

# Incorporation of wheat canopy temperatures into agroecosystem models by using a meta-model

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## Background & Objective

- Heat stress can significantly affect crop development and yield.
- Established agroecosystem models operating in daily time steps often use air temperature ( $T_{air}$ ) based approaches to estimate the impact of heat stress.
- Nevertheless mean and maximum canopy temperatures ( $T_{c,mean}$ ,  $T_{c,max}$ ) are potentially more suitable than  $T_{air}$  to quantify temperature effects on yield.
- Diurnal cycles of  $T_{air}$  and canopy temperature ( $T_c$ ) differ depending on meteorological conditions and soil water status.
- Therefore  $T_c$  cannot be directly derived from meteorological data and information related to soil water status is needed from dynamic models.
- We suggest a simple empirical model based on multiple linear regressions using available daily meteorological variables & output data from models operated at a daily time step to consider canopy-air temperature differences ( $\Delta T_{mean}$ ,  $\Delta T_{max}$ ) in these models.

## Material & Methods

### Data

- Rainout shelter experiments with wheat (*Triticum aestivum* cv. Dekan; 200 kg N/ha) conducted in Northern Germany (2010 & 2011; 3 irrigation levels: 0, 80 and 100 % of plant available soil water, PASW).

### Multiple linear regression model

$$T_{c,mean} = 2.87 + 0.89T_{air} + 0.02E_{AV} - 7.17 \frac{E_{act}}{ET_{pot}} - 0.37u - 0.04e_s \quad \text{adj.}r^2 = 0.96$$

$$T_{c,max} = 4.34 + 0.88T_{air} + 0.02E_{AV} - 9.96 \frac{E_{act}}{ET_{pot}} - 0.52u - 0.14e_s \quad \text{adj.}r^2 = 0.94$$

$$\Delta T_{mean} = 1.86 - 0.08T_{air} + 0.01E_{AV} - 2.63 \frac{ET_{act}}{ET_{pot}} + 0.12u - 0.32e_s \quad \text{adj.}r^2 = 0.77$$

$$\Delta T_{max} = 2.39 - 0.06T_{air} + 0.01E_{AV} - 2.51 \frac{ET_{act}}{ET_{pot}} + 0.06u - 0.28e_s \quad \text{adj.}r^2 = 0.74$$

