



Systems for Biological Timing in the Green Lineage



Andrew Millar
SynthSys-Plants

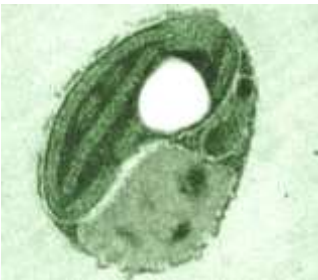


Multiscale models – plant biology

Genomics

Phenomics

- ‘Crop-style’ growth model for *A.t.*
- A tool to reconcile and understand pleiotropic (dynamic, quantitative) phenotypes.



- How can a community build such a tool?
- What about its impact on Food Security?

Current:

Karine Prado

Zeenat Noordally

Sarah Hodge

Katalin Kis

Johanna Kramer

Uriel Urquiza

Yin-Hoon Chew

Matthew Hindle

Argyris Zardilis

Daniel Seaton

Tomasz Zielinski

Past:

Simon Thain

Kamal Swarup

Ruth Bastow

Harriet McWatters

Shigeru Hanano

Seth Davis

Mandy Dowson-Day

Giovanni Murtas

Neeraj Salathia

Maria Eriksson

Anthony Hall

Alex Morton

Boris Shulgin

Nickiesha Bromley

Victoria Hibberd

Megan Southern

Domingo Salazar

Paul Brown

James Locke

Laszlo Kozma-Bognar

Kieron Edwards

Adrian Thomson

Qian Xing

John O'Neill

Treenut Saithong

Ozgur Akman

Oxana Sorokina

Chris Tindal

Ruth Bastow
(GARNet/GPC)

Kevin Stratford, EPCC

Carl Troein

Laura Dixon

Benedicte Wenden

Martin Beaton

Alexandra Pokhilko

Kirsten Knox

Gerben van Ooijen

Eilidh Troup, EPCC

Rob Smith

Amitesh Pratap

Anne Moore

David Toner

Peter Freeman

C.-Elisa Schaum

Ally Hume, EPCC

Collaborators

Ramon Grima; Guido

Sanguinetti; Vincent Danos

PlaSMo: H. Ougham (IBERS),

R. Muetzelfeldt (Simulistics Ltd.)

Philippe de Reffye (CIRAD)

TiMet: M. Stitt, A. Graf (MPI Golm), Wilhelm Gruissem (ETHZ), Alison Smith (JIC)

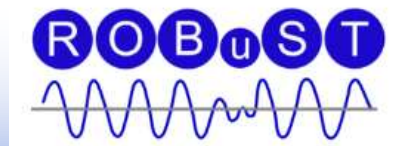
ROBuST: K. Halliday (UoE), S. Penfield (Exeter), A. Hall (Liverpool),

D. Rand, B. Finkenstädt (Warwick)

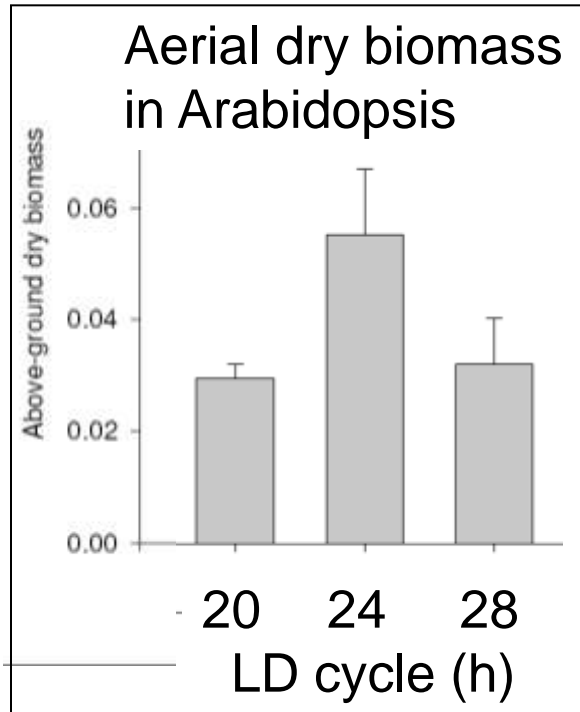
Paloma Mas (Barcelona)

Takato Imaizumi (U. Wash.)

Funding: BBSRC, EU, EPSRC, HFSP

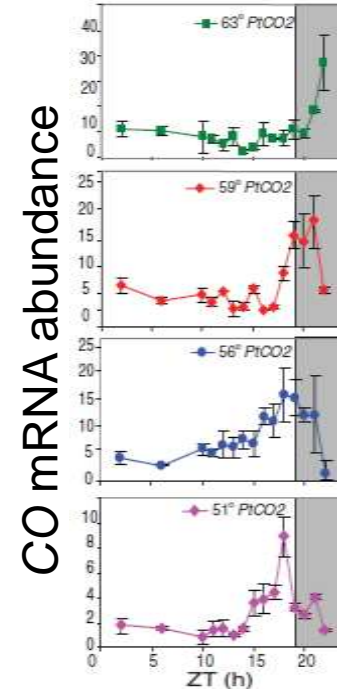
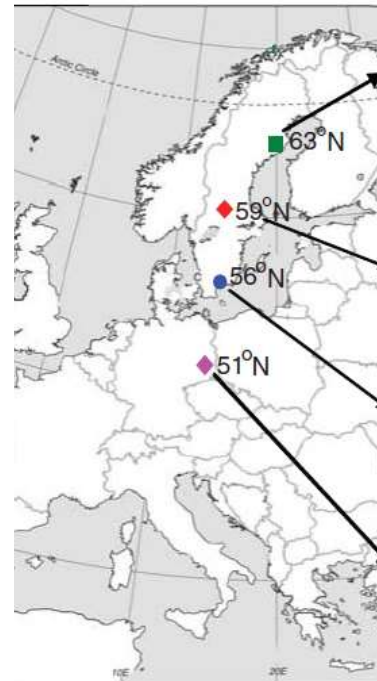


