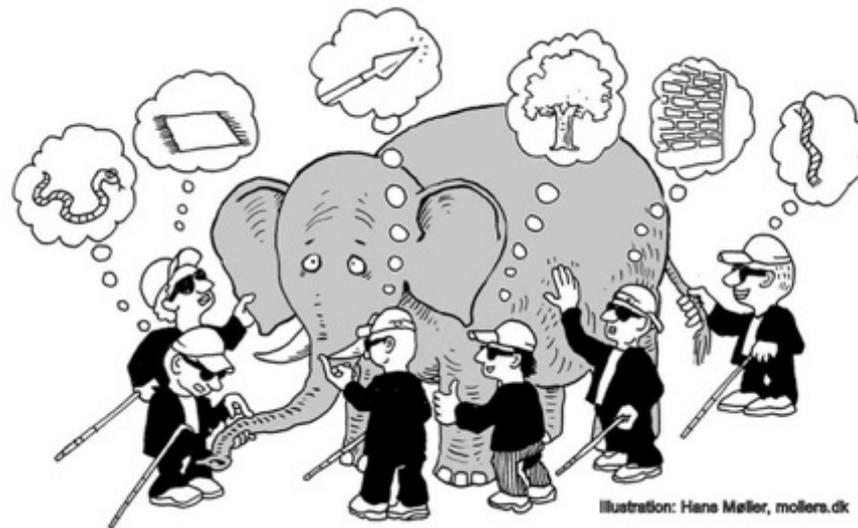




# Gross Primary Productivity or The blind men and the Elephant



**Georg Wohlfahrt**

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# Outline

- ⌘ Definition of gross primary productivity (GPP)
- ⌘ Why bother with the unmeasurable?
- ⌘ Review: multiple constraints on GPP (the blind men theme)
- ⌘ Eddy covariance CO<sub>2</sub> flux partitioning revisited
- ⌘ Carbonyl sulfide (COS) – the silver bullet?
- ⌘ Conclusions



## Definitions

$$P_n = \underbrace{V_c}_{(a)} - 0.5 \cdot V_o - R_{\text{day}}$$

$\underbrace{\hspace{10em}}_{(b)}$

$\underbrace{\hspace{15em}}_{(c)}$

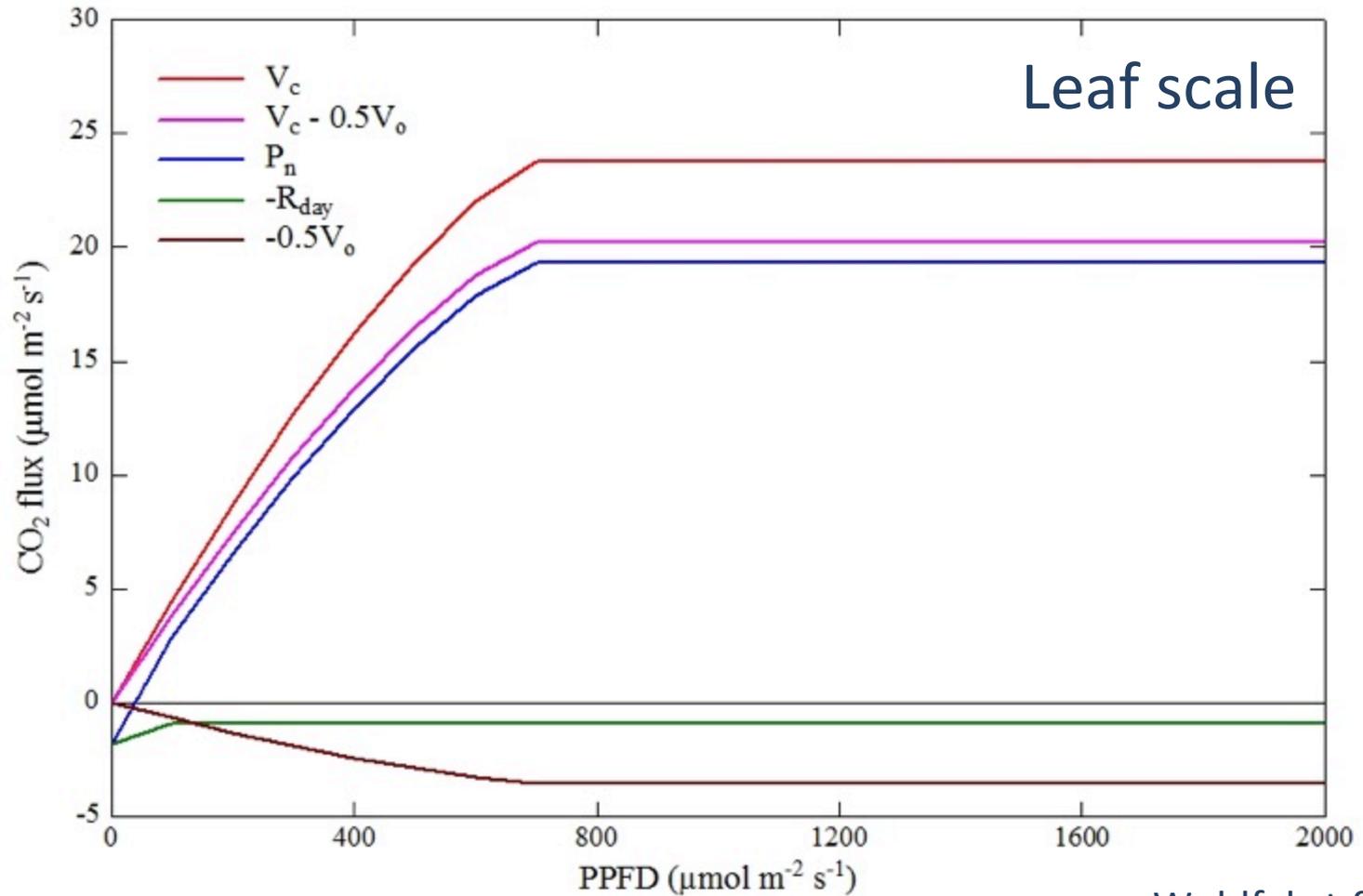
(a)  $V_c$ : carboxylation rate, gross photosynthesis, 'true' photosynthesis

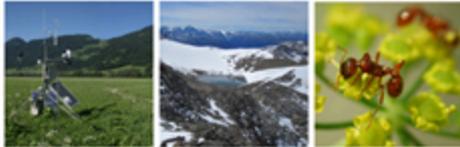
(b)  $V_c - 0.5V_o$ : 'apparent' photosynthesis, GPP

(c)  $V_c - 0.5V_o - R_{\text{day}}$ : net photosynthesis

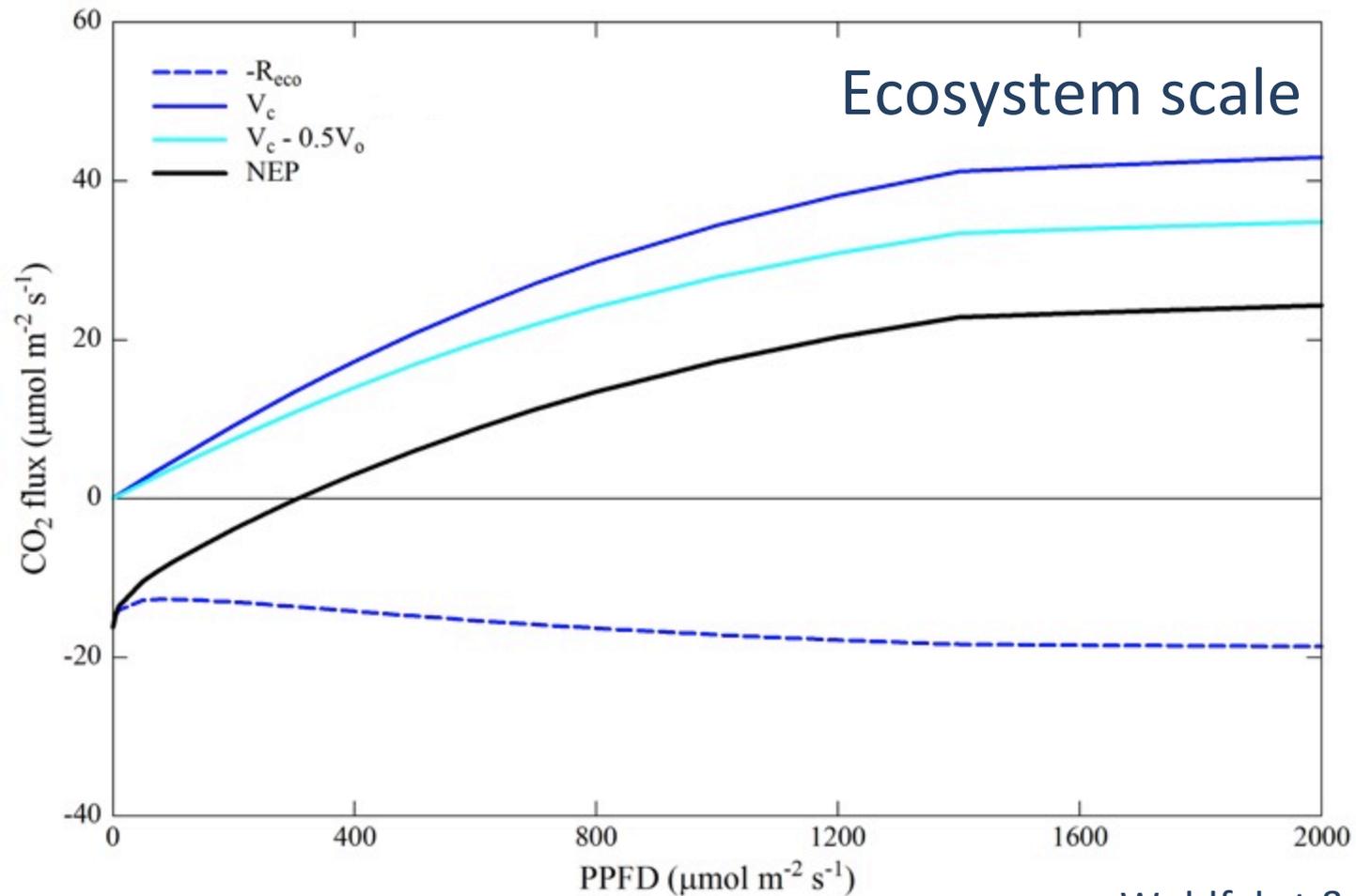


# Definitions





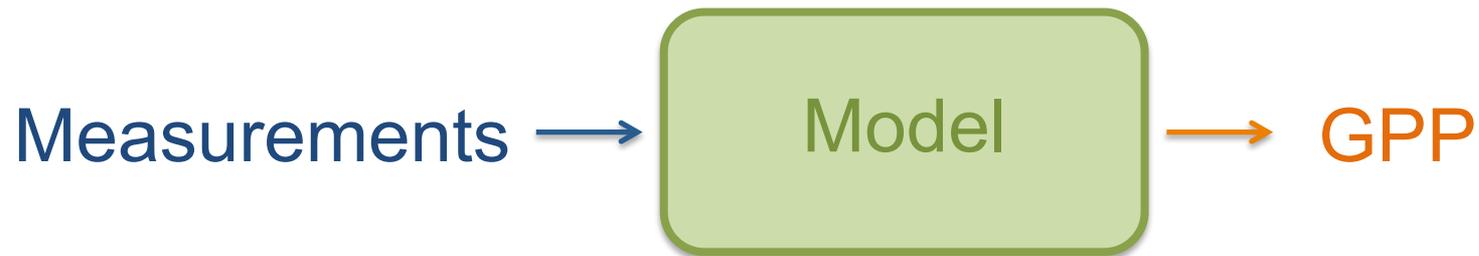
# Definitions





## Why bother with GPP?

⌘ GPP can only be estimated by indirect methods.

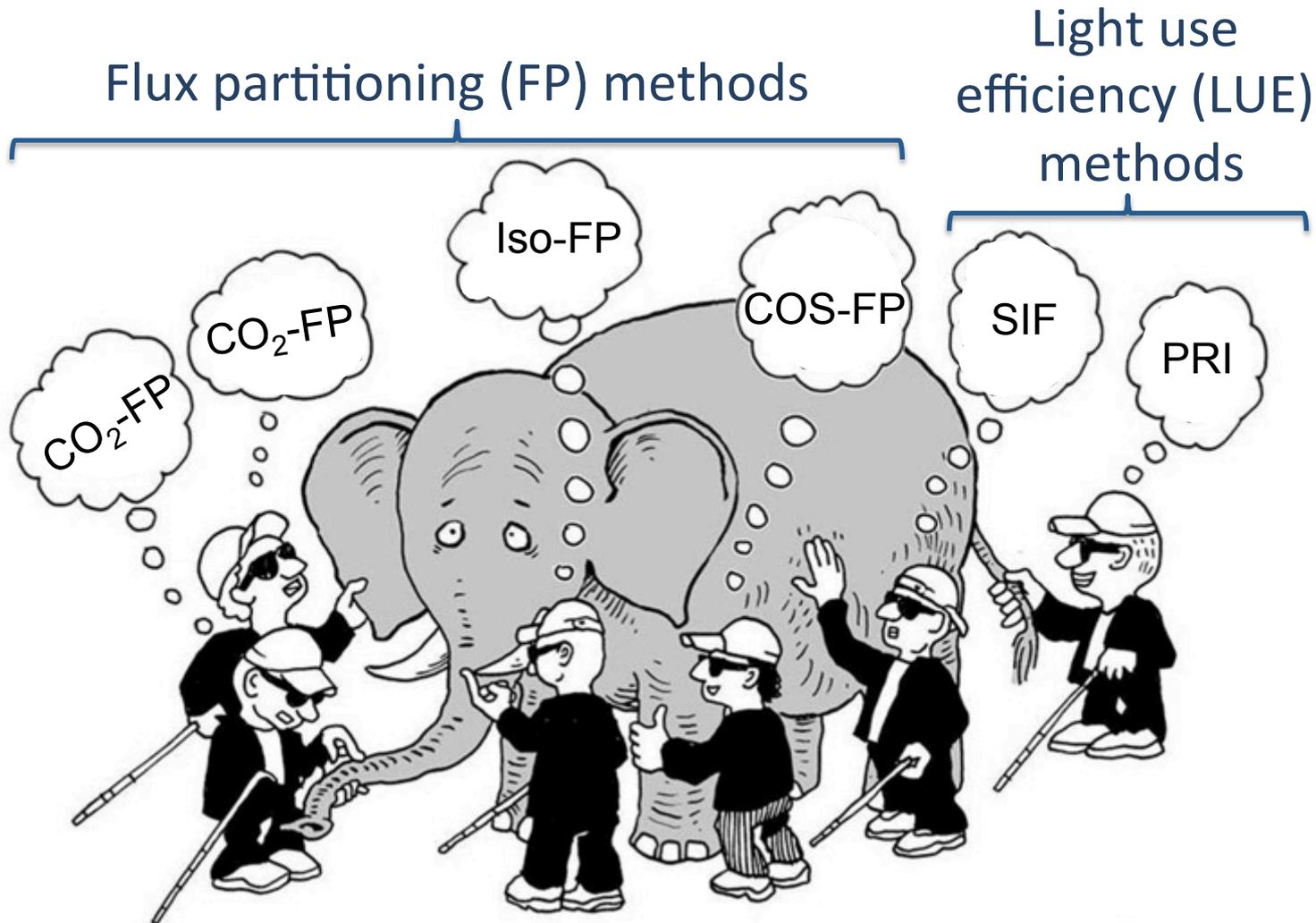




## Why bother with GPP?

- ⌘ GPP can only be estimated by indirect methods.
- ⌘ The main motivation for estimating GPP experimentally is that carbon cycle models simulate uptake (photosynthesis) and release (ecosystem respiration) of  $\text{CO}_2$  separately and thus require separate calibration data.
- ⌘ The net  $\text{CO}_2$  exchange being the difference between two large fluxes (GPP and ER) is very sensitive to partial errors.
- ⌘ Calibration against NEP is problematic due compensating errors which, because of contrasting drivers of photosynthesis and respiration, may cause unrealistic predictions under changing climatic conditions.

# Multiple constraints on GPP



# Multiple constraints on GPP

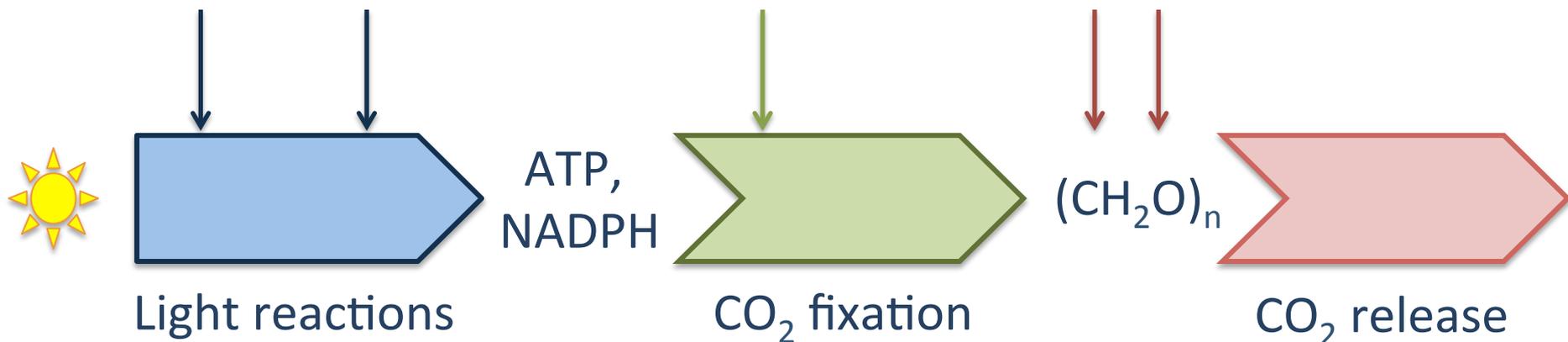
(i) Photochemical reflectance index (PRI)

(ii) Sun-induced fluorescence (SIF)

(iii) Carbonyl sulfide (COS-FP)

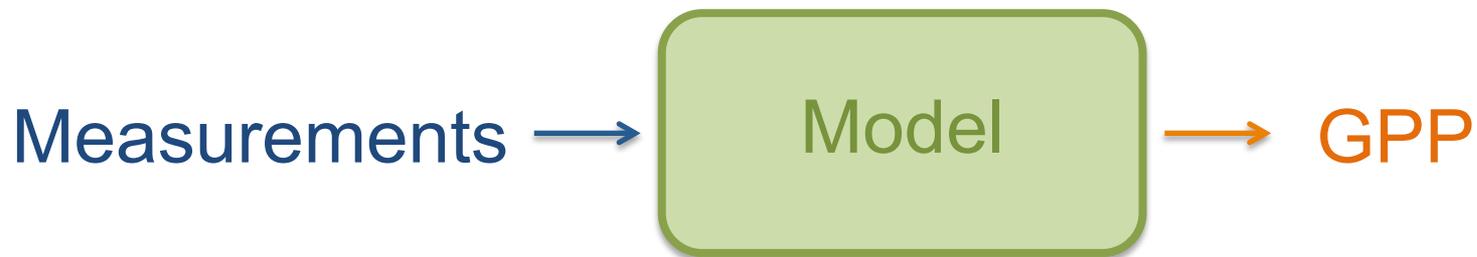
(iv) Isotopic flux partitioning (Iso-FP)

(v) CO<sub>2</sub> flux partitioning (I and II)





