

Gap-filling strategy for net ecosystem exchange of carbon dioxide at agro-ecosystems in Korea



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Challenges

Observation \leftrightarrow Simulation

Short growing periods

Seasonal response

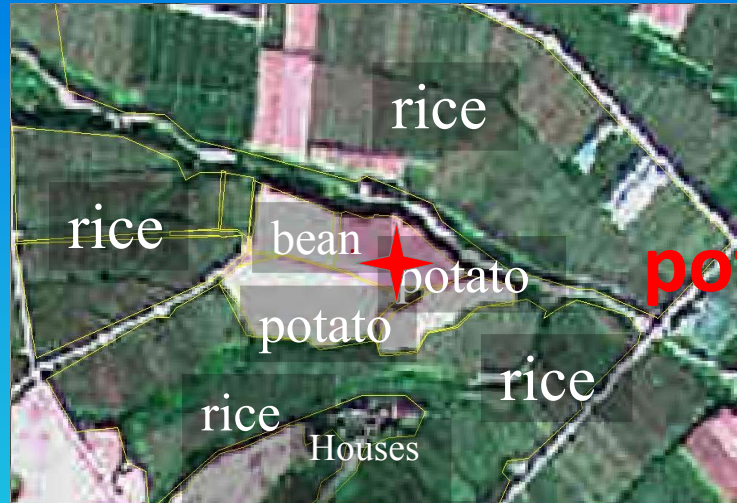
Human activities

Patchy

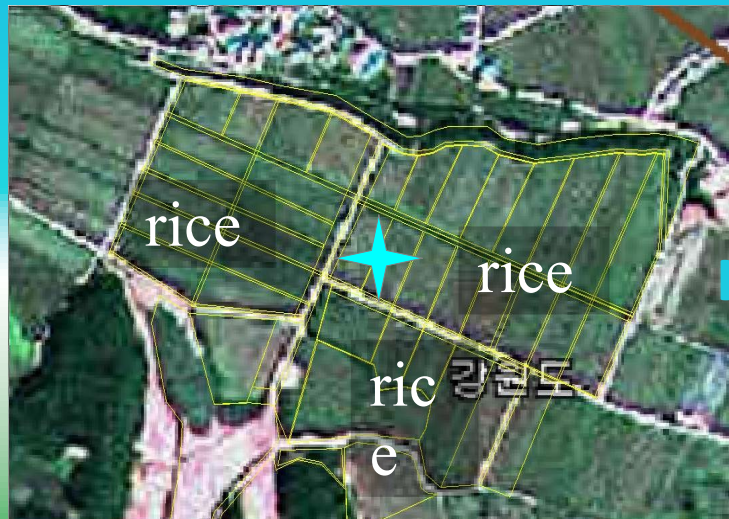
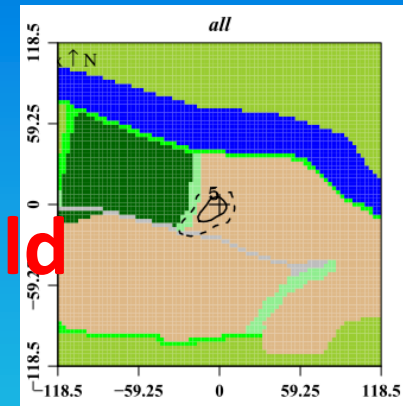
Monsoon



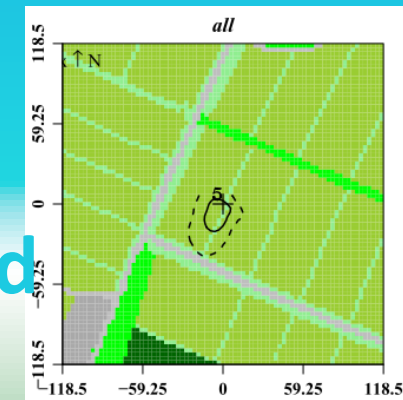
Patchy farmlands



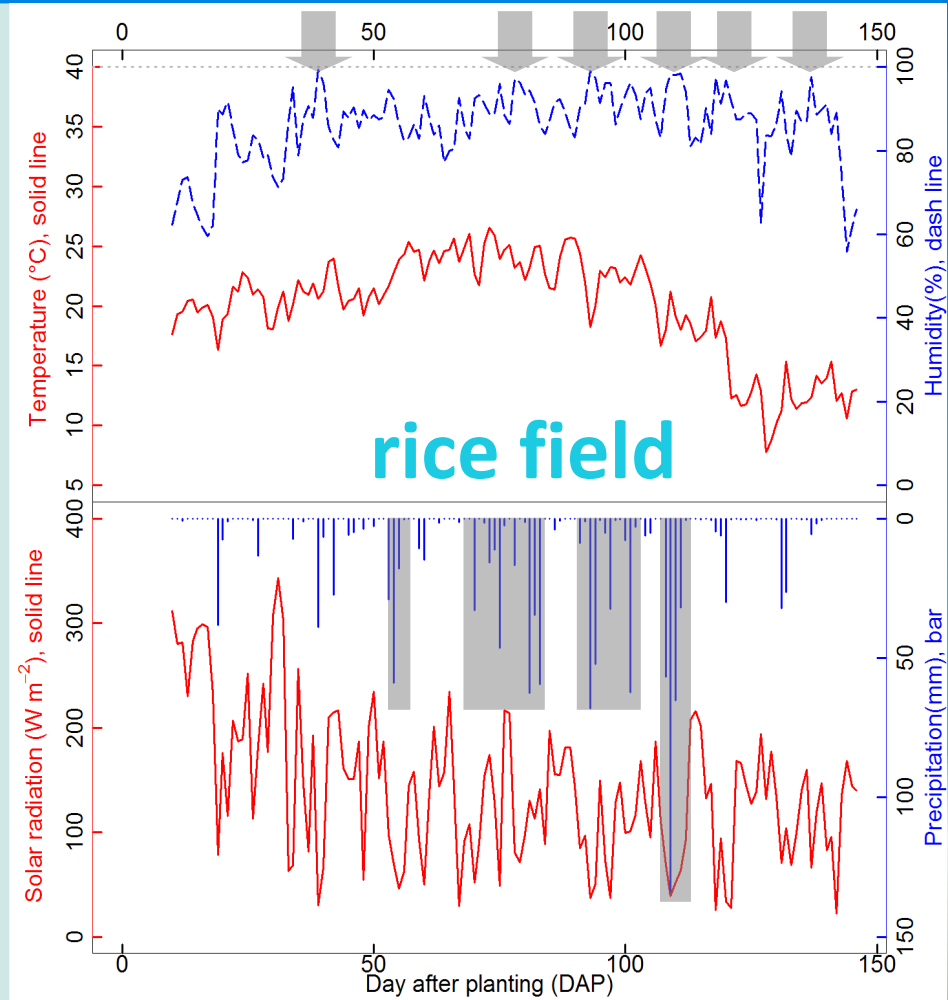
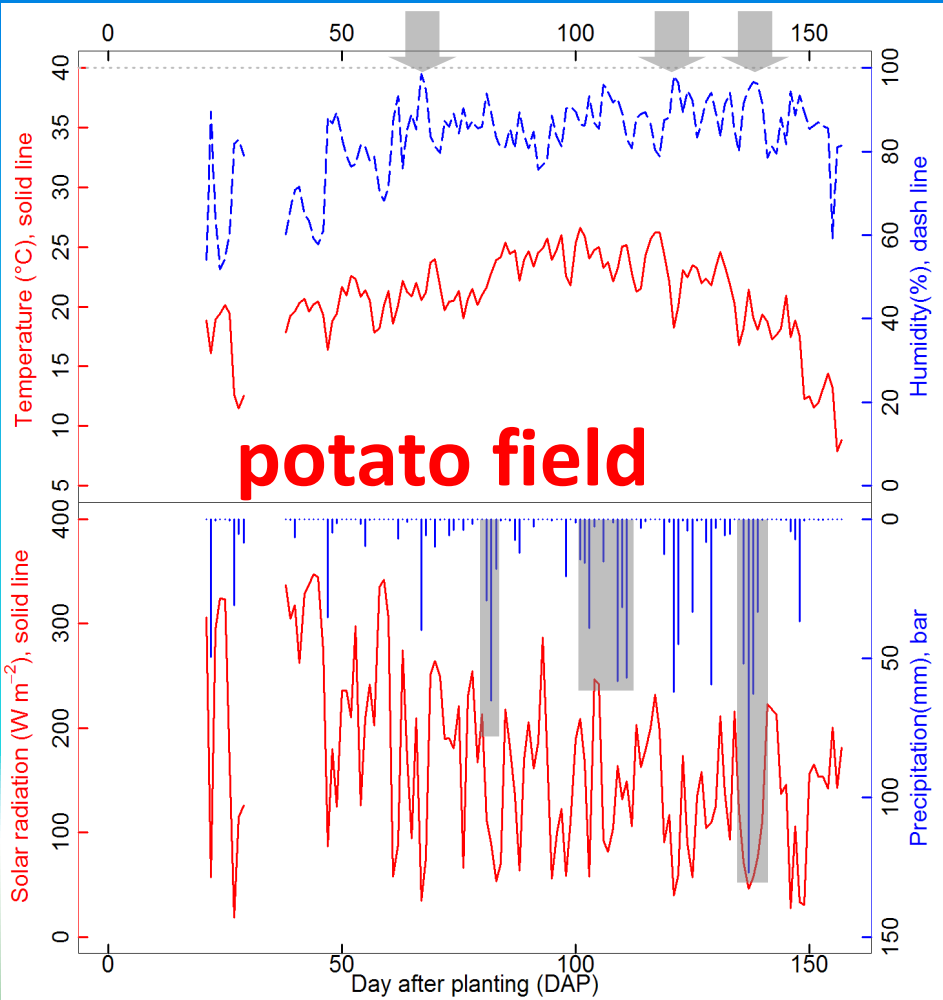
potato field