Phase matters



Dodd *et al.*
Science 2005

Critical day length in aspen trees

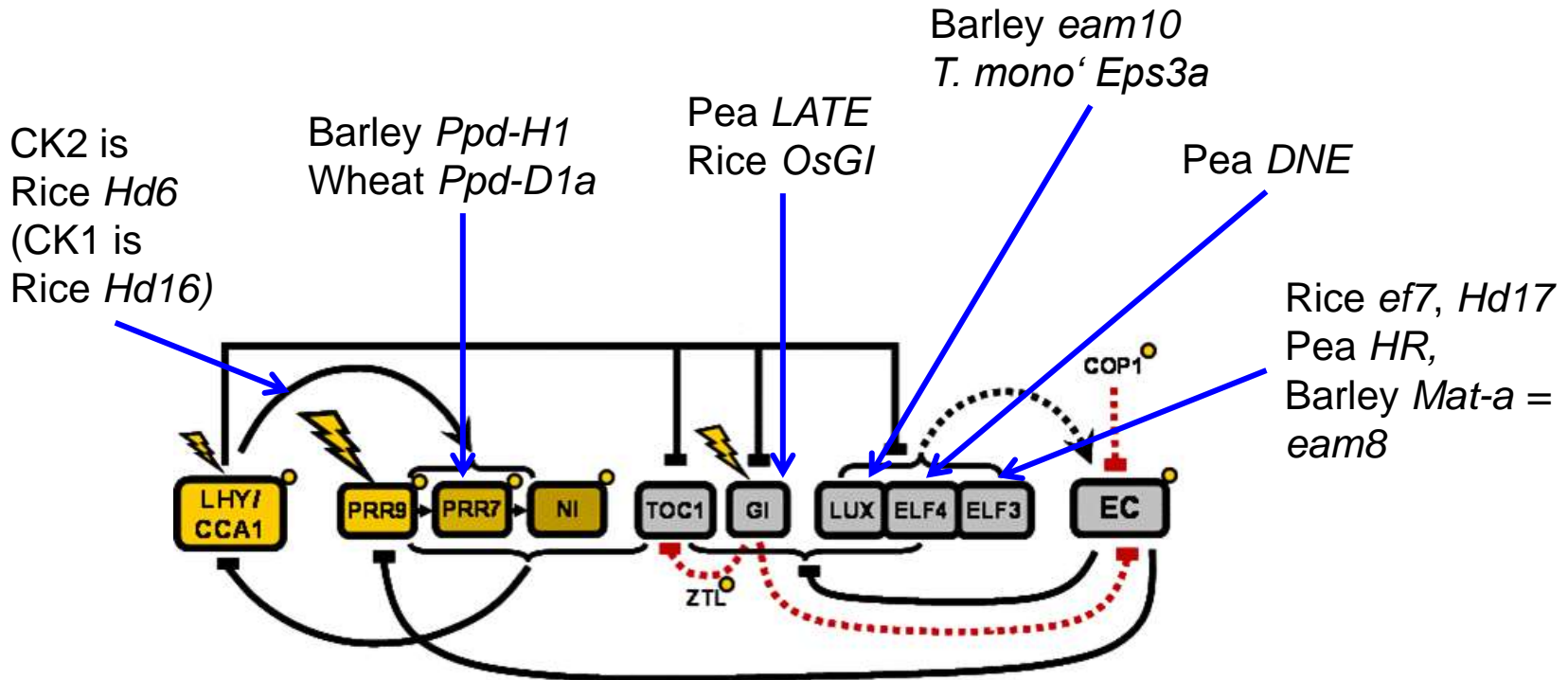


Bohlenius *et al.* Science 2006

- Altering the day/night cycle changes the peak times = *phase*
- Correct phase optimises growth and seasonal development

A.t. Clock Genes in Crops

- Regulation of photoperiodic flowering



- Also many flowering-specific genes, like *Arabidopsis CO*, *FT*.

Schema from Pokhilko et al., *Molecular Systems Biology* 8:574 (2012)

Multiscale models – plant biology

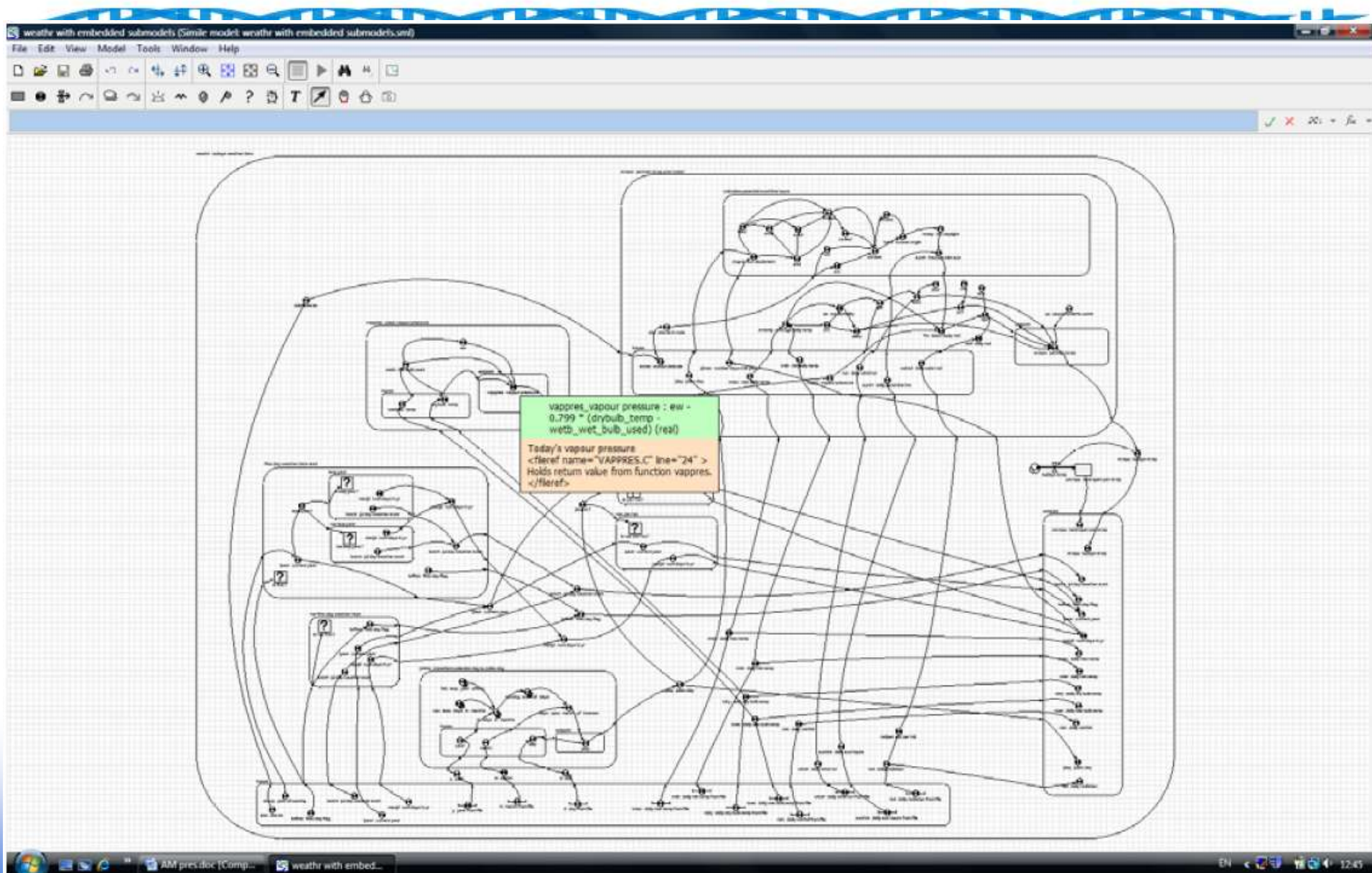
- ‘Crop-style’ growth model for *A.t.*
- A tool to reconcile and understand *conditional*, pleiotropic (dynamic, quantitative) phenotypes.



