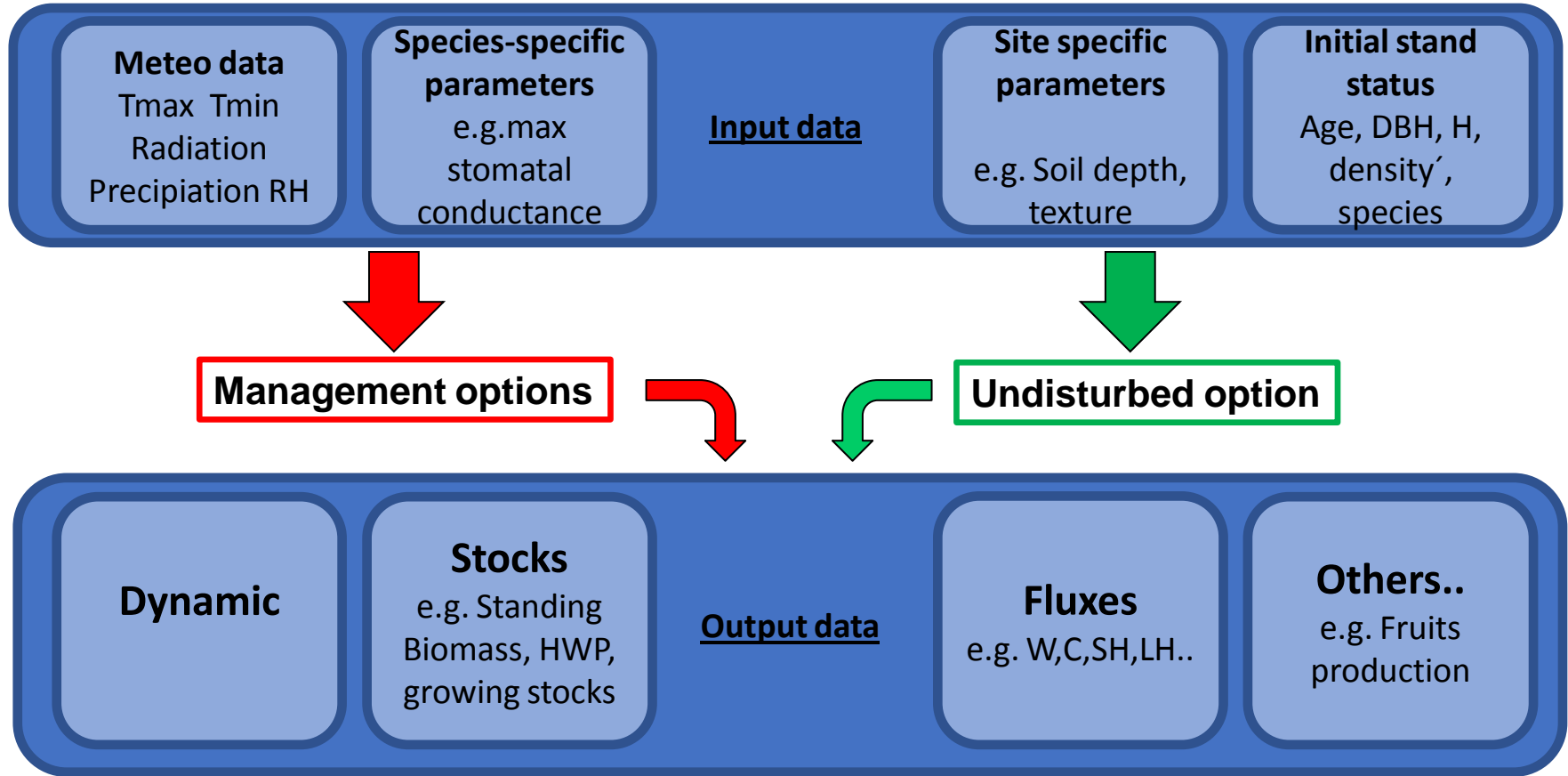
3D-CMCC-FEM Model Flowchart:



3D-CMCC-FEM Model core logic-structure

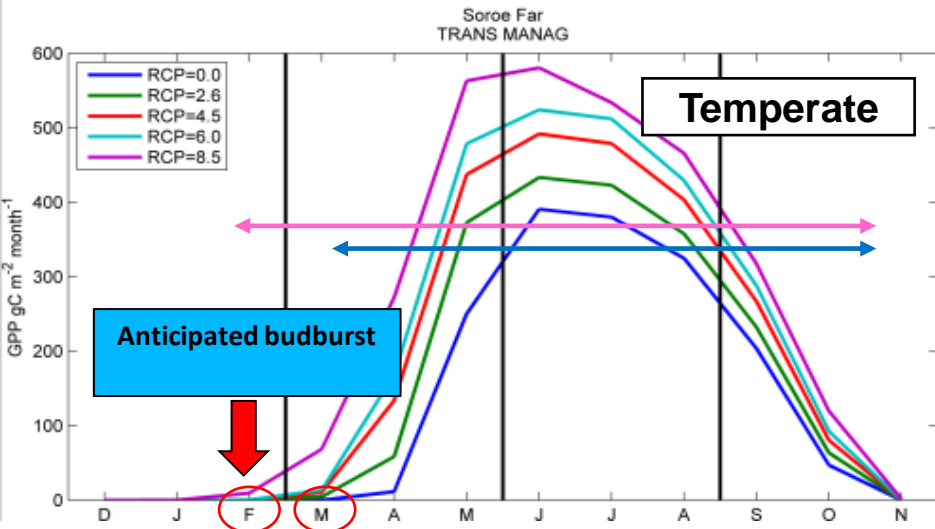


Input/output model data and simulation options

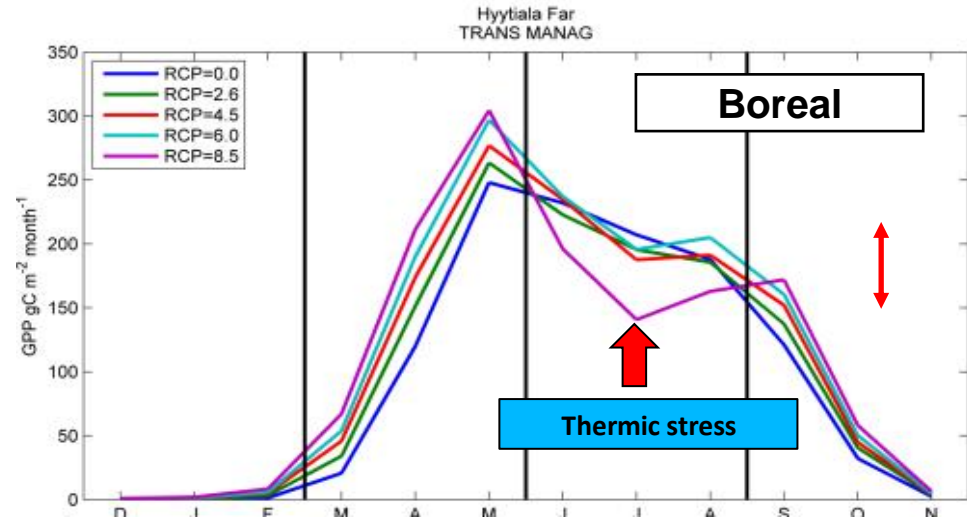


Process-Based Model (PBMs) – Make predictions on climate change

Changes in **phenology** under different **climate forcing scenarios** from 2000 to 2100