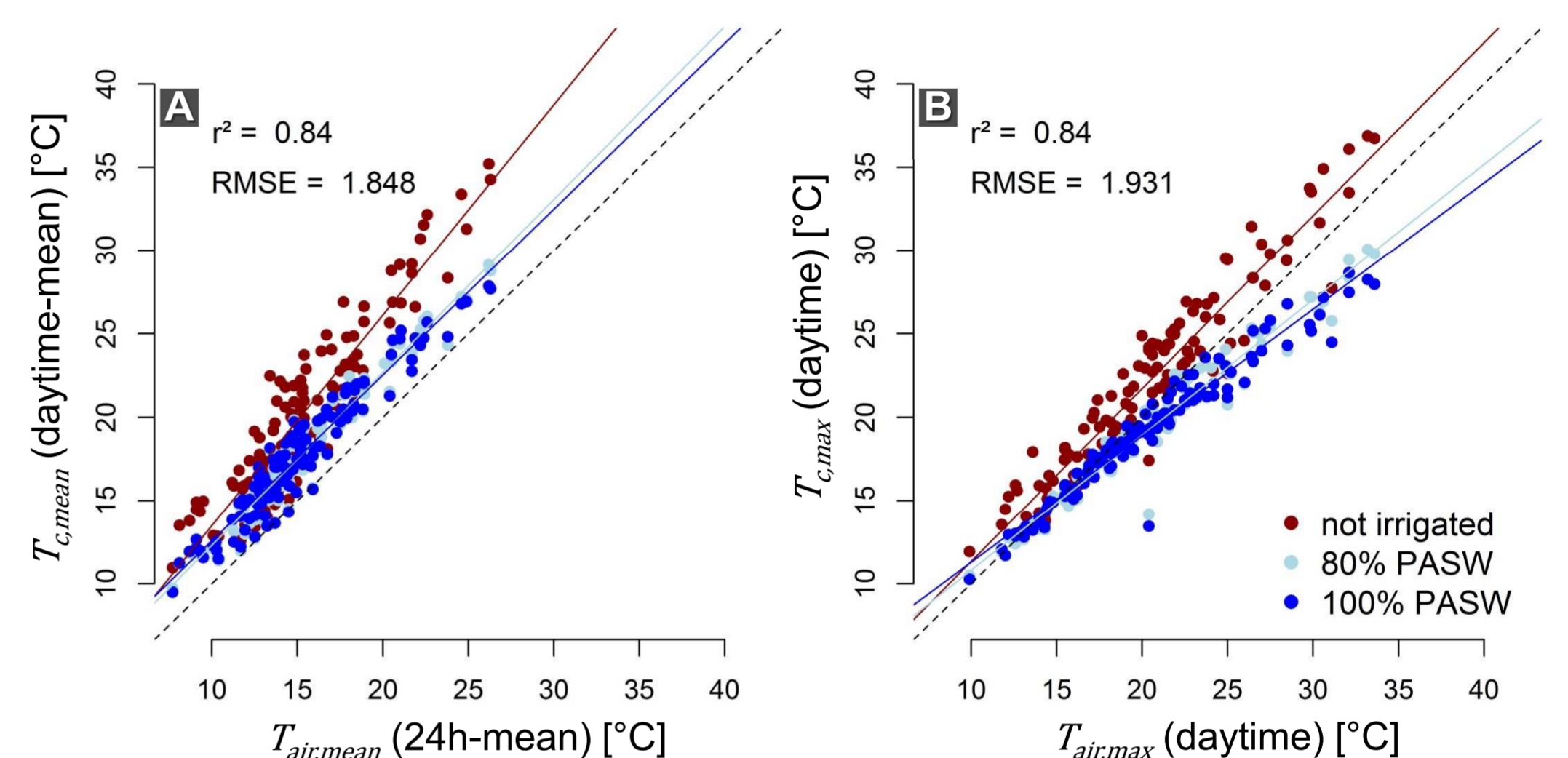
$E_{AV}$ : leaf area specific available energy for sensible heat fluxes ( $E_{AV} = \{R_{tot} - ET_{act}\} / \ln(LAI)$ );  $R_{tot}$ : total radiation;  $LAI$ : leaf area index;  $E_{act}$ : actual evaporation;  $u$ : wind speed;  $e_s$ : saturation deficit;  $ET_{act}$ : actual evapotranspiration;  $ET_{pot}$ : potential evapotranspiration