Genomics

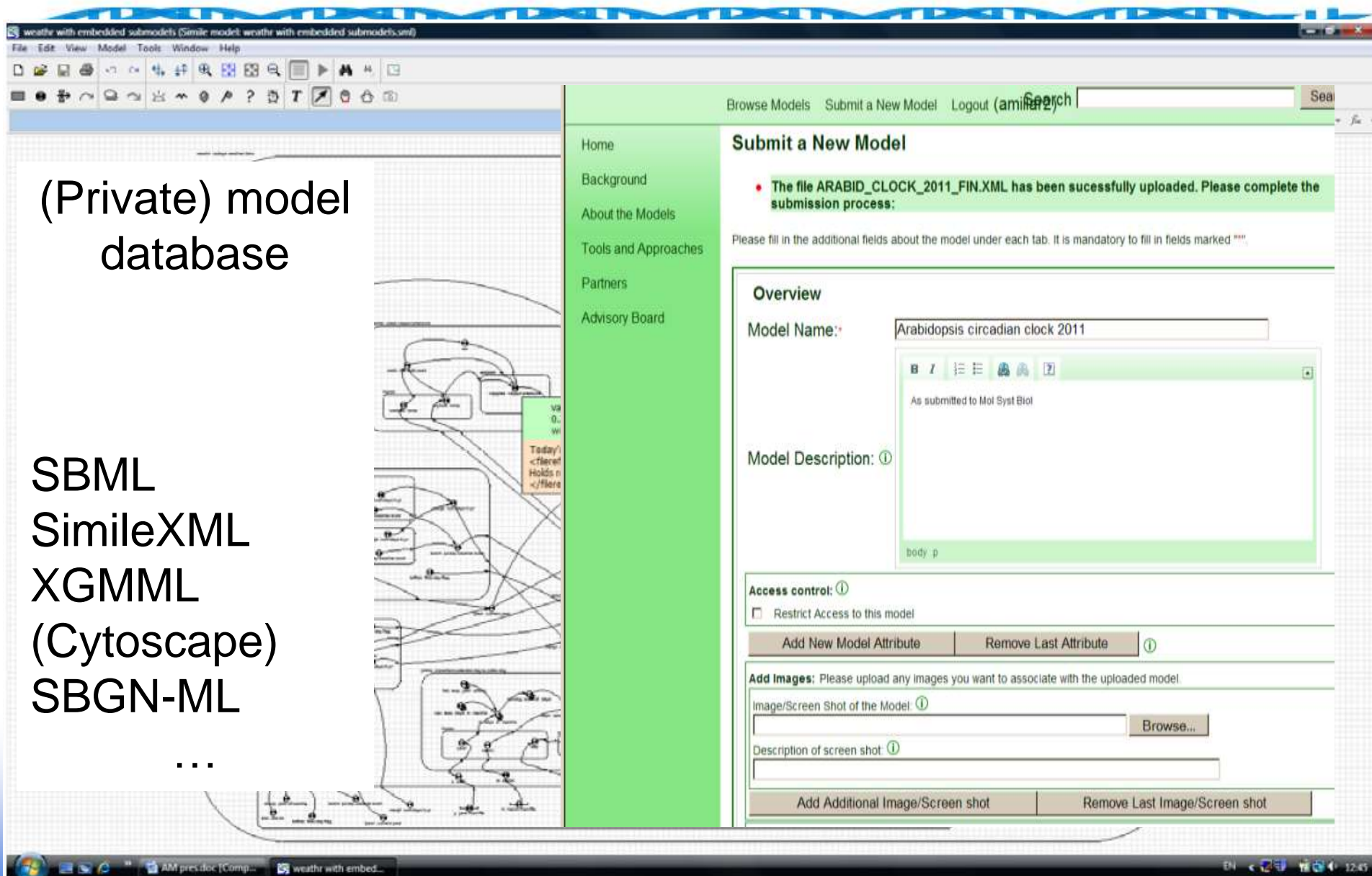
Phenomics

Collate models, in Simile software



(Private) model
database

SBML
SimileXML
XGMML
(Cytoscape)
SBGN-ML
...



weather with embedded submodels (Simile models: weather with embedded submodels.smf)

File Edit View Model Tools Window Help

Browse Models Submit a New Model Logout (amiller) Search

Submit a New Model

- The file ARABID_CLOCK_2011_FIN.XML has been successfully uploaded. Please complete the submission process:

Please fill in the additional fields about the model under each tab. It is mandatory to fill in fields marked ""

Overview

Model Name: Arabidopsis circadian clock 2011

Model Description: ①

Access control: ①

☐ Restrict Access to this model

Add New Model Attribute Remove Last Attribute ①

Add Images: Please upload any images you want to associate with the uploaded model.

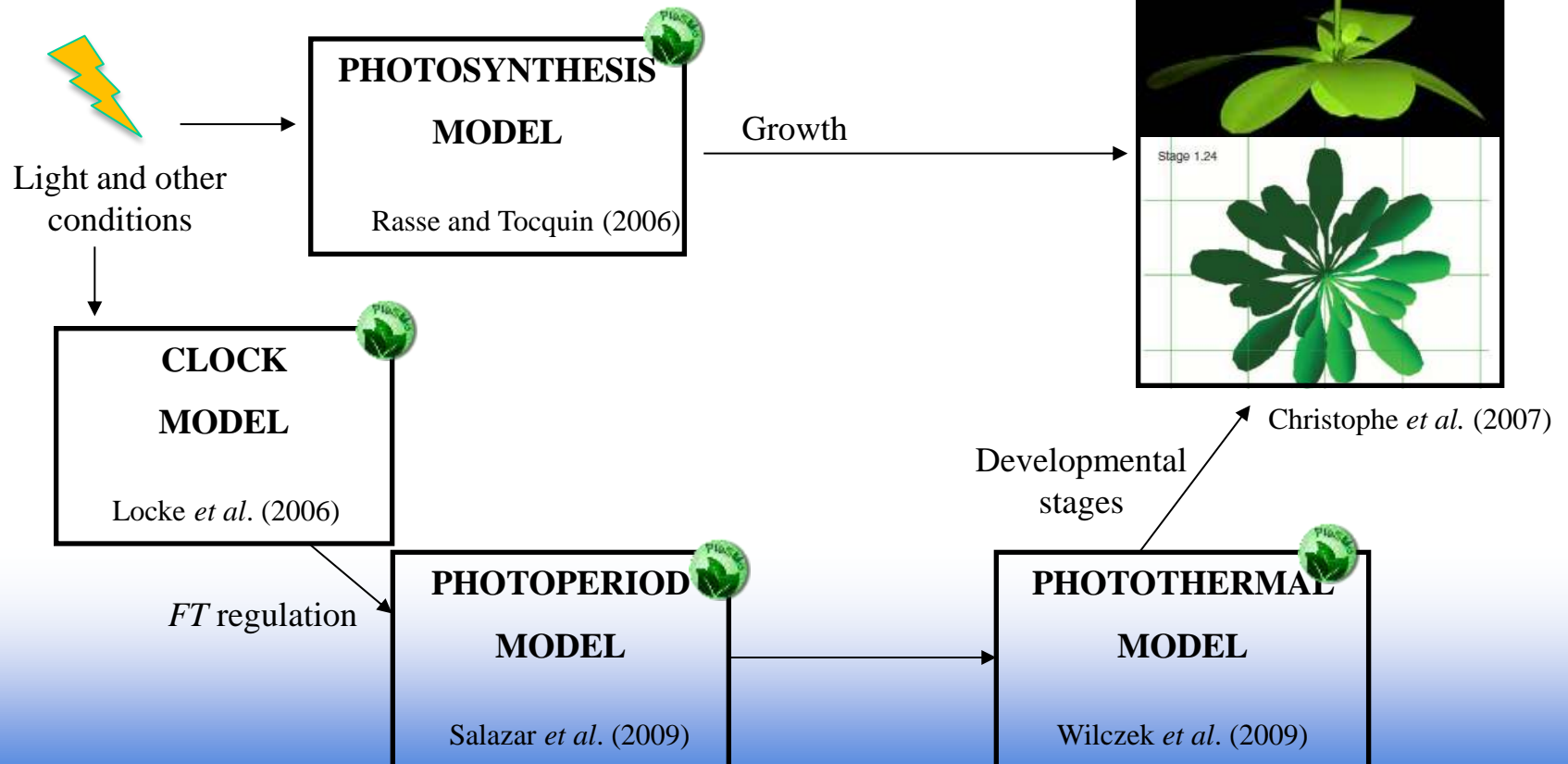
Image/Screen Shot of the Model: ①

Description of screen shot: ①

Add Additional Image/Screen shot Remove Last Image/Screen shot

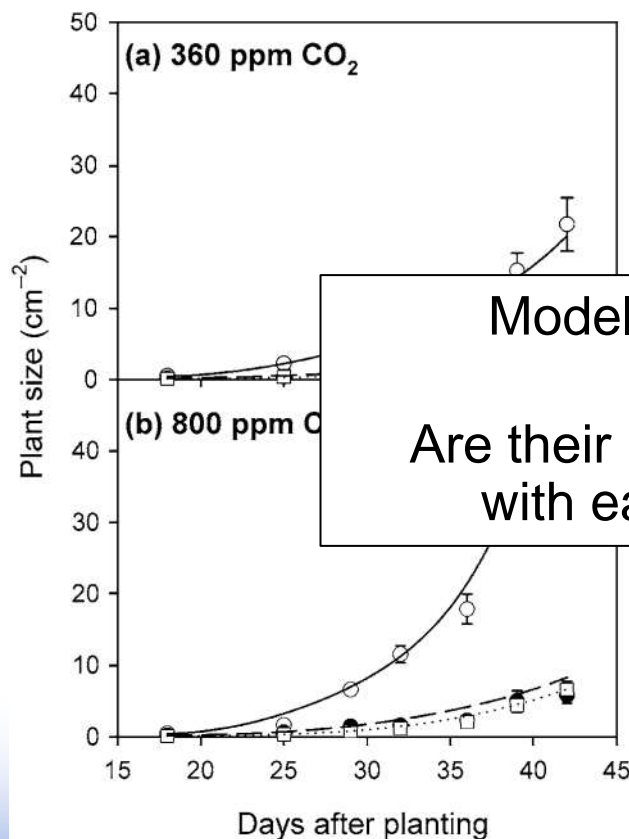
Modular models?