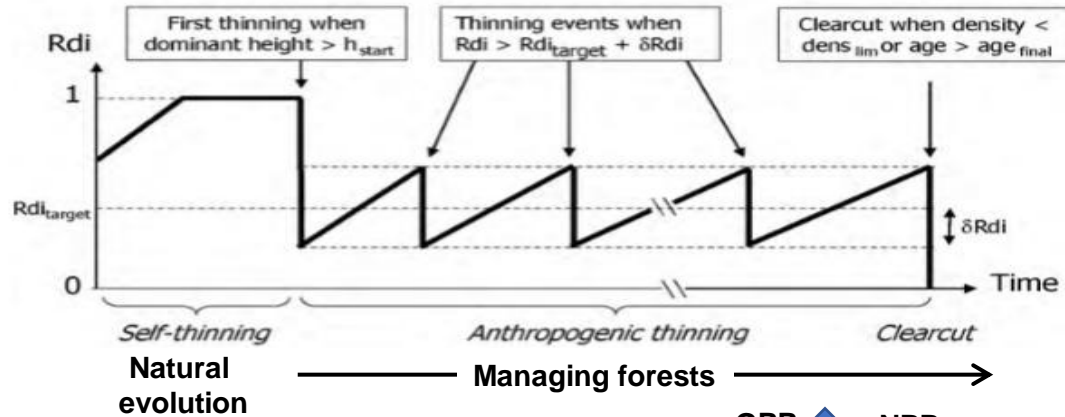
Soroe site (Denmark)
Fagus sylvatica



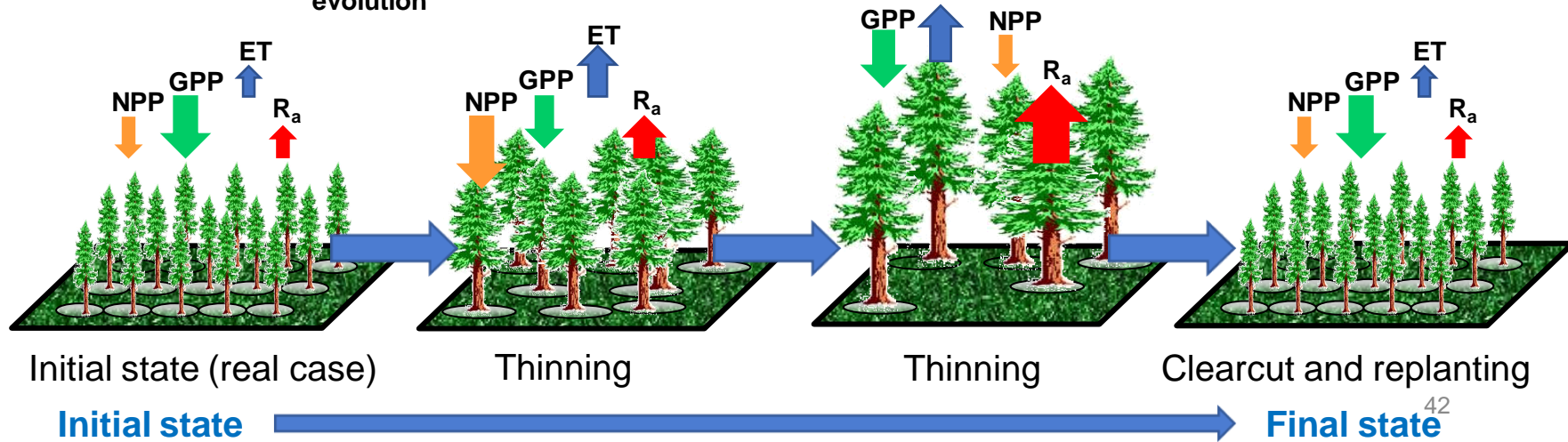
Hyttiala site (Finland)
Pinus sylvestris

Process-Based Model (PBMs) – Make predictions on forest management

What happens if we manage forests?