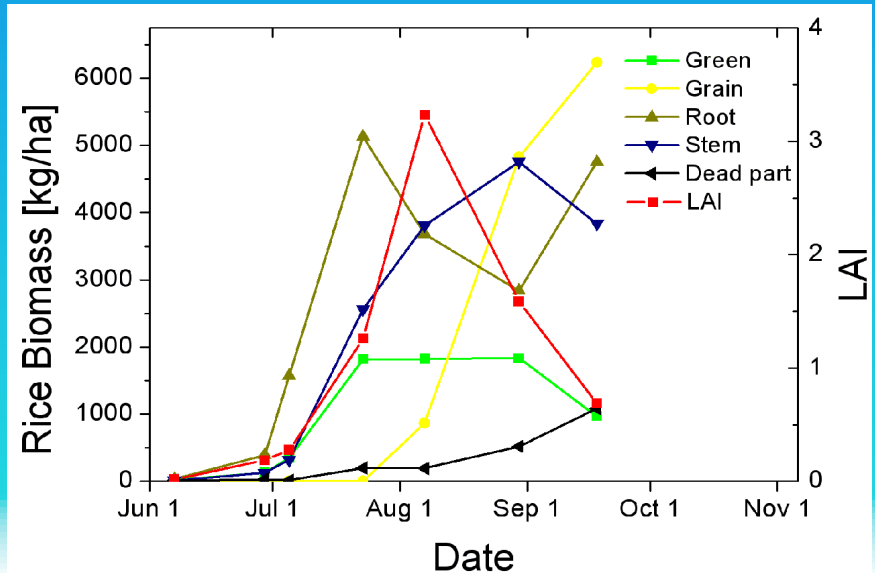
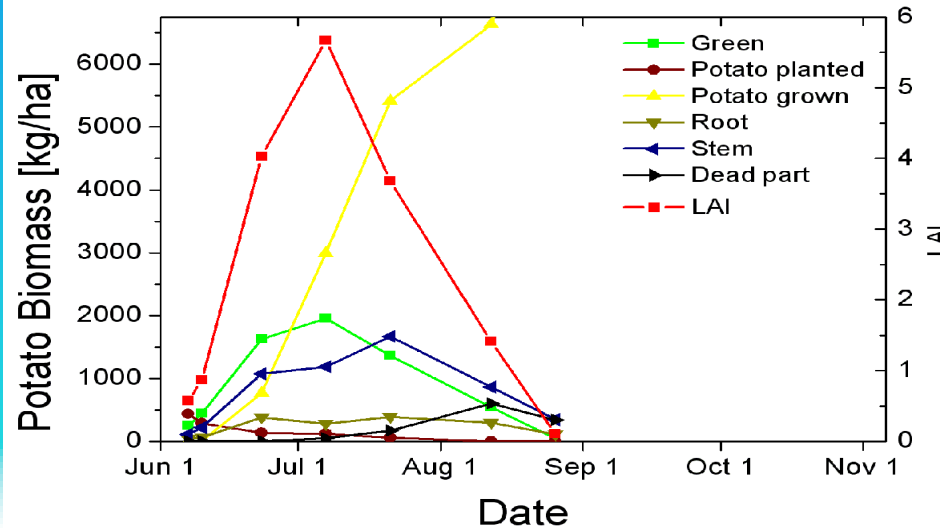
rice field



Monsoon

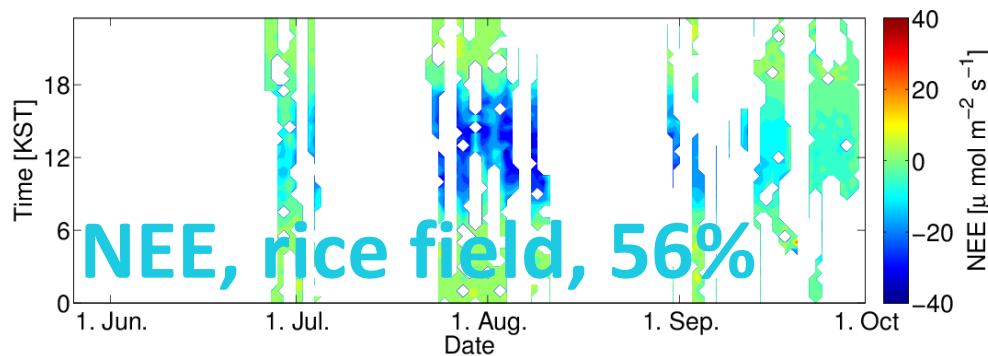
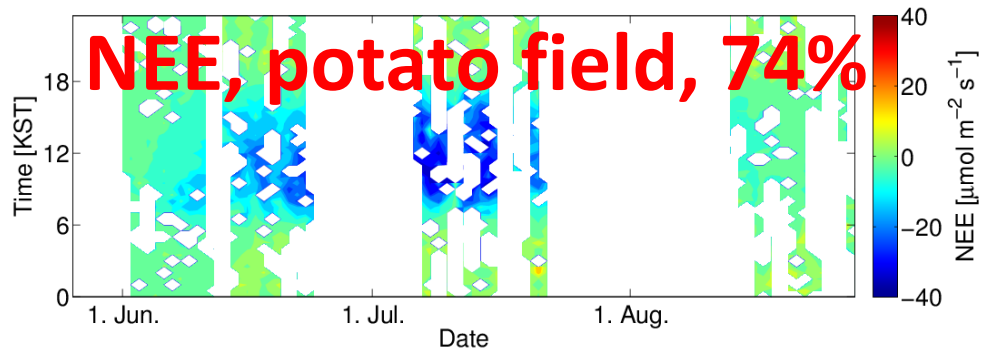


Fast-growing



Gaps in data-set

Data acquisition after overall quality control (*Foken et al., 2004*) and outlier check



Gap-filling methods

- Mean Diurnal Variation
- Look-Up Table
- Non-linear regression
- Other methods, e.g. artificial neural networks

Aubinet et al. 2000
Falge et al., 2001
Moffat et al. 2007

Driving factors of NEE

$$\beta^* = \begin{cases} \beta_0^* e^{-k(\text{VPD} - \text{VPD}_0)} & , \text{VPD} > \text{VPD}_0 \\ \beta_0^* & , \text{VPD} \leq \text{VPD}_0 \end{cases}$$

Lasslop et al., 2010

Q: dry and irrigated farmland?

Vapor pressure deficit (VPD)

Seasonal

- Temporal groups
Q: 16 days, 8 days, 4 days, 2 days?
- When no observation available

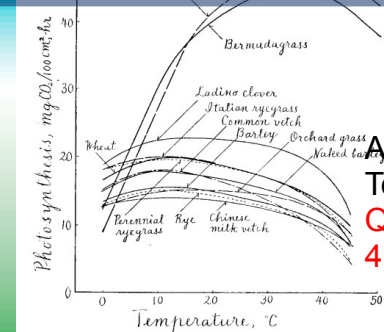
other

NEE

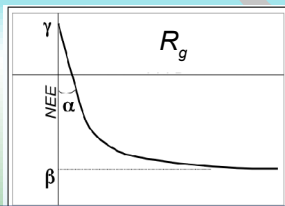
Temperature

Light

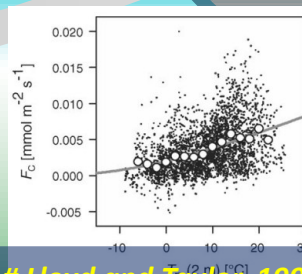
Murata and Iyama, 1963



Alternative:
Temperature groups
Q: 28 K, 14 K, 8 K, 4 K or 2 K?



Michaelis and Menten, 1913
Falge et al., 2001



Lloyd and Taylor, 1994

Gap-filling strategy for CO₂ flux

	Nighttime	Daytime
Ecosystem respiration (R_{eco})	Measured with gaps	gaps
Net ecosystem exchange (NEE)	$NEE = R_{eco}$	Measured with gaps
Gross primary production (GPP)	0	$GPP = NEE - R_{eco}$

Lloyd and Taylor, 1994

$$R_{eco} = R_{ref} e^{E_0 \left(\frac{1}{T_{ref} - T_0} - \frac{1}{T - T_0} \right)}$$

