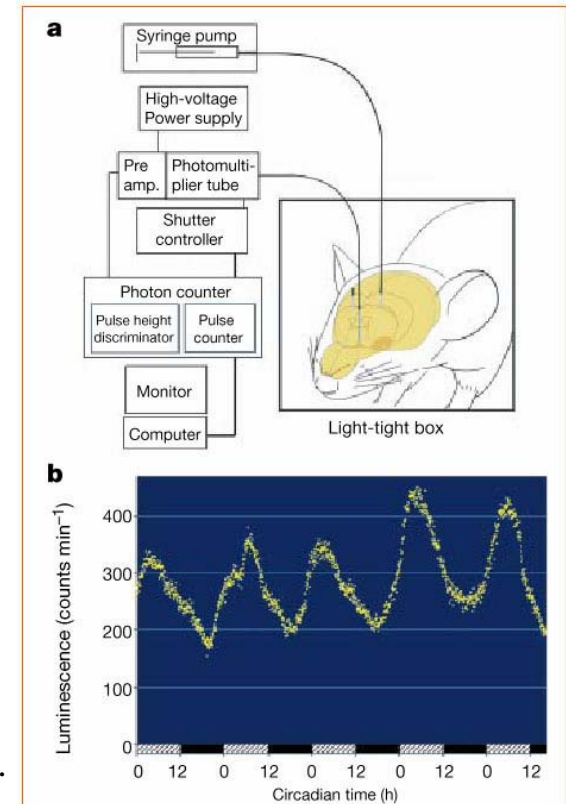
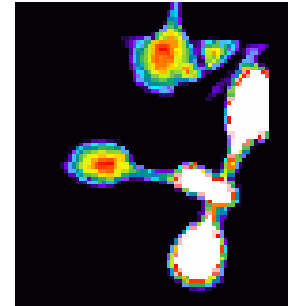


# The circadian clock as a paradigm for Systems Biology

The requirements for systems biology are well-established in circadian research

- Dynamic, quantitative data *in vivo* and in cell cultures
- Crosses scales
  - Molecules to ecosystem or clinic
- Crosses taxonomic groups
- Major contributions from modelling since 1960's
- Worldwide research community



Yamaguchi *et al.*  
Nature, 2001

## Current:

Laszlo Kozma-Bognar

Kieron Edwards

Adrian Thomson

Vacancy !

Ozgur Akman

Paul Brown

James Locke

Treenut Saithong

Parantap Shukla

Vacancy !

Ruth Bastow (GARNet)

## 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](#)

## Collaborators

[Igor Goryanin \(Informatics\)](#)

[IPCR -](#)

[Matthew Turner \(UW Physics\)](#)

[David Rand \(UW Maths\)](#)

[Bärbel Finkenstädt \(Statistics\)](#)

[Mark Muldoon and David  
Broomhead \(Manchester\)](#)

[Lorenz Wernisch \(Birkbeck\)](#)

[Peter Gould, Anthony Hall](#)  
(Liverpool)

[Antony Dodd, Alex Webb,](#)  
(Cambridge)

[Ferenc Nagy \(Szeged\)](#)

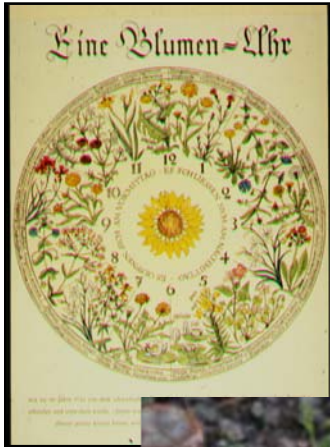
[Eberhard Schäfer, Stefan  
Kircher \(Freiburg\)](#)

[Rick Amasino \(Madison\)](#)

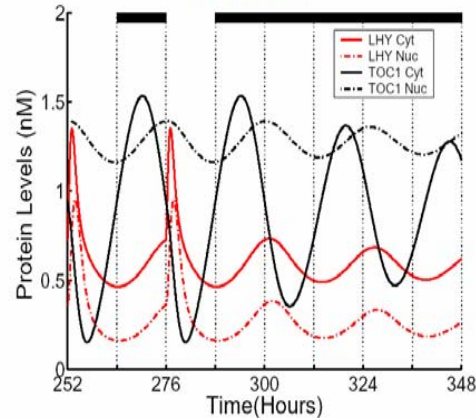
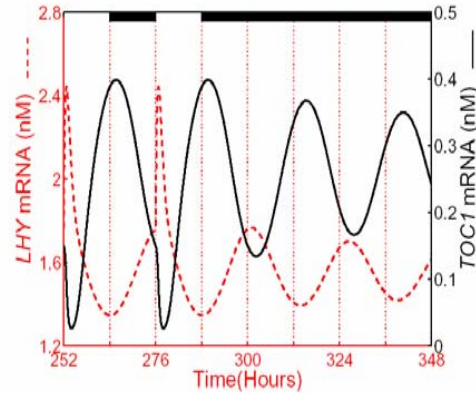