# CO<sub>2</sub> flux partitioning I



NEP

$$NEP_n = -ER_n$$

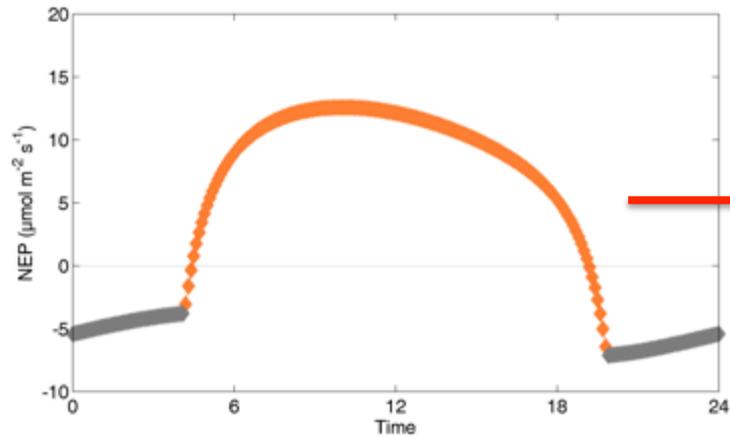
$$GPP = NEP_d + ER_d$$

$$ER_n = ER_d = f(T)$$

$$NEP_d = GPP - ER_d$$

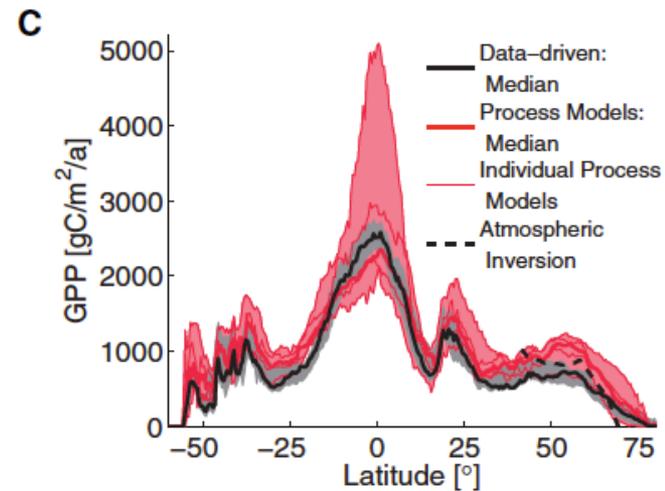
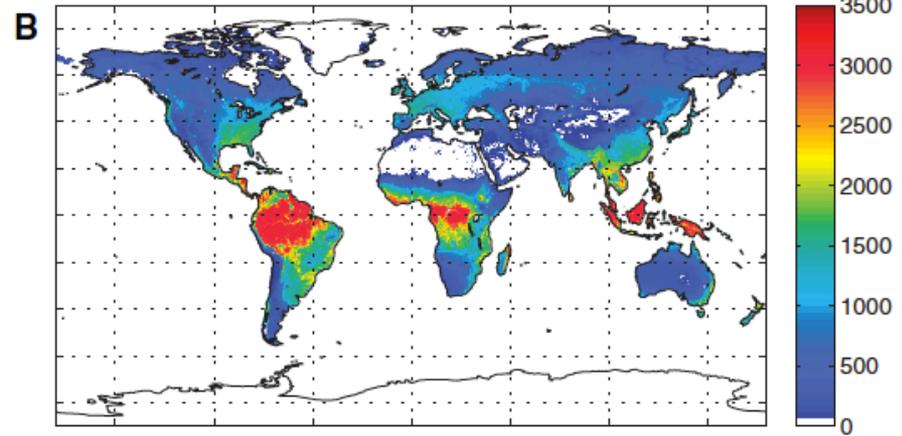
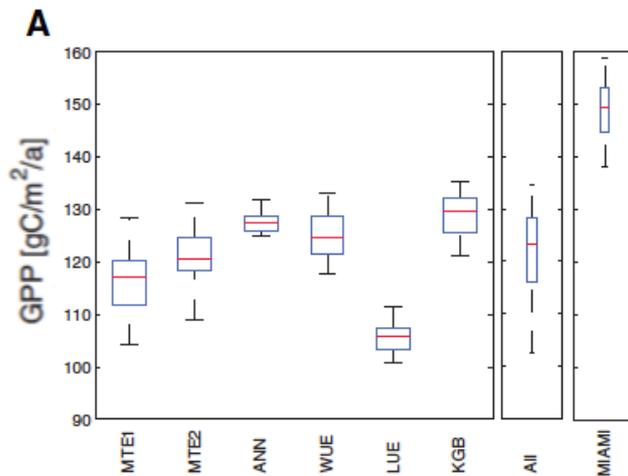


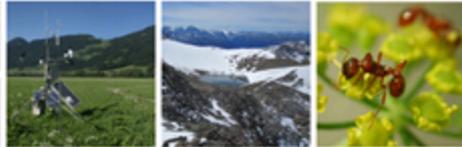
# CO<sub>2</sub> flux partitioning I



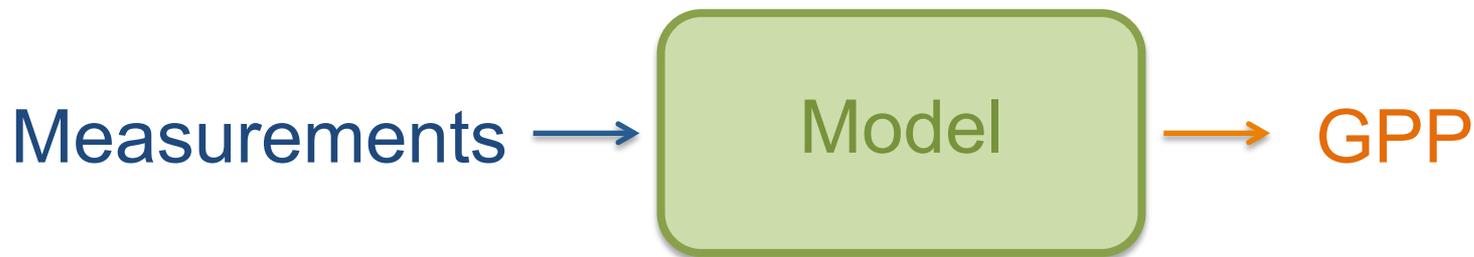


# CO<sub>2</sub> flux partitioning I





## CO<sub>2</sub> flux partitioning II



NEP

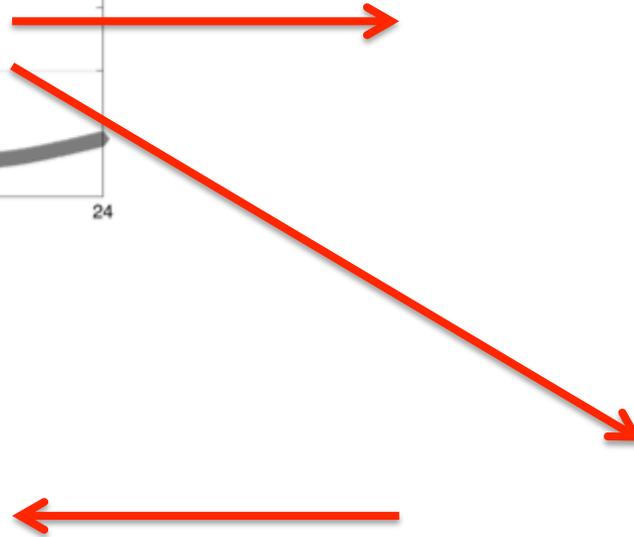
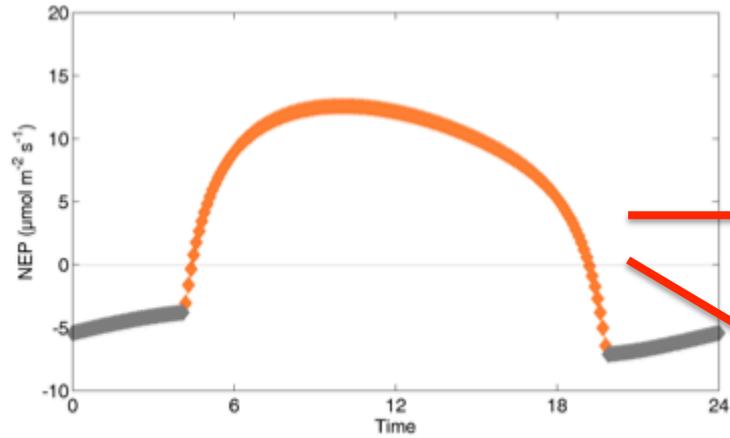
$$NEP_n = -ER_n @ T_{ref} \cdot e^{\beta \cdot T} \quad GPP = NEP_d + ER_d @ T_{ref} \cdot e^{\beta \cdot T}$$

$$GPP = f(PAR, VPD)$$

$$NEP_d = GPP - ER_d @ T_{ref} \cdot e^{\beta \cdot T}$$



# CO<sub>2</sub> flux partitioning II





# Isotopic flux partitioning

Measurements



Model



GPP

$F_N$ ,  $\delta_N F_N$ ,  $\delta_R$ ,  $\delta_a$ ,  
 $C_a$ ,  $\lambda E$ ,  $H$ ,  $R_{net}$ ,  $r_a$ ,  
 $VPD$ ,  $T_a$

$$F_N = F_A + F_{NR}$$

$$\delta_N F_N = \delta_A F_A + \delta_{NR} F_{NR}$$

... and several other auxiliary eqs.

solve eqs. for  $F_A$ ,  $F_{NR}$



# Isotopic flux partitioning

$$F_N = F_A + F_{NR}$$

Net CO<sub>2</sub> flux

$$\delta_N F_N = \delta_A F_A + \delta_{NR} F_{NR}$$

Isoflux

$$\delta_A = \delta_a - \Delta$$

$$\Delta = a + (b - a) C_i / C_a$$

Farquhar et al. (1982)

$$-F_A = g_c (C_a - C_i)$$

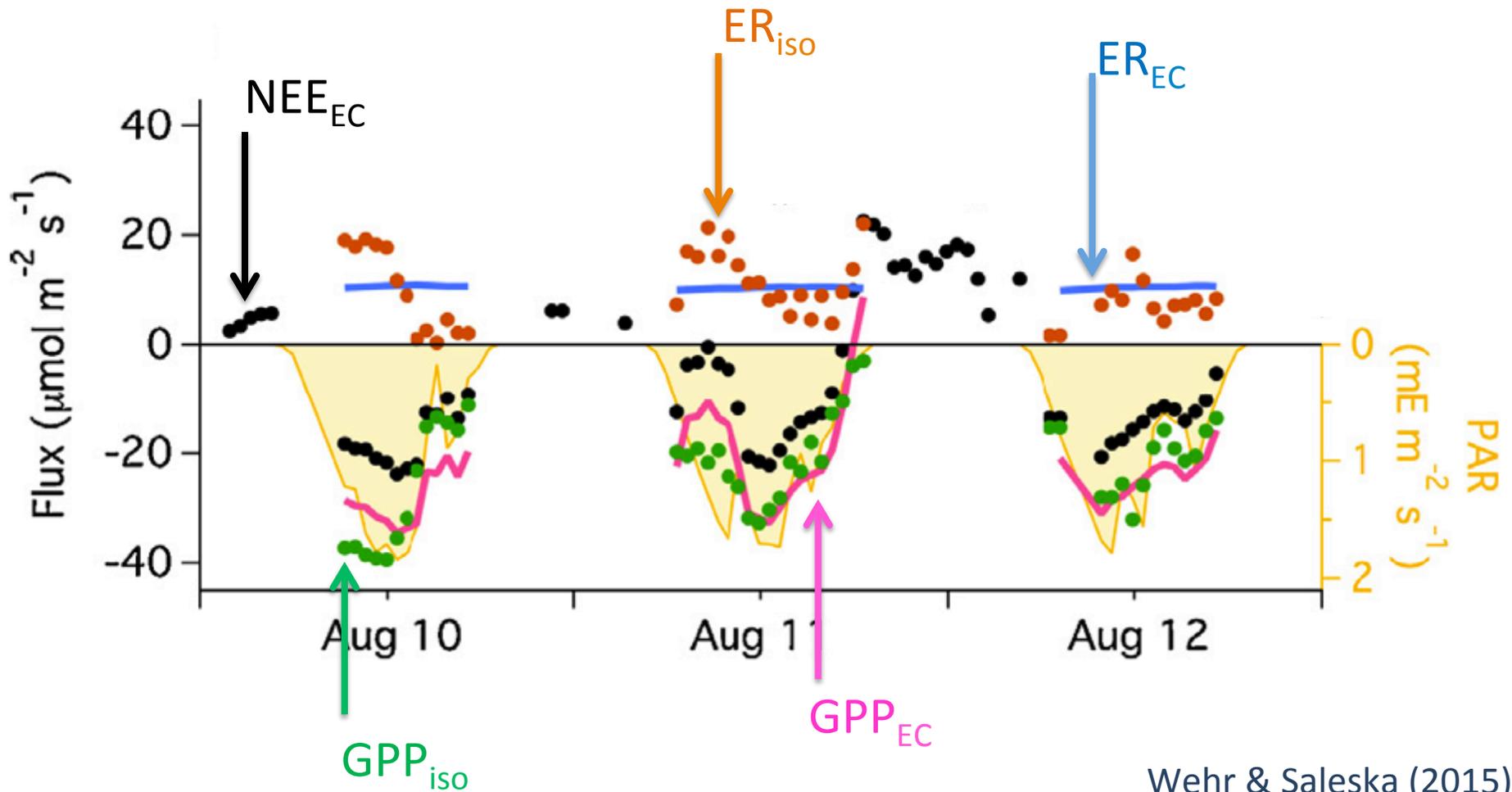
Fick's law; big-leaf approximation

$$g_c = f(\lambda E, H, R_{net}, r_a, VPD, T_a) \quad \text{Penman-Monteith}$$

Yakir & Wang (1996), Bowling et al. (2001), Ogee et al. (2003),

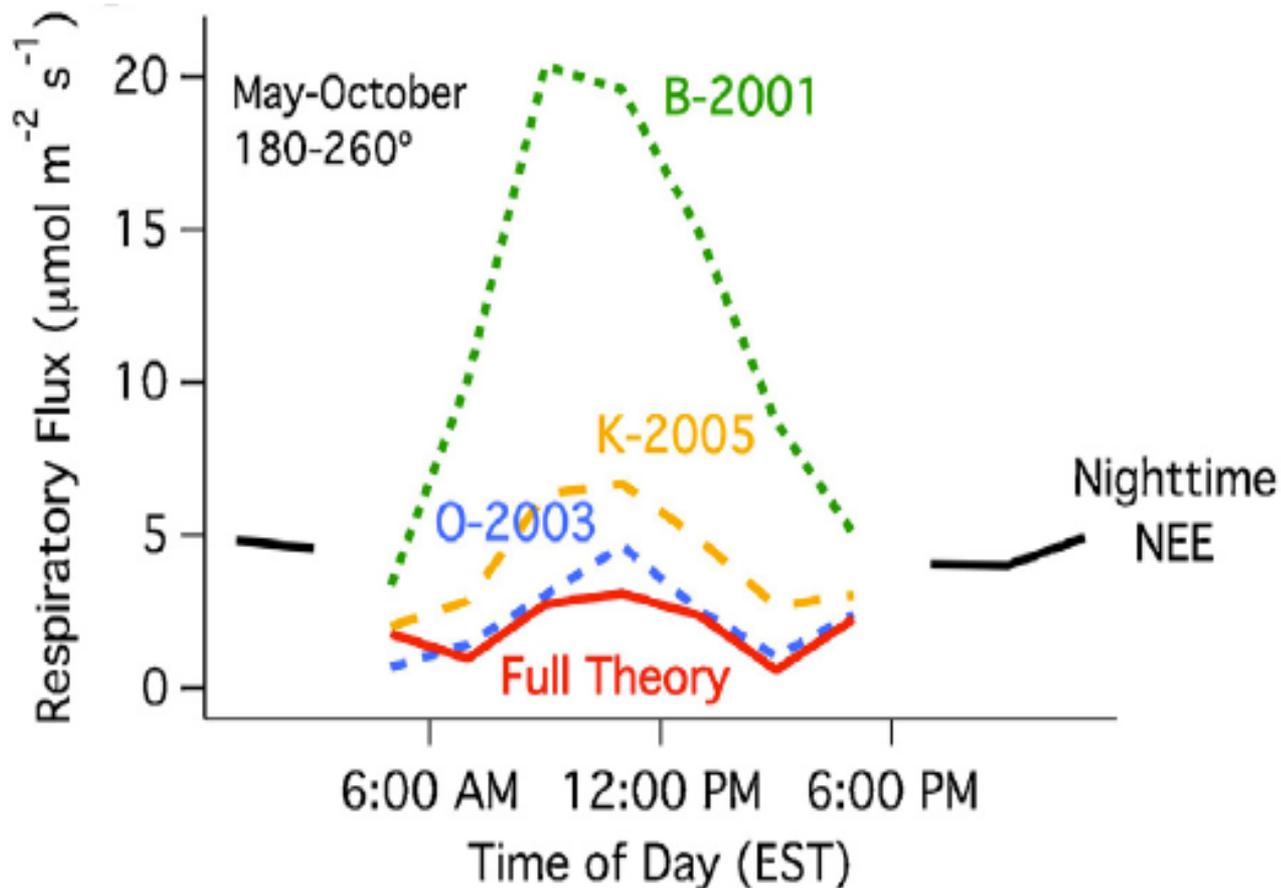
Wehr & Saleska (2015)

# Isotopic flux partitioning



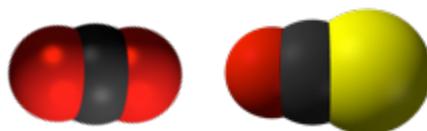
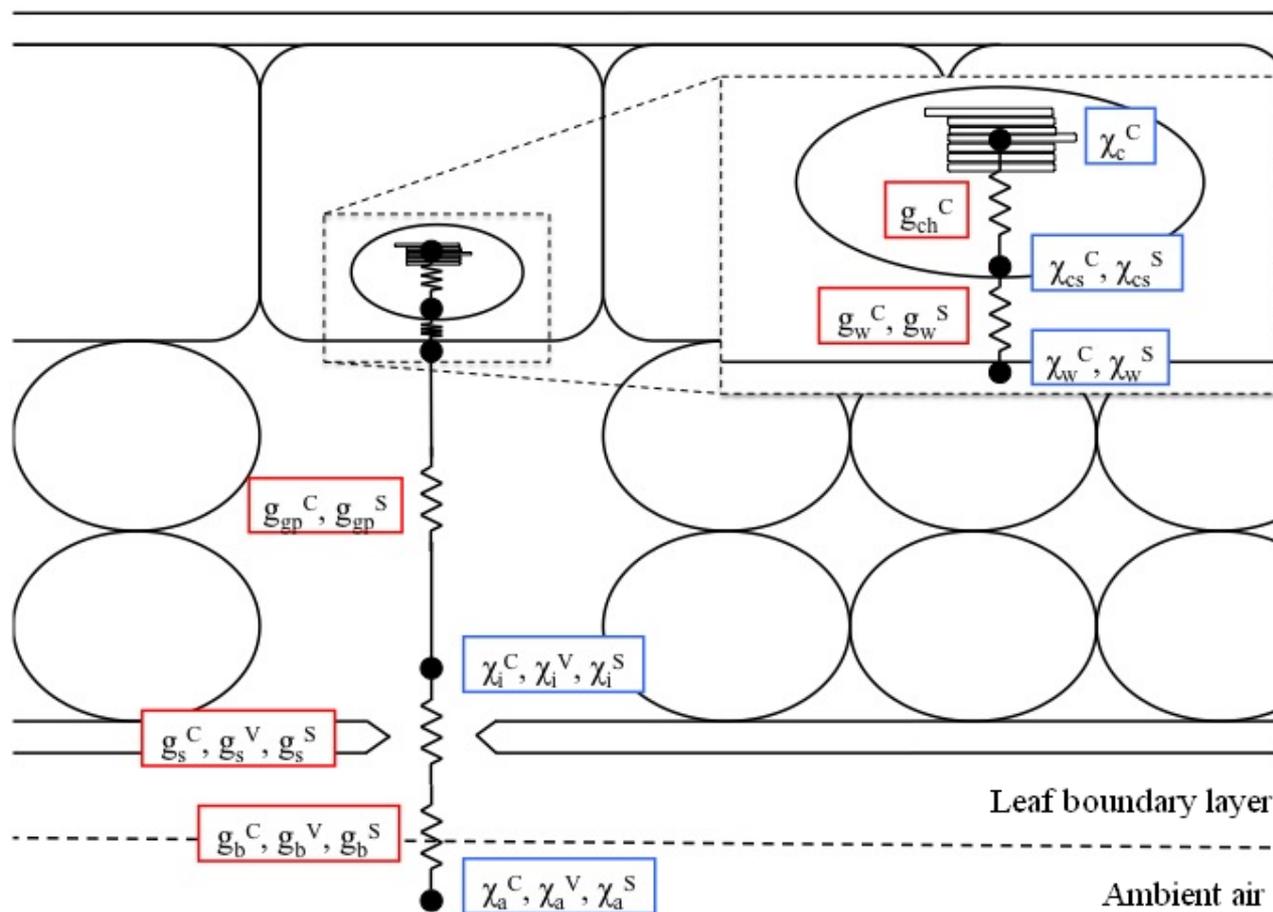