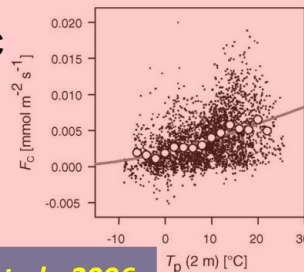
T_{ref} : reference temperature, 10 °C

R_{ref} : R_{eco} at T_{ref}

E_0 : temperature sensitivity

T : air temperature

T_0 : constant value, -46.02 °C



Ruppert et al., 2006

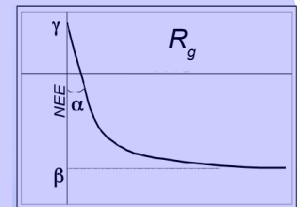
Michaelis and Menten, 1913

Falge et al., 2001

$$NEE = \frac{\alpha R_g \beta}{\alpha R_g + \beta} + R_{eco}$$

$$NEE = GPP + R_{eco}$$

$$GPP = \frac{\alpha R_g \beta}{\alpha R_g + \beta}$$



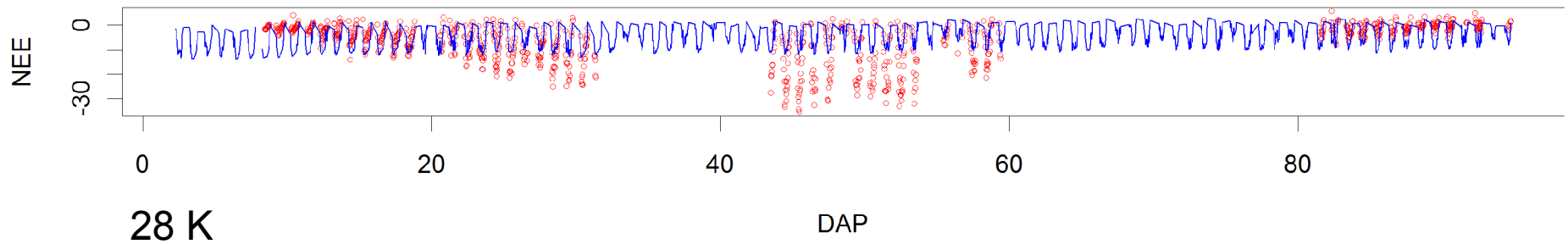
R_g : global radiation

α : initial slope

β : saturated NEE

seasonal temperature VPD

Temperature dependency

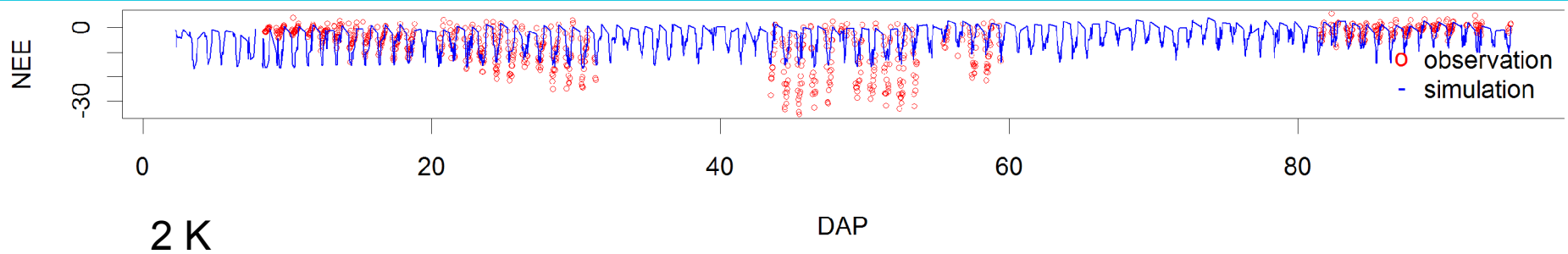


14 K

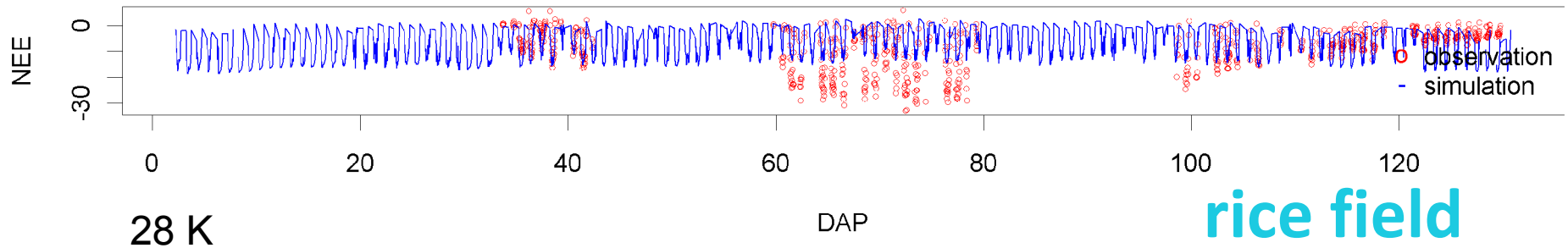
8 K

4 K

potato field



