



Linking ambient temperature to crop growth and phenology on a cultivar specific basis

Lukas Kronenberg

21st annual WGIN stakeholder meeting

Norwich 2024-02-08

Temperature has a strong effect on plant phenology

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Wild flowers

This article is more than **8 months old**

Flowers arriving a month early in UK as climate heats up

Plants now bloom in mid-April on average, with scientists warning of mismatches with insects and birds



Damian Carrington
Environment editor
@dpcarrington
Wed 2 Feb 2022 06:00 GMT

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Science & Environment

Climate change: UK plants now flowering a month earlier

2 February 2022 · Comments

Climate



GETTY IMAGES

Naturalists have been recording the appearance of spring blossom for centuries

By **Helen Briggs**
Environment correspondent

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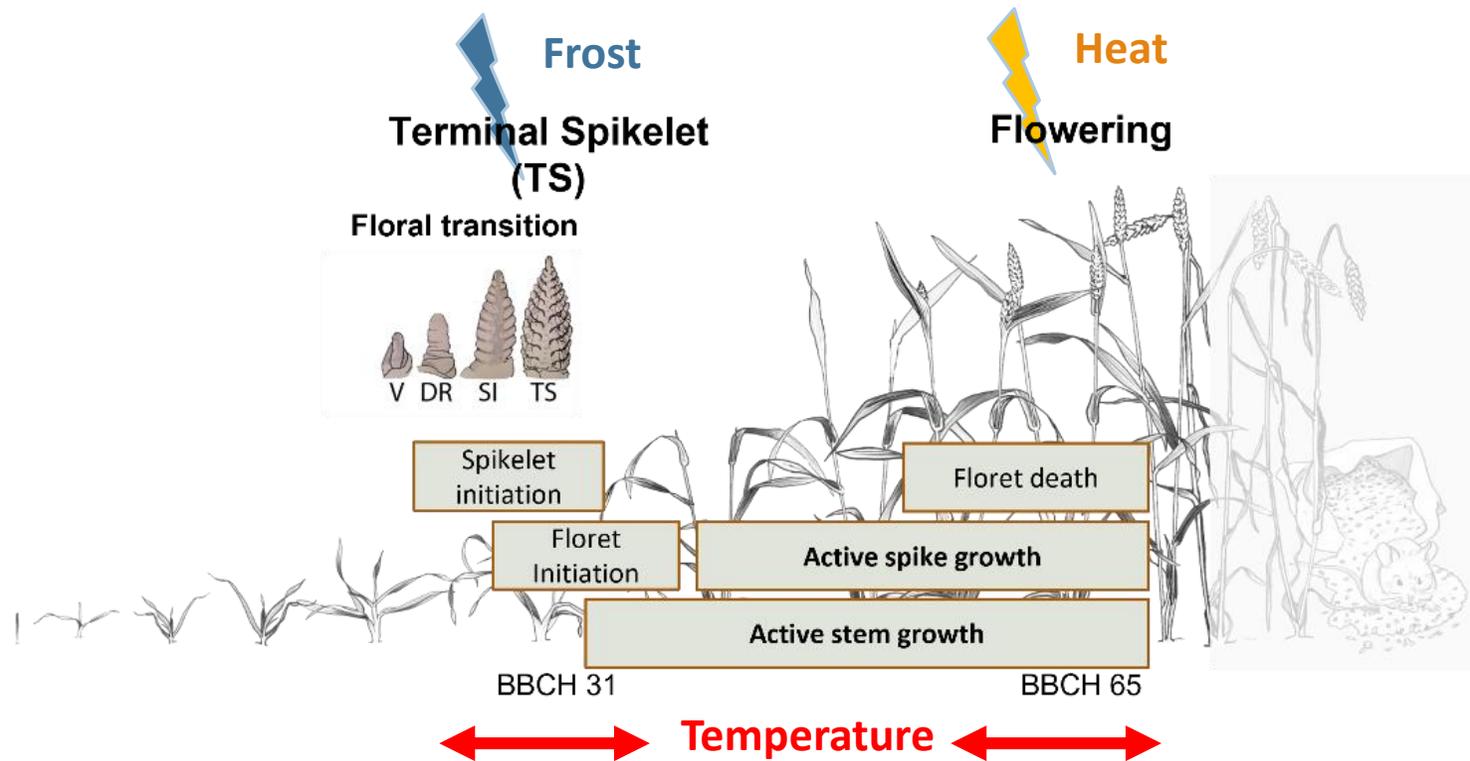
Spring could soon start in FEBRUARY: UK plants are flowering a month earlier due to climate change, study warns

- Climate change is causing plants in the UK to flower a month earlier on average
- That is the finding of a Cambridge University study analysing 406 plant species
- They looked at 400,000 observations from records dating back to 18th century
- Average first flowering date from 1987-2019 was a month earlier than 1753-1986

By **SAM TONKIN FOR MAILONLINE**
PUBLISHED: 01:42, 2 February 2022 | **UPDATED:** 13:34, 2 February 2022

Image source: University of Göttingen - E. Rezaei - innovations-report.de

Critical phenological phases need to happen at the right time!