Funding: BBSRC, Gatsby, EPSRC, EU

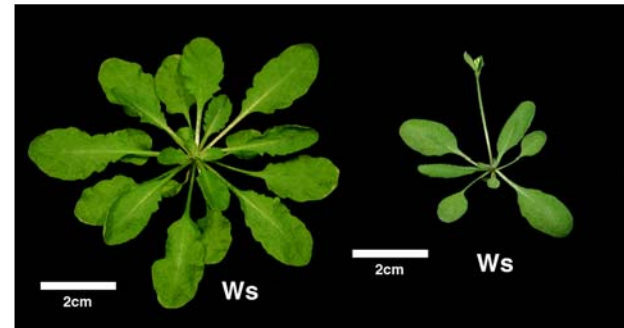
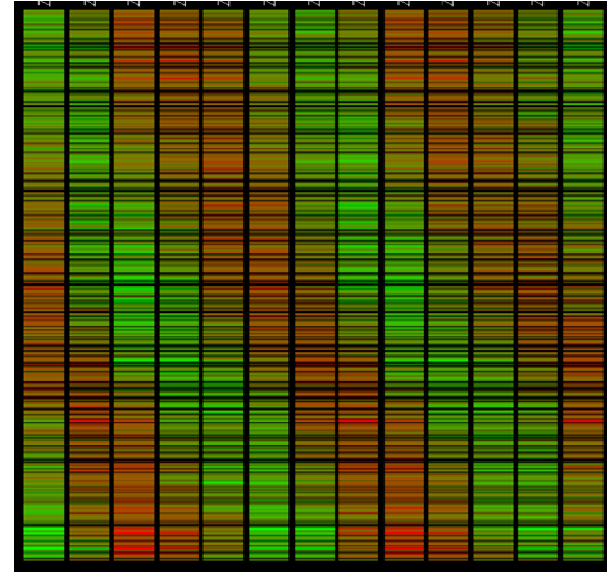
# Circadian clock in *Arabidopsis thaliana*



3 mm  
seed  
→



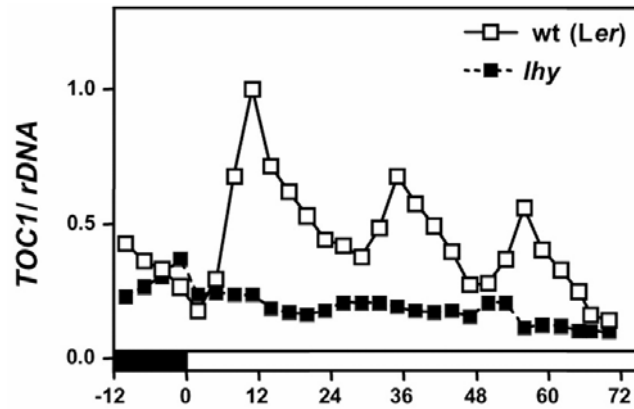
Time in LL (h)  
26 30 34 38 42 46 50 54 58 62 66 70 74



- Plant clock controls growth and flowering time
- Regulates >15% of RNA transcripts