# Isotopic flux partitioning





# COS flux partitioning





# COS flux partitioning

Measurements



GPP

$$F_{\text{COS}}, \chi_{\text{COS}}, \chi_{\text{CO}_2}$$

$$\lambda = (F_{\text{COS}} / \chi_{\text{COS}}) /$$

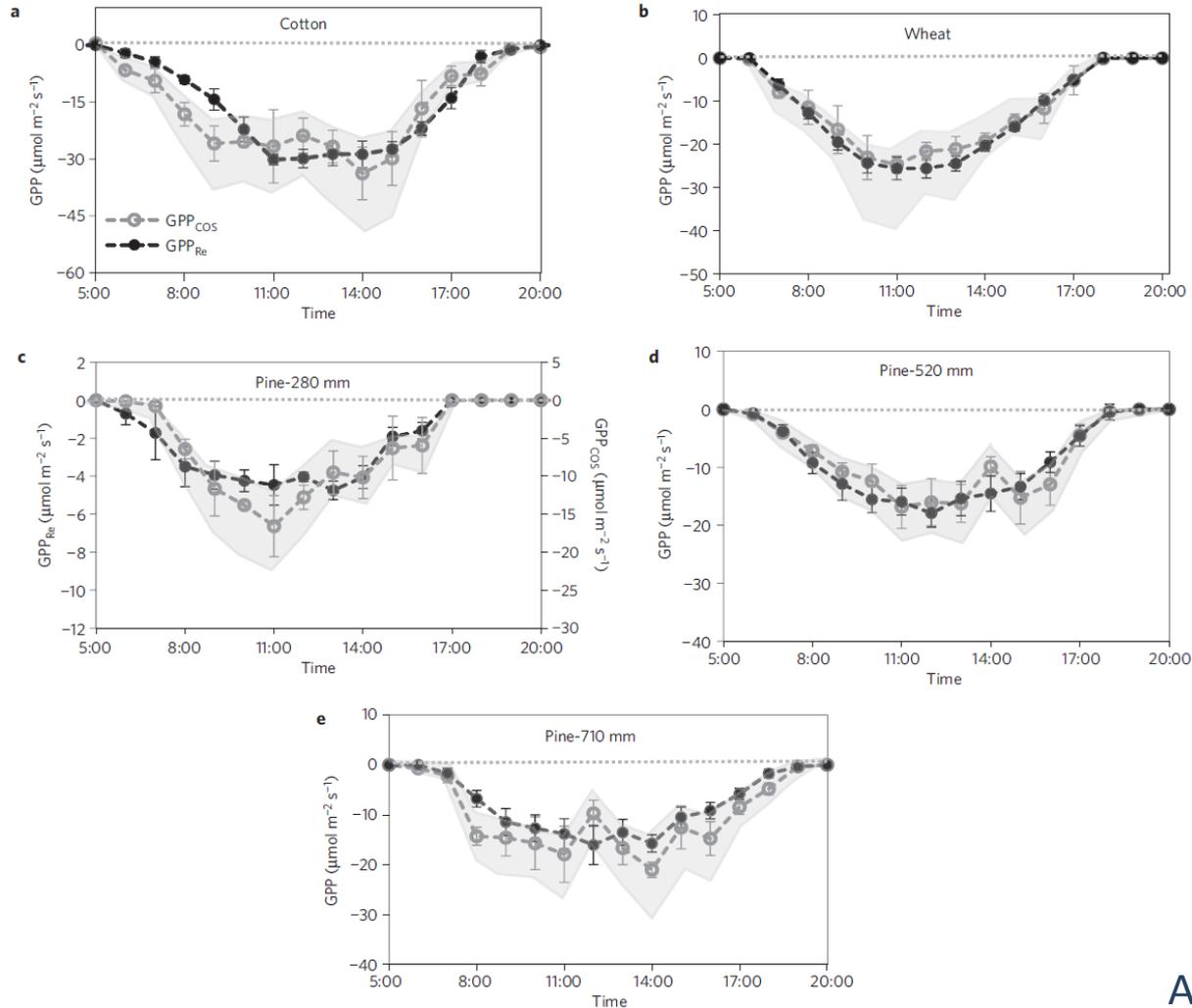
$$GPP = (\chi_{\text{CO}_2} / \chi_{\text{COS}}) \cdot (F_{\text{COS}} / \lambda)$$

$$(GPP / \chi_{\text{CO}_2}) \approx \text{const.}$$

no other COS sources or sinks

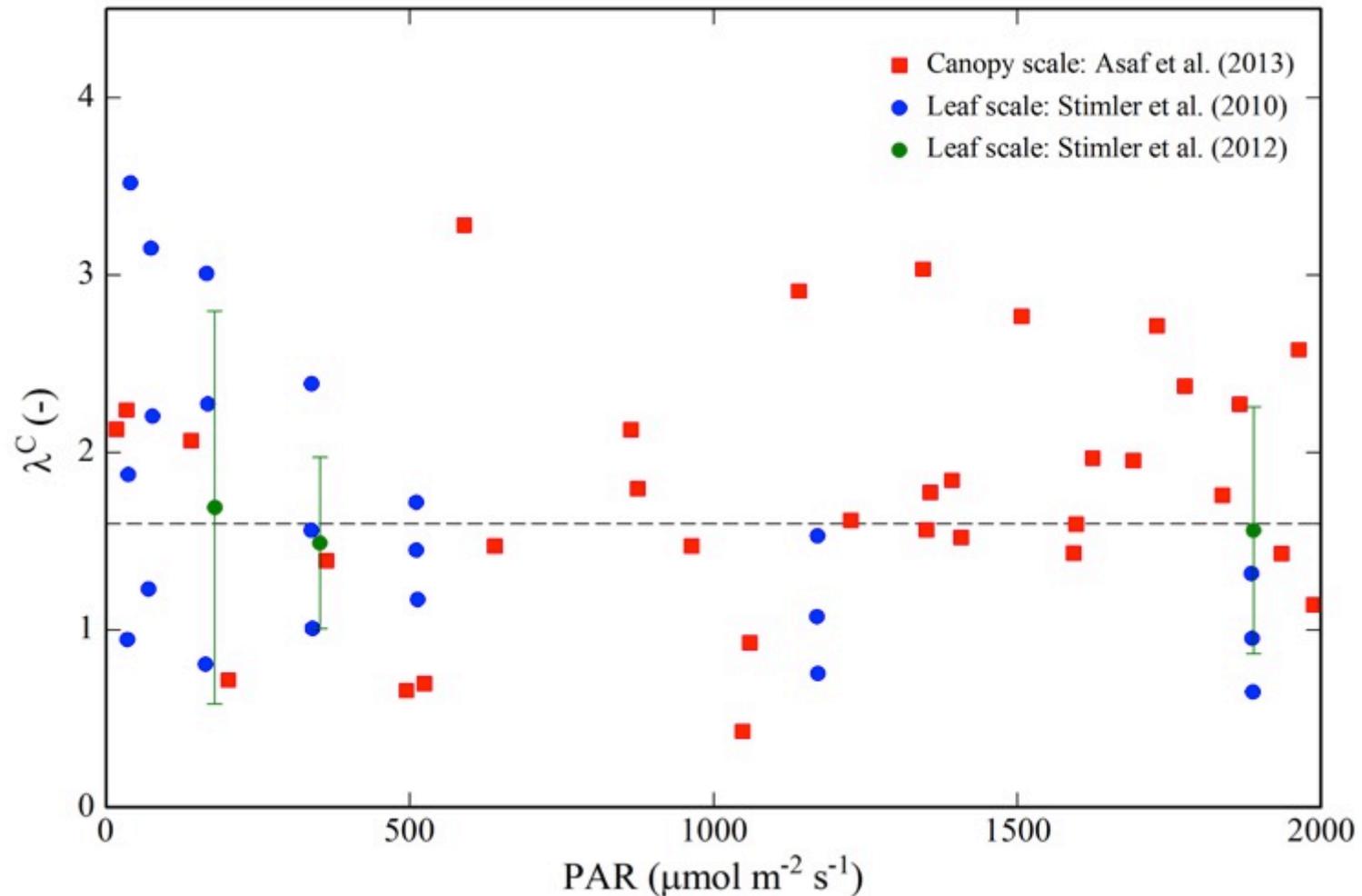


# COS flux partitioning



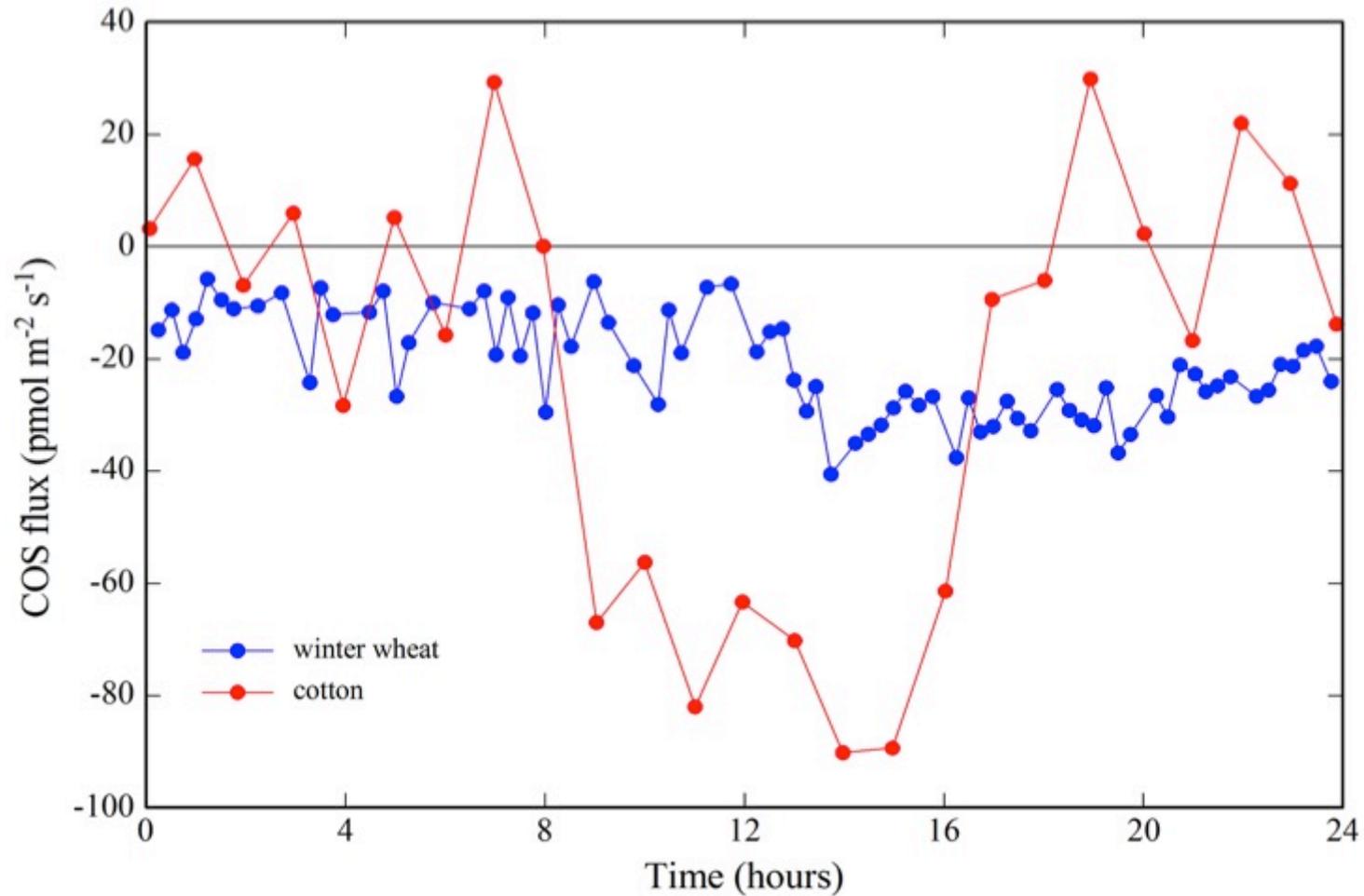


# COS flux partitioning



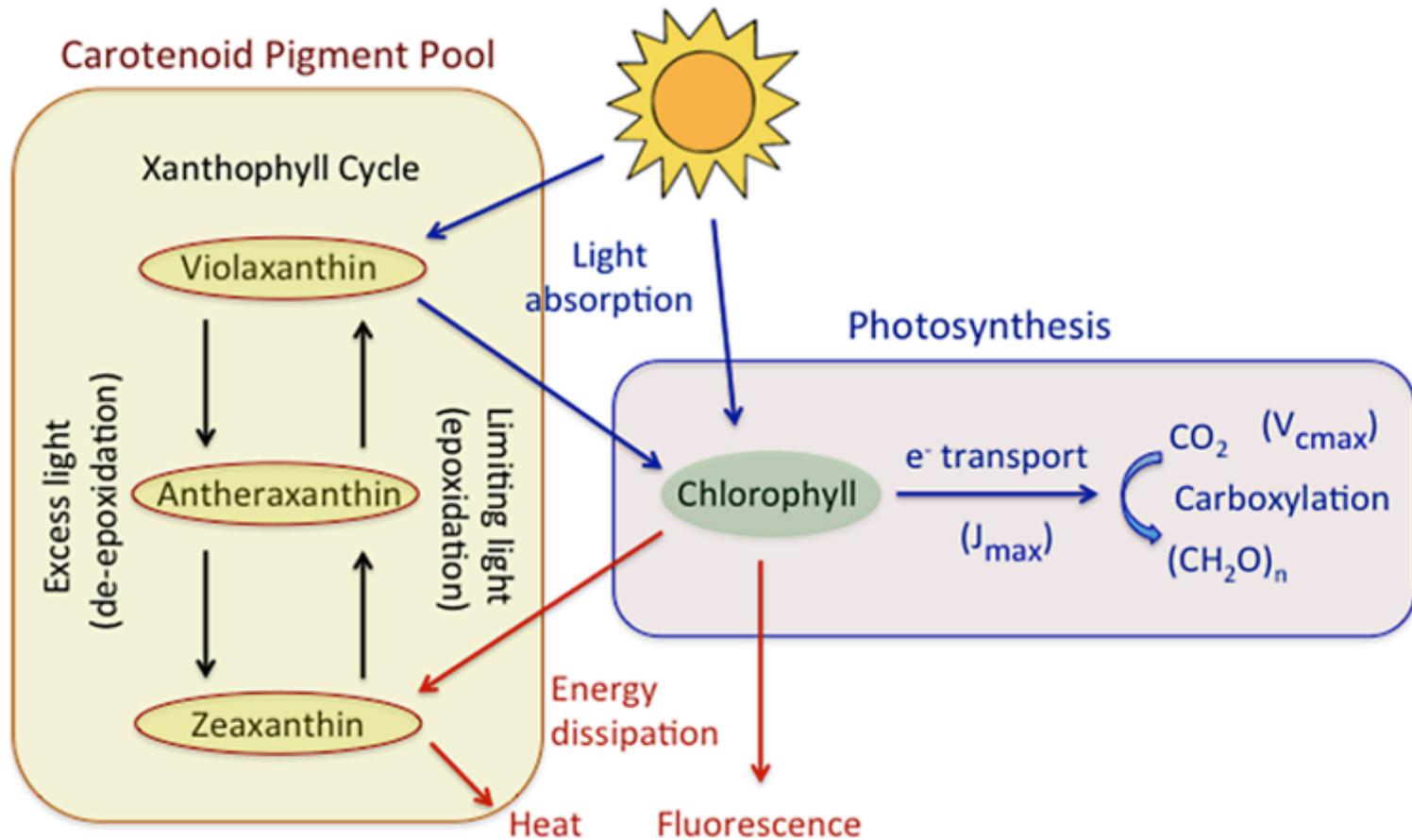


# COS flux partitioning



data from Asaf et al. (2013; cotton) and Billesbach et al. (2014; winter wheat)

# Photochemical reflectance index (PRI)



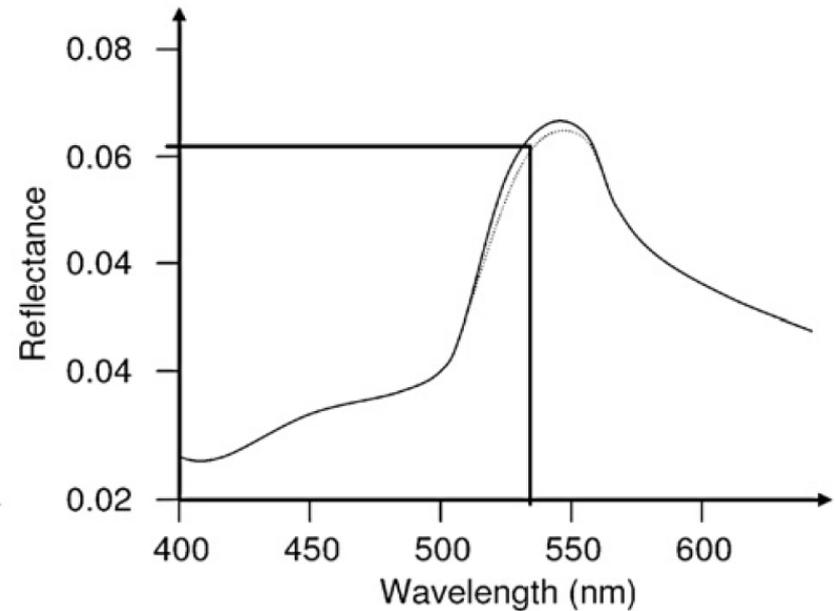
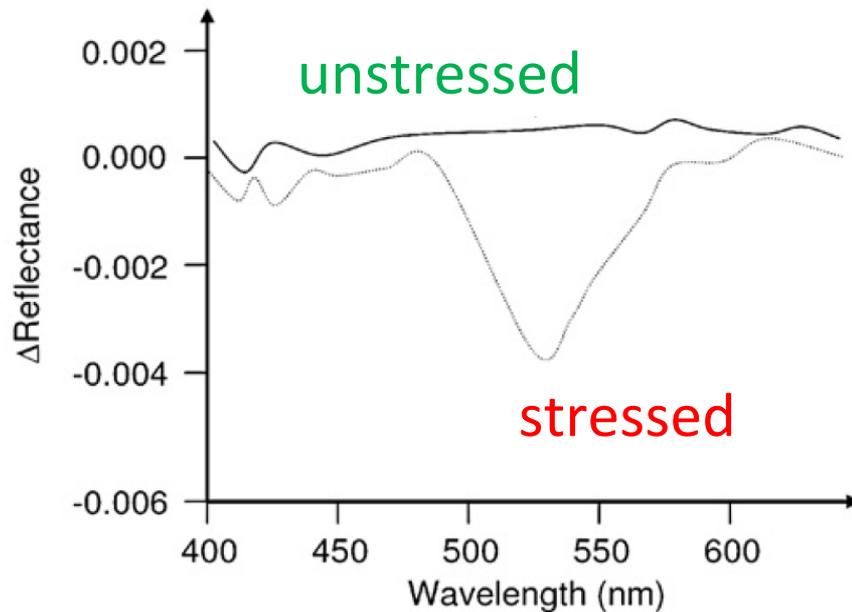


# PRI

$$PRI = (\rho_d - \rho_r) / (\rho_d + \rho_r)$$

$$\rho_d = 531\text{nm}, \rho_r = 570\text{nm}$$

Gamon et al. (1992)



Hall et al. (2008)