Example:

Wheat stem elongation phase

- critical for the formation of yield potential
- Longer duration → more grains per spike
- Frost around GS31 or heat around flowering reduce # grains and yield

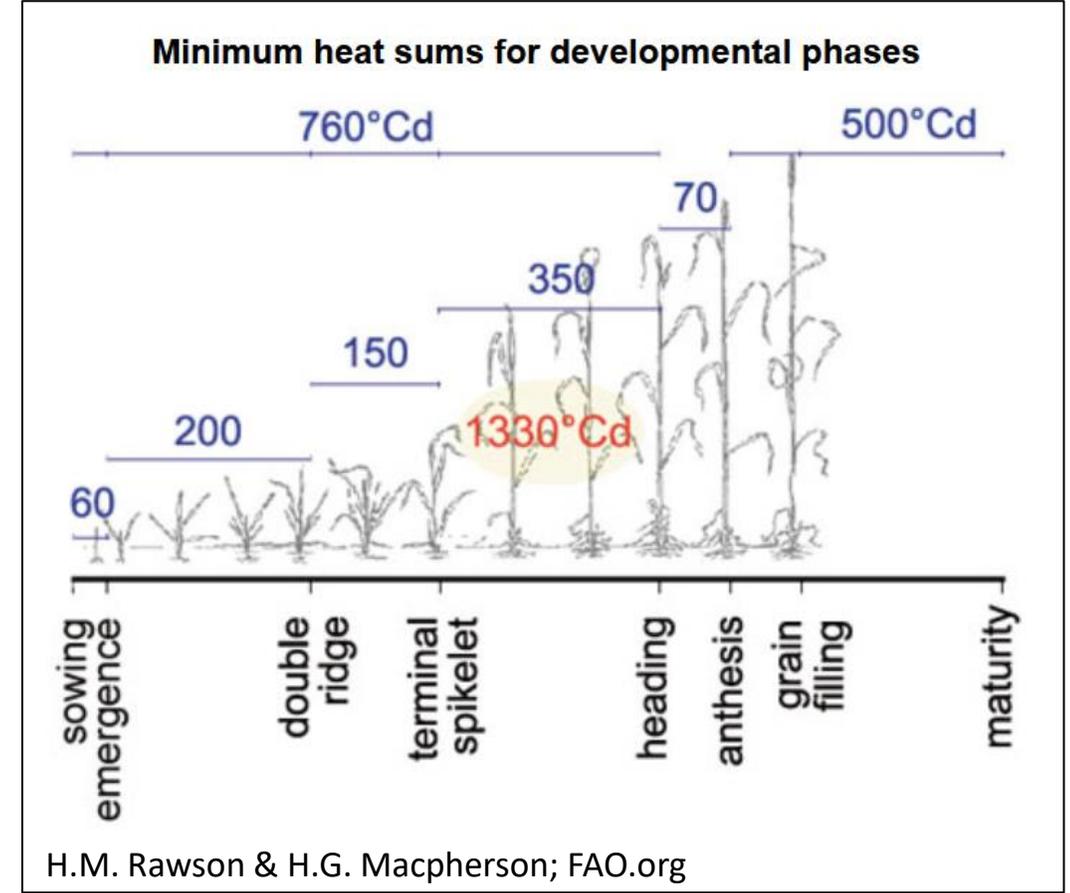
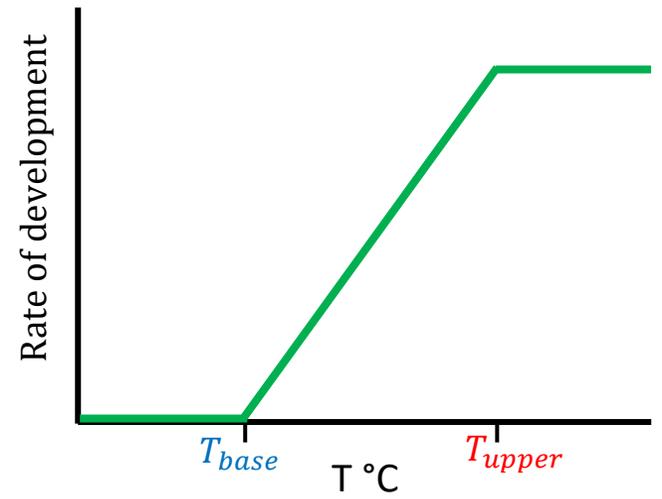
How do we quantify this?