Temperature dependency

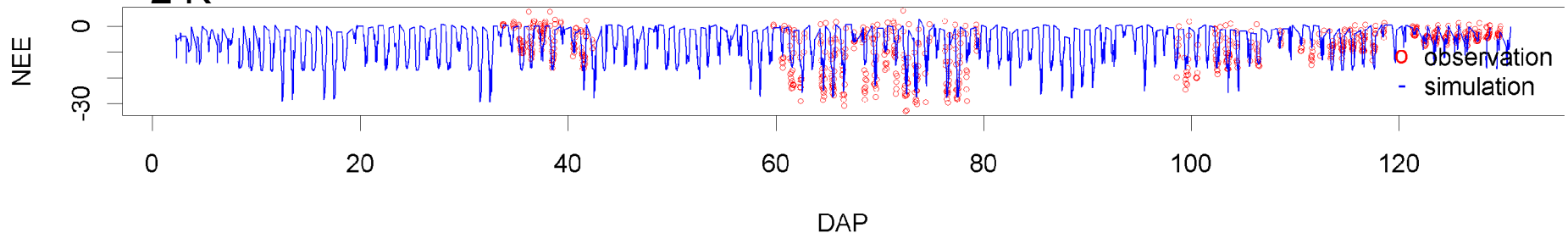


14 K

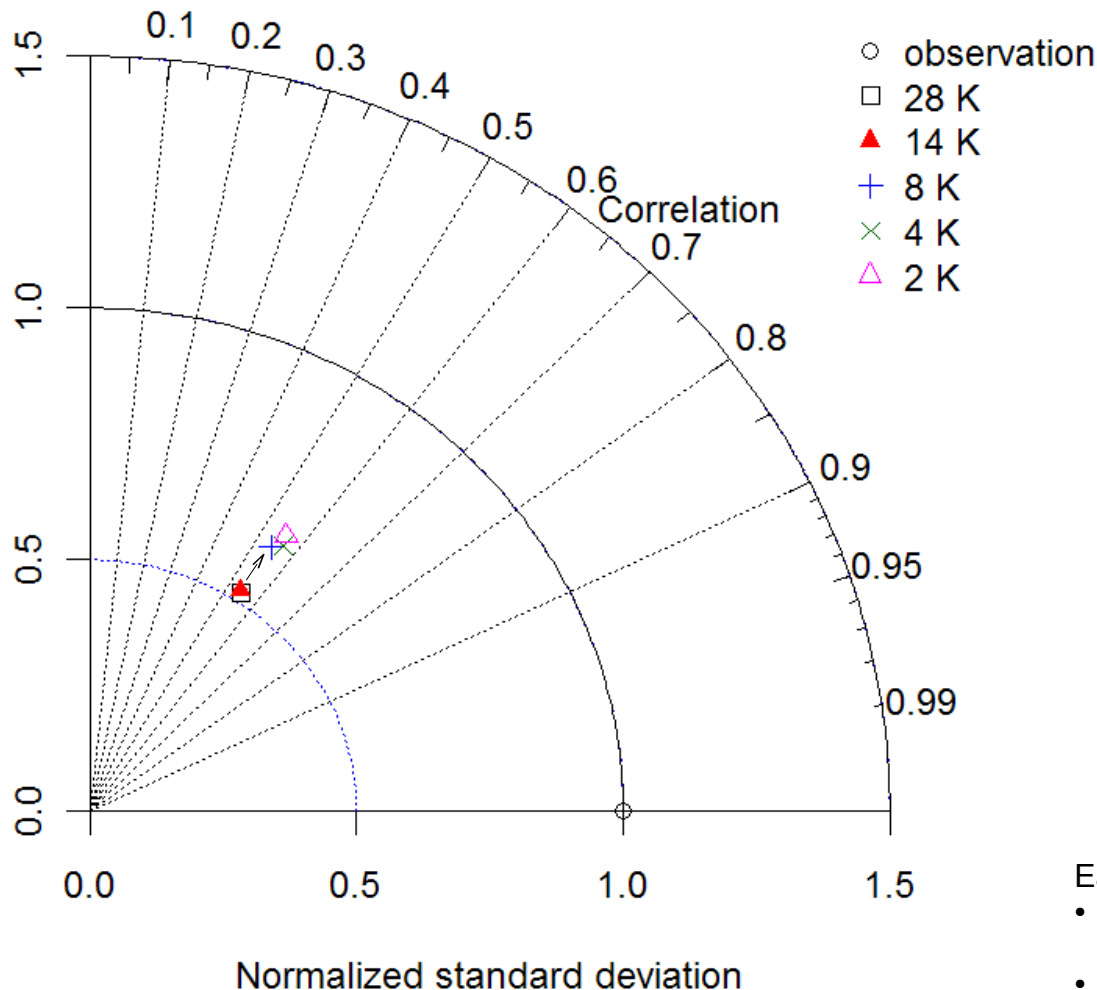
8 K

4 K

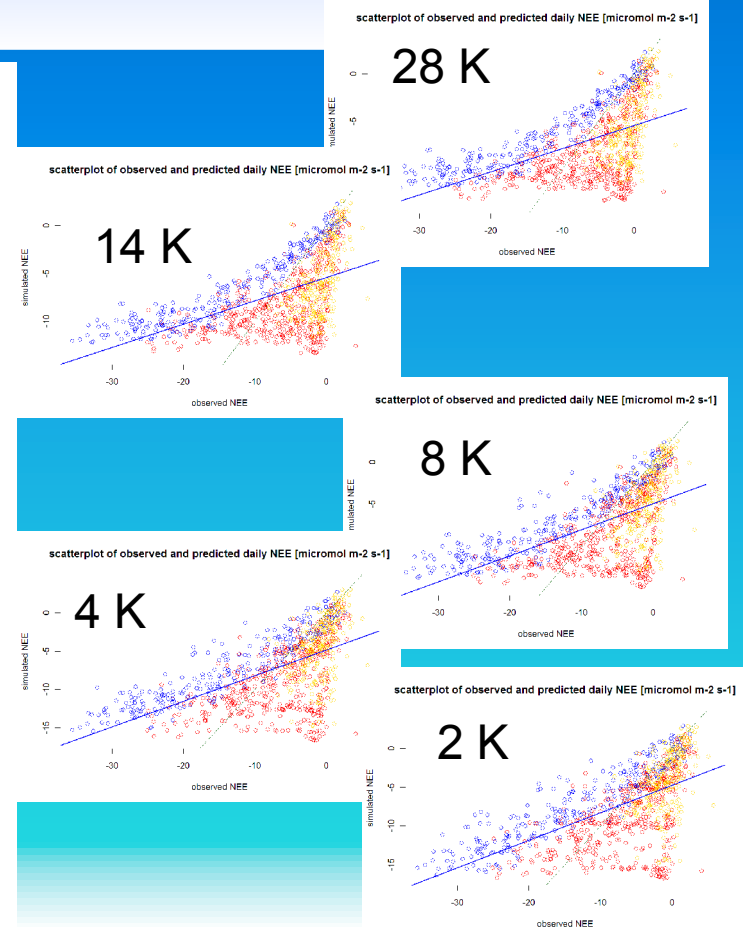
2 K



Temperature classification



potato field

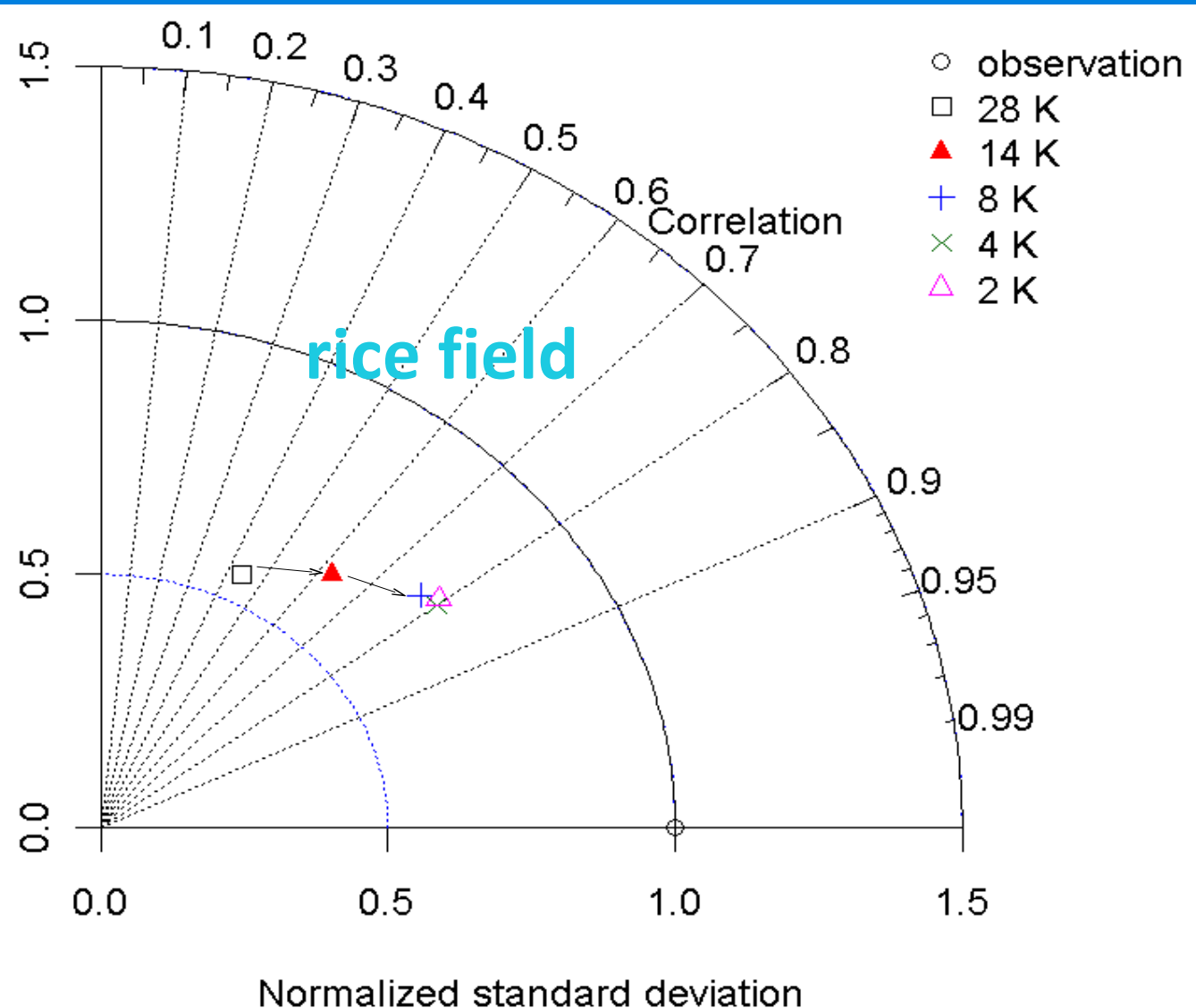


Each single point specifies the performance of one model.

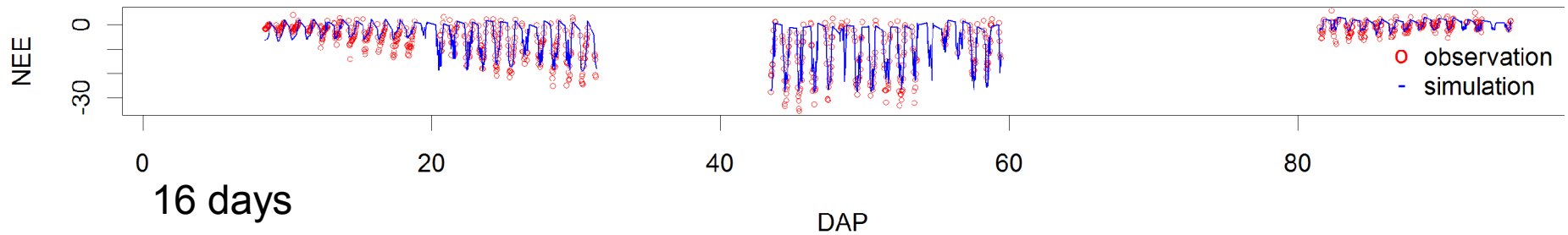
- Radial distance:
Normalized standard deviation,
- Polar angle:
correlation coefficient,
- Distance to observation point (○):
root mean square error.

Taylor (2001)

Temperature classification



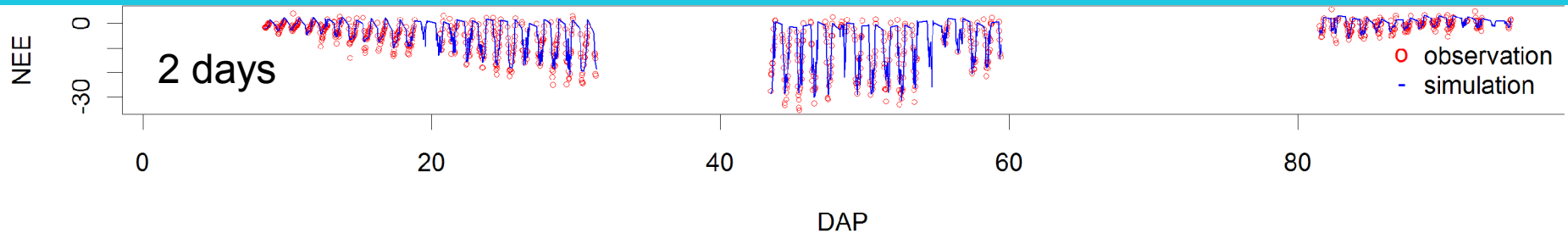
Temporal classification



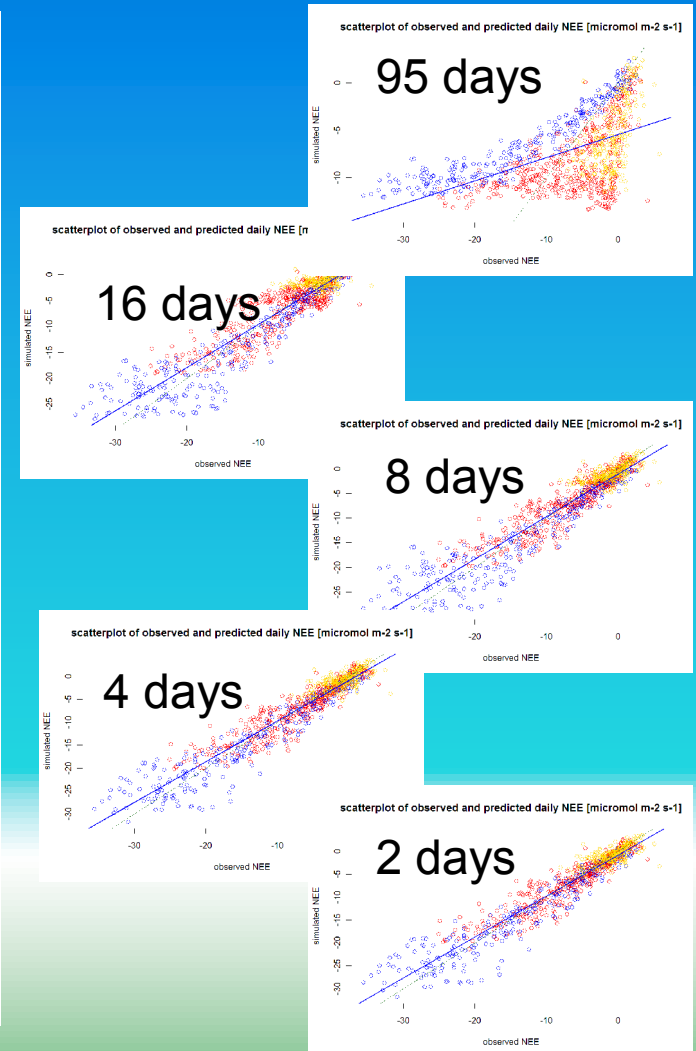
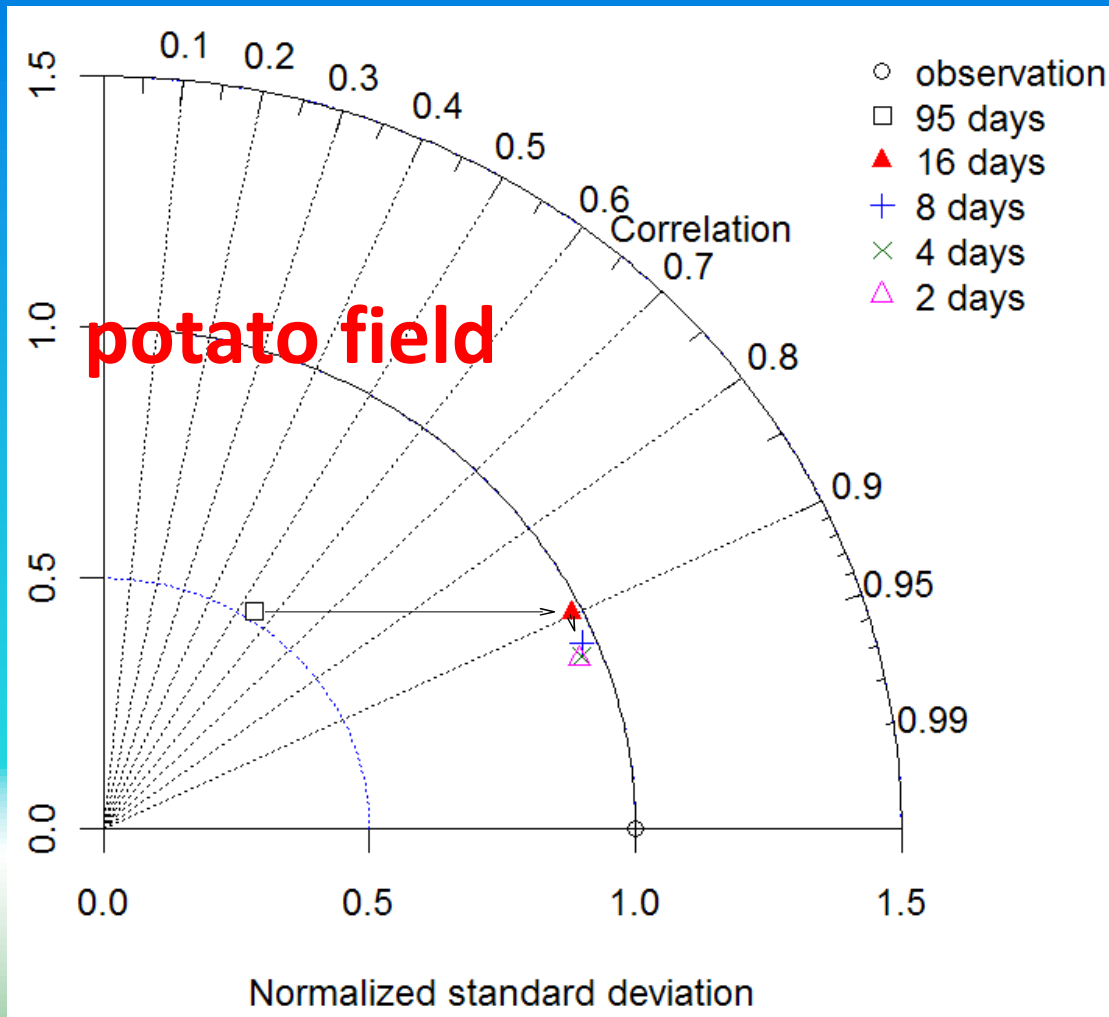
8 days