PRI

Measurements →

Model

→ GPP

PAR, NDVI, PRI,  
 $f_{\text{dif}}$ ,  $f_{\text{sun}}$

$$f_{\text{APAR}} = f(\text{NDVI})$$

$$\epsilon = f(\text{PRI}, f_{\text{dif}}, f_{\text{sun}})$$

$$\text{GPP} = \text{PAR} \cdot f_{\text{APAR}} \cdot \epsilon$$

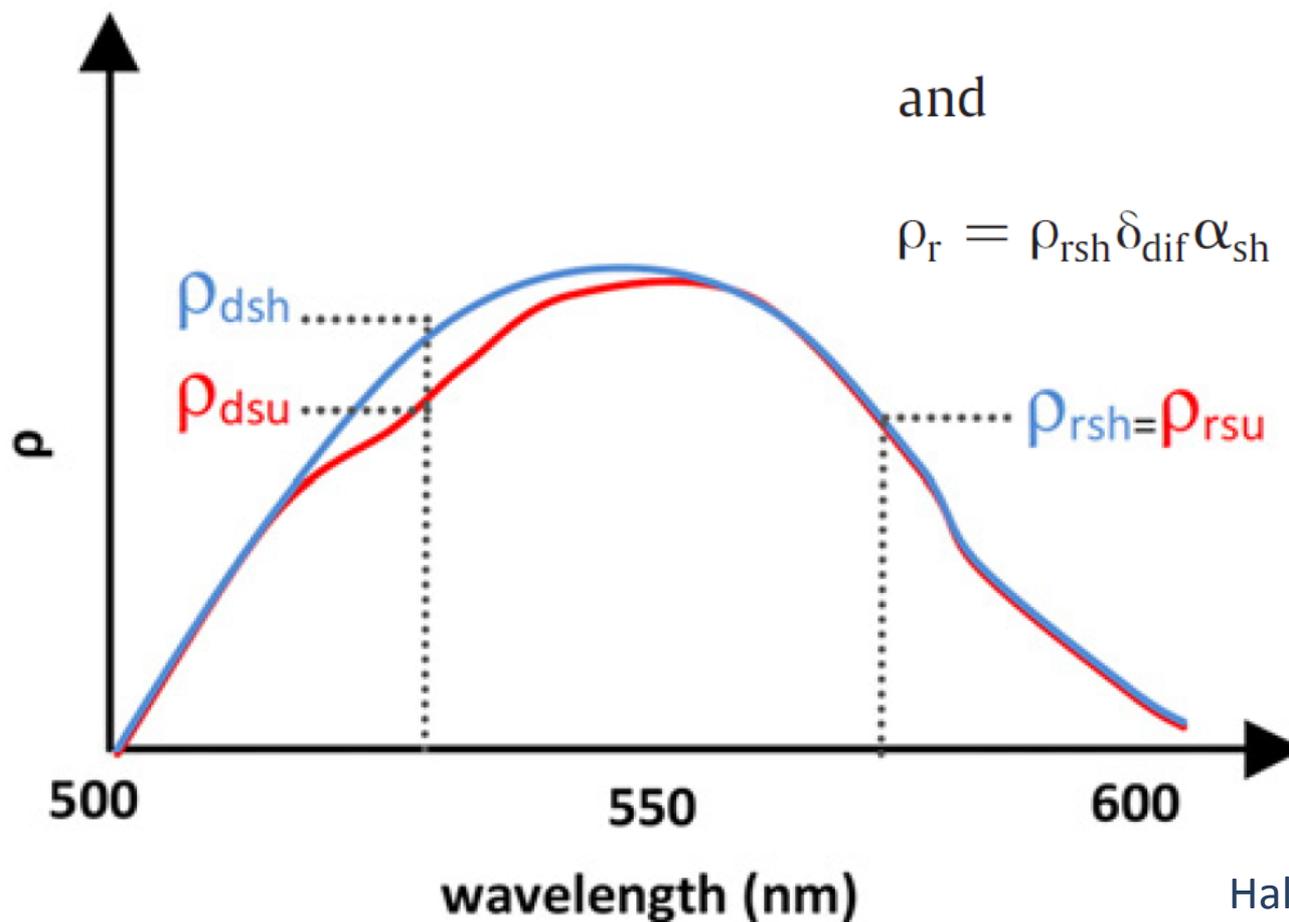


## PRI

$$\rho_d = \rho_{dsh} \delta_{dif} \alpha_{sh} + \rho_{dsu} \alpha_{su},$$

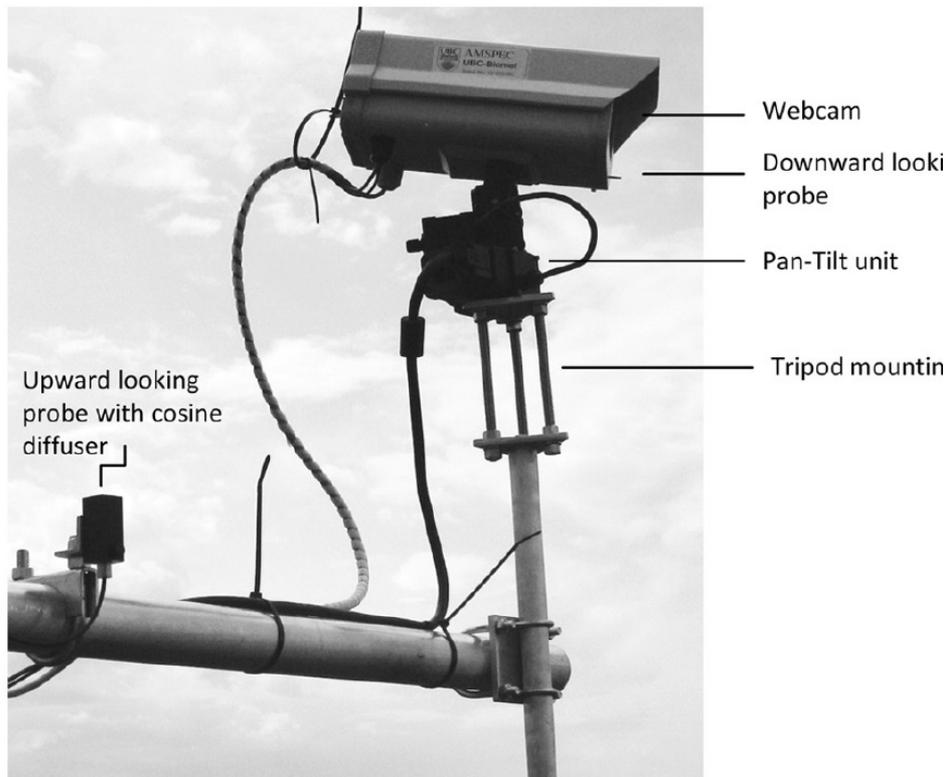
and

$$\rho_r = \rho_{rsh} \delta_{dif} \alpha_{sh} + \rho_{rsu} \alpha_{su},$$

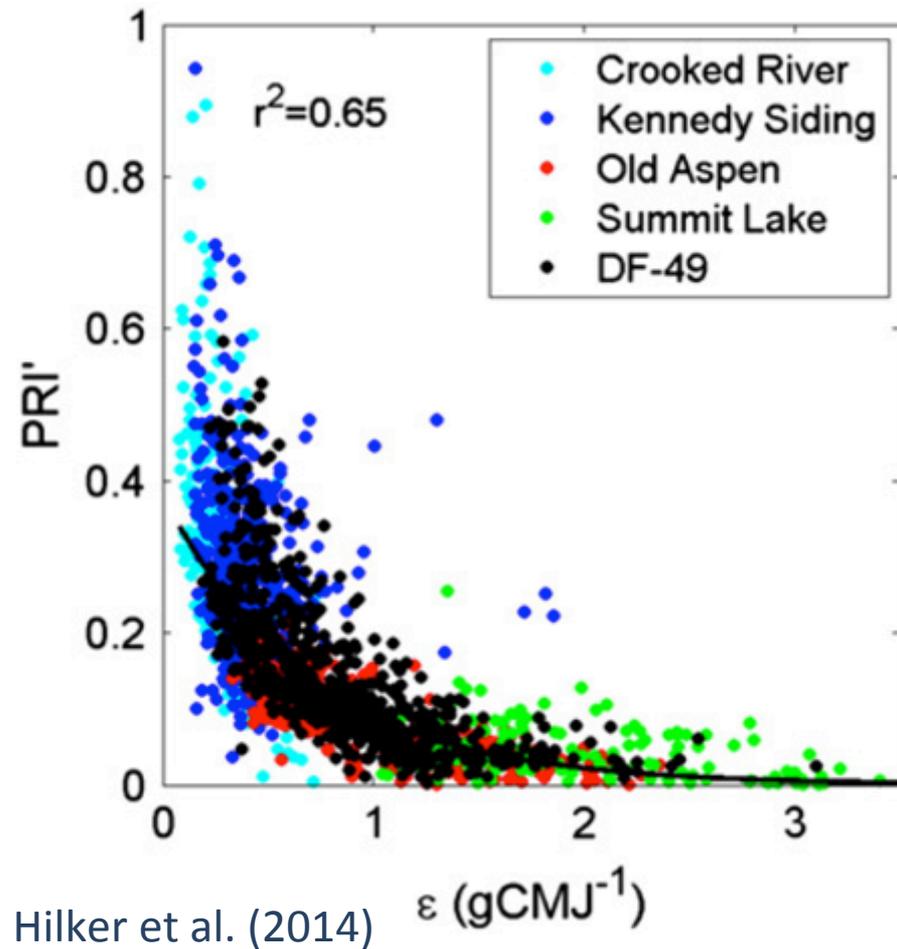




# PRI



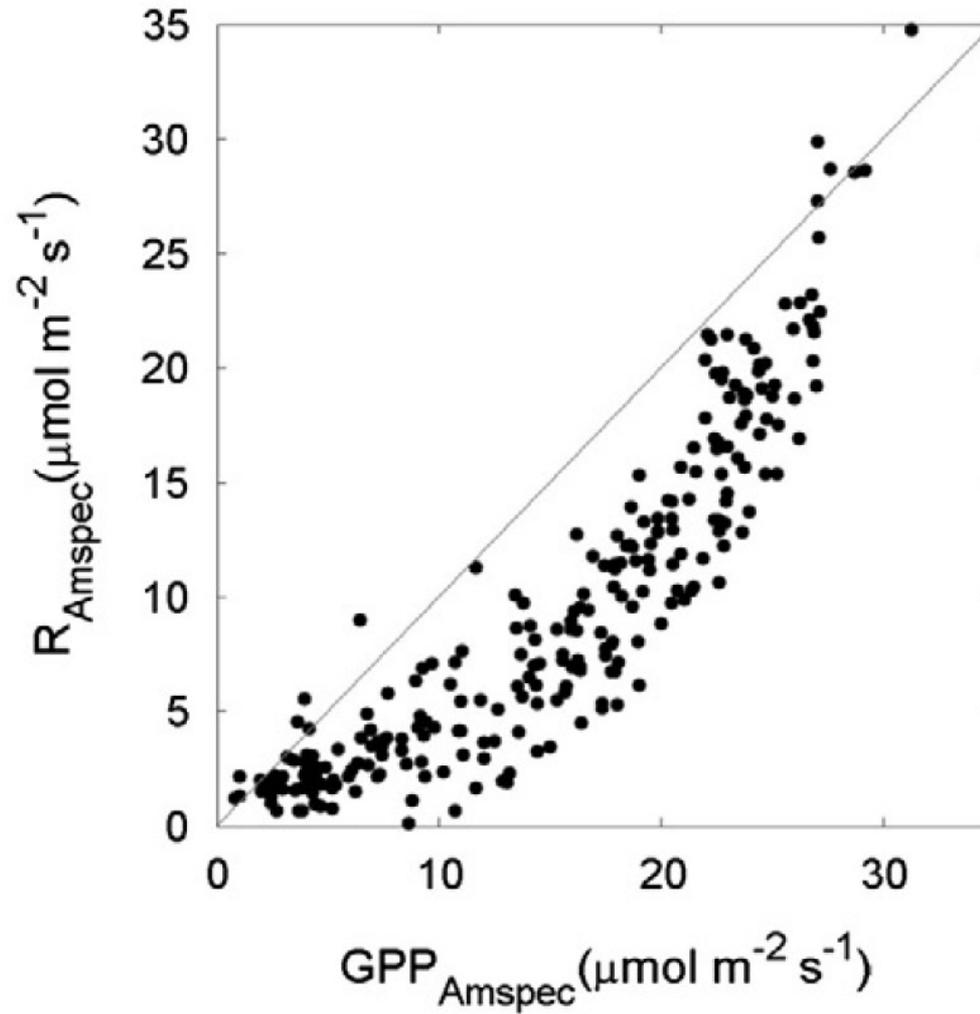
Hilker et al. (2010)



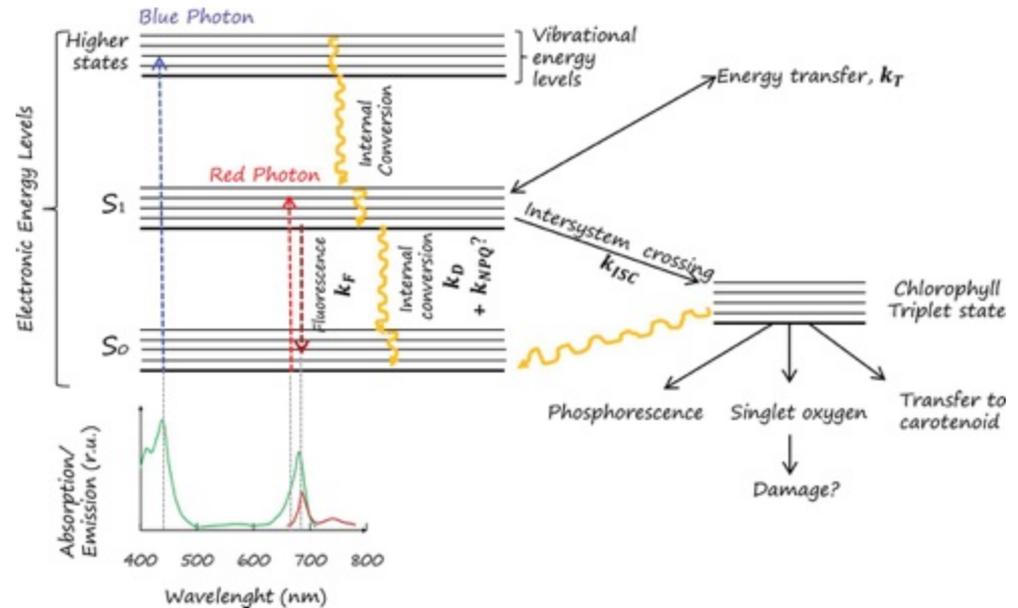
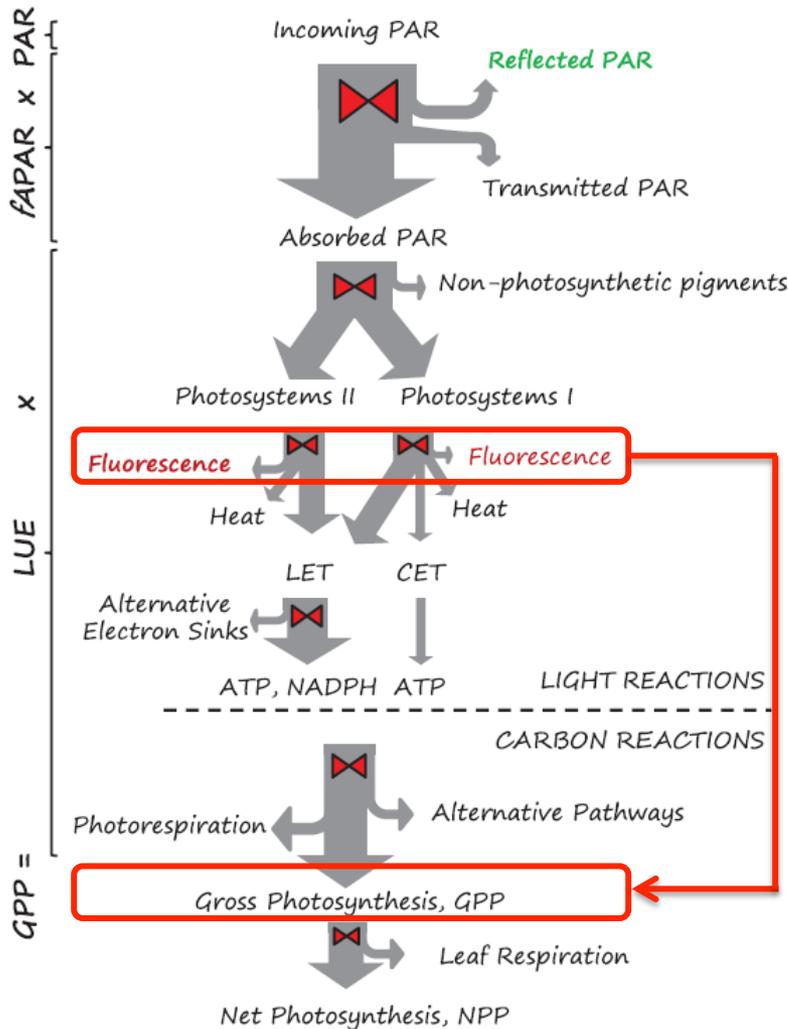
Hilker et al. (2014)



# PRI

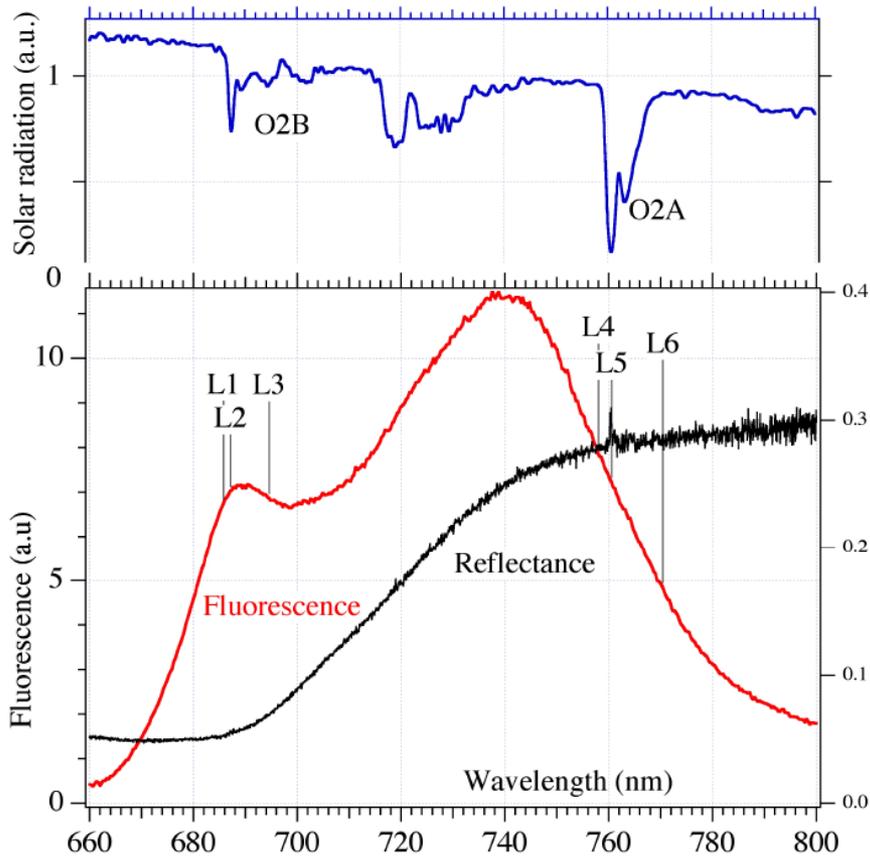


# Sun-induced fluorescence

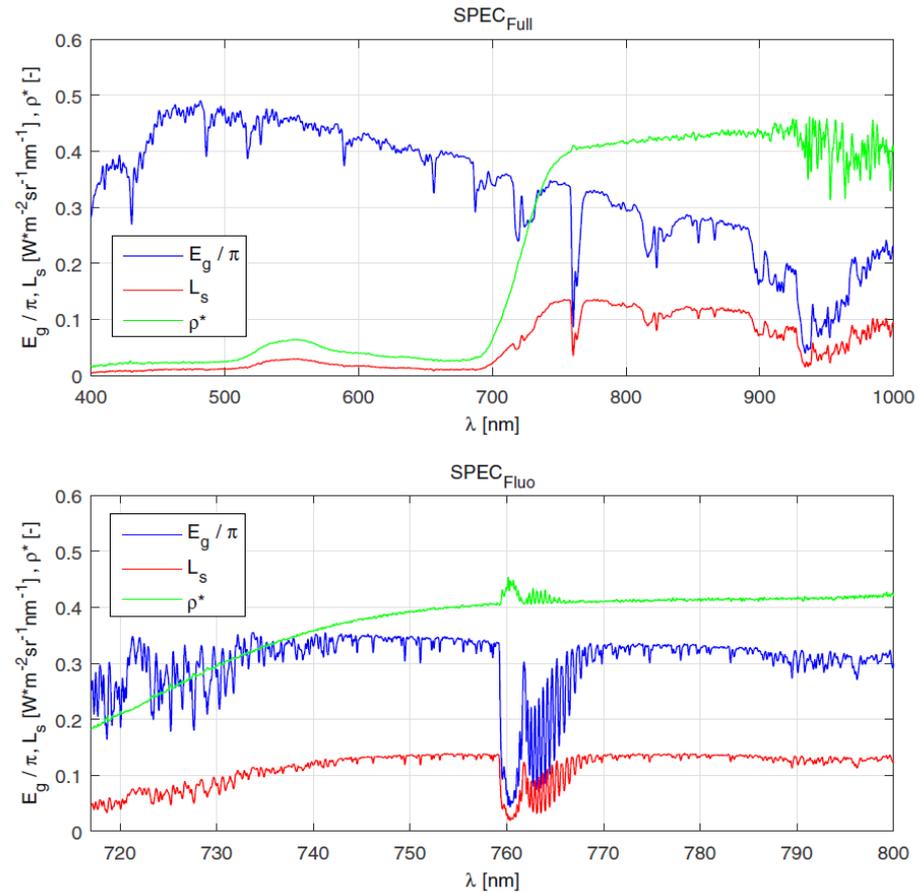




# Sun-induced fluorescence



Rascher et al. (2008)