The concept of **Growing Degree Days**

a.k.a. **thermal time** a.k.a. **heat sums**

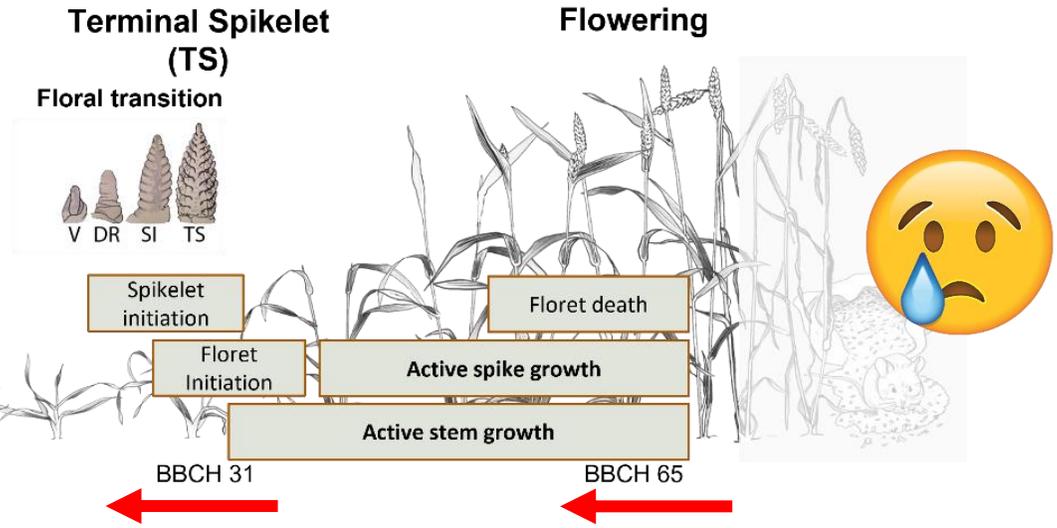
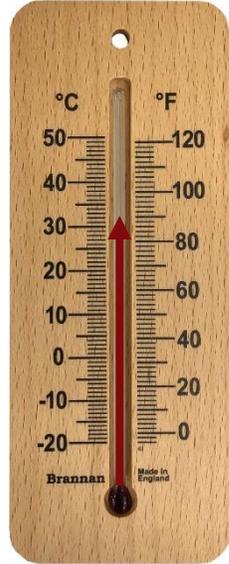
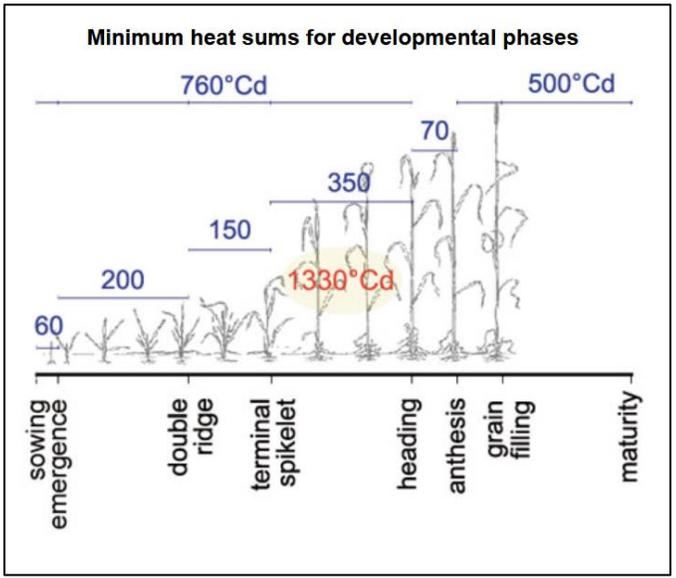
$$GDD = \sum_{d=1}^n \begin{cases} T_d \text{ mean} - T_{base}, & T_{base} < T_d \text{ mean} < T_{upper} \\ 0, & T_d \text{ mean} < T_{base} \\ T_{upper} - T_{base}, & T_d \text{ mean} > T_{upper} \end{cases}$$

- $T_d \text{ mean}$: daily mean temperature
- T_{base} : **species-specific** base temperature
- T_{upper} : **species-specific** upper temperature limit



- **Crop modelling**
- **Agronomic crop management**

Species specific temperature response...



Research



Temperature responses of developmental processes have not been affected by breeding in different ecological areas for 17 crop species

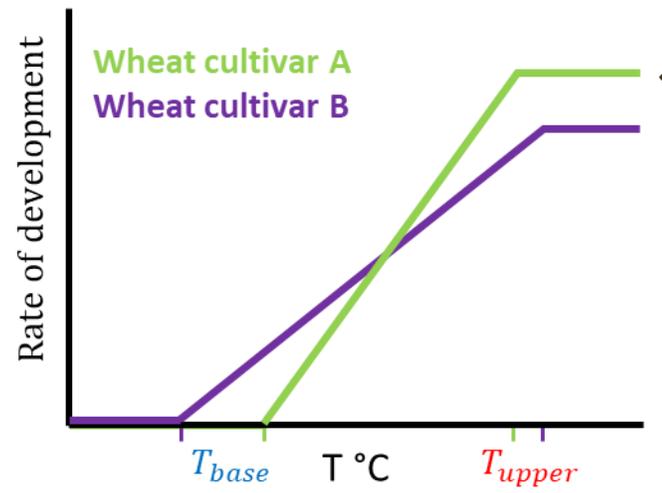
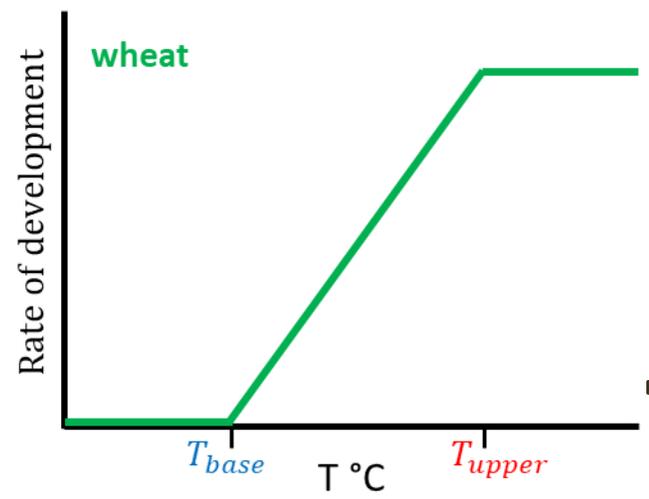
Boris Parent¹ and François Tardieu²

¹Australian Centre for Plant Functional Genomics, PMB1, Glen Osmond, SA 5064, Australia; ²INRA, UMR759 Laboratoire d'Ecophysiologie des Plantes sous Stress Environnementaux, Place Viala, F-34060 Montpellier, France