### Model Inputs

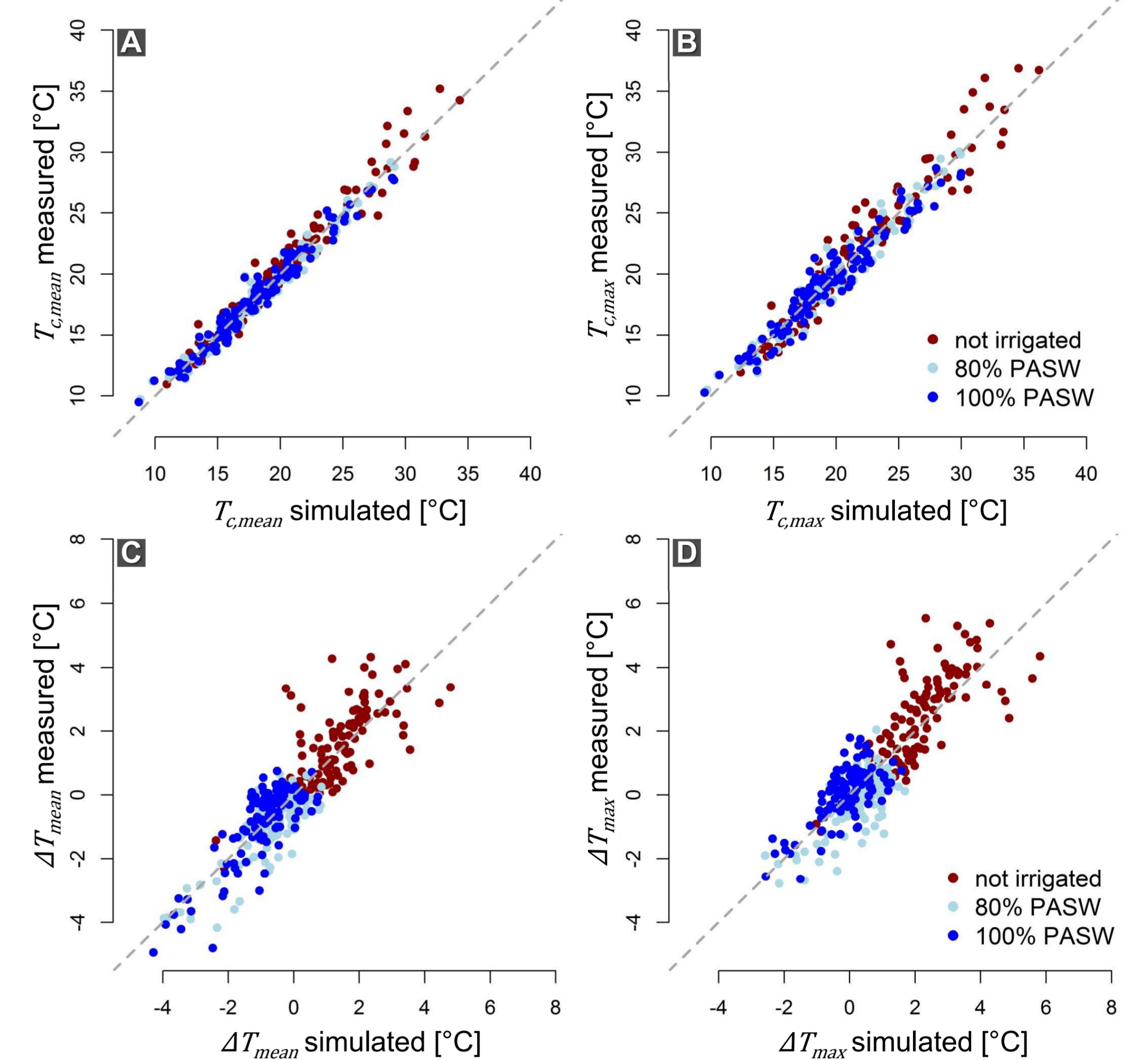
- Daily means of meteorological data between stem elongation and dough development.
- Means of canopy temperatures between sunrise+3h and sunset-3h.
- Simulated  $ET_{act}$ ,  $ET_{pot}$ ,  $E_{act}$
- The variance inflation factor (VIF) < 3 was used as benchmark to assess existing multi-collinearity of meteorological data.

## Preliminary Results

- $T_c$  differs from  $T_{air}$  with systematic deviation due to water status (Fig. 1).
- Goodness of fit of the multiple linear regression model:
  - Realistic canopy temperatures with an RMSE of < 1°C for  $T_{c,mean}$  and ~1 – 1.4°C for  $T_{c,max}$  (Fig. 2 A, B).
  - Realistic canopy-air temperature differences ( $\Delta T_{mean}$ ,  $\Delta T_{max}$ ) with an RMSE of ~0.8 °C which can be used as an indicator for crop response to water stress (Fig. 2 C, D).



**Fig. 1:** Linear regression between measured  $T_{air,mean}$  (24h-mean) and  $T_{c,mean}$  (daytime) (A) and between measured  $T_{air,max}$  and  $T_{c,max}$  (B) in 2010 and 2011 (statistics of the overall regression fit are shown; colored solid lines indicate linear model fits for the different irrigation treatments; dashed black line: line of identity)



**Fig. 2:** Scatterplots between simulated and measured  $T_{c,mean}$  (A),  $T_{c,max}$  (B),  $\Delta T_{mean}$  (C) and  $\Delta T_{max}$  (D) for the years 2010 and 2011 (dashed gray line: line of identity)

## Discussion and Outlook

- Observed high canopy temperatures could have a strong impact on wheat productivity and models should strive to predict them accurately especially if critical temperature thresholds are used.
- This regression model is a first step to develop the aspired meta-model.
- In order to obtain a more universal algorithm longer time series data and non-linear responses of canopy temperatures to environmental conditions need to be included.