4 days

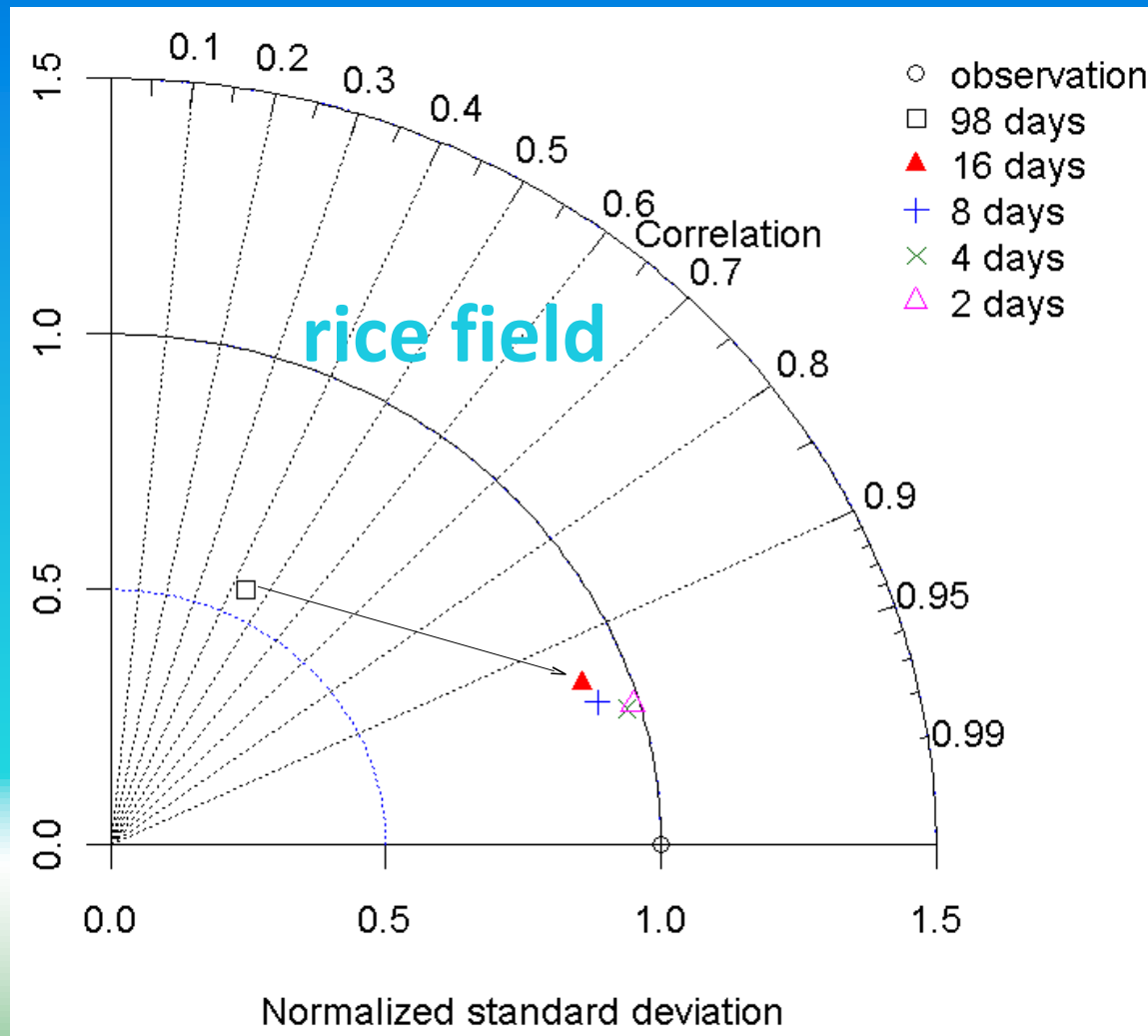
potato field



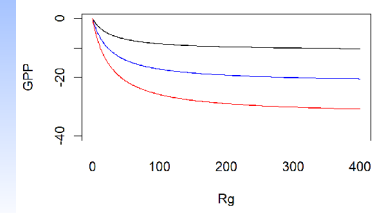
Temporal classification



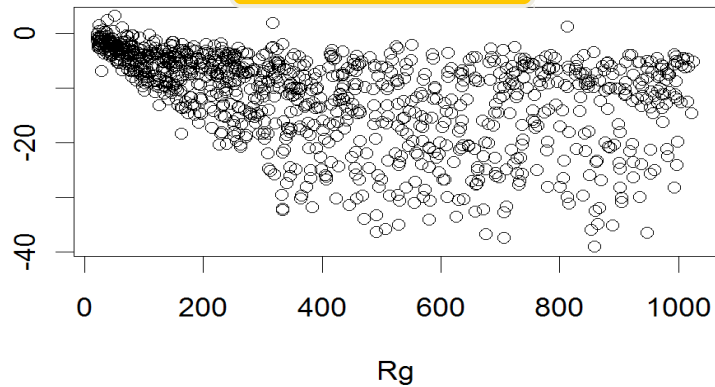
Temporal classification



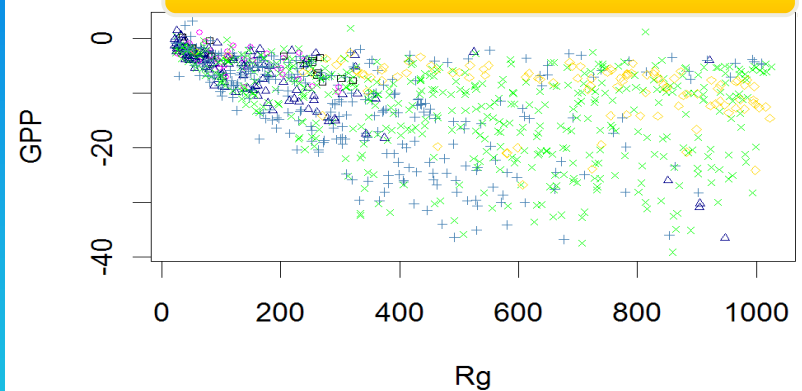
Data classification



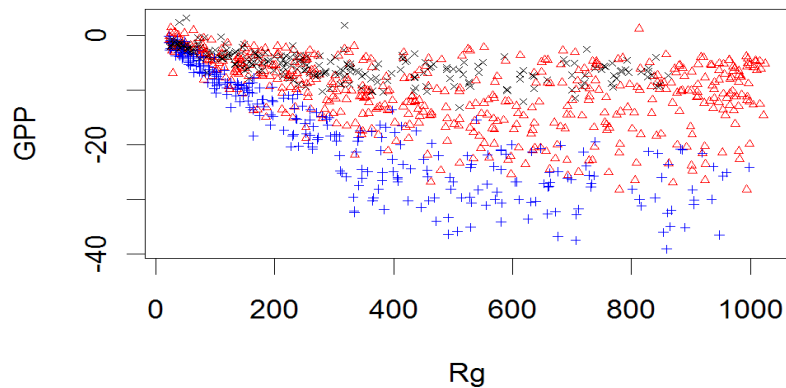
All data



temperature classification

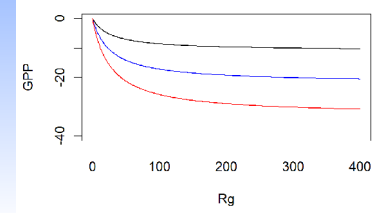


temporal classification

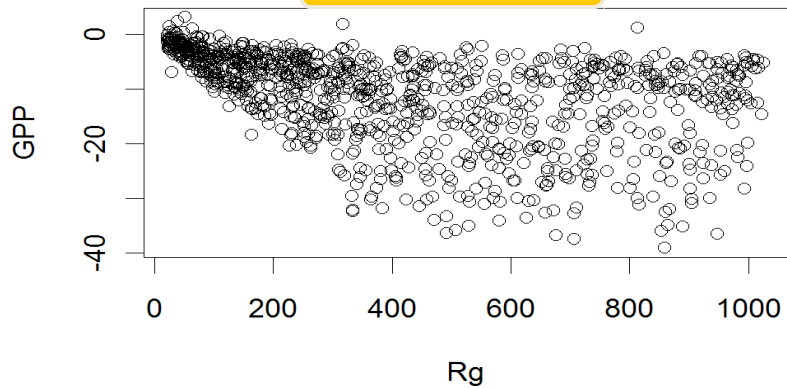


Other classification?