Cogliati et al. (2015)

# Sun-induced fluorescence

Measurements



Model



GPP

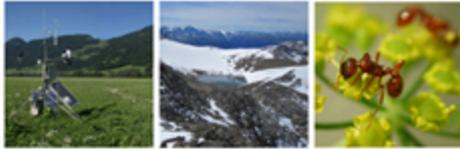
SIF

$$GPP = PAR \cdot fAPAR \cdot \epsilon_p$$

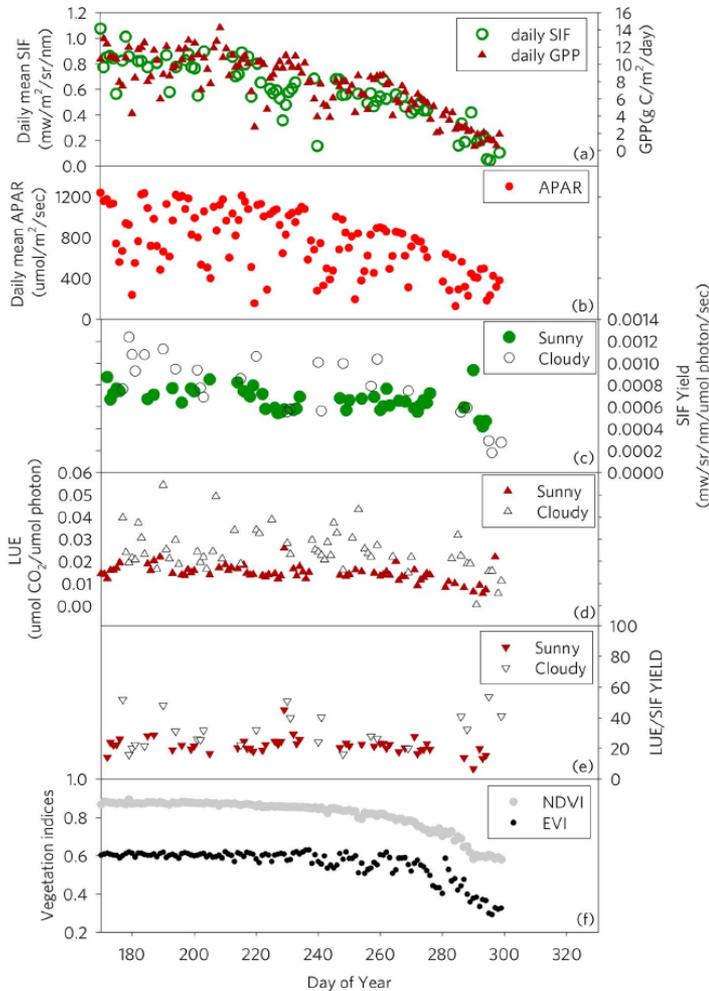
$$GPP = SIF \cdot \epsilon_p / \epsilon_f$$

$$SIF = PAR \cdot fAPAR \cdot \epsilon_f$$

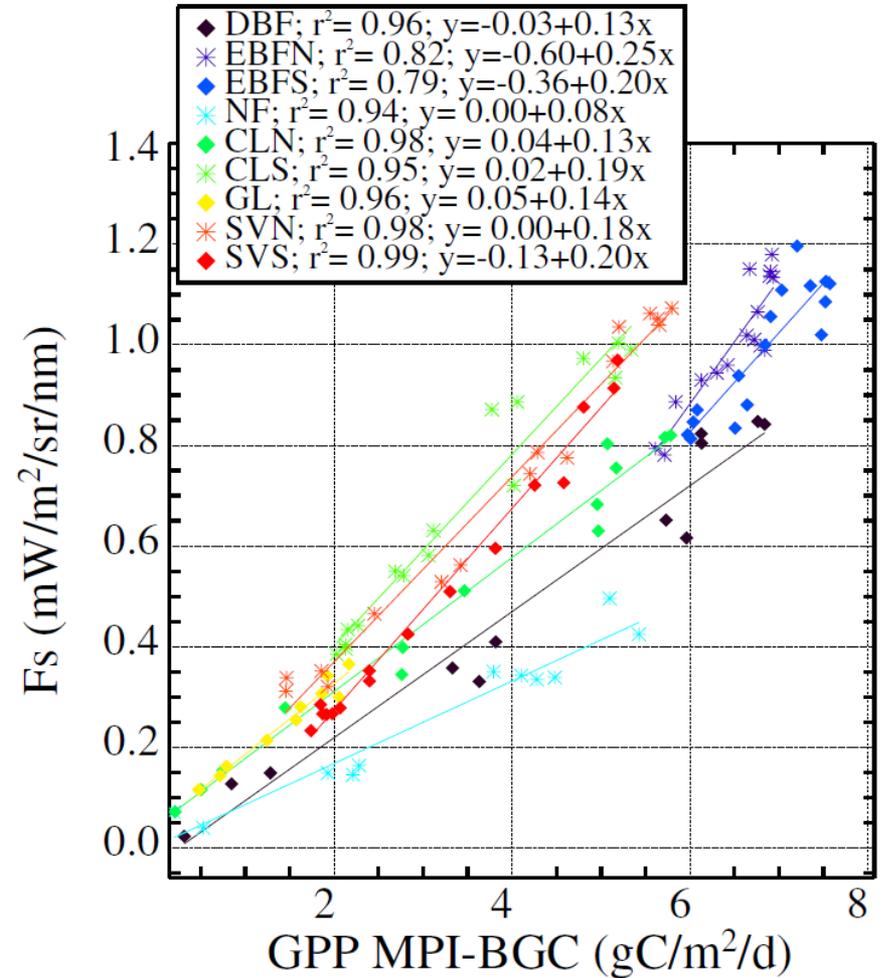
$$\epsilon_p / \epsilon_f \approx \Phi_p / \Phi_f \approx \text{const.}$$



# Sun-induced fluorescence

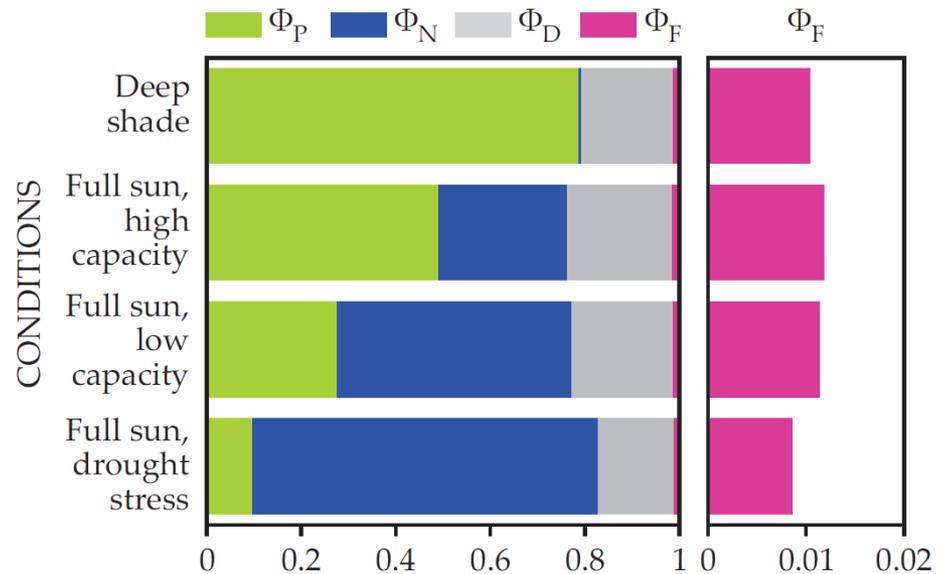
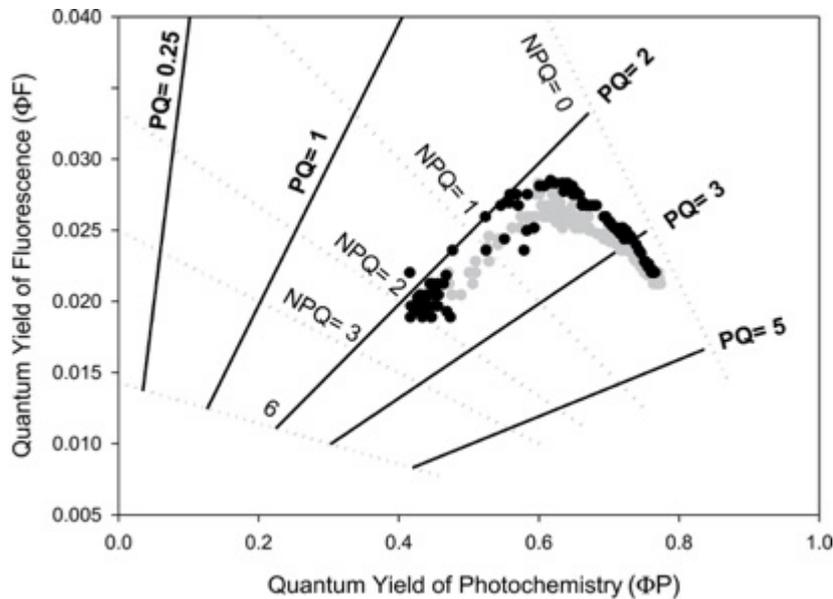


Yang et al. (2015)



Guanter et al. (2012)

# Sun-induced fluorescence





# CO<sub>2</sub>-FP revisited

$$NEP_n = -(R_{\text{dark}} + R_{\text{non-leaf}})$$

$$NEP_d = V_c - 0.5V_o - (R_{\text{day}} + R_{\text{non-leaf}})$$

$f(T)$

$$R_{\text{day}} = R_{\text{dark}} \cdot k$$

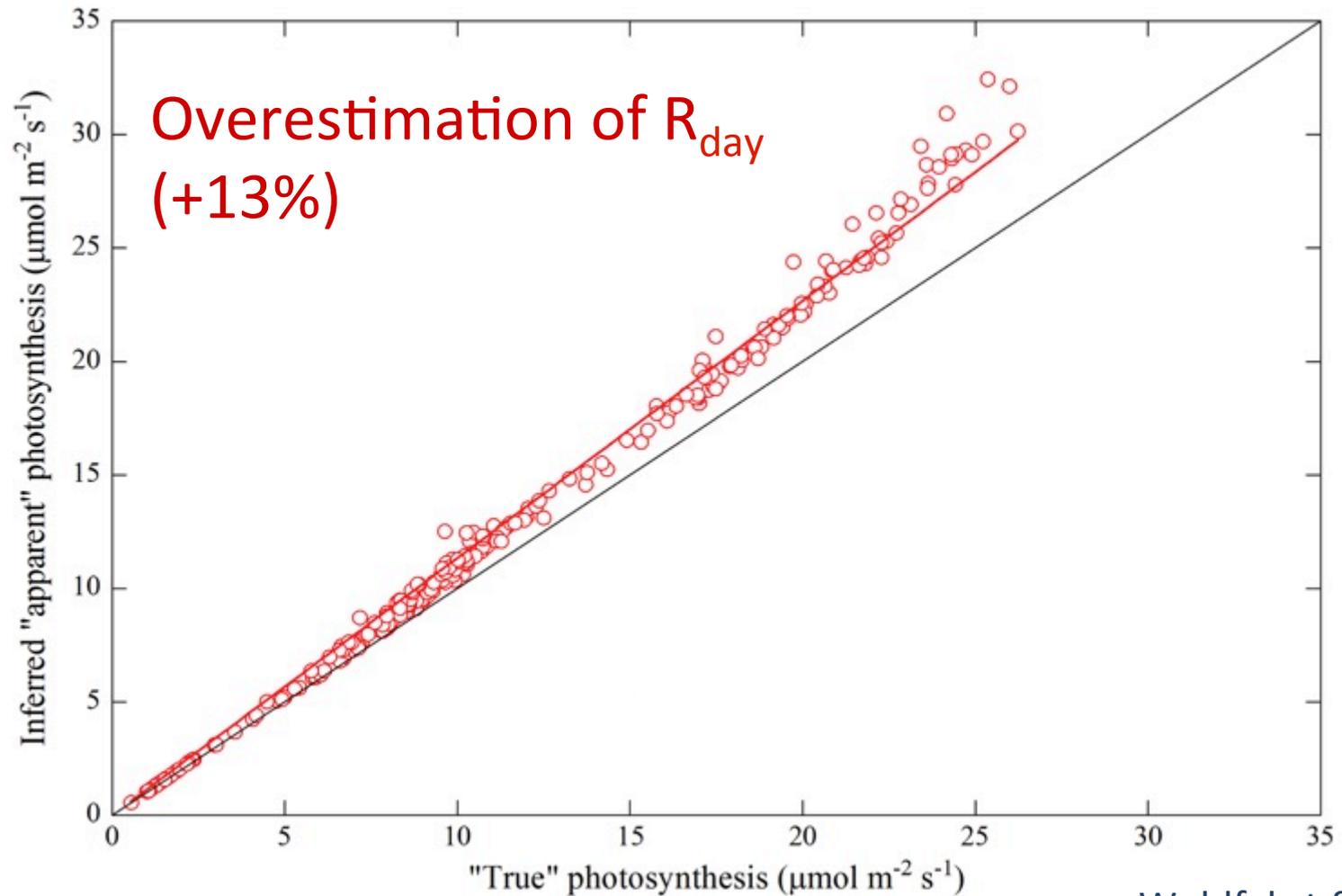
$$0.2 < k < 1.3$$

(Niinemets, 2014)

#1: because  $R_{\text{day}} < R_{\text{dark}}$ ,  $NEP_n$  overestimates daytime ecosystem respiration



# CO<sub>2</sub>-FP revisited





# CO<sub>2</sub>-FP revisited

$$NEP_n = -(R_{\text{dark}} + R_{\text{non-leaf}})$$

$$NEP_d = V_c - 0.5V_o - (R_{\text{day}} + R_{\text{non-leaf}})$$

$f(T)$

$$R_{\text{day}} = R_{\text{dark}} \cdot k$$

$$0.2 < k < 1.3$$

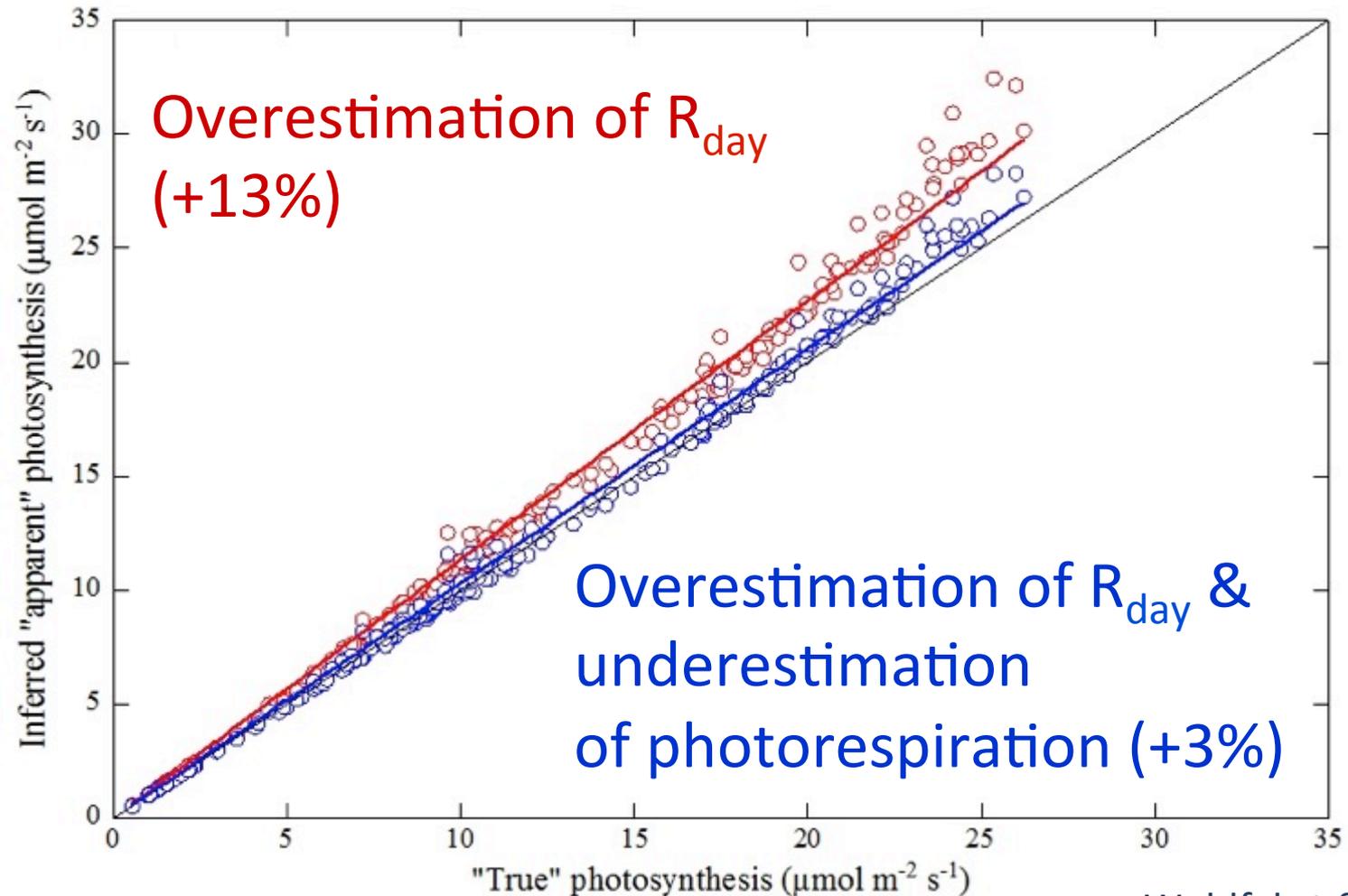
(Niinemets, 2014)

#1: because  $R_{\text{day}} < R_{\text{dark}}$ ,  $NEP_n$  overestimates daytime ecosystem respiration