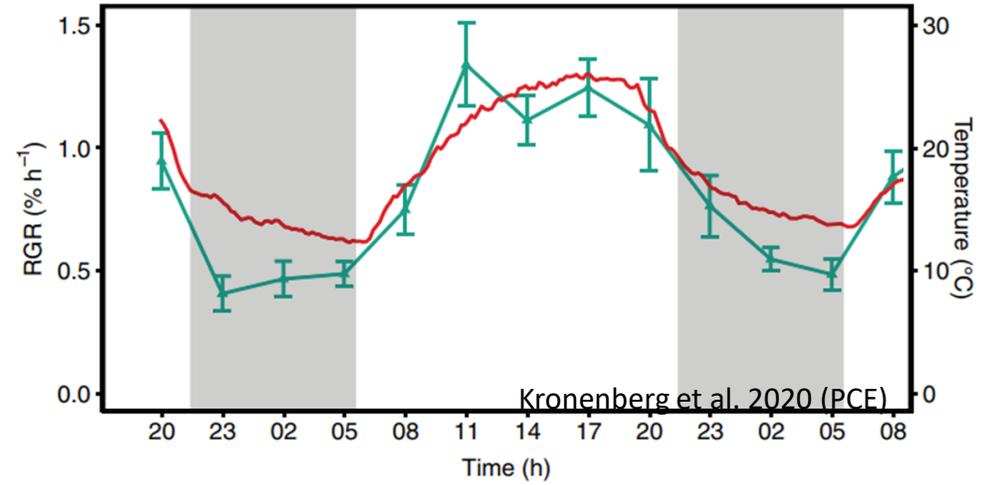
... Or rather cultivar specific temperature response ?



Feldversuch mit Winterweizen: Gegenüberstellung der Sorte „Tommi“ aus dem Jahr 2002 und der Sorte „Heines VII“ aus dem Jahr 1950 in der Phase zwischen Beginn des Ährenschiebens und Beginn der Blüte. Universität Göttingen
 image source: University of göttingen
 - E. Rezai - innovations-report.de



Growth is very sensitive to temperature!



- use growth as temperature response indicator
- Measure canopy height increase in the field, on a plot-level basis
- Using drones

SCIENTIFIC REPORTS

OPEN **Climate change effect on wheat phenology depends on cultivar change**

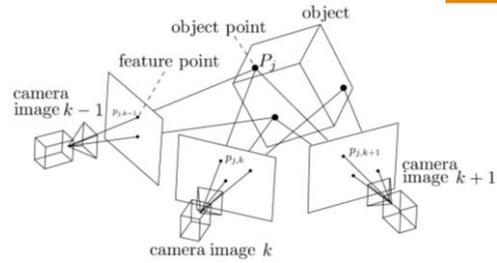
15 June 2017
6 March 2018

Ehsan Eyshi Rezaei^{1,2,4}, Stefan Siebert^{1,4}, Hubert Hüging³ & Frank Ewert^{1,3}

How to measure canopy height with a drone?



Structure from motion



3D point cloud / digital elevation model



Plot canopy height extraction
[zonal statistics]

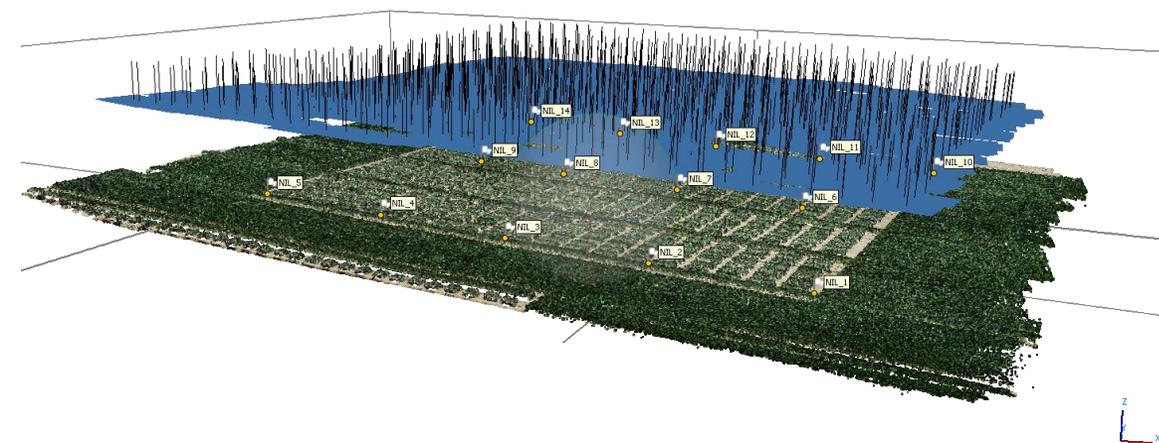
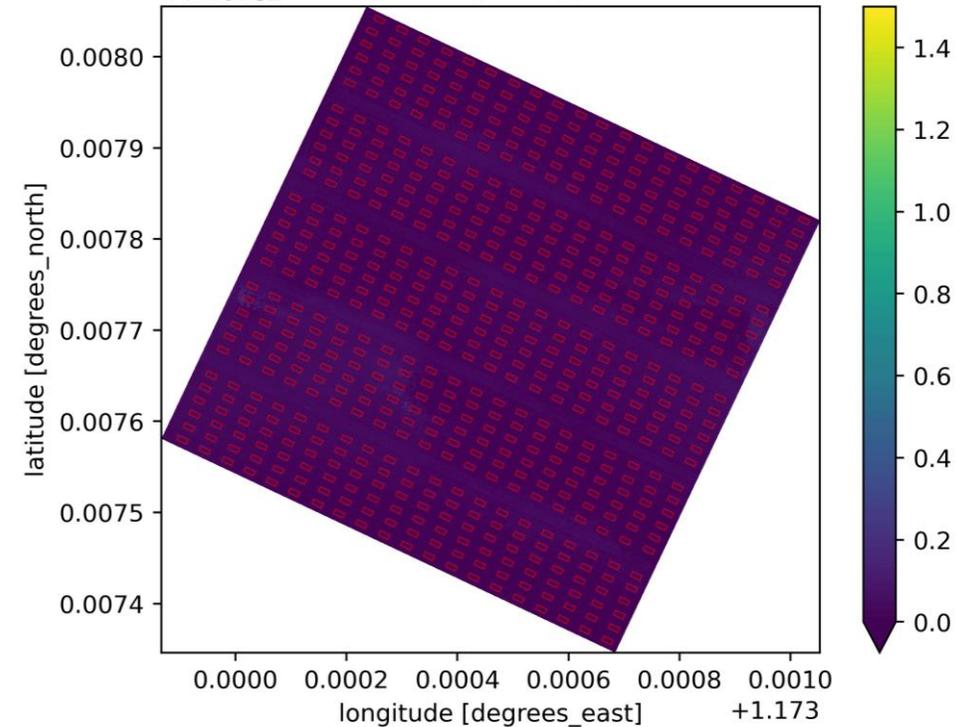