- ‘Crop-style’ growth model for Arabidopsis
- Q: can we build from existing models?
 - simple at first; experts (you) can add detail
- A: only if they are comparable!



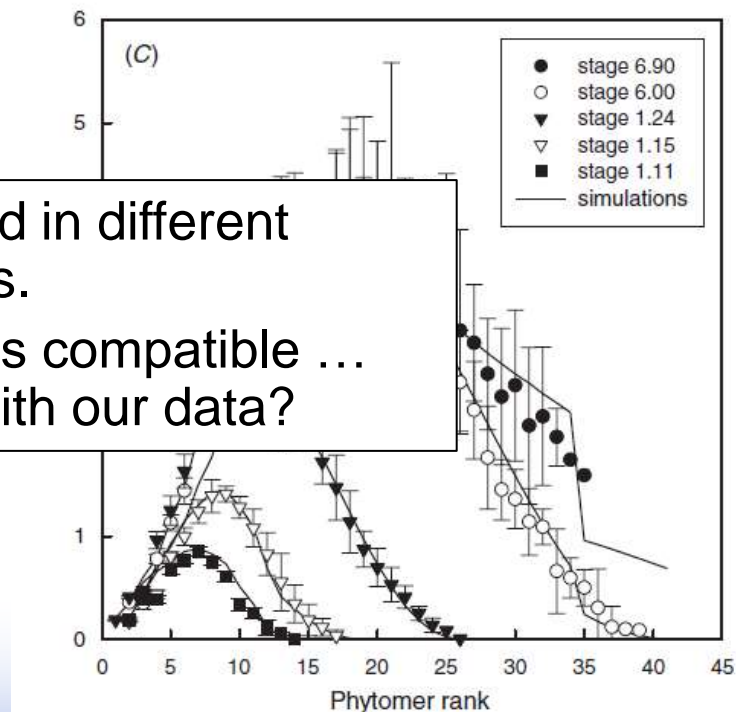
Comparing models

- Total leaf area from Rasse & Tocquin
- Predicts carbon biomass.
- Model runs in time.
- Individual leaf areas from Greenlab
- Predicts total biomass.
- Model runs in developmental stages.

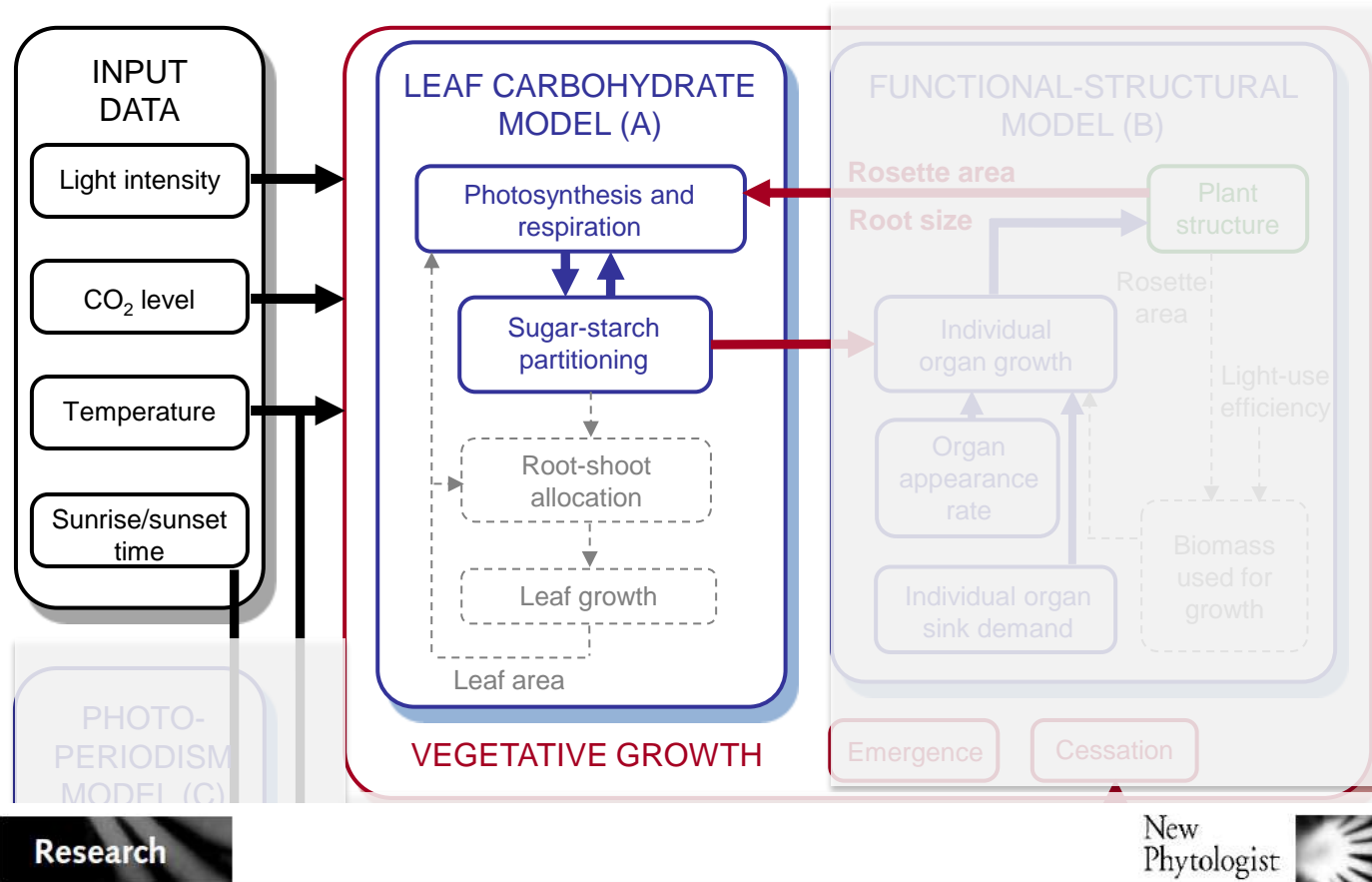


Models were calibrated in different laboratories.

Are their parameter values compatible ... with each other, and with our data?



