Modelling of ecosystem respiration with proximal sensing data and meteorological measurements

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## The STSM objective

- Simulate ecosystem respiration using proximal sensing data and meteorological measurements;
- Determine if basal respiration is more related to:
  - Structural indices (NDVI, MTCI, ND, EVI)
  - Physiological activity indices (Fy760 or PRI)

## Ecosystem Respiration – R<sub>eco</sub>

• CO<sub>2</sub> production by all organisms in a ecosystem

Soil respiration (heterotrophic + roots)

Above ground respiration (leaves, branches, stems...)

- Diverse and changing array of organisms
- Peak during night time  $\rightarrow$  no photosynthesis
- Major influence in global C cycle

#### **Gross Primary Production – GPP**

- Total energy produced by plants and cyanobacteria
  - Photo- and chemosynthesis
  - Part is used by primary producers for cellular respiration
  - Part is the net primary production NPP
- Empirical evidence for the link between GPP and  $\rm R_{eco}$  for most ecosystems

# GPP as driver of R<sub>eco</sub>

- Network of eddy covariance and chamber measurements increased the estimates of ecosystem-scale GPP
- Upscale of GPP to regional and global scales relies on remote sensing information about:
  - Ecosystem structure
  - Light use efficiency
  - Sun-induced chlorophyll fluorescence
  - ... more being explored!

# $VIs \rightarrow GPP \rightarrow R_{eco}$

- Vegetation Indeces VIs from proximal sensing to model GPP and Rb
  - Avoids the dependence on ground measurements
  - Less disturbance of the ecosystem
  - Application at regional and global scales

#### The Reco models

 $R_{eco} = R_b \times f(T) \times f(P)$ 

- Simple models:
  - One C pool
  - Overall system state
  - Different formulations for dependency on GPP
  - Estimation of Rb from VIs

Table 1 Different model formulations of the dependency of ecosystem respiration (R<sub>BCO</sub>) on gross primary productivity (GPP) used in this analysis

Model	Formula
LinGPP	$R_{\rm ECO} = (R_0 + k_2 {\rm GPP})$
	$\times e^{E_0\left(\frac{1}{T_{ref}-T_0}-\frac{1}{T_A-T_0}\right)} \times \frac{\alpha k + P(1-\alpha)}{k + P(1-\alpha)}$
ExpGPP	$R_{\rm ECO} = [R_0 + R_2(1 - e^{k_2 \rm GPP})]$
	$\times e^{E_0\left(\frac{1}{T_{rel}-T_0}-\frac{1}{T_A-T_0}\right)} \times \frac{\alpha k + P(1-\alpha)}{k + P(1-\alpha)}$
MicMenGPP	$R_{\rm ECO} = \left[R_0 + \frac{R_{\rm MAX} \rm{GPP}}{\rm{GPP} + hR_{\rm MAX}}\right]$
	$\times e^{E_0\left(\frac{1}{T_{ref}-T_0}-\frac{1}{T_A-T_0}\right)} \times \frac{\alpha k + P(1-\alpha)}{k + P(1-\alpha)}$
addLinGPP	$R_{\rm ECO} = R_0 \times e^{E_0 \left(\frac{1}{T_{\rm ref} - T_0} - \frac{1}{T_A - T_0}\right)}$
	$\times \frac{\alpha k + P(1 - \alpha)}{k + P(1 - \alpha)} + k_2 \text{GPP}$
addExpGPP	$R_{\rm ECO} = R_0 \times e^{E_0 \left(\frac{1}{T_{\rm ref} - T_0} - \frac{1}{T_{\rm A} - T_0}\right)}$
	$\times \frac{\alpha k + P(1 - \alpha)}{k + P(1 - \alpha)} + R_2(1 - e^{k_2 \text{GPP}})$
addMicMenGPP	$R_{ECO} = R_0 \times e^{E_0 \left(\frac{1}{T_{ref} - T_0} - \frac{1}{T_A - T_0}\right)}$
	$\times \frac{\alpha k + P(1 - \alpha)}{k + P(1 - \alpha)} + \frac{R_{MAX}GPP}{GPP + hR_{MAX}}$

From Migliavacca, M. et al. (2011)

- SMANIE Small-scale MANIpulation Experiment;
- Mediterranean savannah in Caceres Spain:
- Effects of N and P fertilization on ecosystem level



- Manual static chambers (Perez-Priego et al, 2015):
  - Net CO<sub>2</sub> fluxes
  - Photosynthetically active radiation (PAR)
  - Air and vegetation T
  - Atmospheric P
  - Soil T @ 5 and 10 cm
  - Vapor pressure deficit



- Manual field spectrometer (Perez-Priego et al, 2015):
  - Sun-inducedchlorophyll fluorescence yield at
    760nm Fy760
  - Scaled photochemical reflectance index sPRI
  - Normalized difference vegetation index NDVI
  - MERIS terrestrial-chlorophyll index MTCI



- Net CO<sub>2</sub> fluxes
- Air, vegetation, soil temperature
- Structural indices (NDVI, MTCI)
- Physiological activity indices (Fy760, sPRI)
- 4 Campaigns:
  - C1: Before fertilization
  - C2: 3 weeks after fertilization, peak of growing period
  - C3 and C4: Drying period

#### Results – Rb driven by sPRI



# Results – R<sub>eco</sub> driven by measured GPP and AirT



# Results – R<sub>eco</sub> driven by NDVI, LST and AirT



#### Conclusions

- Best performance of R<sub>eco</sub> models with measured GPP
- NDVI is the best structural index to model R<sub>eco</sub>
- sPRI is the best physiological index to model  $R_{eco}$
- AirT gives better results than SoilT

# For the future...



## Collaborations and institutes involved





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#### **Comments & Suggestions**

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