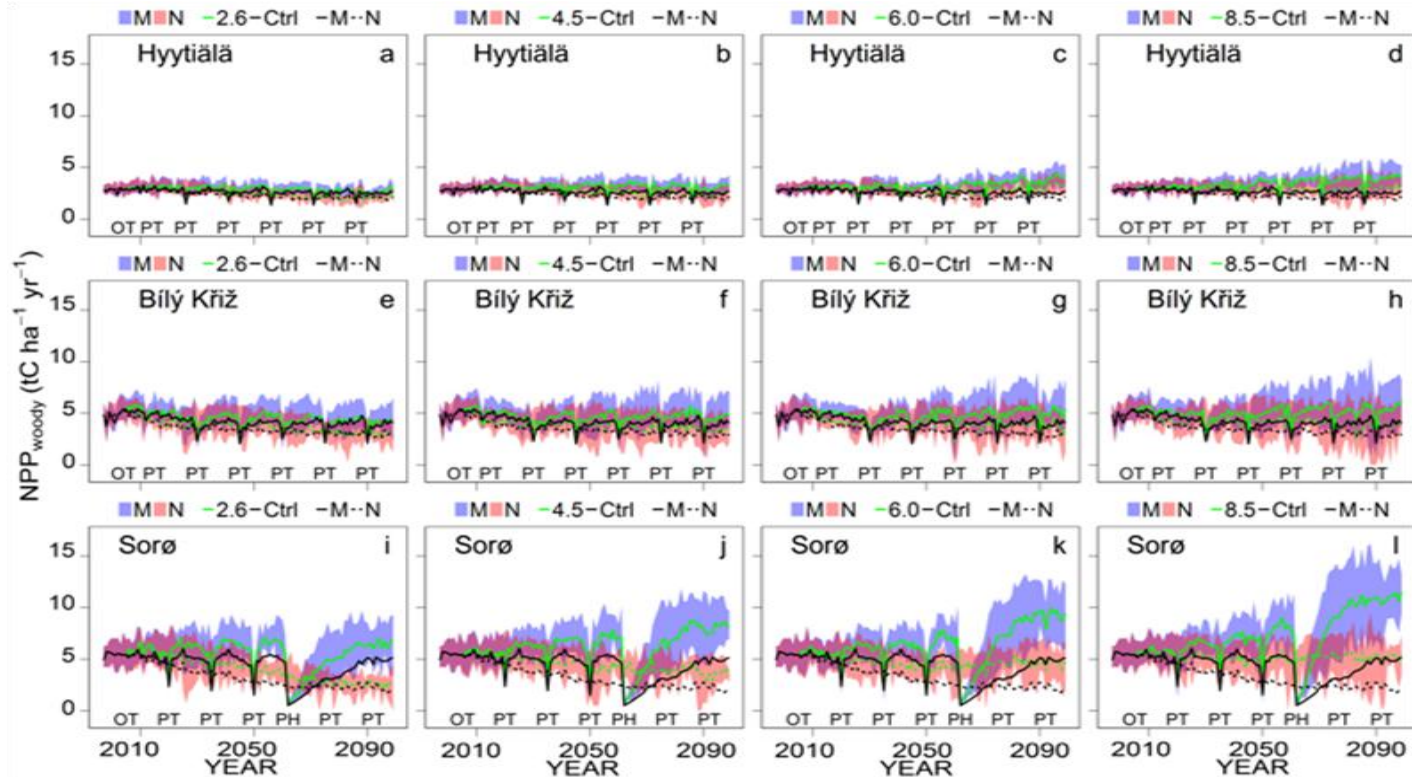


(Bellassen *et al.* 2010)