Moulon et al., 2013;
DOI: 10.1007/978-3-642-37447-0_20

2023-02-14

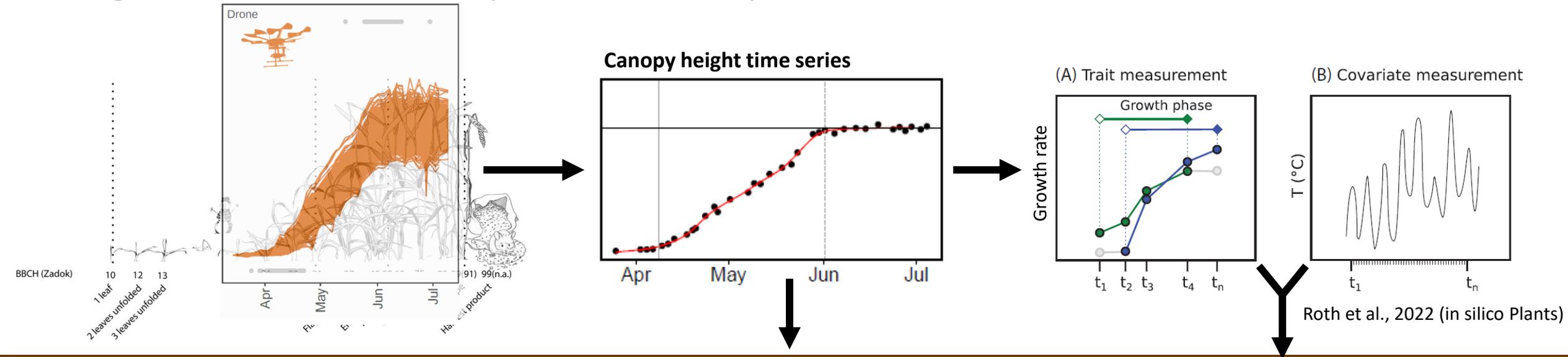
Canopy height time series

+5.262e1 band = 1, spatial_ref = 0



<https://shiny.usys.ethz.ch/PhenoFlyPlanningTool/>
Roth et al., 2018; Plt.Methods

Canopy height time series allow to model cultivar-specific timing of stem elongation and its temperature response

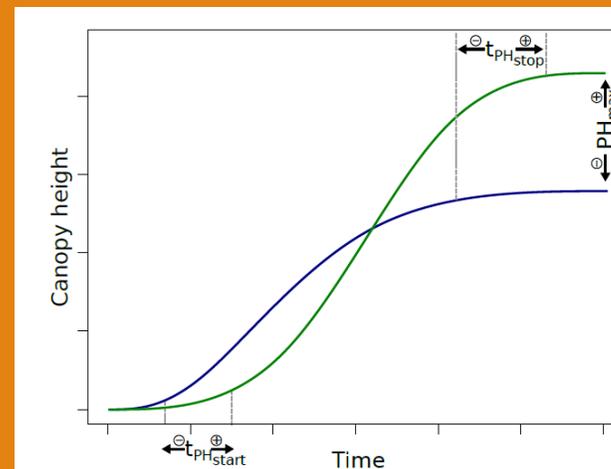


Using canopy height measurements, we can obtain plot (-> cultivar) specific

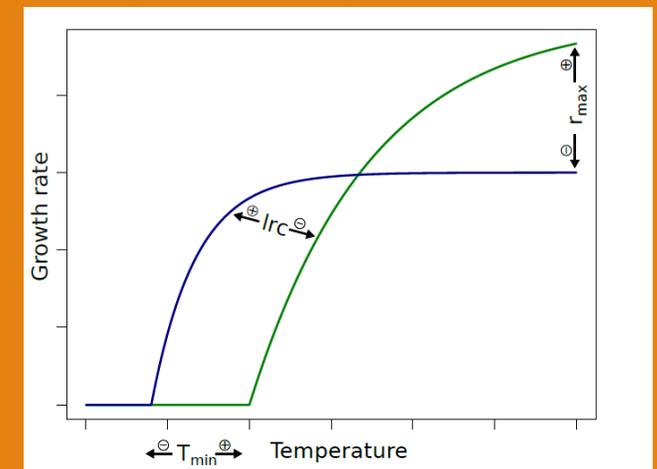
- Temperature response parameters
 - T_{min} base temperature
 - Lrc *per se* response
 - r_{max} «intrinsic» growth at optimum T
- Timing of stem elongation

Kronenberg et al 2017 (Euphytica)
 Kronenberg et al. 2020 (JXB)
 Roth & Kronenberg et al. 2023 (JXB)