Framework Model

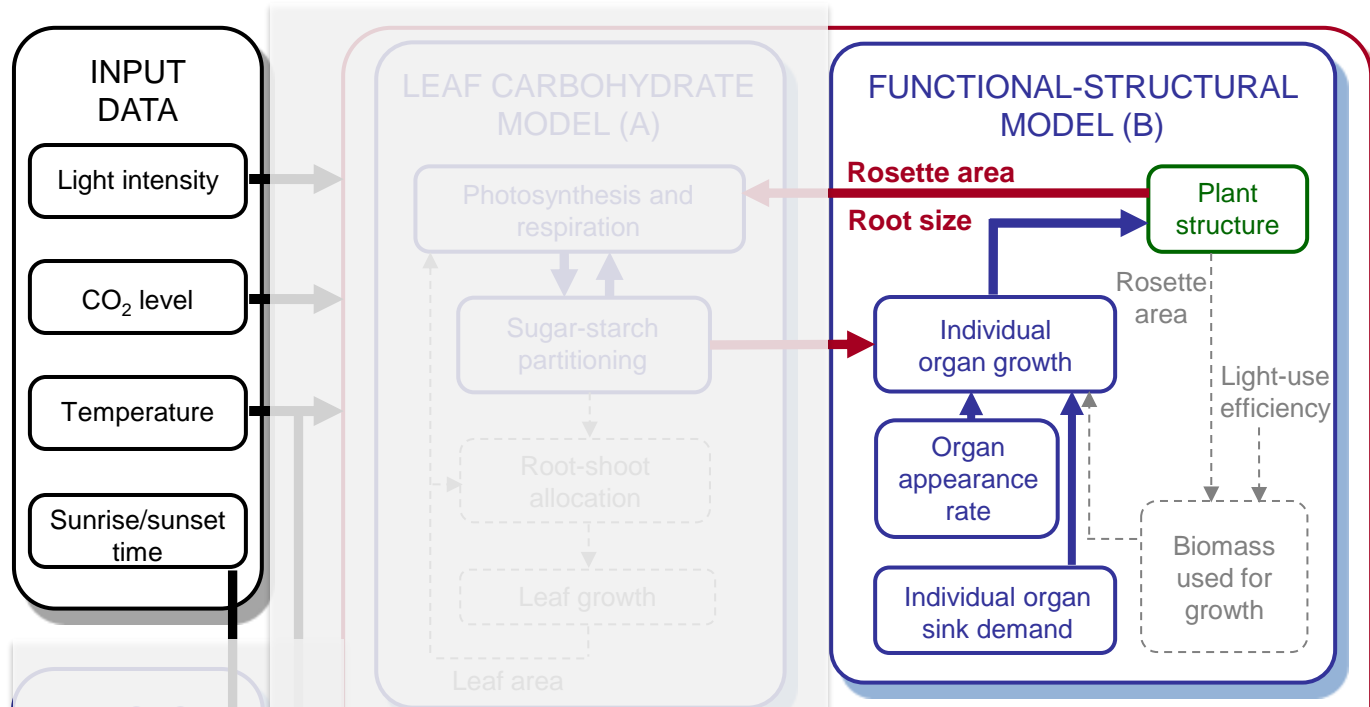


Blue – original
Red – new links
Grey – replaced

Leaf carbohydrate controls over *Arabidopsis* growth and response to elevated CO₂: an experimentally based model

Matlab and Simile software.

Framework Model



Blue – original
Red – new links
Grey – replaced

CSIRO PUBLISHING

www.publish.csiro.au/journals/fpb

Functional Plant Biology, 2008,

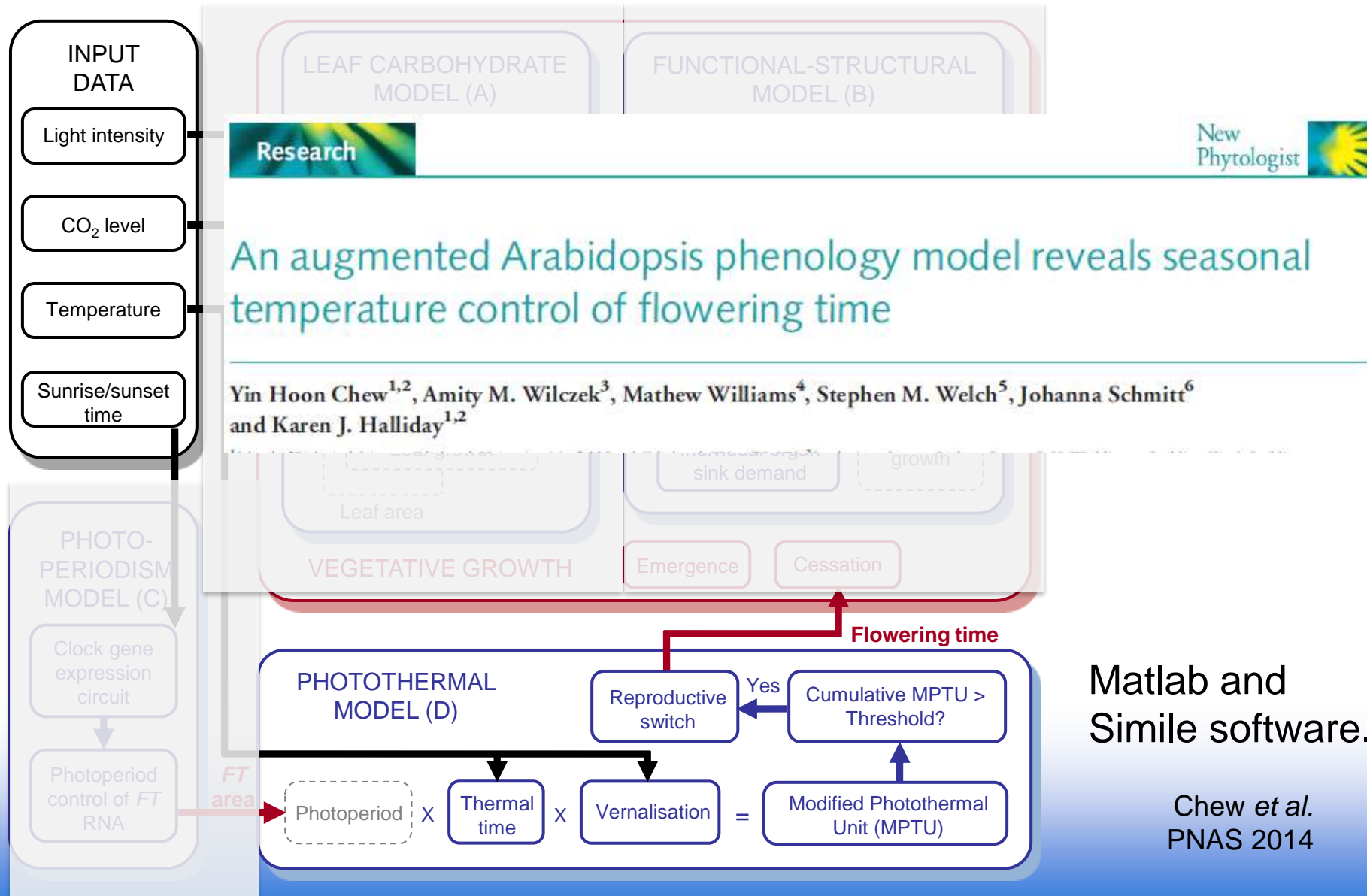
A model-based analysis of the dynamics of carbon balance at the whole-plant level in *Arabidopsis thaliana*

Angélique Christophe^{A,E}, Véronique Letort^B, Irène Hummel^A, Paul-Henry Cournède^B, Philippe de Reffye^C and Jérémie Lecœur^D

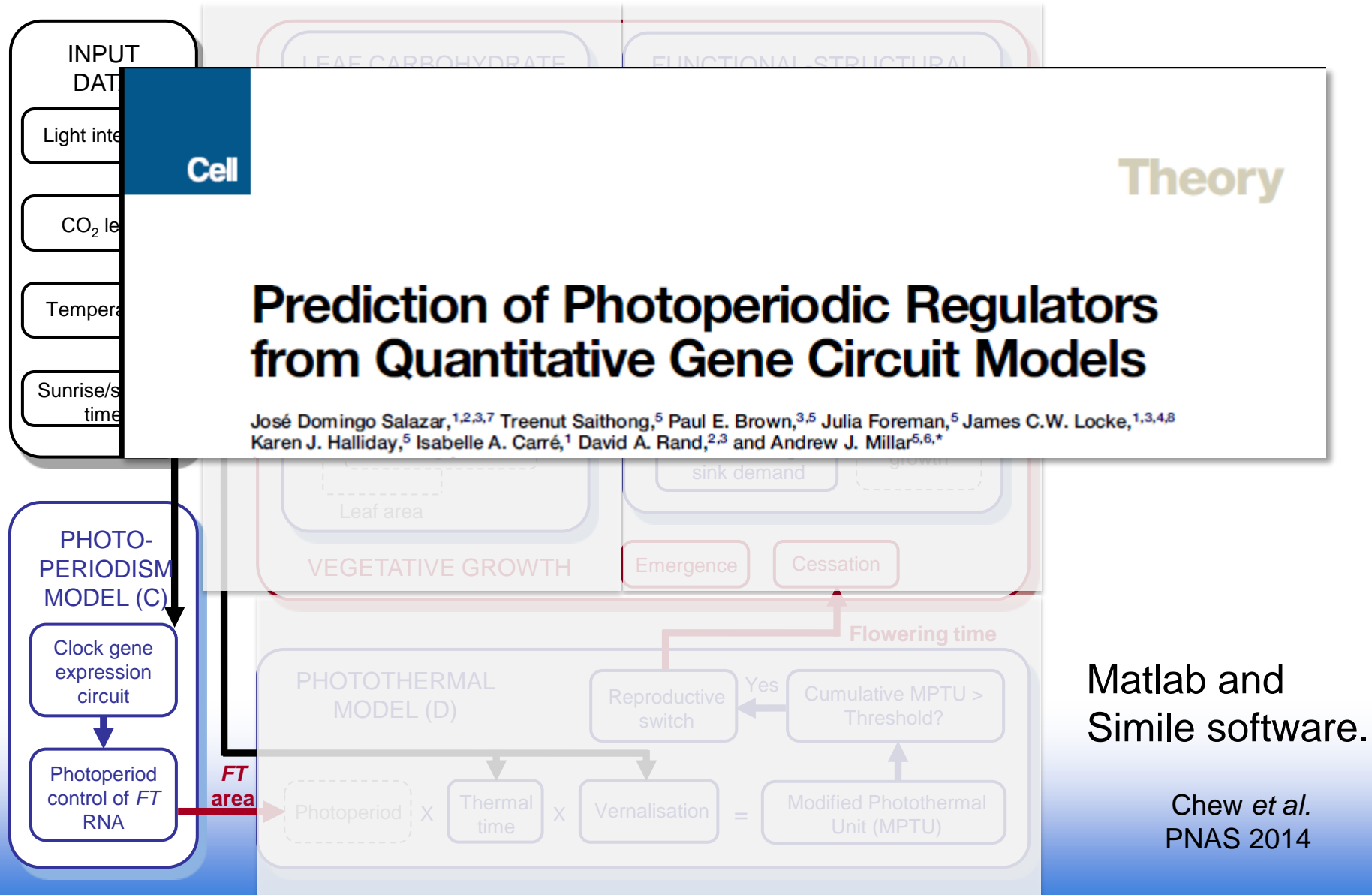
Matlab and Simile software.

