

## PreLES – an empirical model for daily GPP, evapotranspiration and soil water in a forest stand

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### Basic features

"Name etymology": Prediction of LUE, Evapotranspiration, and Soil water

Consists of three stand-alone component models (GPP, ET, SW) that can be used in a chain

Two versions for the ET model:

- (i) "simple" (ET-S)
- (ii) Penman-Monteith (ET-PM)

Works with a daily time step at a stand level

Work in progress: the aim is to develop a simple practical tool for predicting GPP and evapotranspiration in Finland (in a changing climate) with input variables that are easy to obtain

## Basic features (2)

Driving variables (daily totals / daily means)

GPP: PAR, T, VPD, SWC

ET-S: PAR, VPD, SWC, GPP

ET-PM:  $R_n$ , T, VPD, SWC, GPP, U

SW: T, Precip, ET

State / driving variables for which initial values are required

GPP:  $X_{start}$

SW: Snow, SWC

PAR: photosynthetically active radiation

T: air temperature

VPD: water vapour pressure deficit

SWC: soil water content

$R_n$ : net radiation

U: wind speed

Precip: precipitation

$X_{start}$ : starting value for delay transformation of T

Snow: amount of snow on ground

## GPP model

Ecosystem GPP in day t is modelled with the light-use efficiency (LUE) approach:

$$GPP(t) = \beta \cdot \underbrace{fAPAR(t) \cdot PAR(t)}_{\text{PAR absorbed by canopy}} \cdot f_{PAR}(t) \cdot f_T(t) \cdot \min\{f_{VPD}(t), f_{SWC}(t)\},$$

where  $\beta$  is LUE at optimal conditions, *potential LUE*

$fAPAR(t)$  is fraction of PAR absorbed by canopy during day t (here assumed constant 0.75)

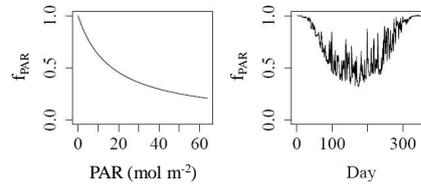
$f_i(t)$  are modifying factors accounting for suboptimal conditions in day t,  $f_i(t) \in [0, 1]$

Mäkelä A *et al.* (2008) Developing an empirical model of stand GPP with the LUE approach: analysis of eddy covariance data at five contrasting conifer sites in Europe. *Global Change Biology* 14(1):92-108.

## GPP model: modifiers

Light:

$$f_{\text{PAR}}(t) = \frac{1}{\gamma \text{PAR}(t) + 1}$$



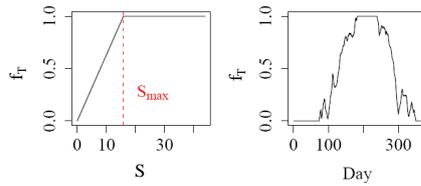
Temperature (state of acclimation):

$$X(t) = X(t-1) + \frac{1}{\tau} [T(t-1) - X(t-1)],$$

$$X(1) = X_{\text{start}}$$

$$S(t) = \max\{X(t) - X_0, 0\}$$

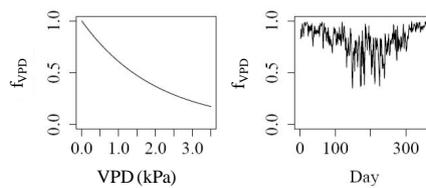
$$f_T(t) = \min\left\{\frac{S(t)}{S_{\text{max}}}, 1\right\}$$



## GPP model: modifiers (2)

VPD:

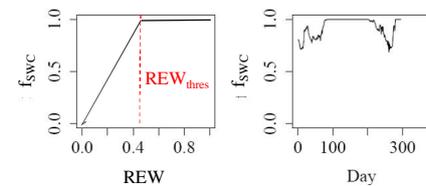
$$f_{\text{VPD}}(t) = e^{-\kappa \text{VPD}(t)} \quad (\kappa > 0)$$