#2:  $NEP_n$  carries no information about photorespiration



# CO<sub>2</sub>-FP revisited



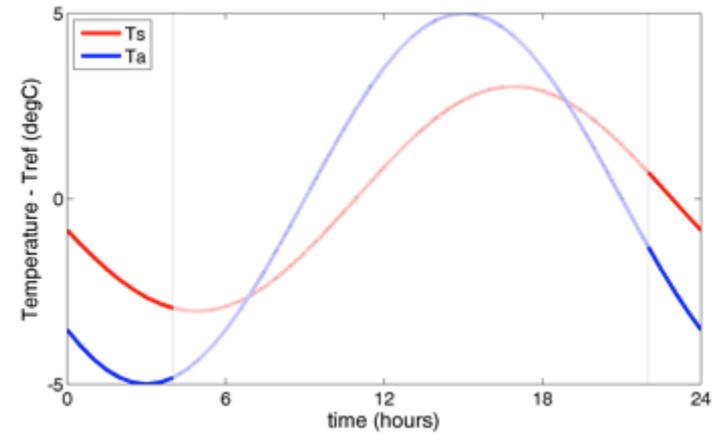


# CO<sub>2</sub>-FP revisited

$$R_{\text{eco}} = R_s + R_{\text{ag}}$$

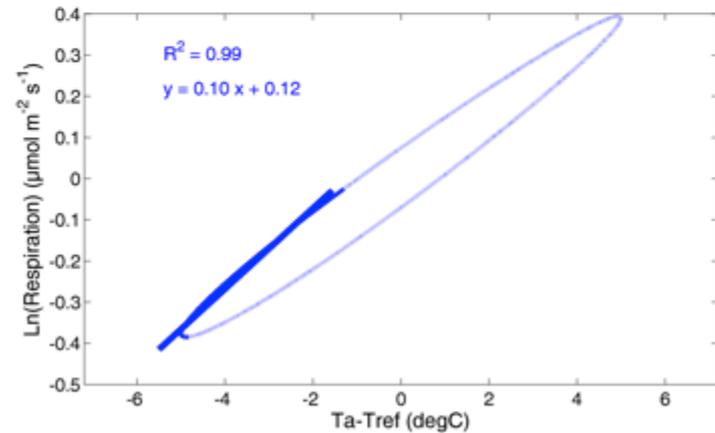
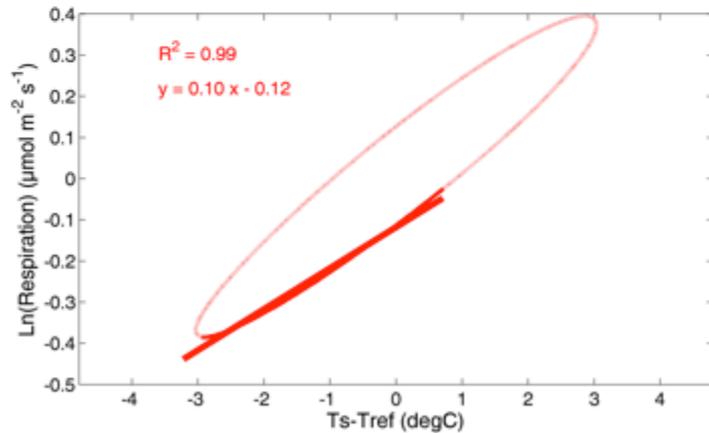
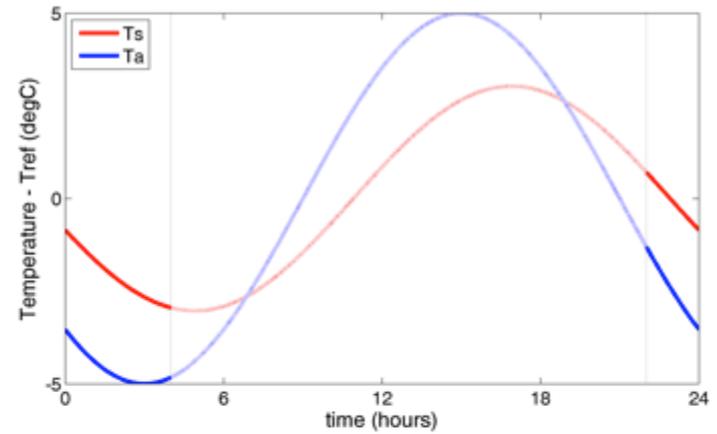
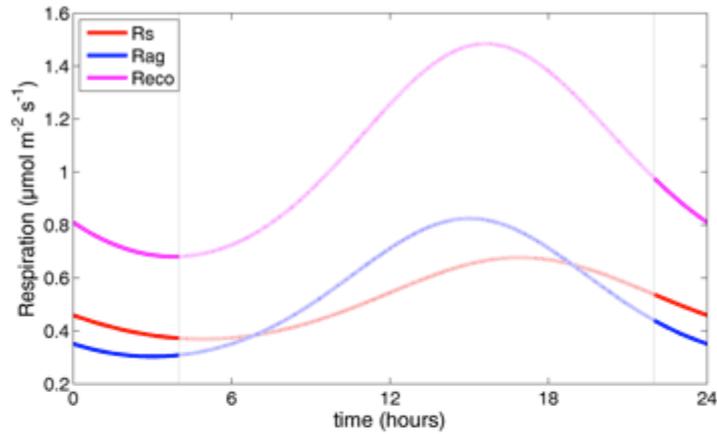
$$R_s = f(T_s)$$

$$R_{\text{ag}} = f(T_a)$$



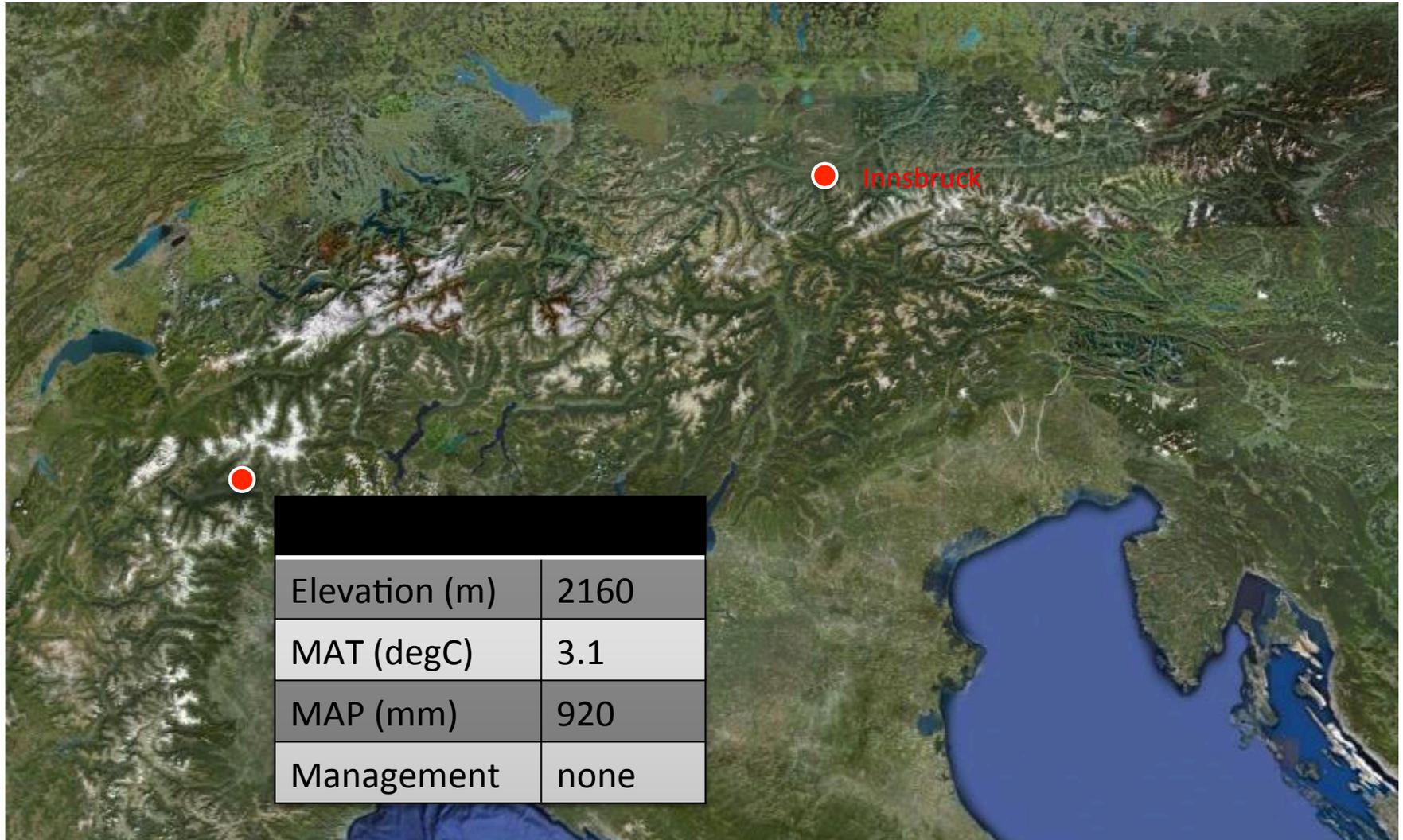


# CO<sub>2</sub>-FP revisited



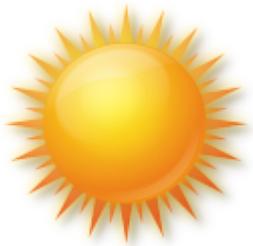


# CO<sub>2</sub>-FP revisited





# CO<sub>2</sub>-FP revisited

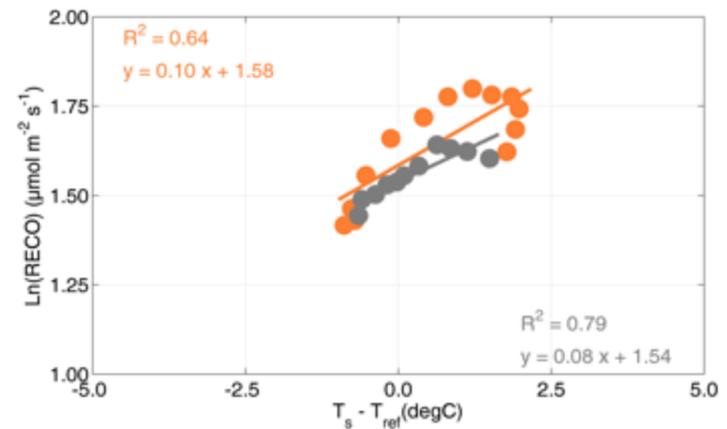
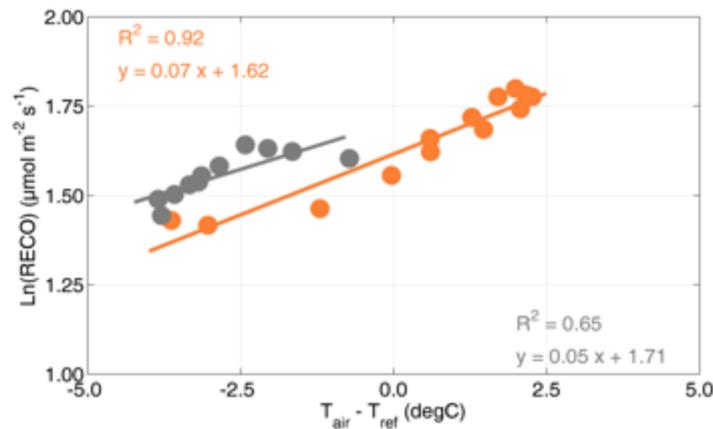
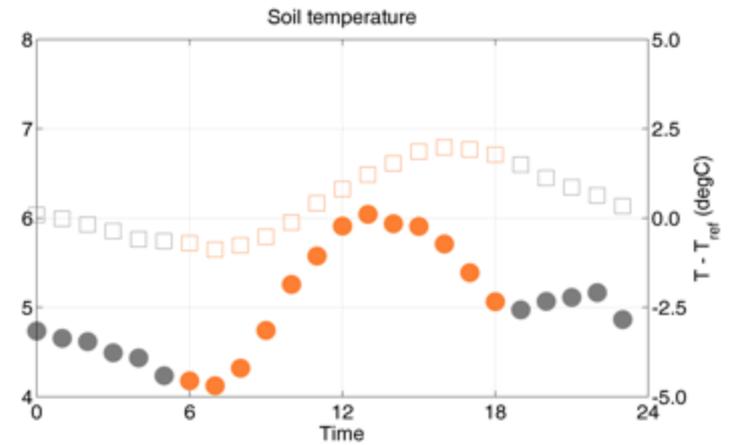
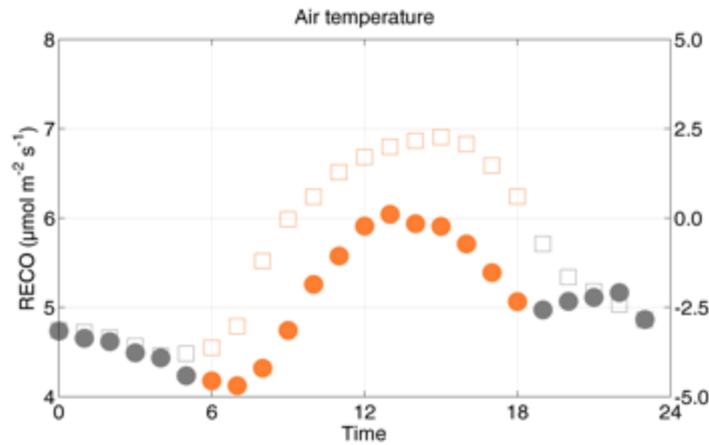


“dark” R<sub>eco</sub>



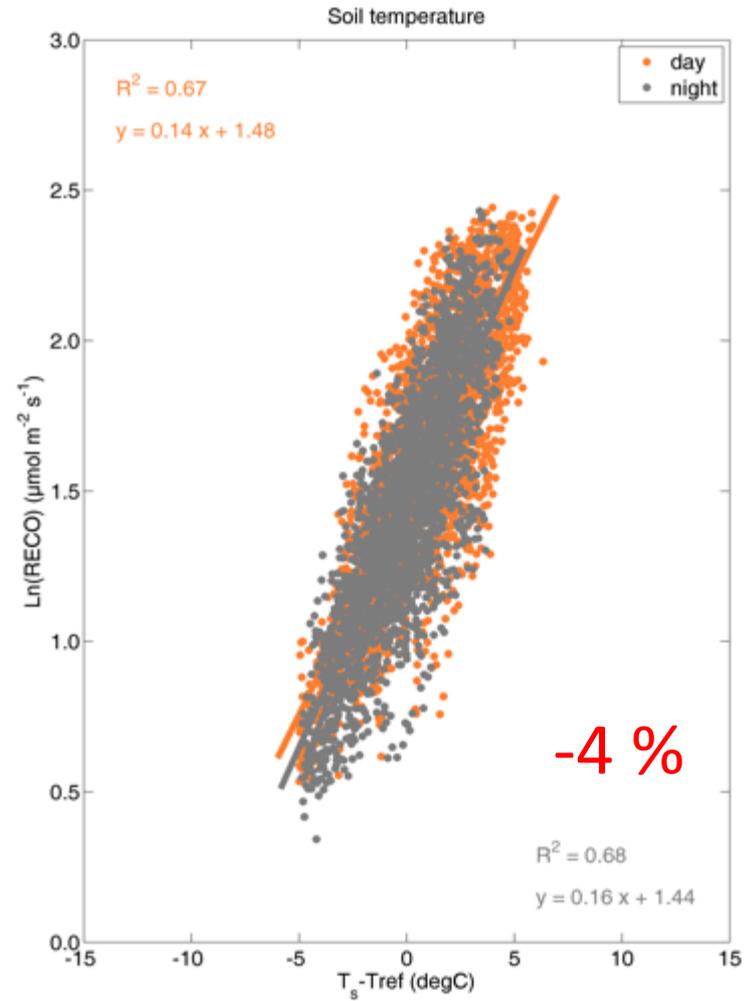
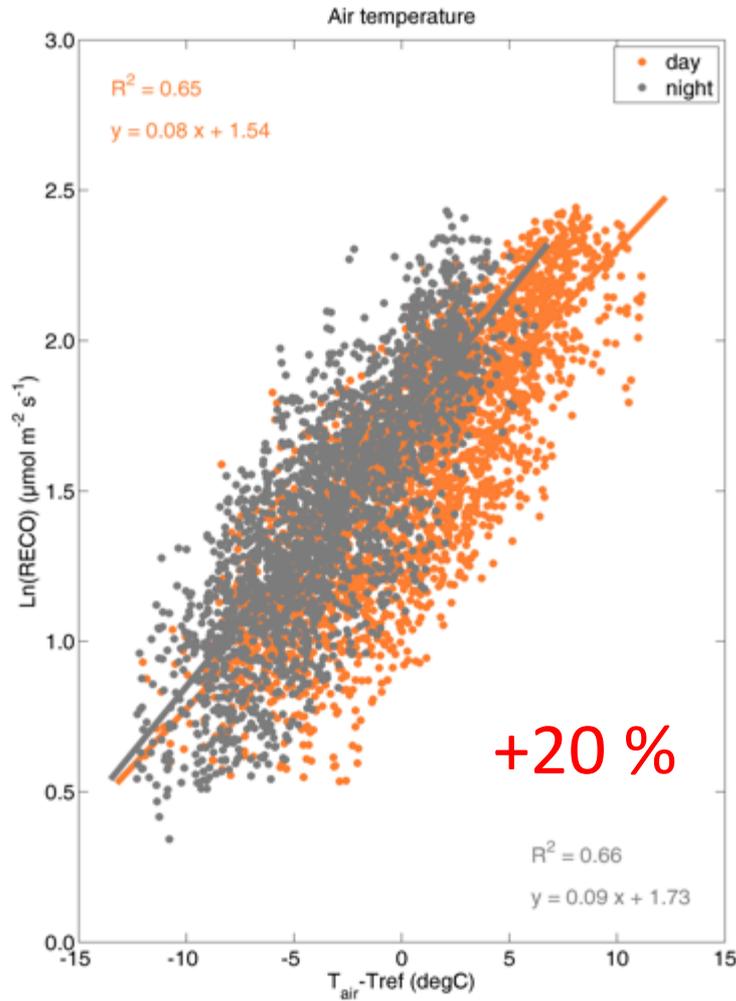