Chew *et al.*
PNAS 2014

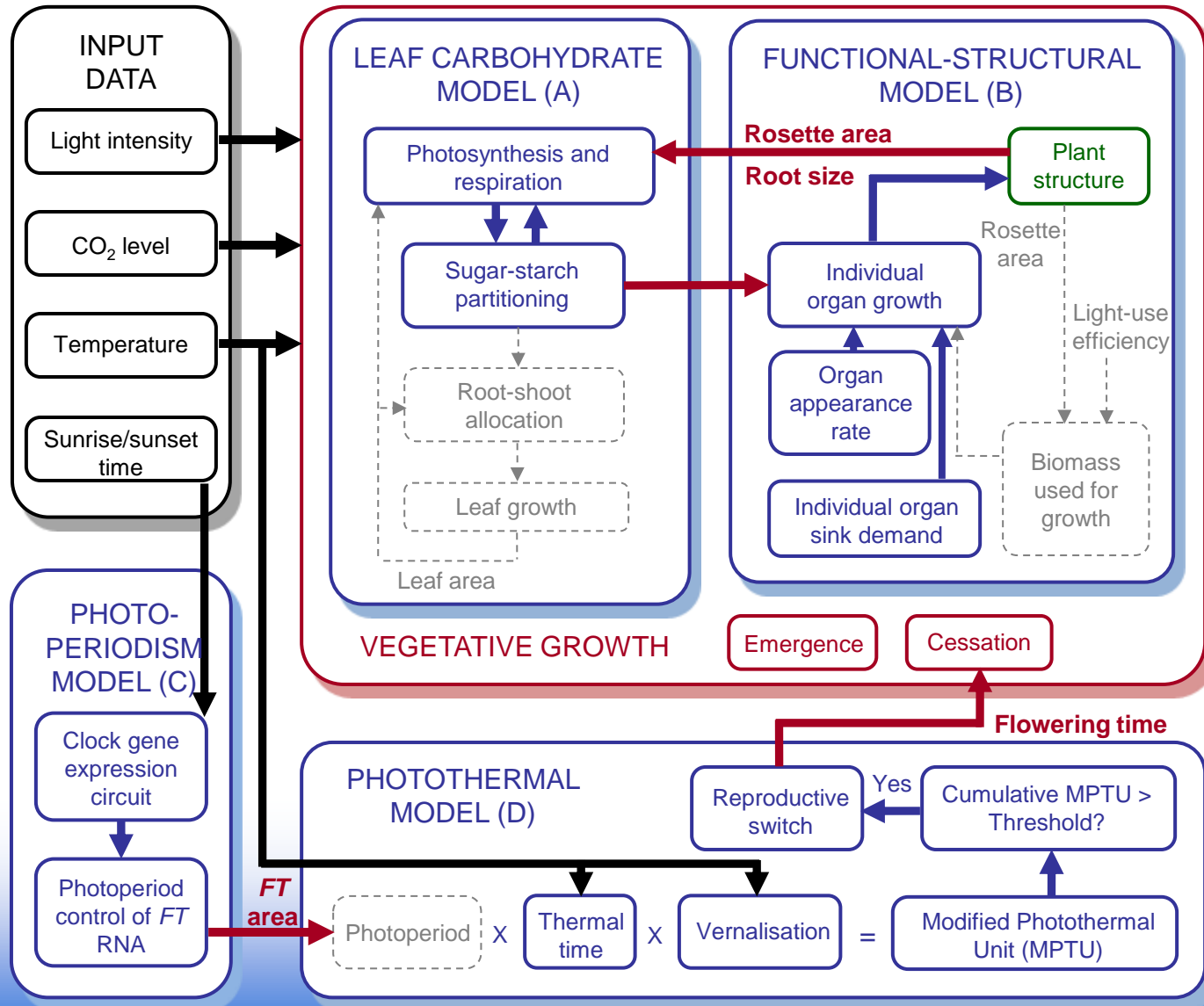
Framework Model



Framework Model

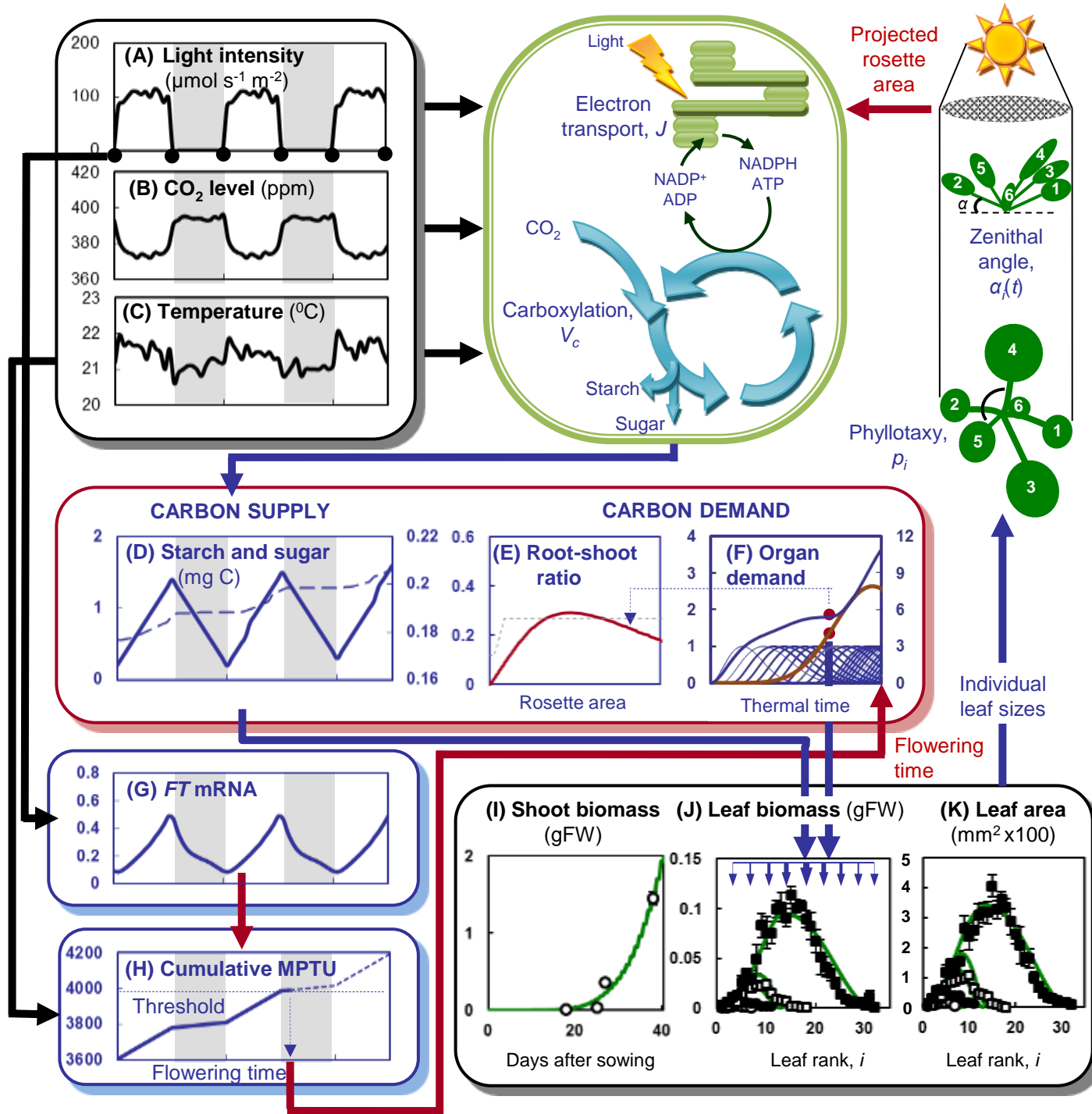


Framework Model

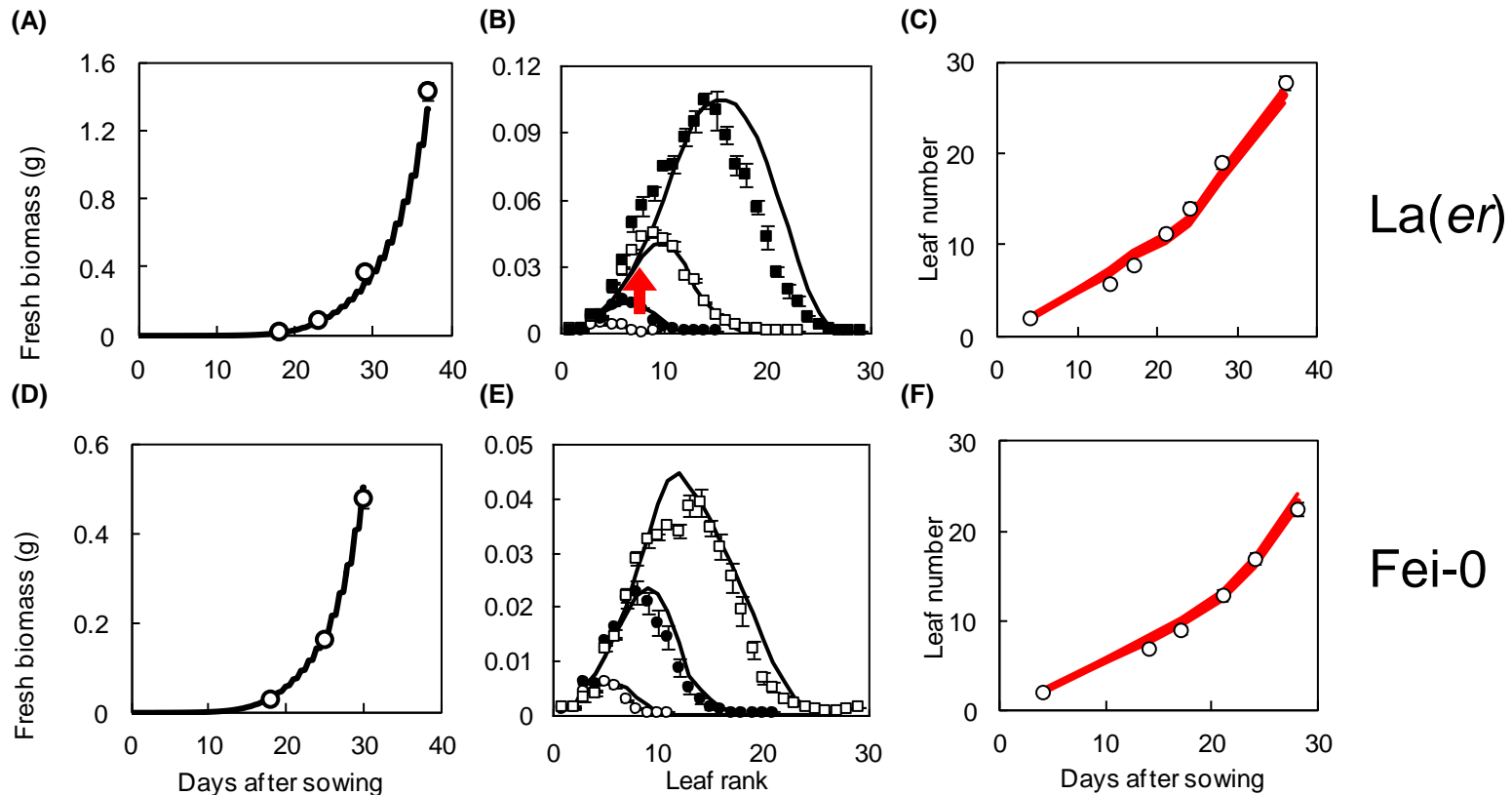


Blue – original
Red – new links
Grey – replaced

Matlab and
Simile software.



Testing on other accessions

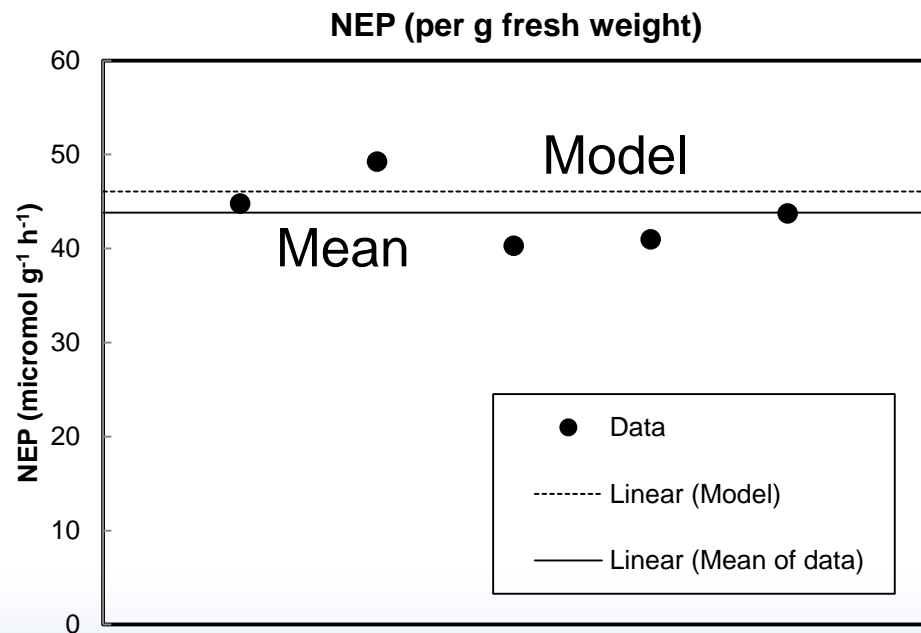


- *La(er)* leaves 5-9 grow for longer (red arrow)
- Good performance without re-calibration, also other labs?
Median R^2 0.94, nRMSE 17% (as good as Col).

Key processes match well

- Parameter sensitivity analysis: what controls biomass?
126 parameters in total; 8 of the 12 most sensitive parameters are in photosynthesis model.
- Gas exchange measures for photosynthesis
- Good match *in reference conditions*.