Soil water content (relative extractable water):

$$\text{REW}(t) = \min\left\{\frac{\text{SWC}(t) - \theta_{\text{PWP}}}{\theta_{\text{FC}} - \theta_{\text{PWP}}}, 1\right\}$$

$$f_{\text{SWC}}(t) = \min\left\{\frac{\text{REW}(t)}{\text{REW}_{\text{thres}}}, 1\right\}$$



$\theta_{\text{PWP}}$ : SWC at permanent wilting point, here  $\theta_{\text{PWP}} = 0.225$

$\theta_{\text{FC}}$ : SWC at field capacity, here  $\theta_{\text{PWP}} = 0.075$

## ET-S model

Ecosystem evapotranspiration in day t is modelled as the sum of transpiration (from vegetation) and evaporation (from ground):

$$ET(t) = \beta_{ET} \frac{GPP(t)}{e^{\kappa_{ET} VPD(t)}} VPD(t) + \alpha \underbrace{[1 - fAPAR(t)] PAR(t)}_{\text{Amount of radiation reaching ground}} \min\left\{\frac{SWC(t)}{\theta_{sat}}, 1\right\}$$

Estimate of canopy conductance,  $\kappa_{ET} > 0$

$\theta_{sat}$ : SWC at saturation ("relative pore volume"), here  $\theta_{sat} = 0.5$

## ET-PM model

Penman-Monteith model for ecosystem evapotranspiration in day t:

$$ET(t) = \frac{s(t)R_n(t) + c\rho(t)g_a(t)VPD(t)}{\lambda(t)\left[s(t) + \chi(t)\left(1 + \frac{g_a(t)}{g_s(t)}\right)\right]}$$

where  $c$  is heat capacity of dry air, constant  
 $s(t)$  is slope of water vapour pressure at saturation w.r.t to air temperature, function of  $T(t)$   
 $\rho(t)$  is molar density of dry air, function of  $T(t)$  and air pressure, air pressure computed as a function of altitude  
 $\lambda(t)$  is heat of condensation, function of  $T(t)$   
 $\chi(t)$  is "psychrometric constant", function of  $T(t)$  and atmospheric pressure

### ET-PM model (2)

$g_a(t)$  is atmospheric conductance, function of  
wind speed  $U(t)$  (here assumed constant 3 m/s),  
zero displacement height (function of stand height),  
and measurement and roughness heights for  
momentum and heat / vapour fluxes (functions of  
stand height)

$g_s(t)$  is surface conductance

### ET-PM model (3)

Surface conductance is modelled as the sum of canopy conductance  $g_c(t)$ , soil conductance  $g_{sw}(t)$  and conductance of surficial water in ecosystem  $g_{cw}(t)$ :

$$g_s(t) = g_c(t) + g_{sw}(t) + g_{cw}(t)$$

$$g_c(t) = \frac{\gamma_{ET} GPP(t)}{c_a VPD(t)^{\kappa_{ET}}}, \kappa_{ET} > 0$$

$$g_{sw}(t) = \alpha [1 - fAPAR(t)] \min \left\{ \frac{SWC(t)}{\theta_{sat}}, 1 \right\}$$

$$g_{cw}(t) = \beta_{ET} W_C(t)$$

$c_a$ : CO<sub>2</sub> concentration in atmosphere,  $c_a = 380$  ppm

$\theta_{sat}$ : SWC at saturation ("relative pore volume"),  $\theta_{sat} = 0.5$

$W_C(t)$ : size of surficial water "storage" in day  $t$ , computed in SW model

## SW model

Soil water balance is computed with the "open bucket" principle:

- water comes into soil through precipitation  $Precip(t)$ , part of precipitation is intercepted by canopy
- water gets out of soil through evapotranspiration  $ET(t)$
- water exceeding field capacity runs off in number of days given by  $\tau_D$
- snow dynamics induce a delay in the water input to soil

If **ET-PM** model is used, precipitation intercepted by canopy goes to storage of surfacial water ( $W_C(t)$  in the equation of  $g_{CW}(t)$ )

- storage has maximum size  $W_{Cmax}$ , interception exceeding this runs to soil
- this storage is emptied with  $ET(t)$  before soil water is influenced

## SW model (2)

Computation is performed by updating state variables recursively in a daily time step