Testing Management Vs. No Management Under Climate Change

Net Primary Productivity



UnManaged

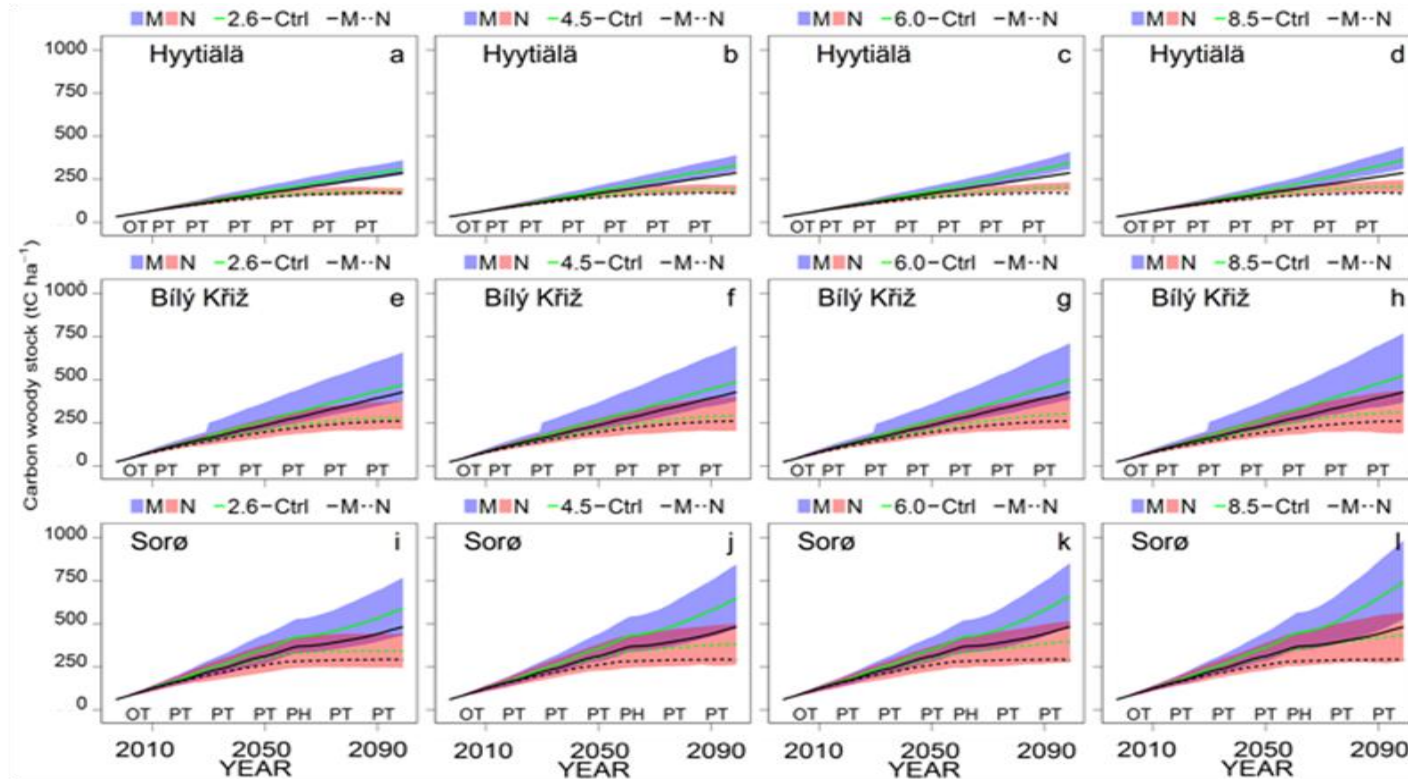
Managed

OT = observed thinning, PT = prescribed thinning, PH = prescribed harvesting

(Collalti *et al.*, 2018)

Testing Management Vs. No Management Under Climate Change

Carbon Woody Stocks



UnManaged



Managed

OT = observed thinning, PT = prescribed thinning, PH = prescribed harvesting

What about future forest management?

Present-day climate

Future climate



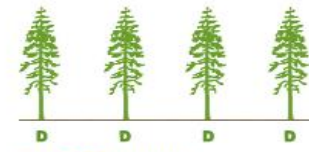
UNTHINNED STAND



Business as usual



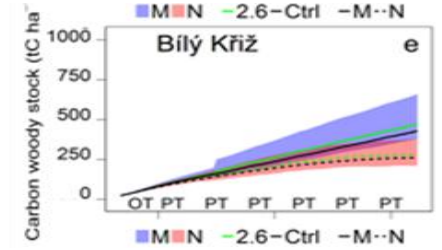
MODERATE THINNING



HEAVY THINNING



LIGHT THINNING



??

??

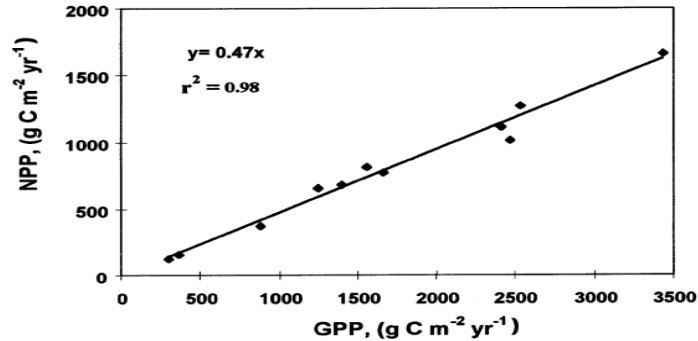
??