# CO<sub>2</sub>-FP revisited



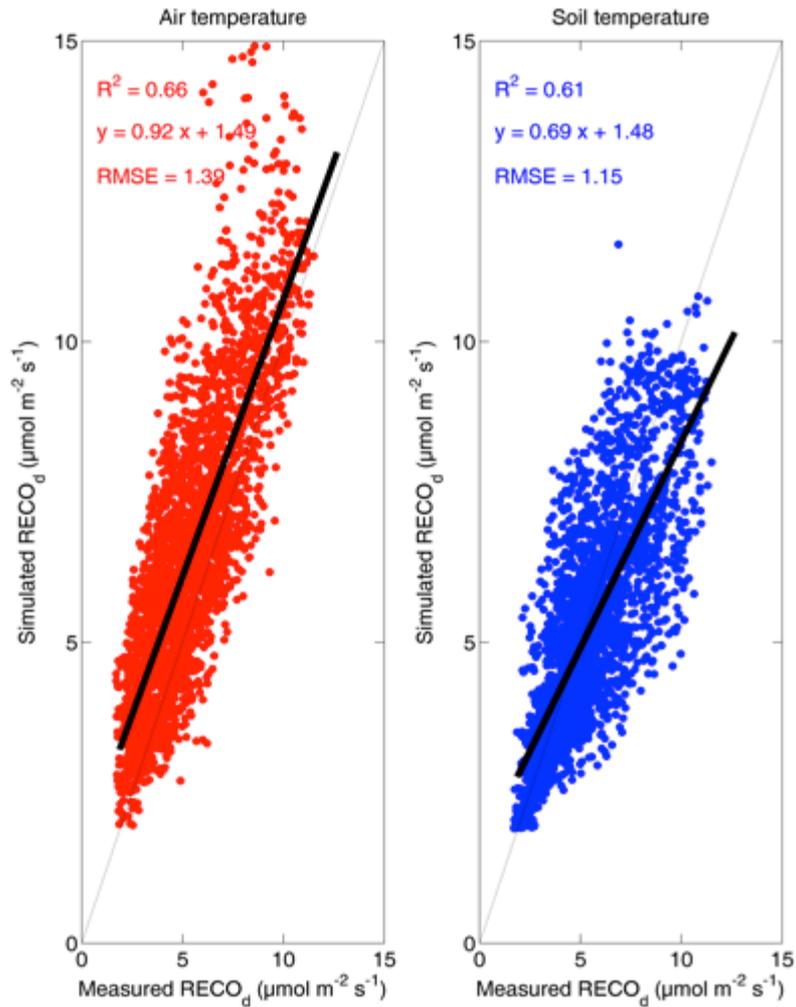


# CO<sub>2</sub>-FP revisited



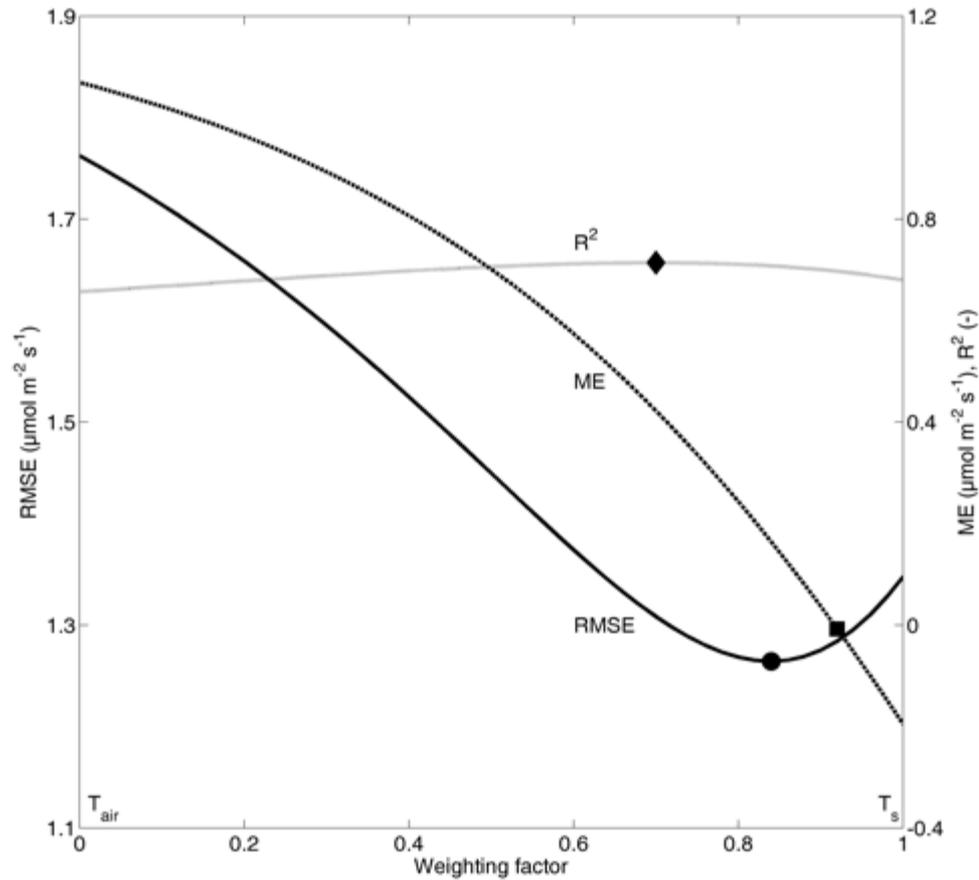


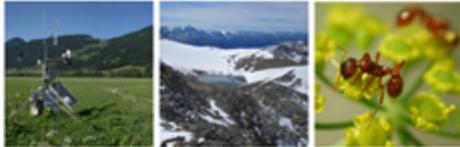
# CO<sub>2</sub>-FP revisited



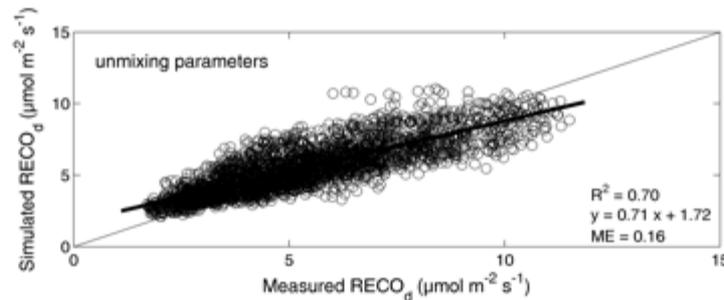
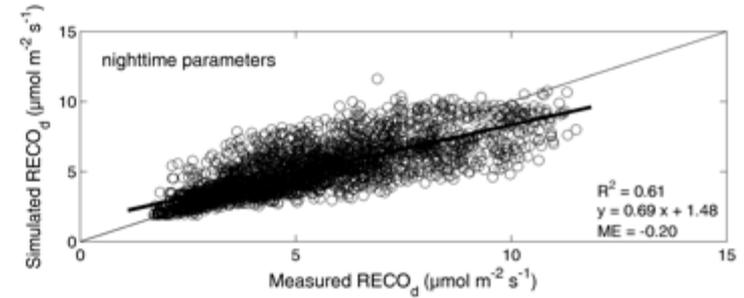
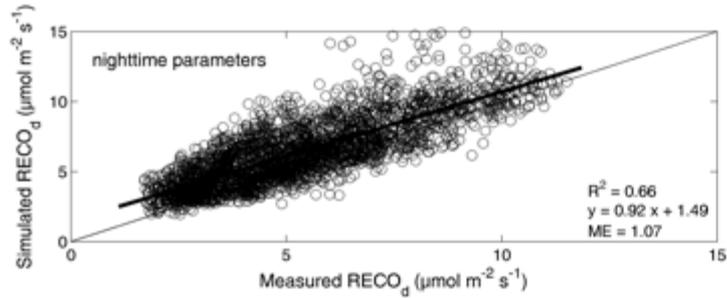
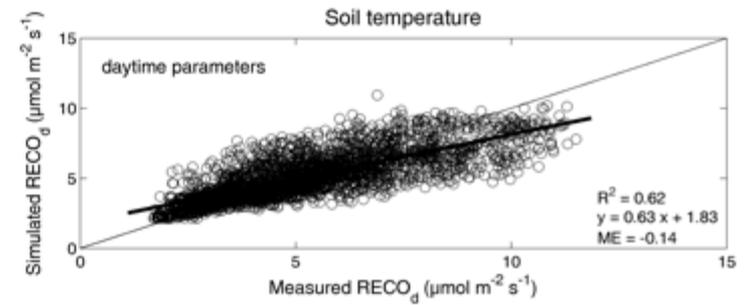
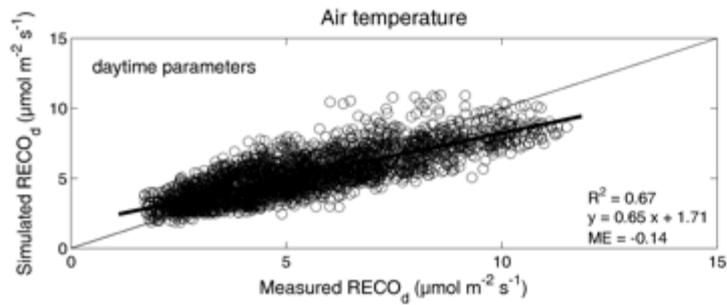