Starting values: amount of soil water  $SoilWater(t_0) = SWC(t_0) \cdot soildepth$   
amount of snow on ground  $Snow(t_0)$  (here soildepth = 529 mm)

### SW model (3)

$$\text{SnowThrough}(t) = \begin{cases} \text{Precip}(t), & T(t) < T_{\text{snow}} \\ 0, & T(t) \geq T_{\text{snow}} \end{cases}$$

$$\text{SnowMelt}(t) = \begin{cases} 0, & T(t) < T_{\text{melt}} \\ \min\{c_{\text{melt}} [T(t) - T_{\text{melt}}], \text{Snow}(t-1) + \text{SnowThrough}(t)\}, & T(t) \geq T_{\text{melt}} \end{cases}$$

$$\text{Snow}(t) = \text{Snow}(t-1) + \text{SnowThrough}(t) - \text{SnowMelt}(t)$$

$$\text{RainThrough}(t) = \begin{cases} 0, & T(t) < T_{\text{snow}} \\ (1 - I_0) \text{Precip}(t), & T(t) \geq T_{\text{snow}} \end{cases}$$

$T_{\text{snow}}$ : temperature under which precipitation comes as snow, here  $T_{\text{snow}} = 0^\circ\text{C}$

$T_{\text{melt}}$ : temperature above which snow melts, here  $T_{\text{melt}} = 0^\circ\text{C}$

$c_{\text{melt}}$ : snow melting coefficient, here  $c_{\text{melt}} = 1.5 \text{ mm}/^\circ\text{C}$

$I_0$ : fraction of precipitation (not in snow) intercepted by canopy, here  $I_0 = 0.33$

### SW model (4)

If **ET-S** is employed for computing  $\text{ET}(t)$ :

$$\text{SoilWaterBeforeDrainage}(t) = \text{SoilWater}(t-1) + \text{RainThrough}(t) + \text{SnowMelt}(t) - \text{ET}(t)$$

$$\text{Drainage}(t) = \max\{0, \underbrace{\text{SoilWaterBeforeDrainage}(t) - \theta_{\text{FC}} \cdot \text{soildepth}}_{\text{Maximum amount of water soil can retain}}\} / \tau_D$$

$$\text{SoilWater}(t) = \text{SoilWaterBeforeDrainage}(t) - \text{Drainage}(t)$$

$$\text{SWC}(t) = \text{SoilWater}(t) / \text{soildepth}$$

### SW model (5)

If **ET-PM** is employed for computing ET(t):

$$\text{Interception}(t) = I_0 \text{ Precip}(t)$$

$$\text{SurfacialWaterBeforeET}(t) = \min \{ \text{SurfacialWater}(t-1) + \text{Interception}(t), W_{Cmax} \},$$

Surfacial water exceeding  $W_{Cmax}$  runs to soil



where  $W_{Cmax}$  is the maximum size of surfacial water storage

$$\text{SurfacialWaterThrough}(t) = \max \{ \text{SurfacialWater}(t-1) + \text{Interception}(t) - W_{Cmax}, 0 \}$$

Evapo-transpiration is first used to empty surfacial storage



$$\begin{aligned} \text{SoilWaterBeforeDrainage}(t) &= \text{SoilWater}(t-1) \\ &+ \text{RainThrough}(t) + \text{SnowMelt}(t) \\ &+ \text{SurfacialWaterThrough}(t) \\ &- \max \{ 0, [\text{ET}(t) - \text{SurfacialWaterBeforeET}(t)] \} \end{aligned}$$

### SW model (6)

$$\text{SurfacialWater}(t) = \max \{ \text{SurfacialWaterBeforeET}(t) - \text{ET}(t), 0 \}$$

Drainage(t), SoilWater(t) and SWC(t) as before

## Bayesian estimation of model parameters

Parameters of each model estimated separately, with measured daily data as input

Likelihood function constructed assuming GPP / ET / SW values in each day (random variables)

- (i) independent of each other (no temporal autocorrelation)
- (ii) normally distributed with mean given by the GPP / ET-PM / SW model and variance proportional to squared mean

Prior distributions of parameters uniform (uninformative)

Estimation with Markov chain Monte Carlo, parameter estimates from means of marginal posterior distributions

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