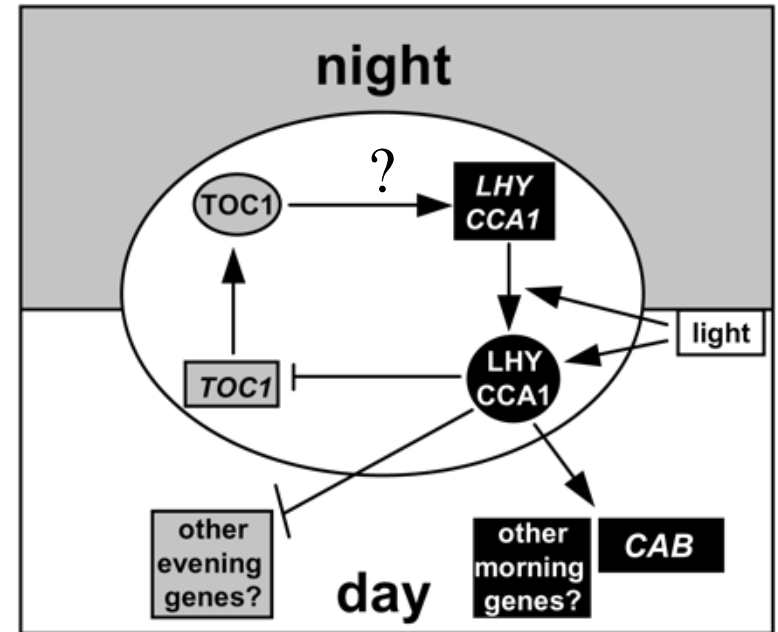
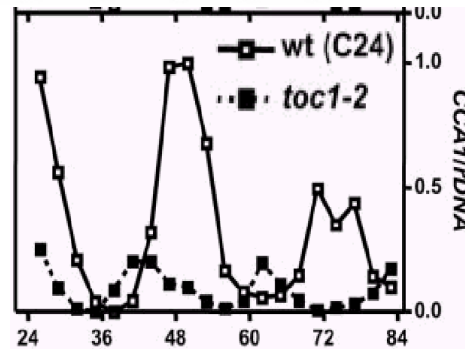
Edwards *et al.*  
Plant Cell 2006

# Mutant plants identify genes in the clockwork



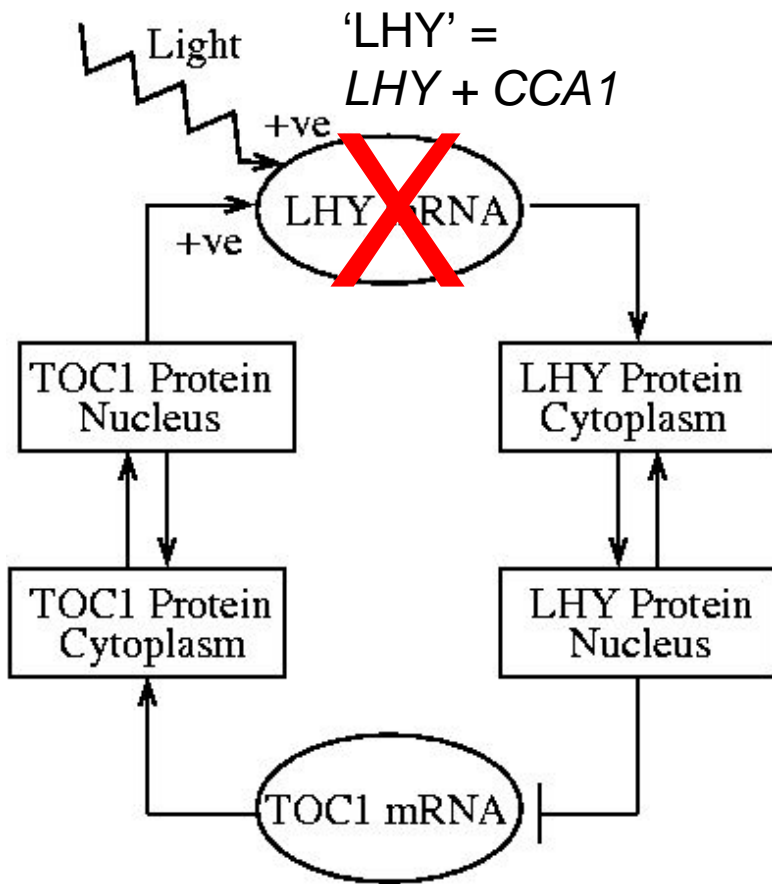
WT = wild  
type (normal)