(Marano *et al.* In prep.)

Process-Based Model (PBMs) – Testing long-lasting ecological theories

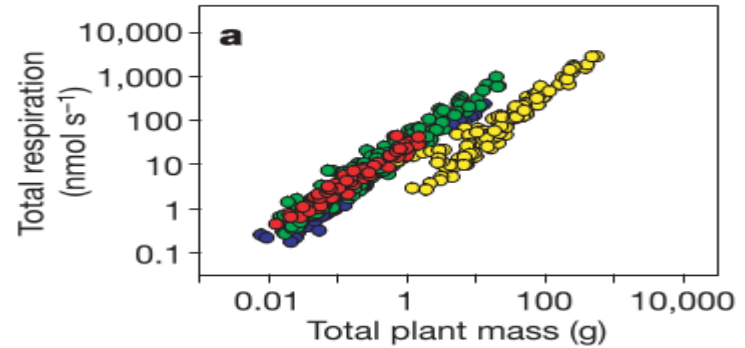
Question: Plant respiration is controlled by photosynthesis or biomass?



(Waring et al. 1998, *Tree Physiology*)



H₁: “Respiration is controlled by **photosynthesis**”



(Reich et al. 2006, *Nature*)



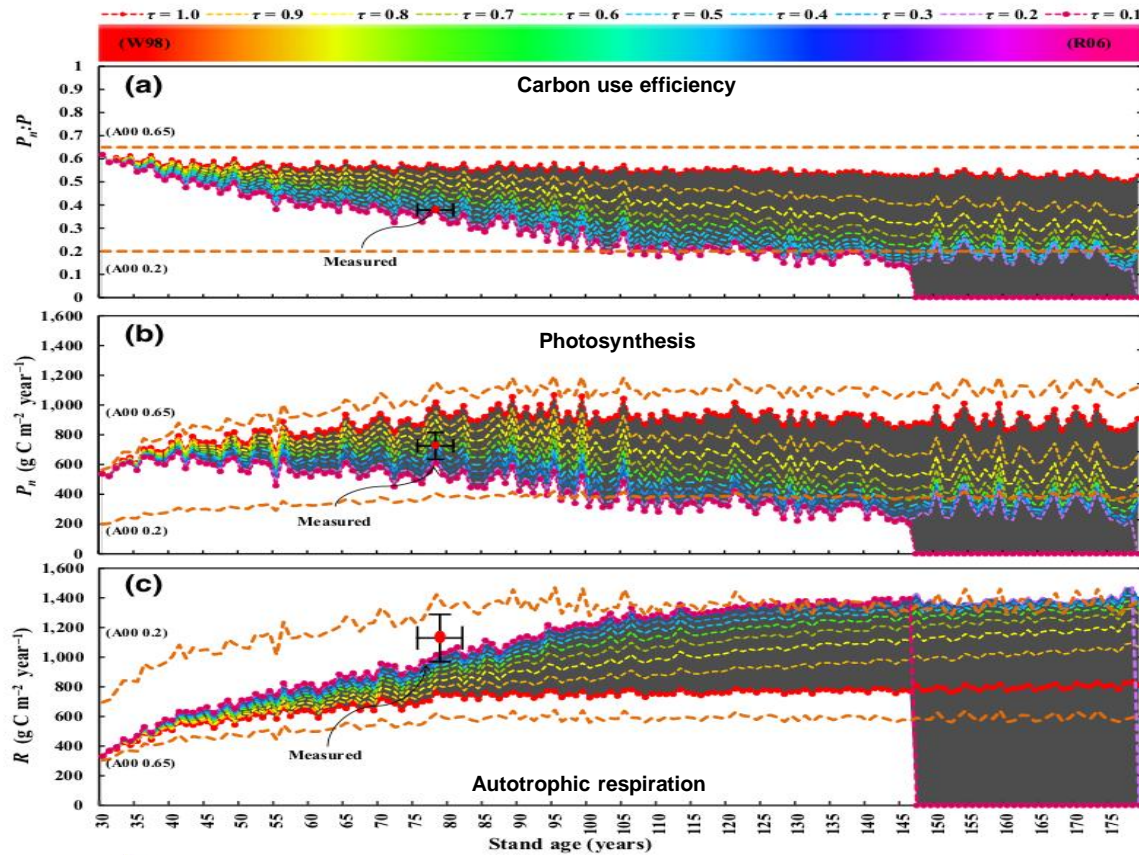
H₂: “Respiration is controlled by (total) **biomass**”



Results: none of these two hypotheses are actually correct!