# CO<sub>2</sub>-FP revisited



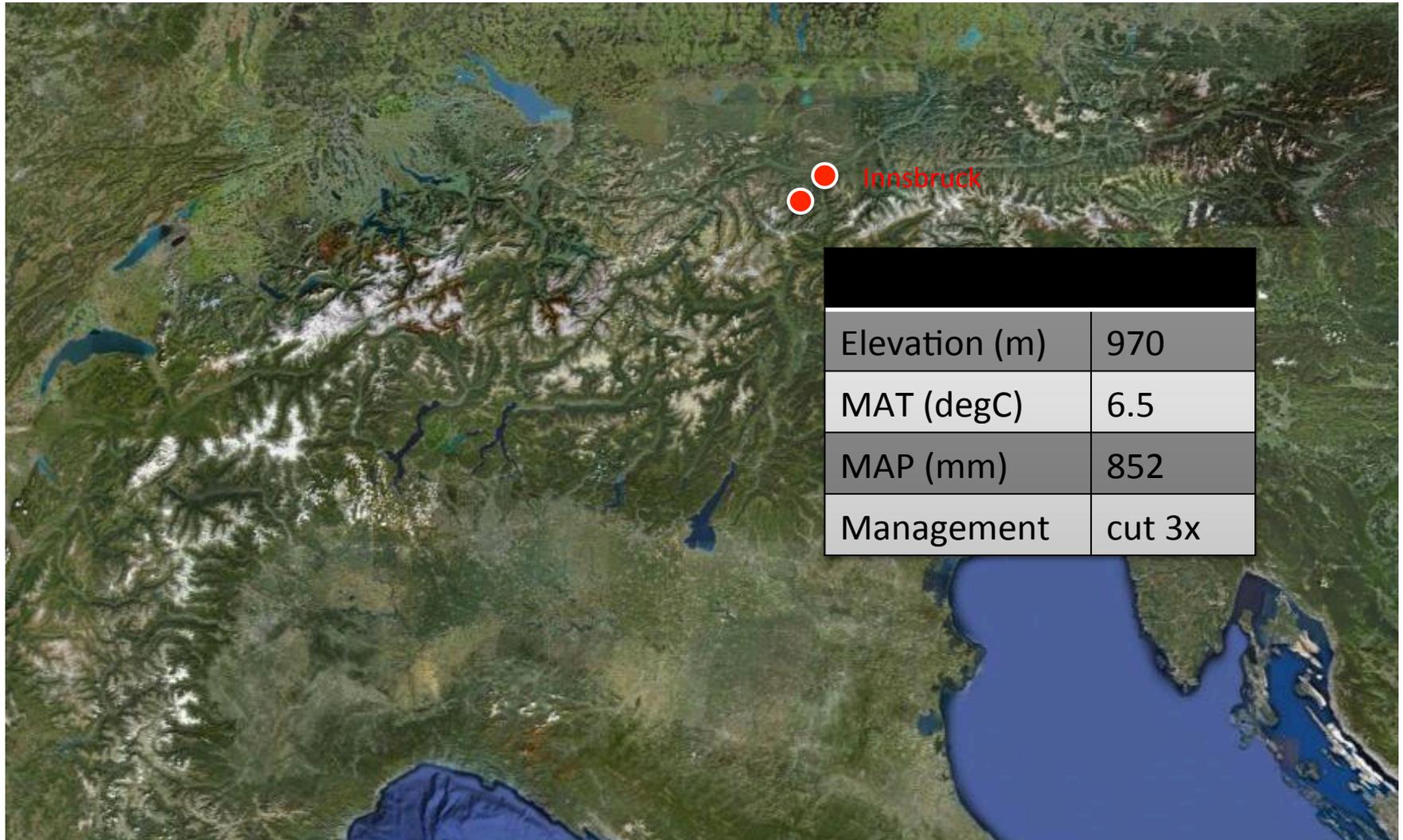


# CO<sub>2</sub>-FP revisited





# COS flux partitioning





# COS flux partitioning

2001 2002 2003 2004 2005 2006 2007 2008 2009 2010 2011 2012 2013 2014 2015

Research lines

Basic abiotic and biotic drivers

Latent and sensible heat and momentum fluxes

CO<sub>2</sub> fluxes

N<sub>2</sub>O fluxes

CH<sub>4</sub> fluxes

GHG

VOC fluxes

VOC fluxes

COS

CO fluxes

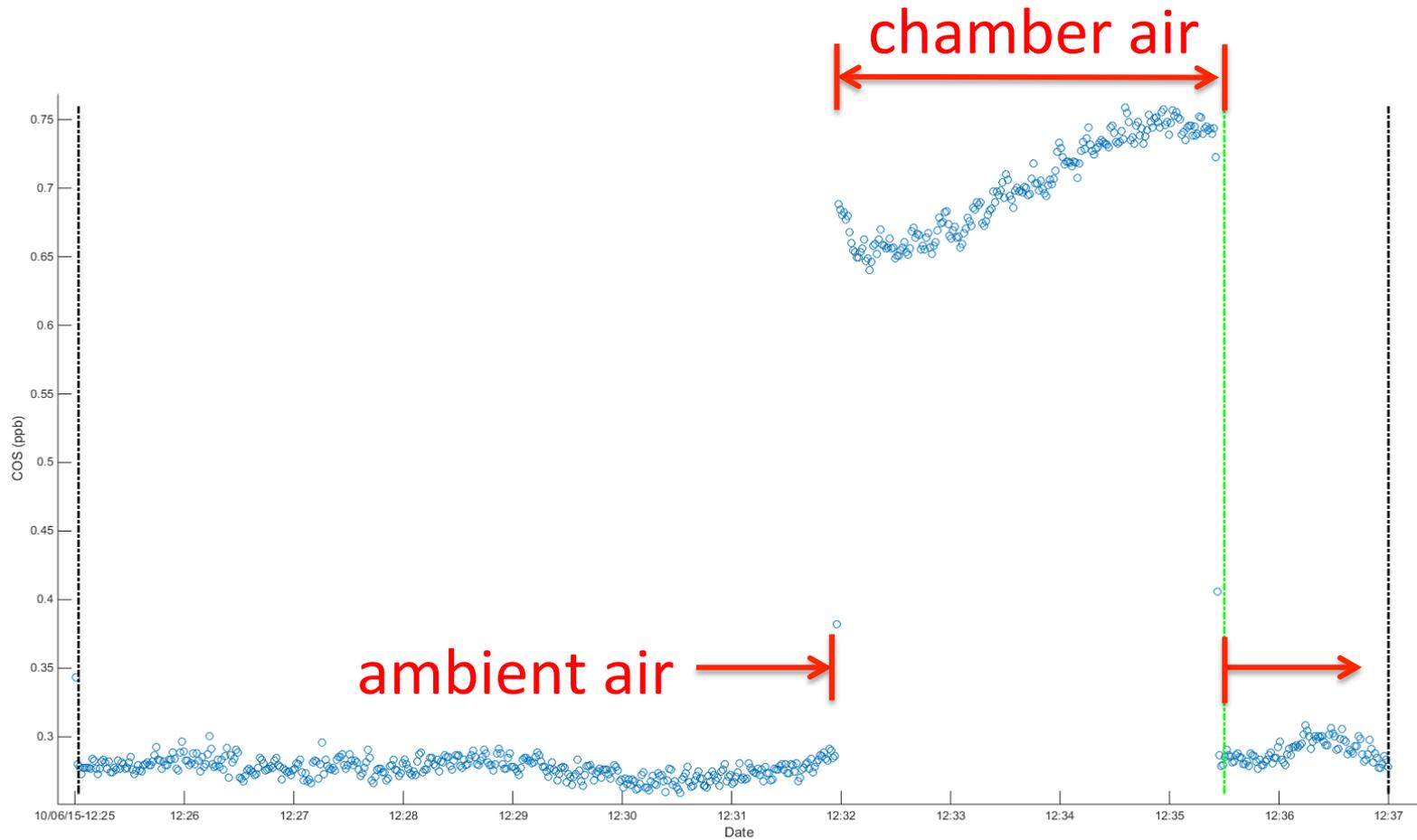
O<sub>3</sub> fluxes

Carbon budget

Air quality

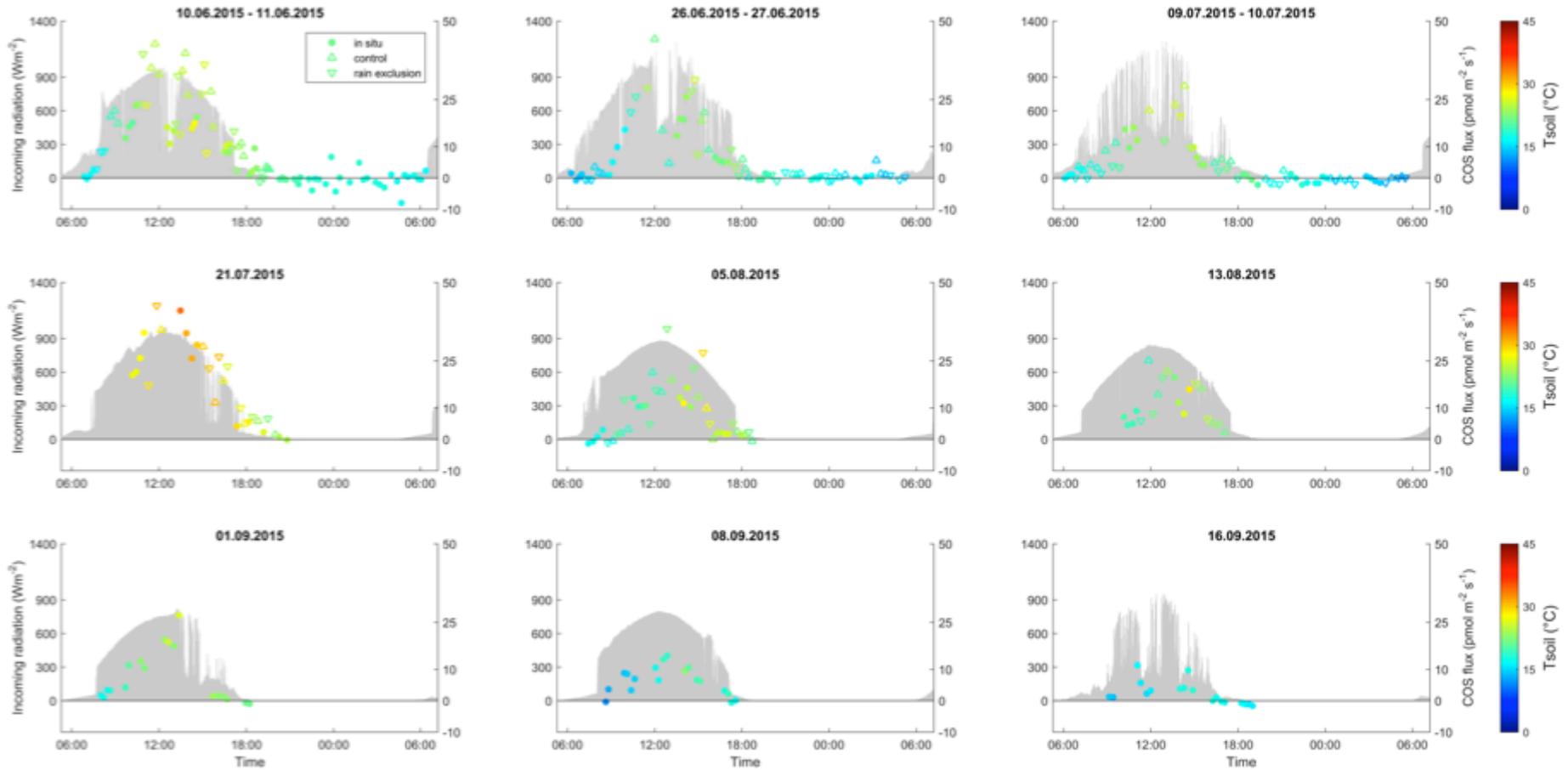


# COS flux partitioning



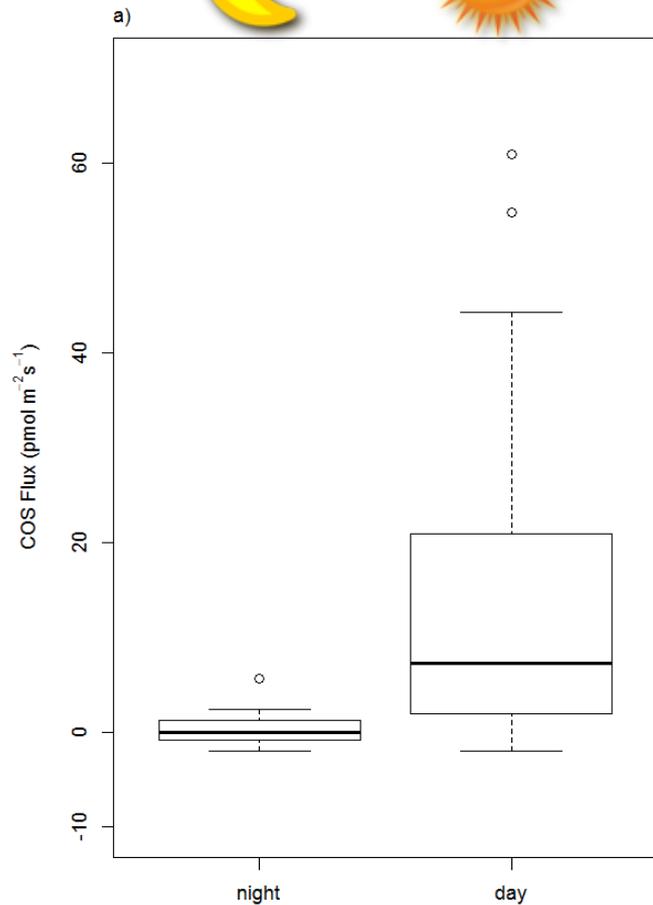


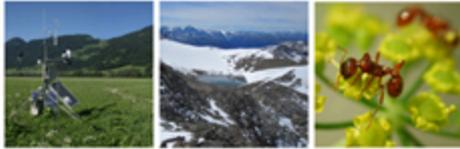
# COS flux partitioning



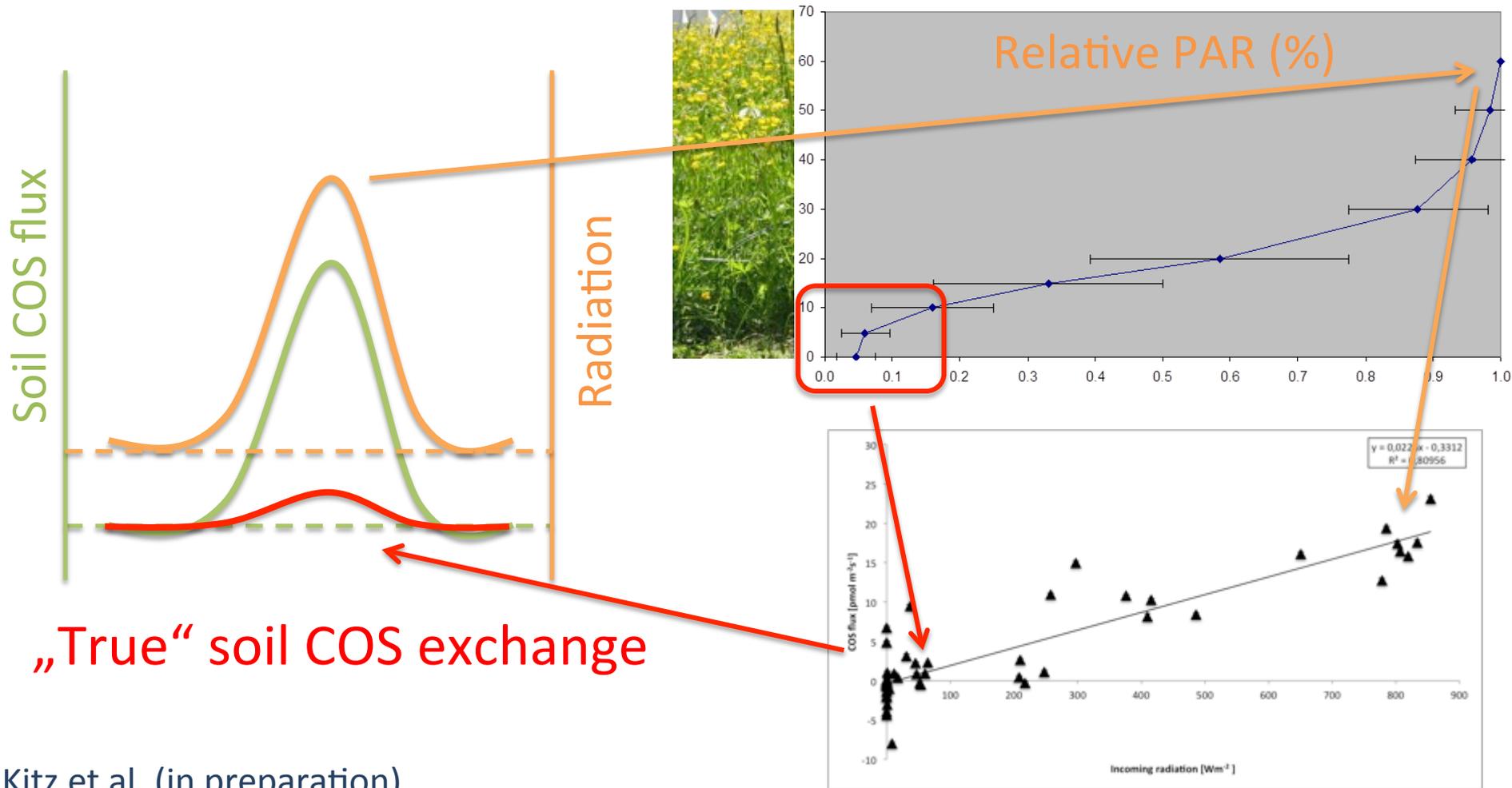


# COS flux partitioning





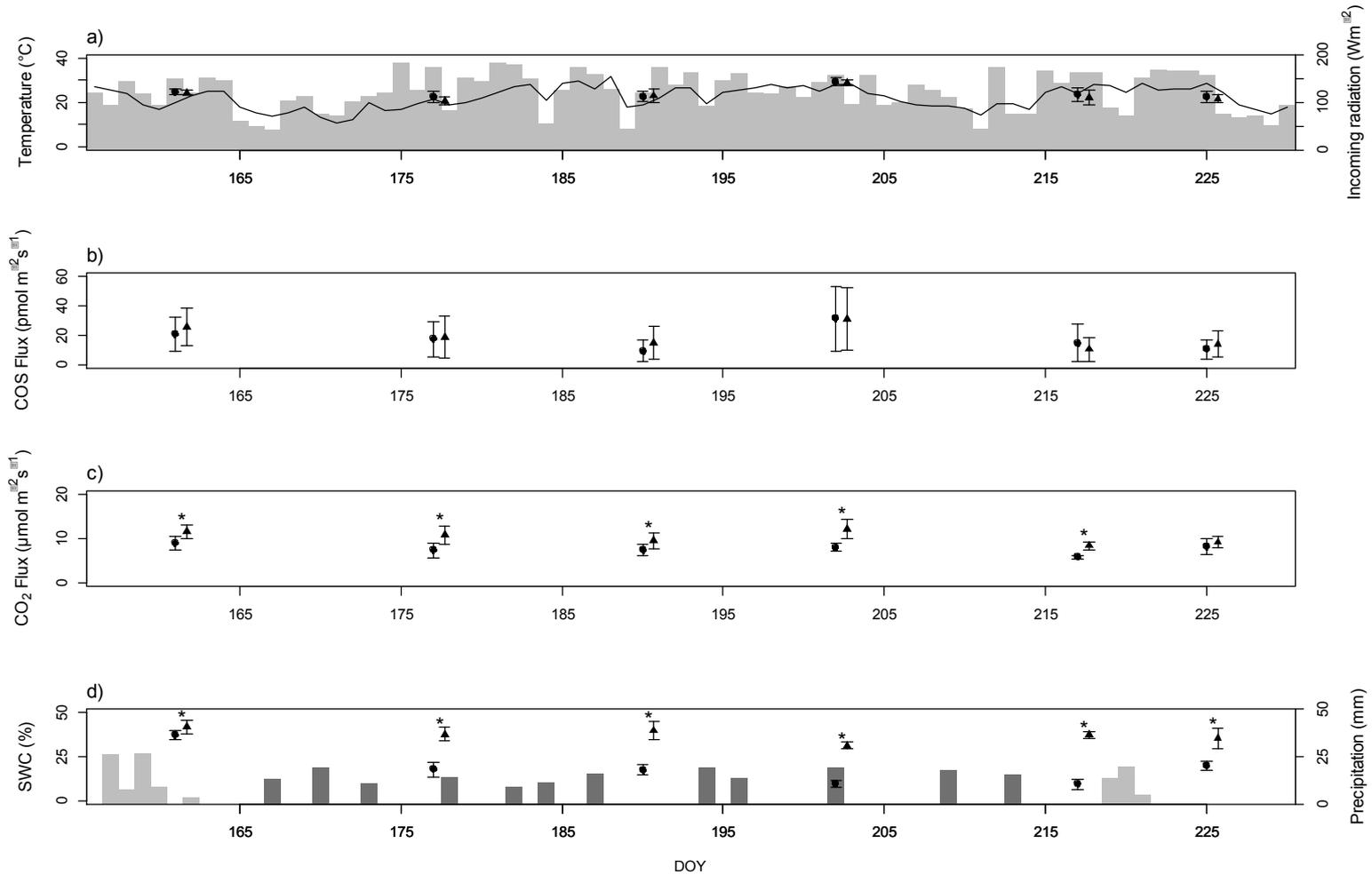
# COS flux partitioning



„True“ soil COS exchange



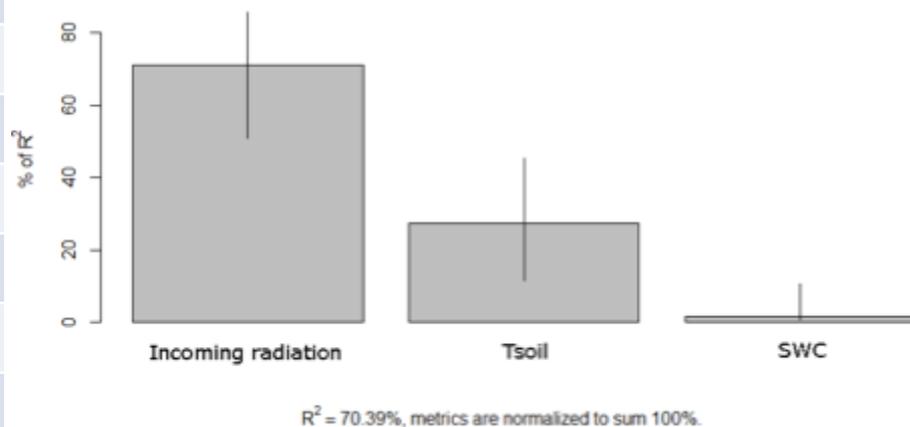
# COS flux partitioning





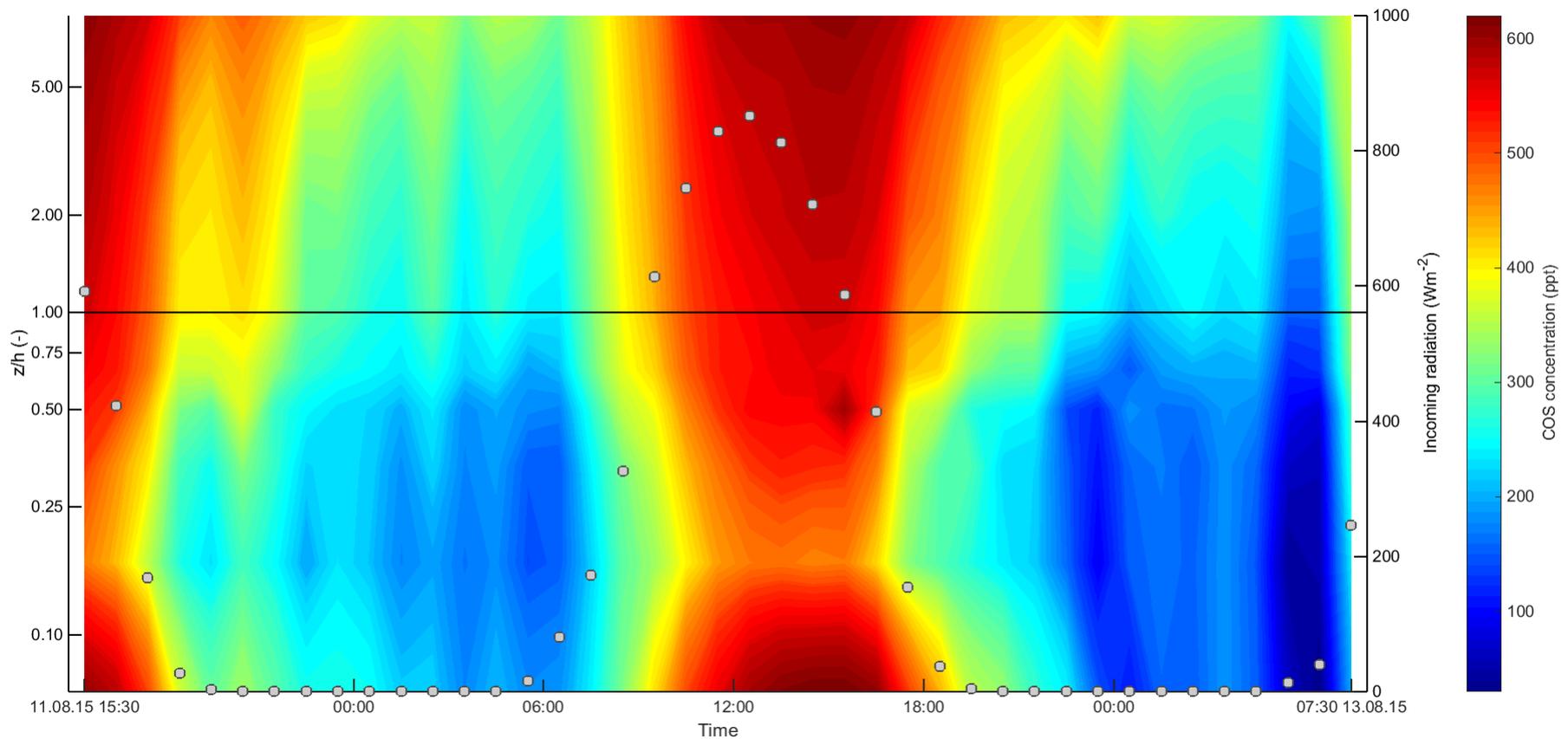
# COS flux partitioning

	Dependent variable:
	log10(COS_flux)
Incoming radiation	0.001*** (0.0001)
Tsoil	0.048*** (0.009)
SWC	0.005 (0.003)
Constant	-0.855*** (0.250)
Observations	55
R <sup>2</sup>	0.704
Residual Std. Error	0.241 (df = 51)
F Statistic	40.417*** (df = 3; 51)
Note:	*p<0.05 **p<0.01 ***p<0.001





# COS flux partitioning

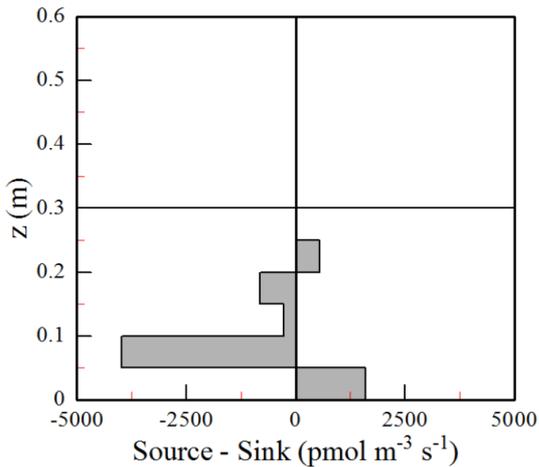




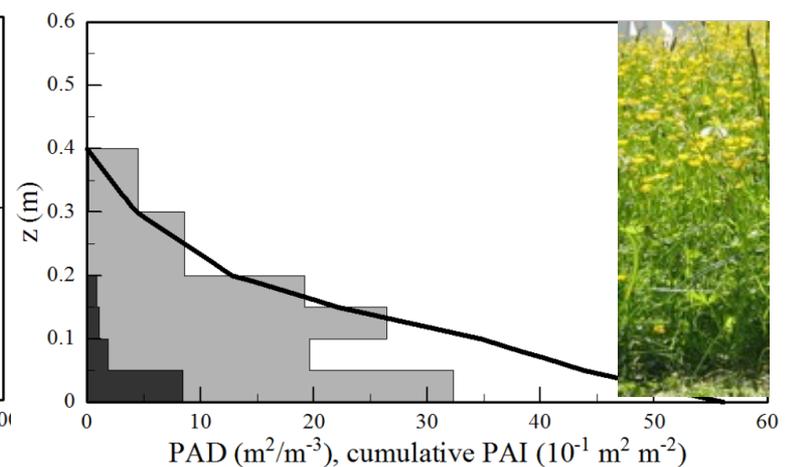
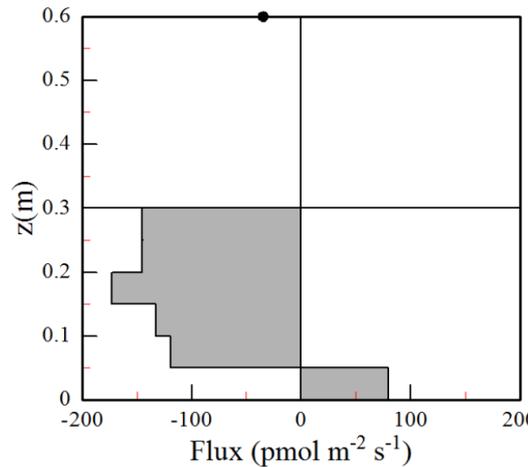
# COS flux partitioning

Example for inversion of Lagrangian turbulent transport model  
(around midday)

Source-Sink

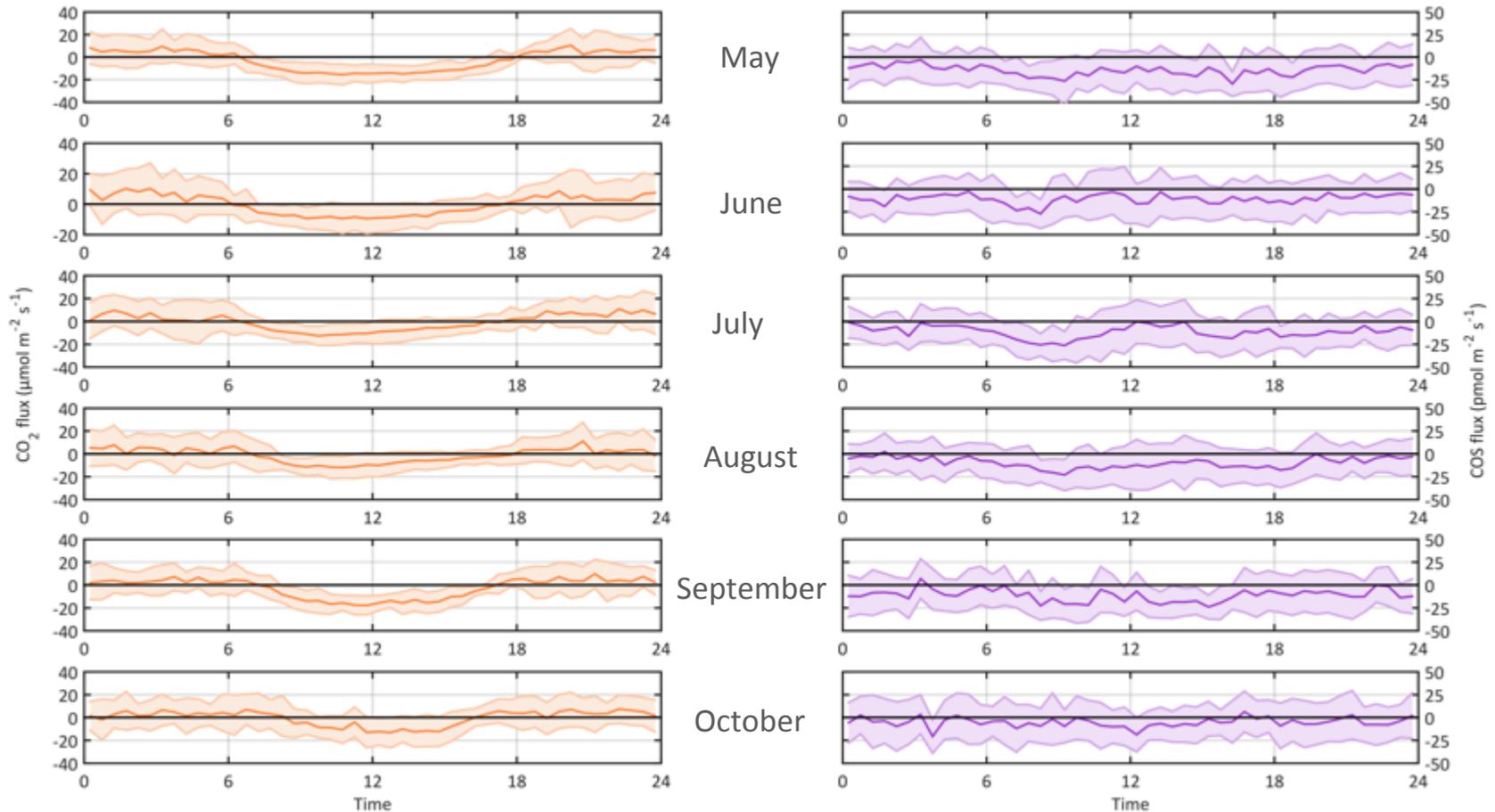


COS-Flux





# COS flux partitioning





# Conclusions

	Level of complexity	Level of understanding	Wider applicability
CO <sub>2</sub> flux partitioning	L	M	H
Isotopic flux partitioning	H	M	L
COS flux partitioning	M	L	L
Sun-induced fluorescence	H	L	VH
Photochemical reflectance index	M	L	VH

L ... low, M ... medium, H ... high, VH ... very high



## Conclusions

⌘ And so these men of Indostan  
Disputed loud and long,  
Each in his own opinion  
Exceeding stiff and strong,  
Though each was partly in the right,  
And all were in the wrong!

The blind man and the Elephant (John Godfrey Saxe, 1816-1887)