Alabadi *et al.*, 2001

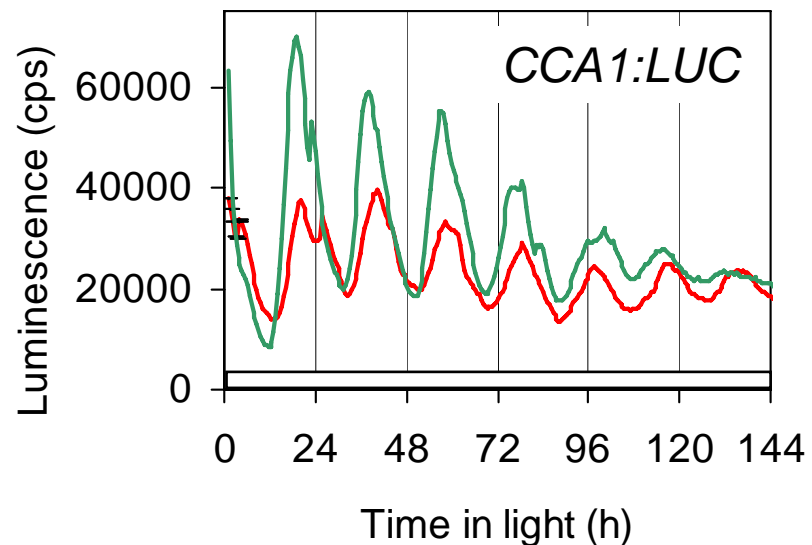


- Negative regulation during the day - *CCA1/LHY*
- Positive regulation at night – *TOC1* +++
- ODE model to test potential for regulation

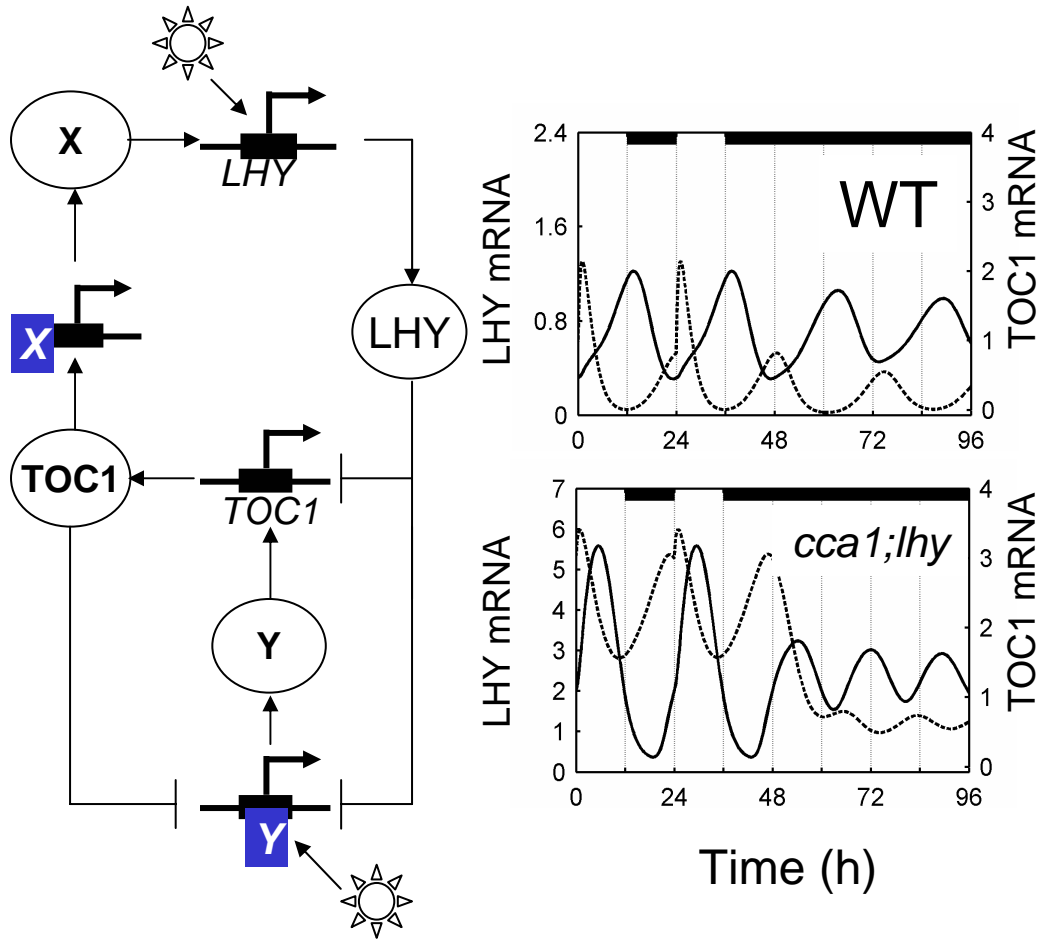
# Single loop is not sufficient



- Simulations contradict data
  - Global parameter search finds no good solutions
    - e.g. *cca1;lhy* double mutants are rhythmic, ~17h period
- ⇒ another loop, without *CCA1* and *LHY*