Timing of stem elongation



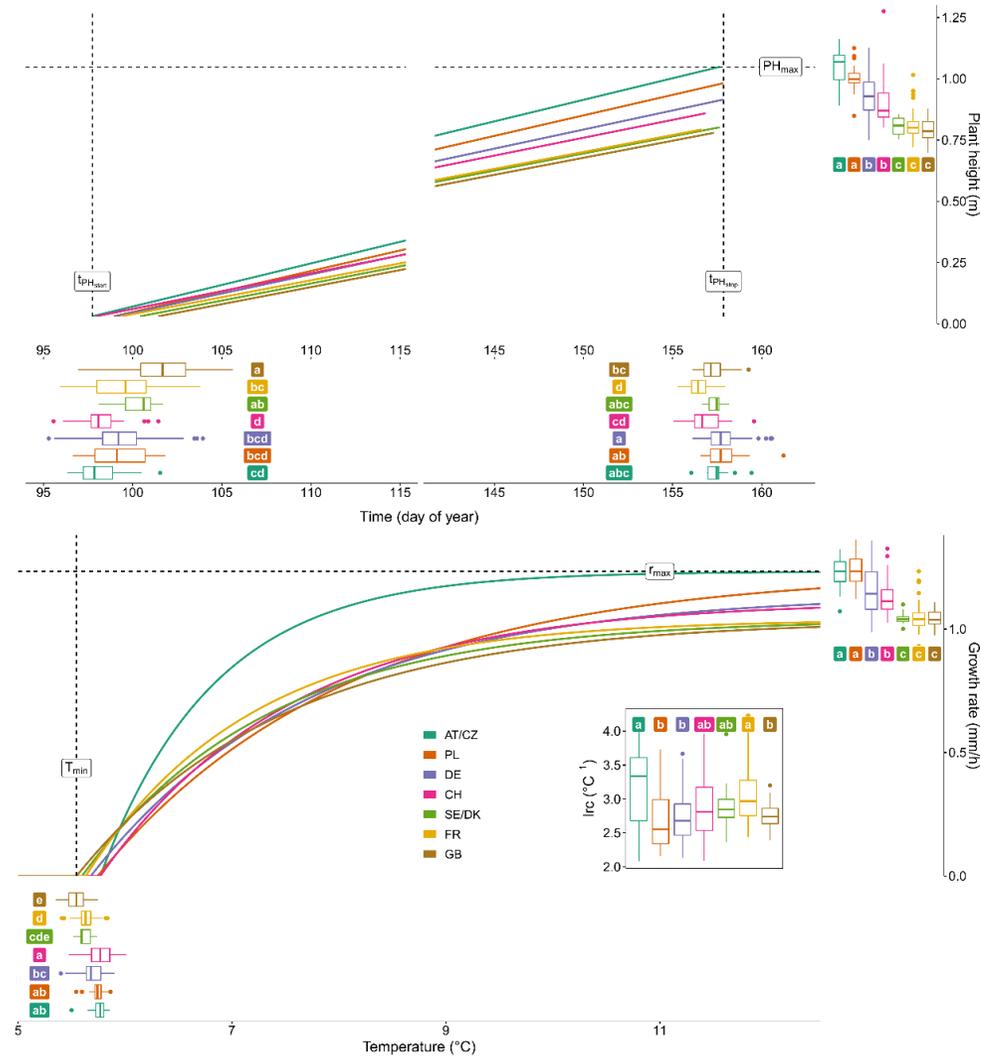
Temperature response



Temperature response and phenology in European elite germplasm

- GABI wheat; 330 varieties
- Grown 2015-2018

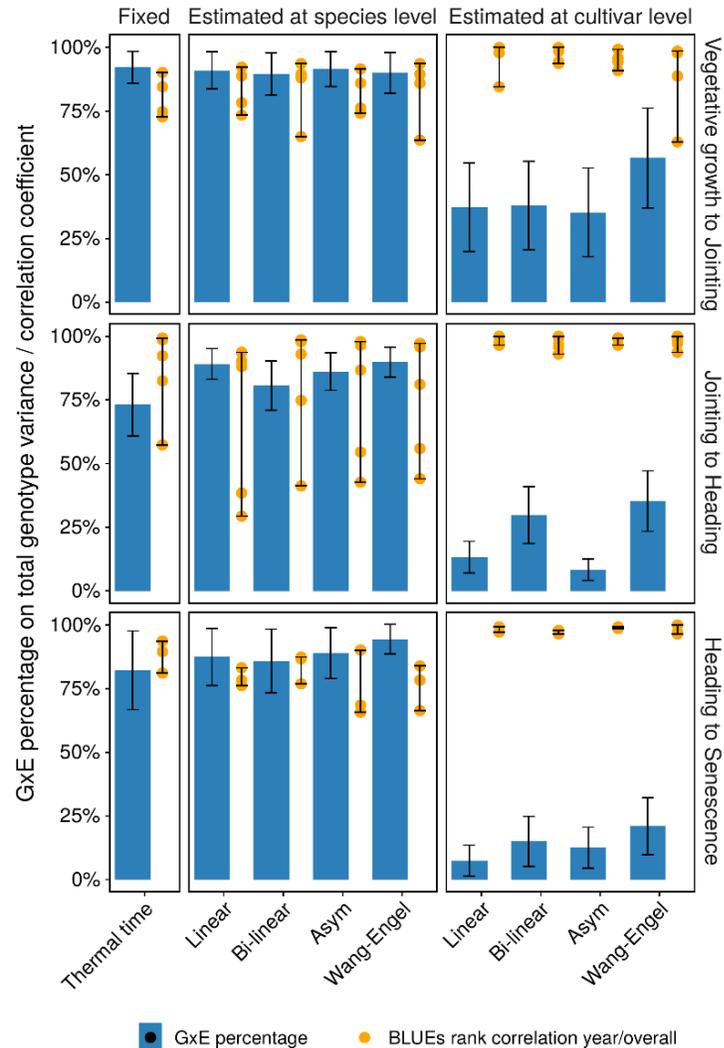
Trait	Heritability
r_{max}	0.89
lrc	0.29
T_{min}	0.63
PHmax	0.98
tPHstart	0.77
tPHstop	0.87



- High heritabilities
→ *We can select for these traits*
- Significant differences among varieties regarding country of registration
→ *Breeding can affect temperature response*
- East > West gradient for height and r_{max}
- West > East gradient for start, T_{min} and lrc (to some extent)

Kronenberg et al., 2021; JXB
Roth & Kronenberg et al., 2023; JXB

Cultivar-specific temperature response greatly improves phenology prediction!