Col WT on Day 38



Testing: altered leaf initiation

Col



Pro35S:MIR156



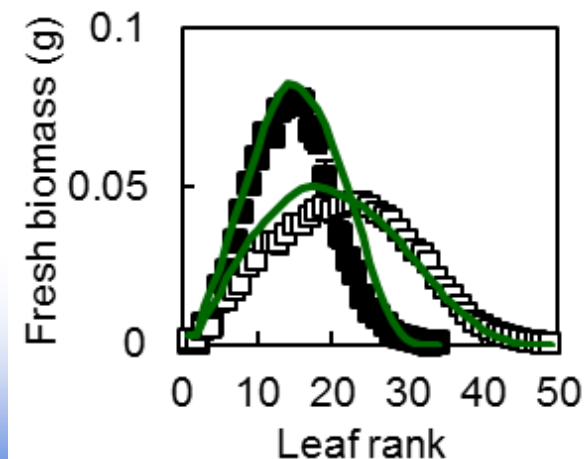
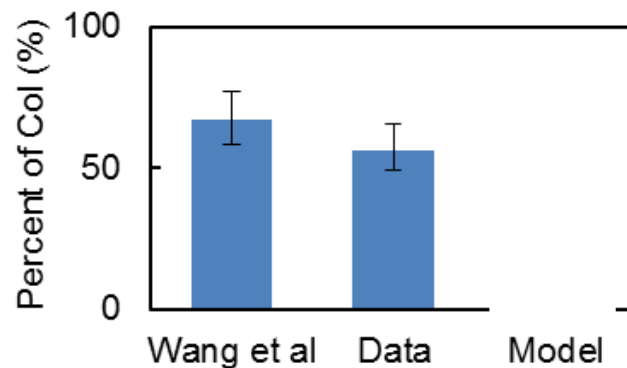
The Plant Cell, Vol. 20: 1231–1243, May 2008, www.plantcell.org © 2008 American Society of Plant Biologists

Dual Effects of miR156-Targeted *SPL* Genes and *CYP78A5/KLUH* on Plastochron Length and Organ Size in *Arabidopsis thaliana* ^{W OA}

Jia-Wei Wang, Rebecca Schwab,¹ Benjamin Czech,¹ Erica Mica,² and Detlef Weigel³

Department of Molecular Biology, Max Planck Institute for Developmental Biology, D-72076 Tübingen, Germany

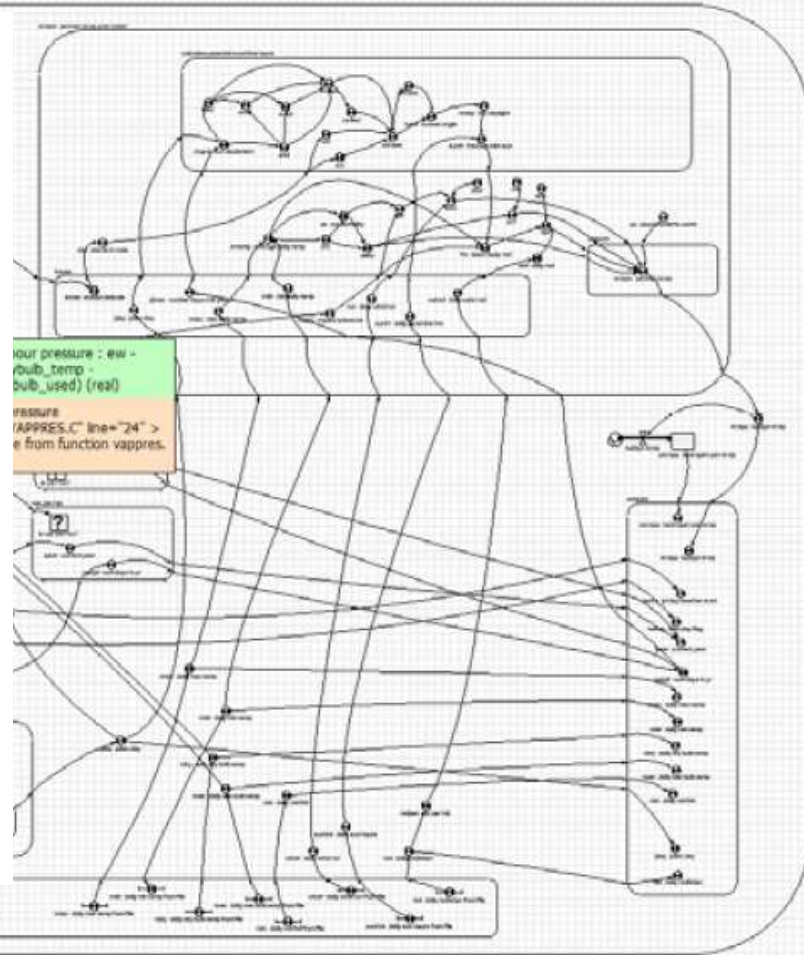
- Increased leaf initiation rate and small leaves
 - One causal effect + ‘compensatory regulation’ or two separate mechanisms ?
- Change *only* initiation, test simulated area...



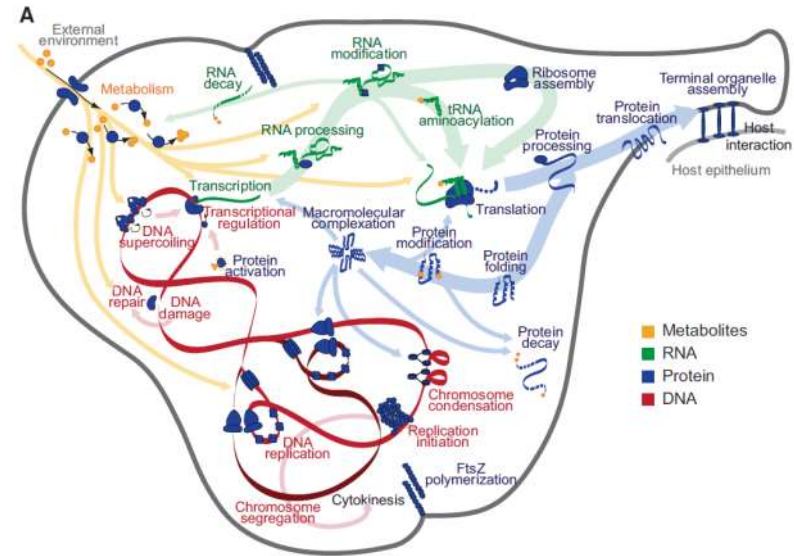
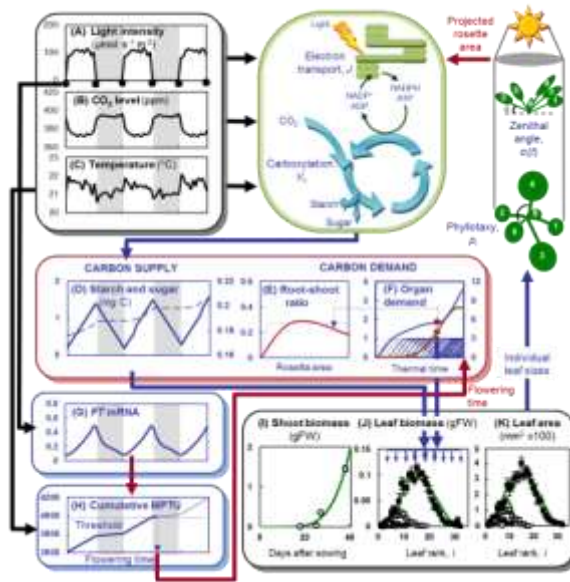
To run the Framework
Model:

Download PLM_76 files
from PlaSMo
(with instructions)

Get Simile
Load Files
[Click Run.](#)



A Framework around the Clock



- Multiple clock effects, interacting, to give whole-plant phenotype: links to multiple research fields.
 - Quantitative molecular detail, linked to genome: ☒
 - Effective concepts, linked to physiology: ☒
- “Digital Organism” technology to link models
 - e.g. Karr et al. Cell 2012, ‘whole-cell’ Mycoplasma model.

Summary

- **Systems Biology aims to understand (explain and predict) complex processes**
 - All components; Across scales.
- **Framework model predicts Arabidopsis growth**
 - combination of existing models: only in *A.t.* ?
 - disparate data (and derived models) were compatible for biomass, less so for flowering.
 - now integrating multiple clock effects on growth.
- **A primitive “Digital Organism”, to be extended.**
 - How should we do this, as a community?