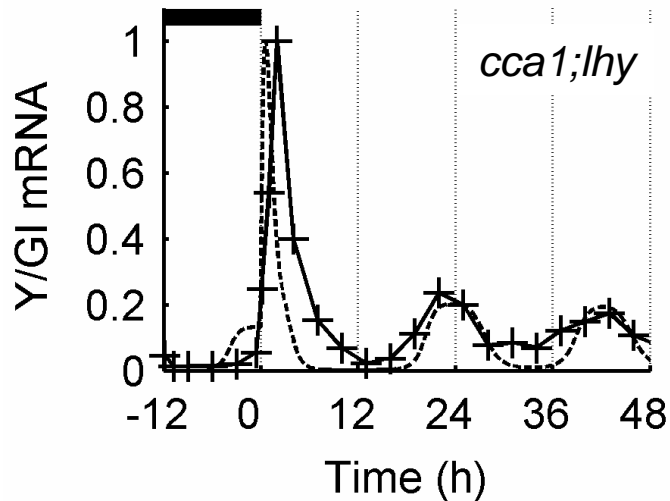
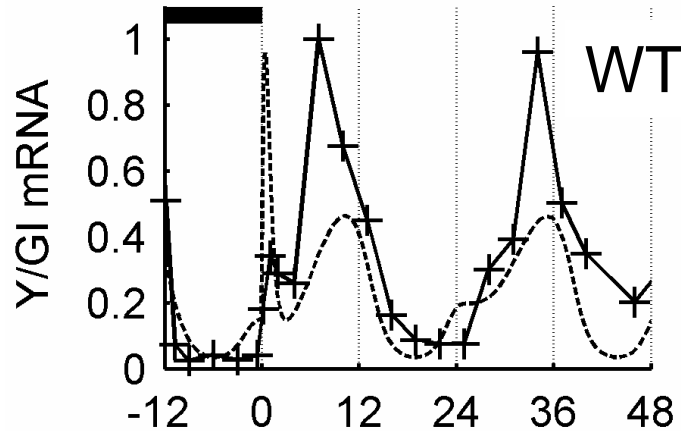
# Interlocking loop model for Arabidopsis clock



- Model- J. Locke
- Hypothetical components  $X$ ,  $Y$  added from inspection of data
- Fit model to WT and mutant data
- Predicts  $X$  and  $Y$  expression

Locke *et al.*, *Mol Syst Biol*, 2005: Data + interlocking loop model.

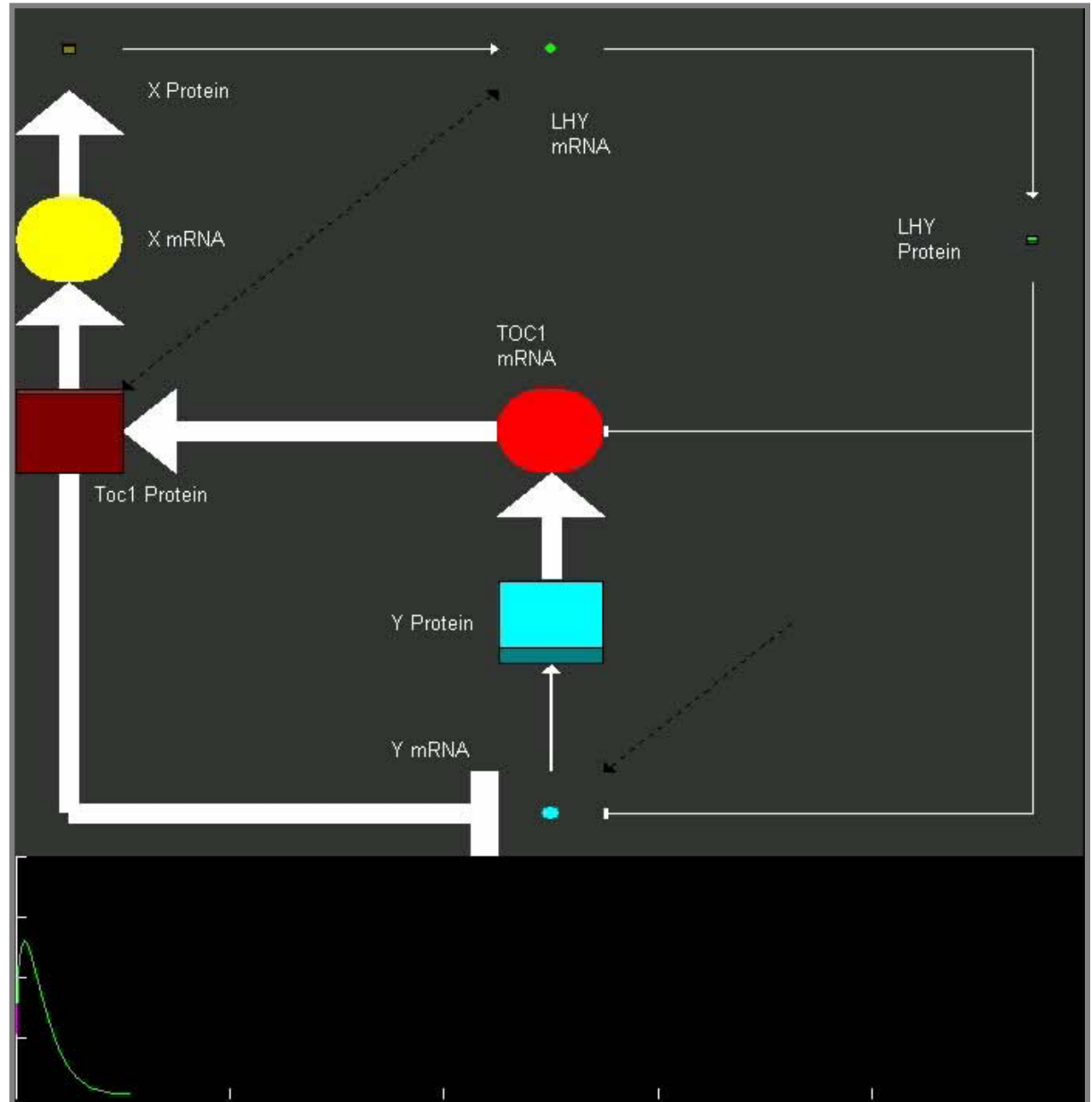
# Experiments to identify *Y* turn up a good candidate