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New Results

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From neglecting to including cultivar-specific *per se* temperature responses: Extending the concept of thermal time for plant development modeling

👤 Lukas Roth, Martina Binder,
👤 Norbert Kirchgessner,
👤 Flavian Tschurr,
👤 Steven Yates,
👤 Andreas Hund,
👤 Lukas Kronenberg,
👤 Achim Walter

doi: <https://doi.org/10.1101/2023.08.29.555271>

Conclusions

- **High throughput field phenotyping** allows to characterize wheat **temperature response** on a **cultivar-specific** level
- Origin **specific temperature response pattern** indicate their relevance **for local adaptation**
- Using **cultivar-specific** temperature response parameters may **improve crop models**
- **High heritability** indicates suitability for direct **phenotypic** selection or applications in **genomic-** or **marker assisted selection**
 - Improving local adaptation
 - Fine-tuning phenology



Special thanks to:



Funding

Swiss National Science Foundation (SNF)
BBSRC Designing Sustainable Wheat (DSW)



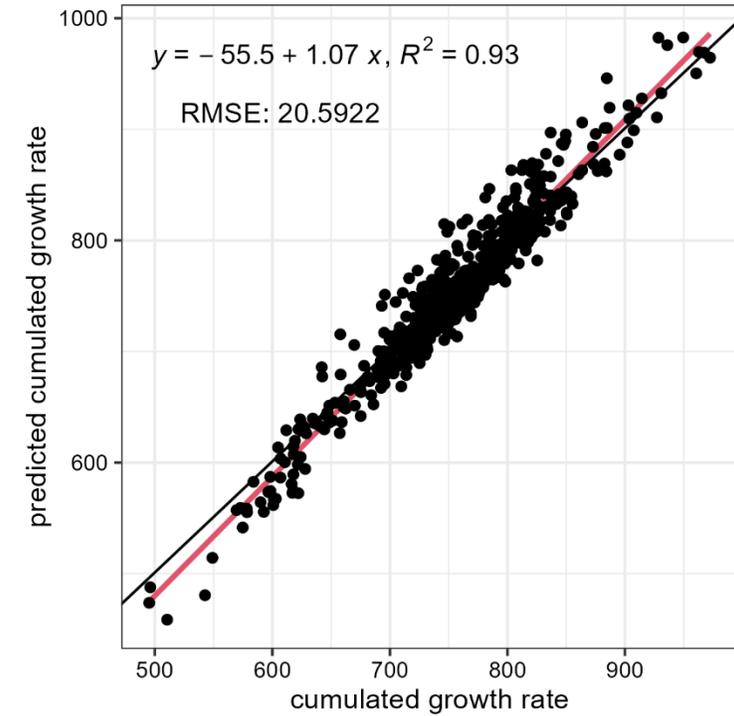
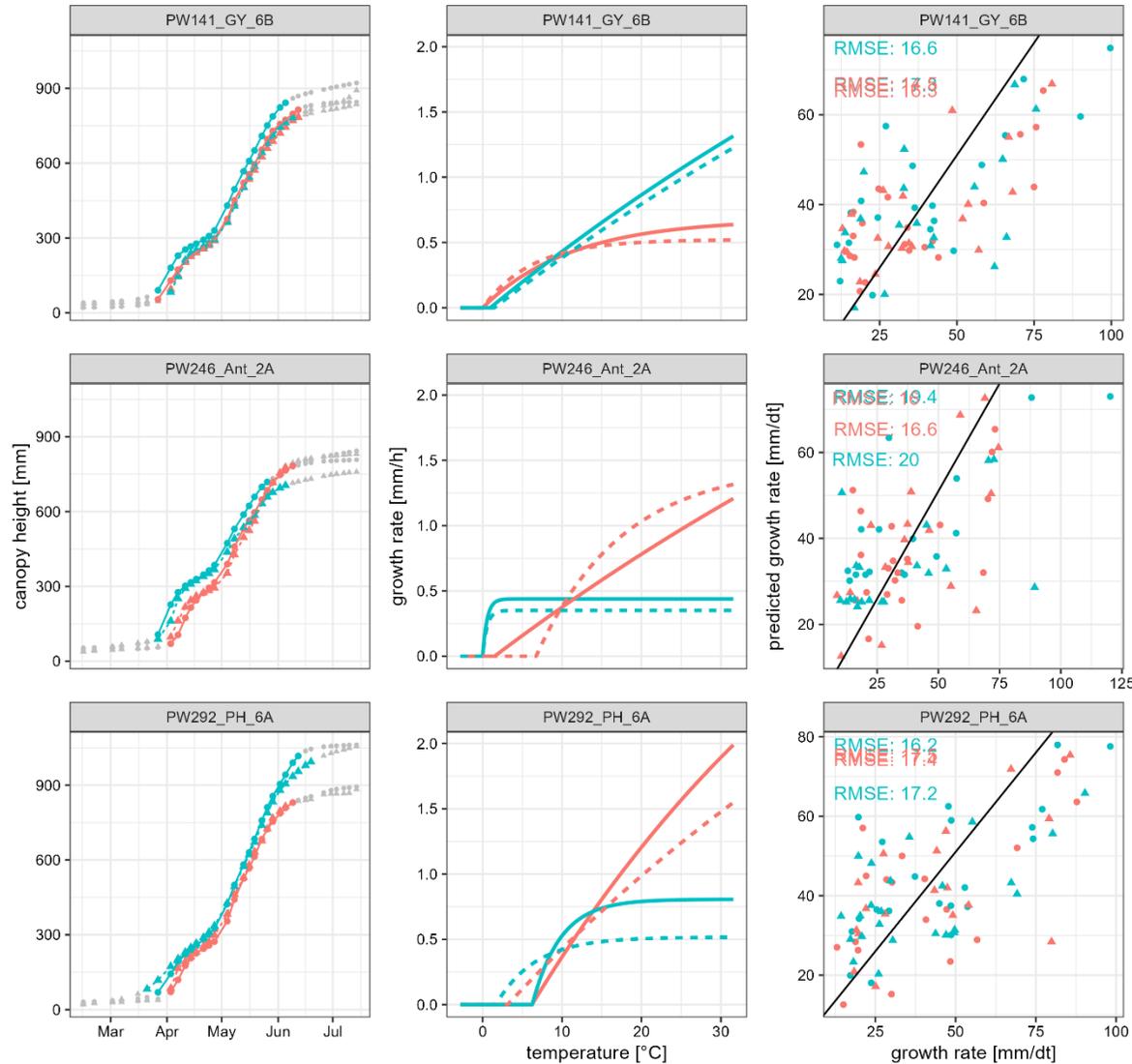
Biotechnology and
Biological Sciences
Research Council