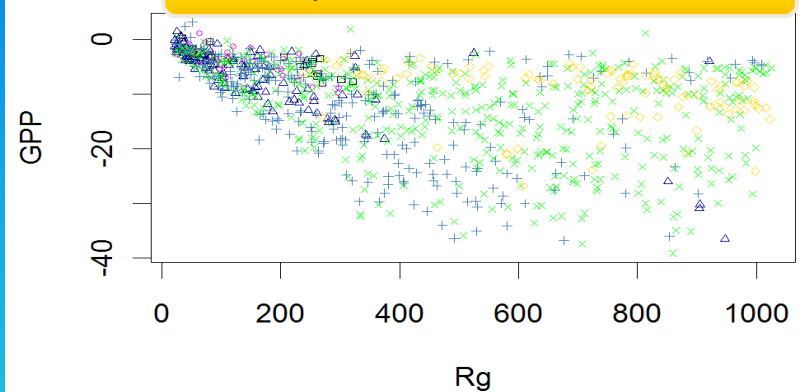
Data classification



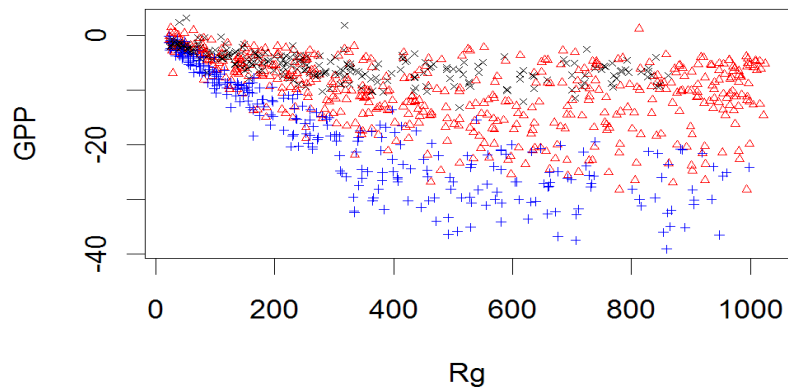
All data



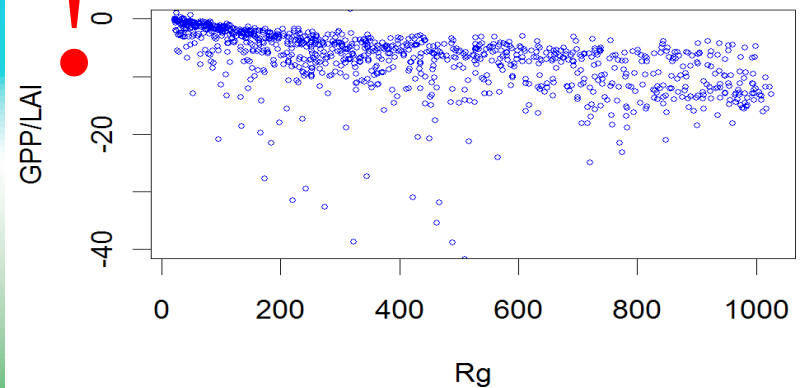
temperature classification



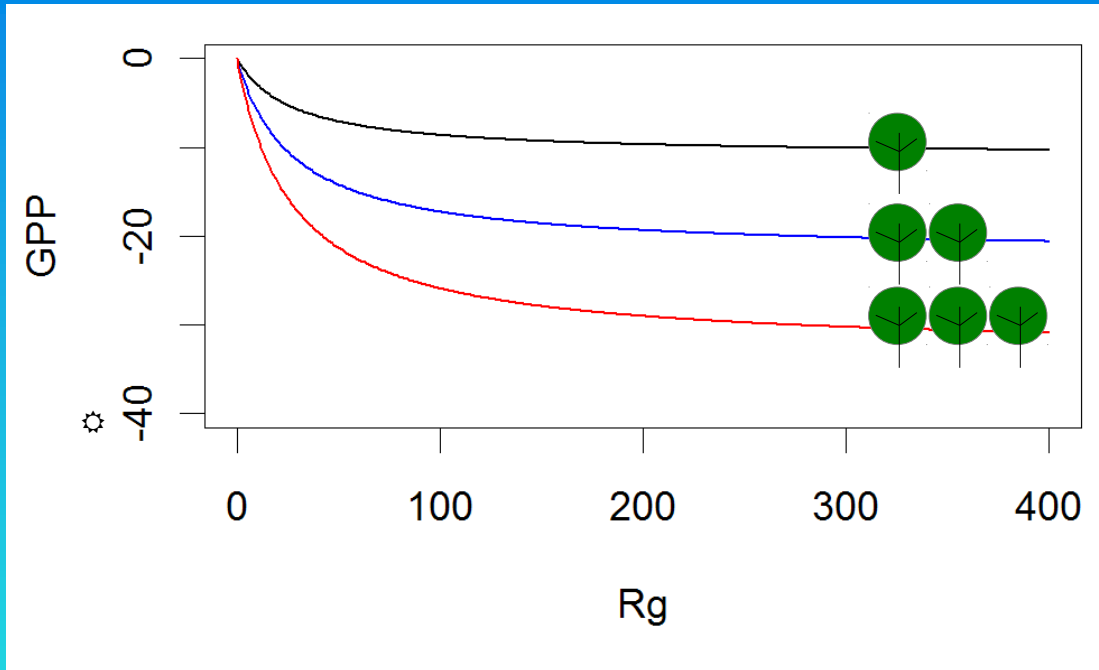
temporal classification



Normalized by LAI



LAI factor



$$GPP = \frac{\alpha R_g \beta}{\alpha R_g + \beta}$$



$$\frac{GPP}{LAI} = \frac{\frac{\alpha}{LAI} R_g \frac{\beta}{LAI}}{\frac{\alpha}{LAI} R_g + \frac{\beta}{LAI}}$$



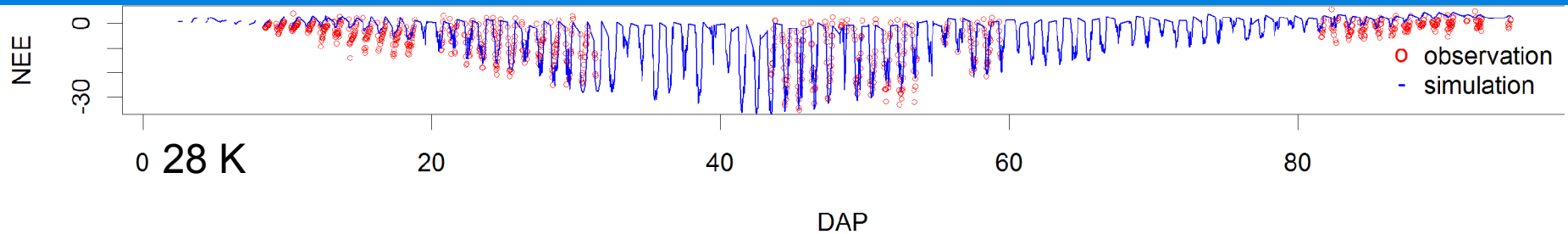
$$GPP' = GPP / LAI$$

$$\alpha' = \alpha / LAI$$

$$\beta' = \beta / LAI$$

$$GPP' = \frac{\alpha' R_g \beta'}{\alpha' R_g + \beta'}$$

LAI factor + temperature class.