- Prediction = dashed line
- M. Southern tested candidate genes by qRT-PCR. Data = crosses
- Unexpected light response of *GIGANTEA* RNA matches prediction
- *GI* data in literature also matches predictions for *Y*

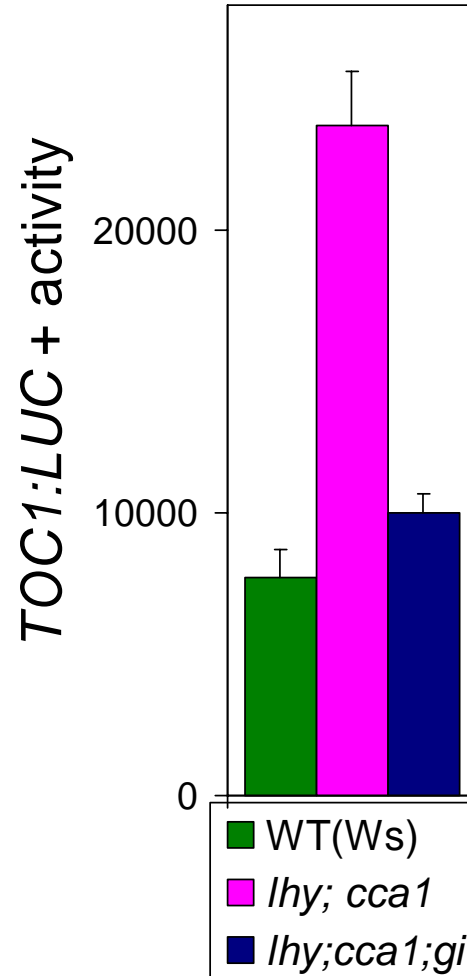
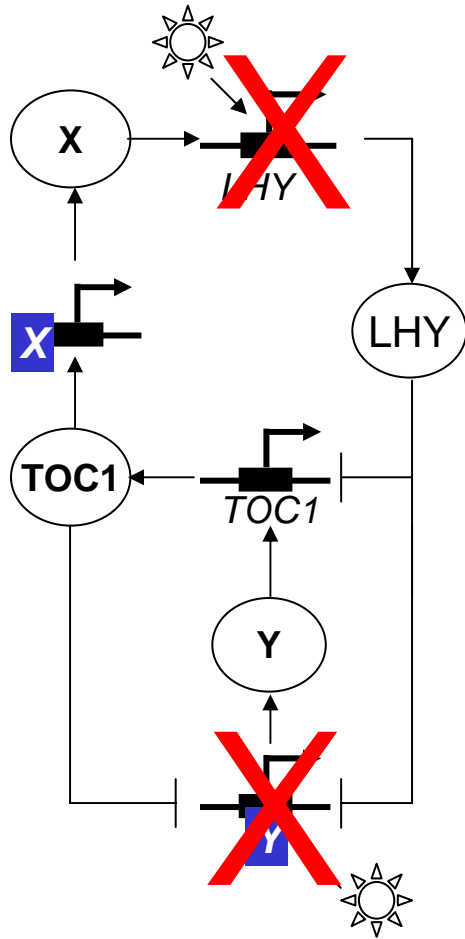
# Simulation and visualisation software