SWISS NATIONAL SCIENCE FOUNDATION

Model fits DFW academic toolkit 2023

REP — 1 — 2 allele — P — W

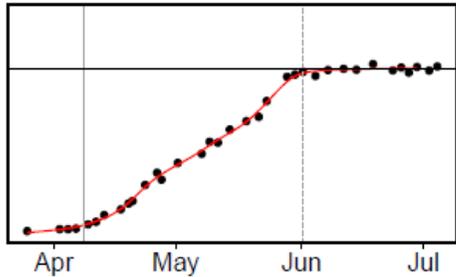


Trait	Heritability
r_{\max}	0.51
lrc	0.54
T_{\min}	0.52
PHmax	0.97
tPHstart	0.49
tPHstop	0.66

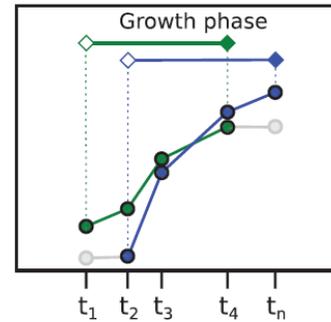
Canopy height time series allow to model genotype-specific timing of stem elongation and its temperature response



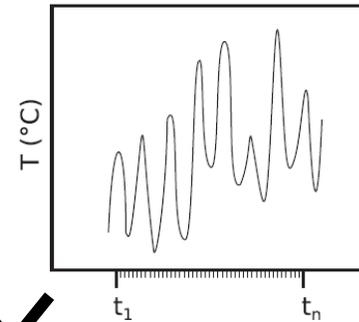
Canopy height time series



(A) Trait measurement

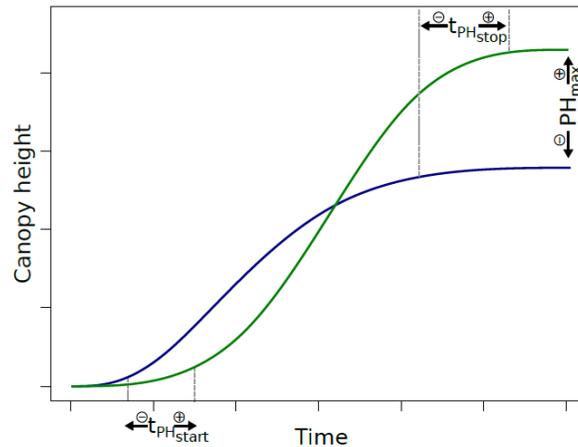


(B) Covariate measurement

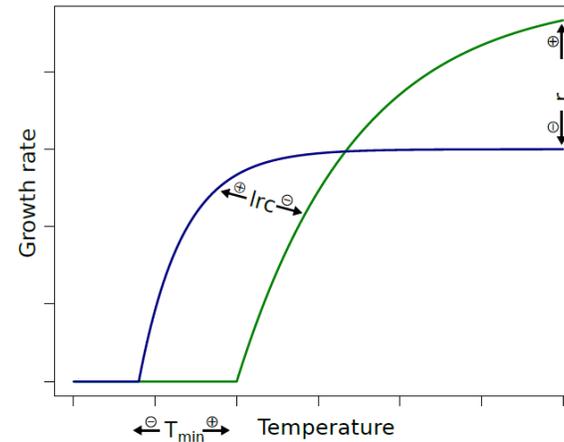


QMER
Roth et al. 2021; Field Crops Research

Timing of stem elongation



Temperature response



Roth et al., 2022; in silico Plants

$$y_t = \sum_{d=t_0}^t \left(\sum_{h=1}^{n_d} r(T_{dh}, \theta) \cdot \Delta m_h \right)$$

$$r = r_{\max} \cdot (1 - \exp(-\exp(s) \cdot (T - T_{\min})))$$

$$r_{\text{asym}}(T) = \begin{cases} r, & r > 0 \\ 0, & \text{otherwise} \end{cases}$$

Kronenberg et al. 2017; Euphytica
Kronenberg et al., 2021; JXB
Roth & Kronenberg et al. 2023; JXB