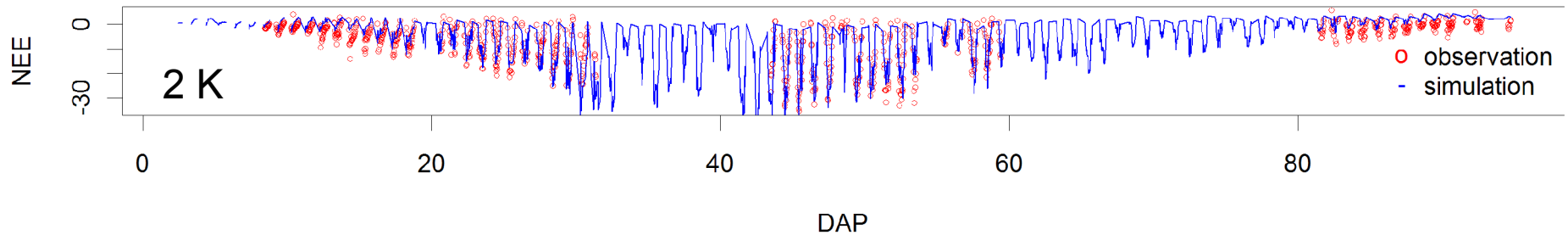


14 K

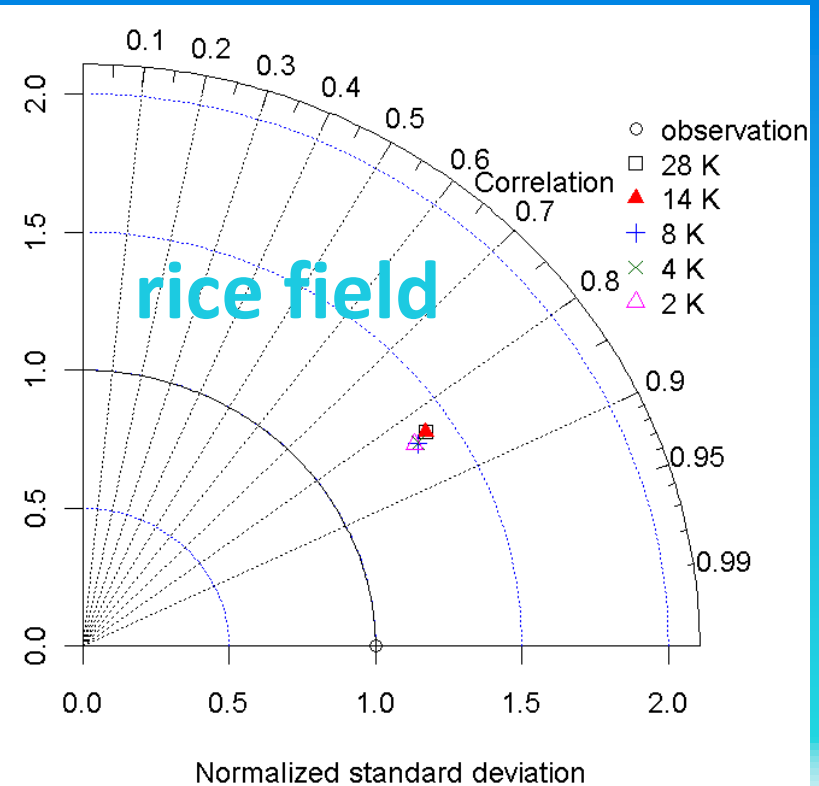
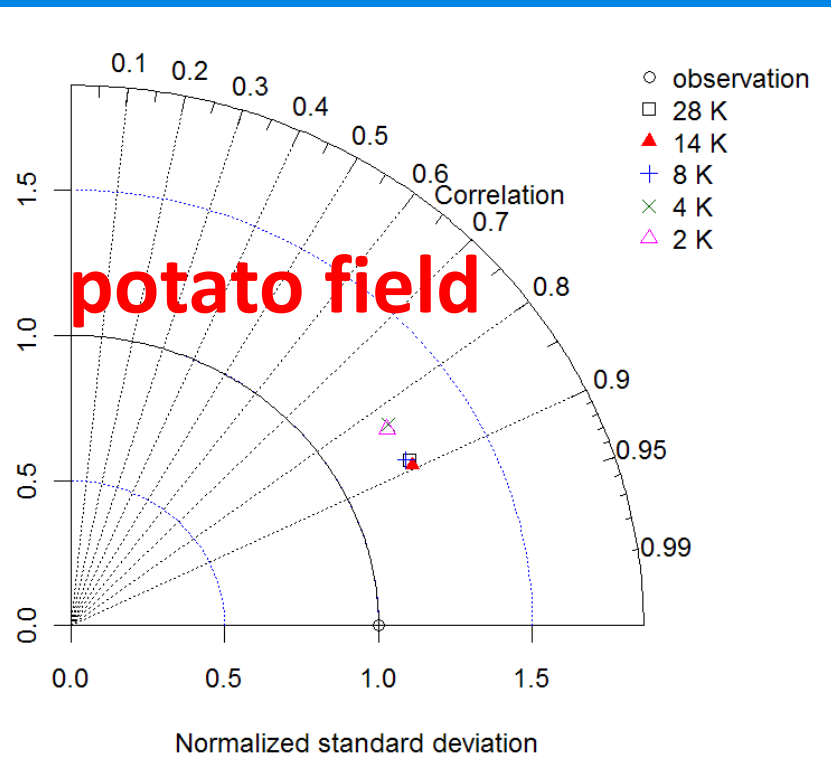
8 K

4 K

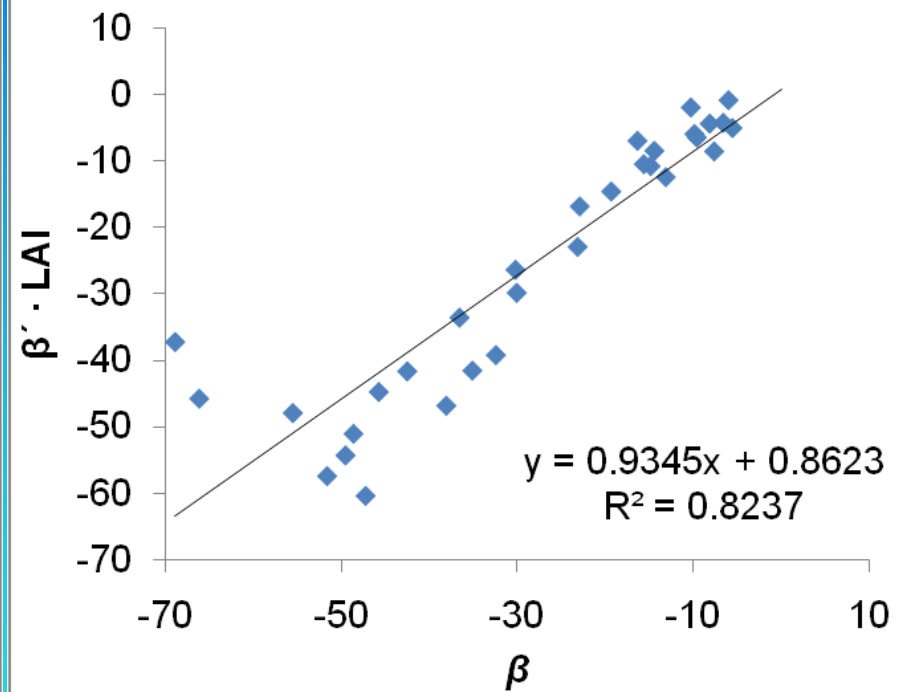
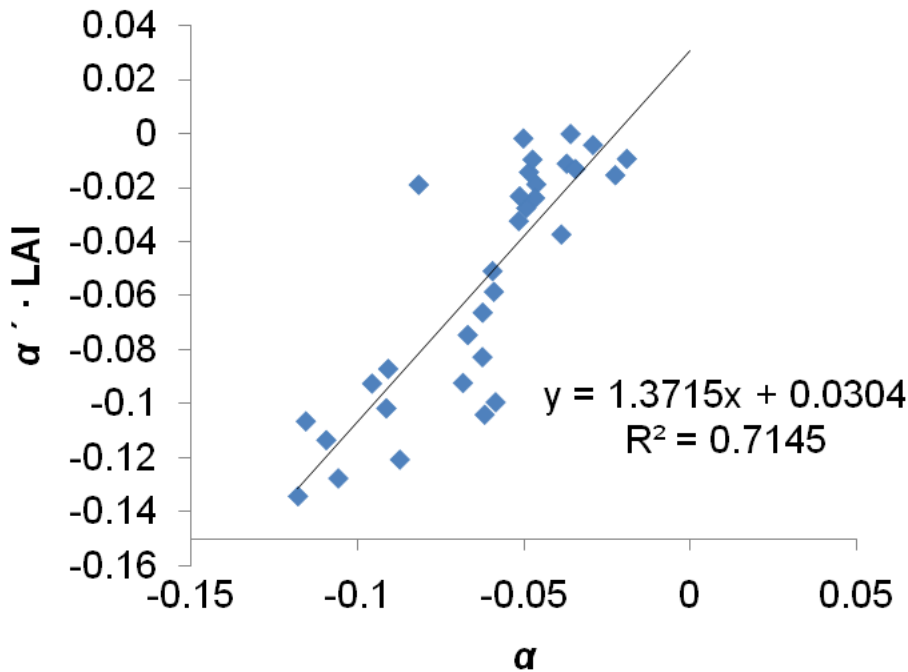
potato field



LAI factor + temperature class.



LAI factor VS temporal class.



$$GPP' = \frac{\alpha' R_g \beta'}{\alpha' R_g + \beta'}$$

$$\alpha' = \alpha / LAI$$

$$\beta' = \beta / LAI$$

Errors

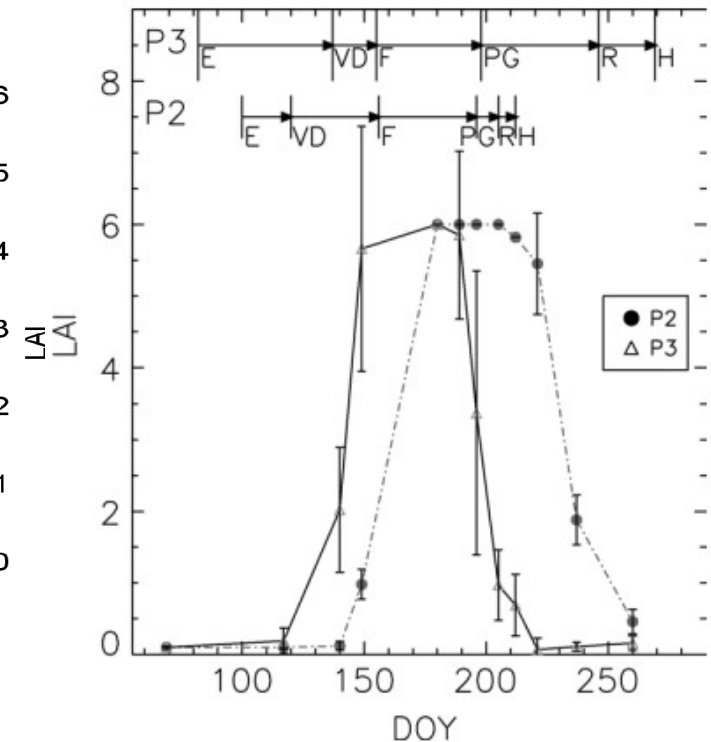
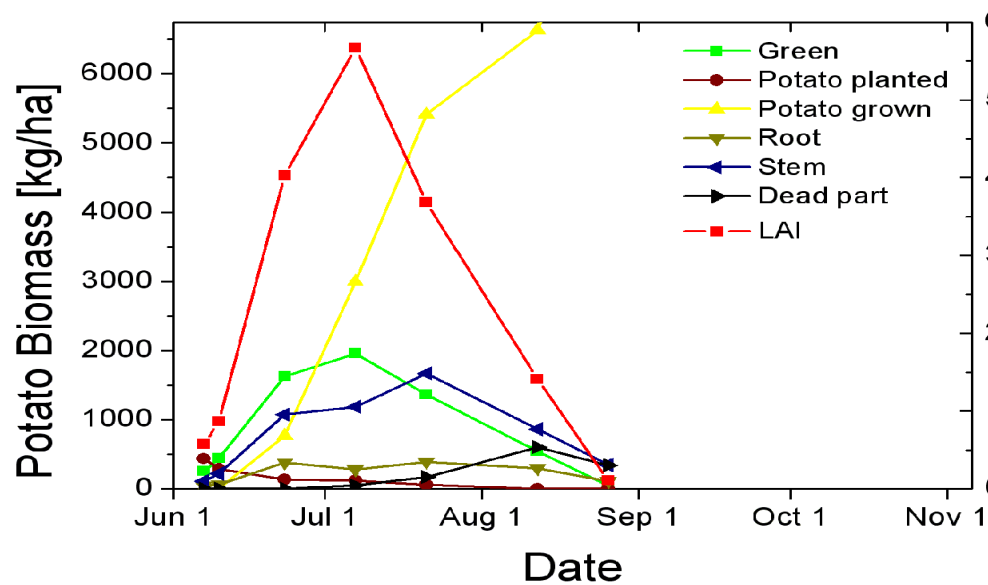


Fig. 5. Retrieved LAI for two potato fields (P2 and P3) with different calendar. Phenological observations are indicated on top. P2 has a longer cycle than P3: emergence is earlier and harvest is later than for P2. E stands for Emergence, VD for Vegetation Development, F for Flowering, PG for Potato Growing, R for Ripening and H for Harvest.