- Paul Brown,  
software engineer
- Matlab animation
- Available at  
[www.amillar.org](http://www.amillar.org)



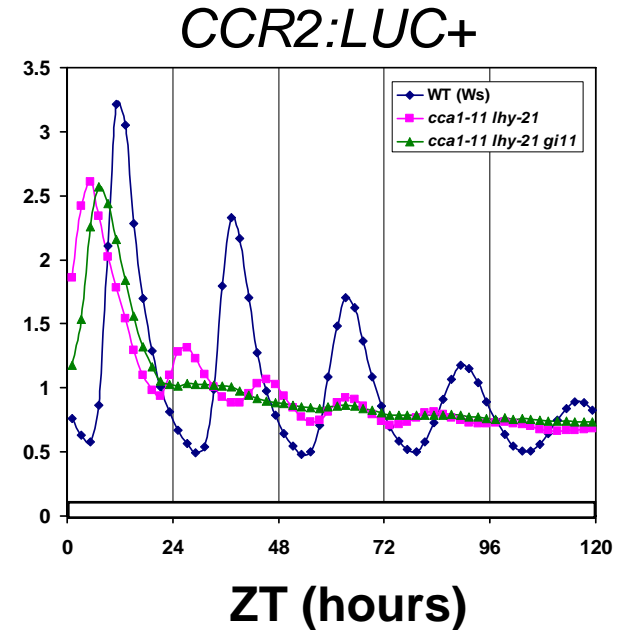
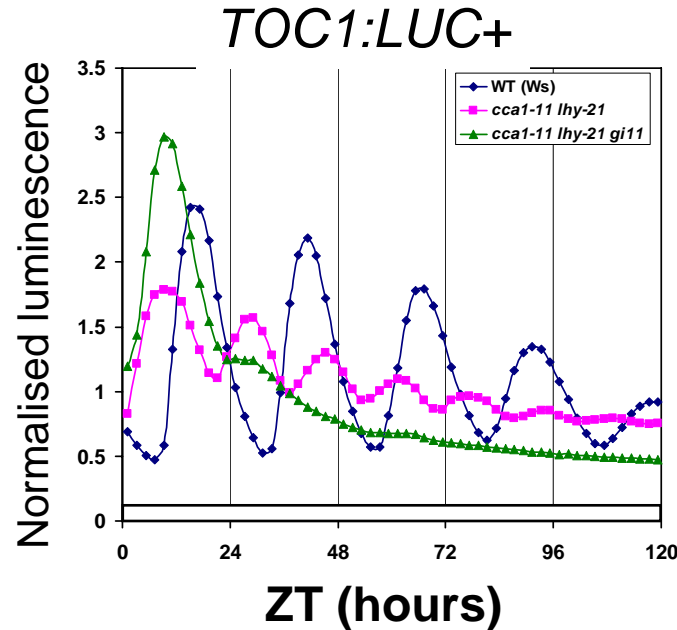
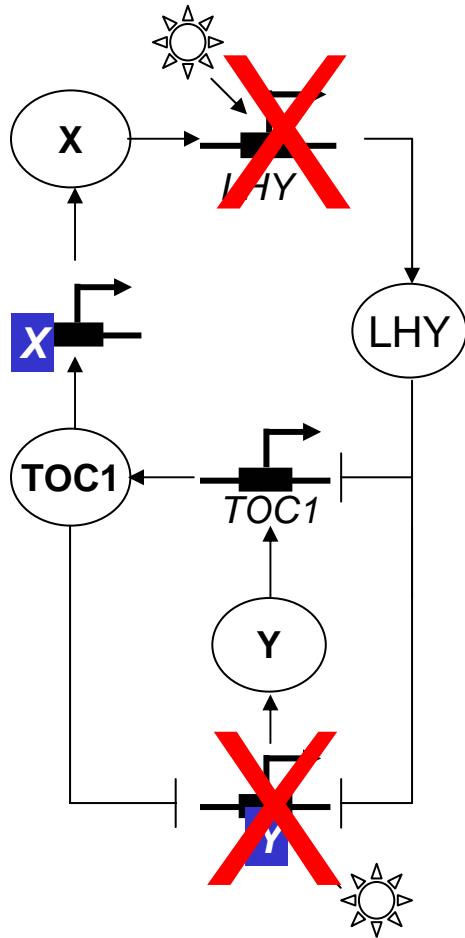