(but how we found out that?)

Process-Based Model (PBMs) – Testing long-lasting ecological theories



If respiration would be controlled only by photosynthesis in winter, when photosynthesis is stopped, all live cells would die. However, there have been found many live cells older than year



H₁: Respiration controlled by photosynthesis



If respiration would be controlled only by biomass at increasing forest age respiration would become too high, consuming too much carbon, and trees would completely die when mature

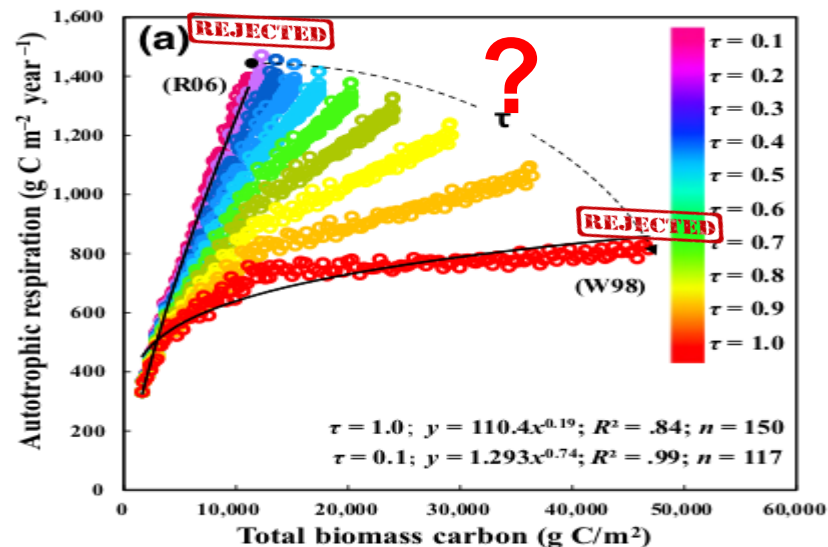


H₂: Respiration controlled by total biomass



Process-Based Model (PBMs) – Testing long-lasting ecological theories

Conclusion: Respiration is controlled by **both photosynthesis and biomass** at a variable extent, which we do not currently know, but somewhere in between the two hypotheses (both excluded)



Conclusions: Strengths and present limitations of forest models (some)

Some present strengths:

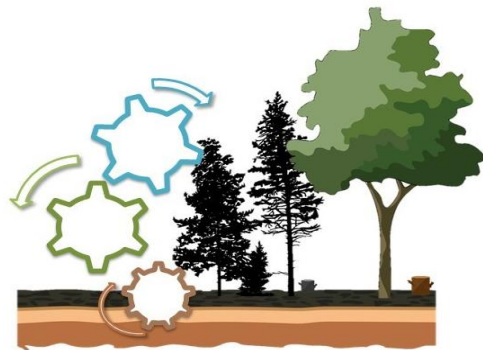
- Possibility to simulate **effects of climate change** (CO₂ fertilization effects, Temperature acclimation, ...)
- Simulate **eco-physiological processes** of heterogeneous forests with complex structure
- Consider **forest structure** evolution (i.e. vertical and horizontal heterogeneity)
- Simulate and quantify light and water **competition**
- Possibility to be spatially upgraded from **local** scale to **regional** scale reducing the amount of the needed initialization data

Some present limitations:

- Relatively high request of **input data** and **parameters**
- High computationally **demanding**
- Still, to some extent, **uncertain**

Thanks!

(alessio.collalti@cnr.it)



Forest Modelling Lab.



National Research Council of Italy



Consiglio Nazionale Ricerche

ISAFOM