VPD factor

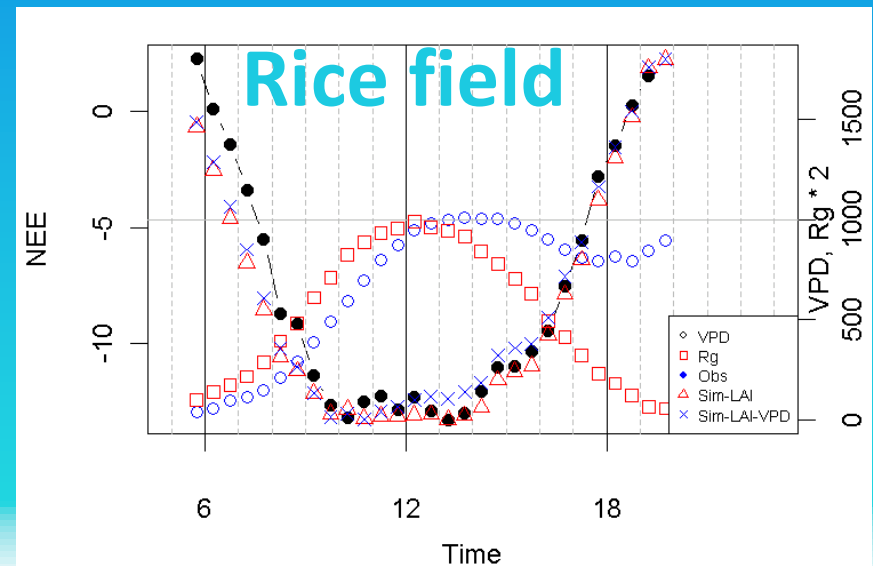
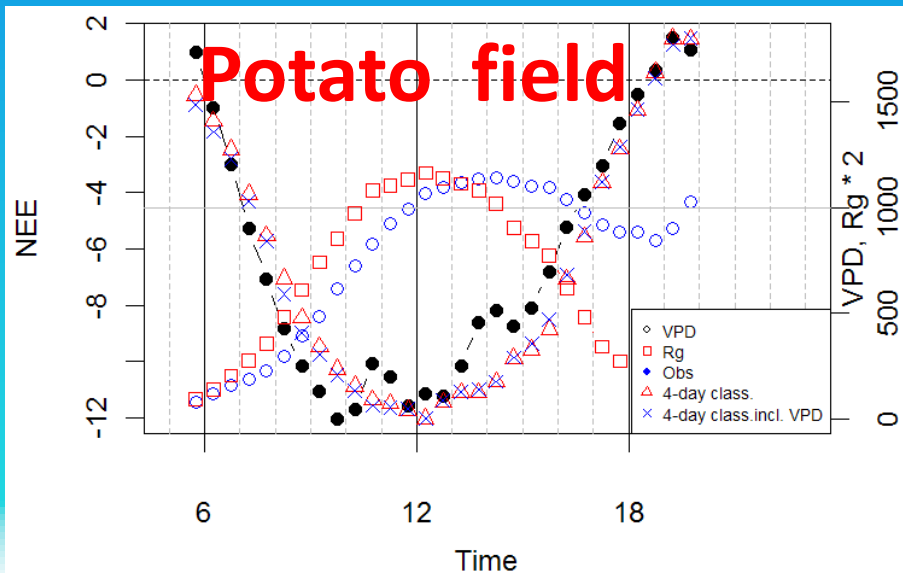
$$GPP = \frac{\alpha R_g \beta}{\alpha R_g + \beta}$$

$$\beta^* = \begin{cases} \beta_0^* e^{-k(VPD - VPD_0)} & , VPD > VPD_0 \\ \beta_0^* & , VPD \leq VPD_0 \end{cases}$$

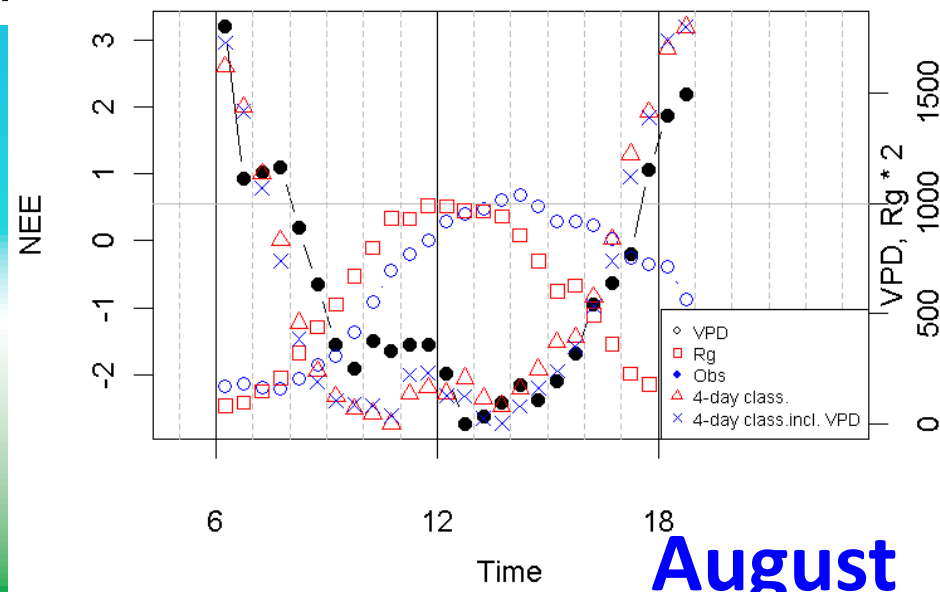
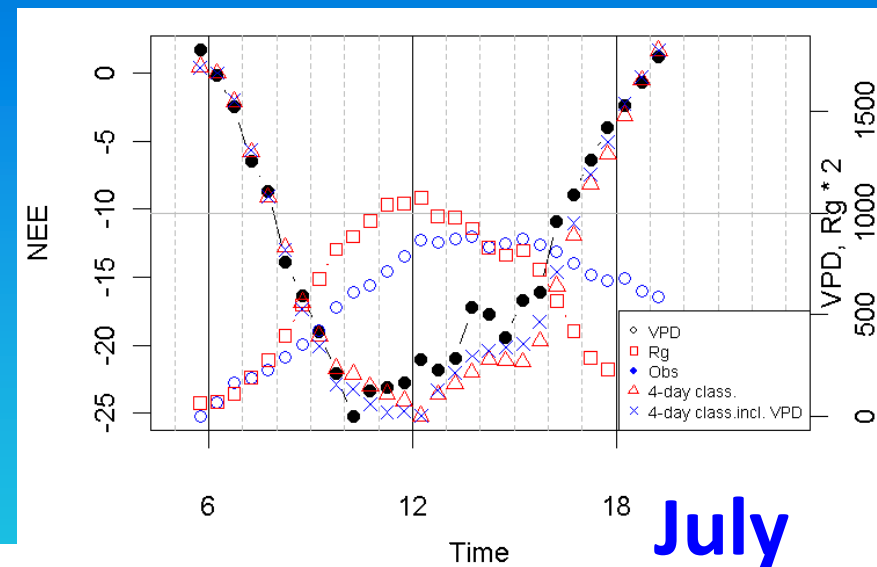
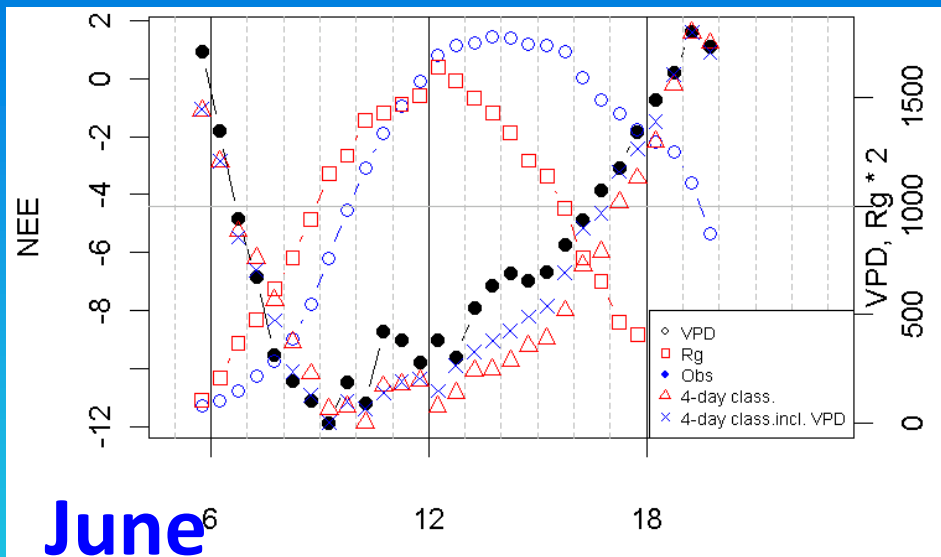
$$VPD_0 = 10 \text{ hPa}$$

Körner, 1995

Lasslop et al., 2010



VPD factor



Potato field

Conclusion

- 4-day and 8-day classification is sufficient for daytime NEE gap-filling for the potato and rice fields, respectively.
- As the seasonal response plays a more important role than temperature response, temperature classification for NEE gap-filling could be ignored for both the potato and rice fields if temporal classification is applied.
- The approach of Introducing a LAI factor can be used for filling large gaps of NEE.
- VPD response is an unimportant factor for both the rice field and the potato field except the early growing stage of potato.