# Validation 1, *TOC1* activation: *GI* is (part of) *Y*



- *LUC* reporters crossed into mutant backgrounds
- *LHY/CCA1* inhibit *TOC1* expression
- *GI* activates *TOC1* expression

# Validation 2, rhythmicity: *G1* is (part of) *Y*

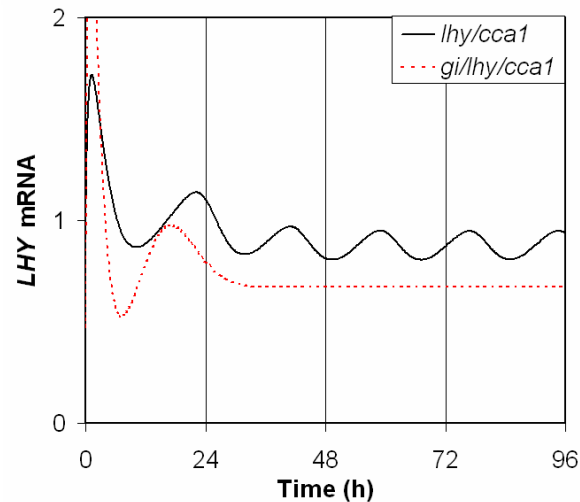
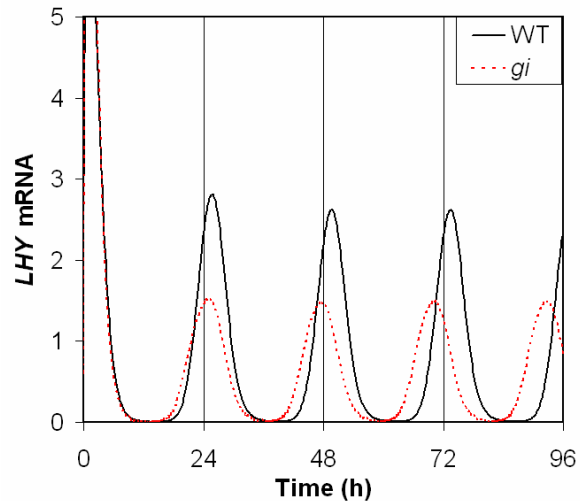


- *LUC* reporters crossed into mutant lines, tested in constant light
- *lhy;cca1* shows 18h rhythm
- *lhy;cca1;gi* does not, in light or darkness

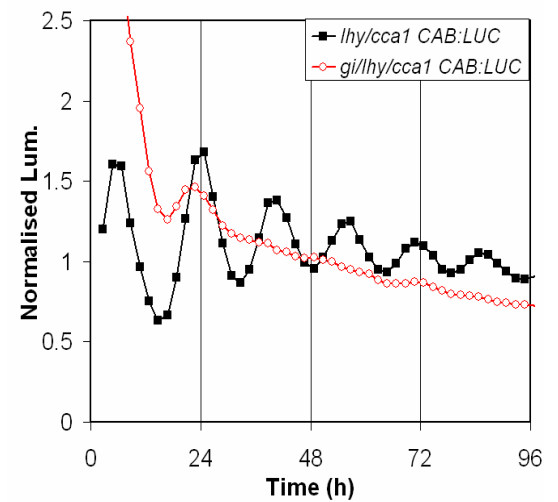
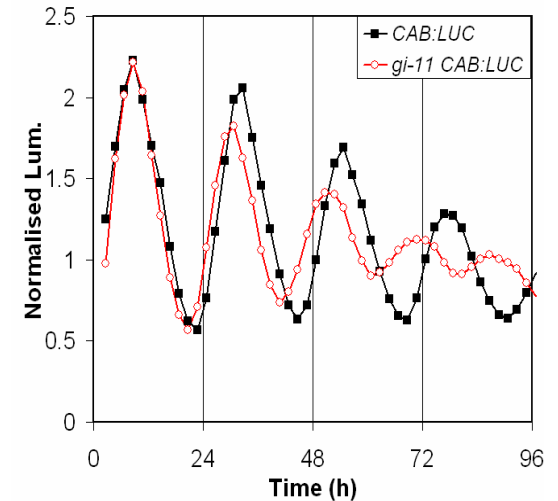
# Validation 3, simulation: *G/* is (part of) *Y*

- *G/* is required for 18h rhythm in light
- Arrhythmia after one cycle in light
- Data closely match simulations using 3-loop model

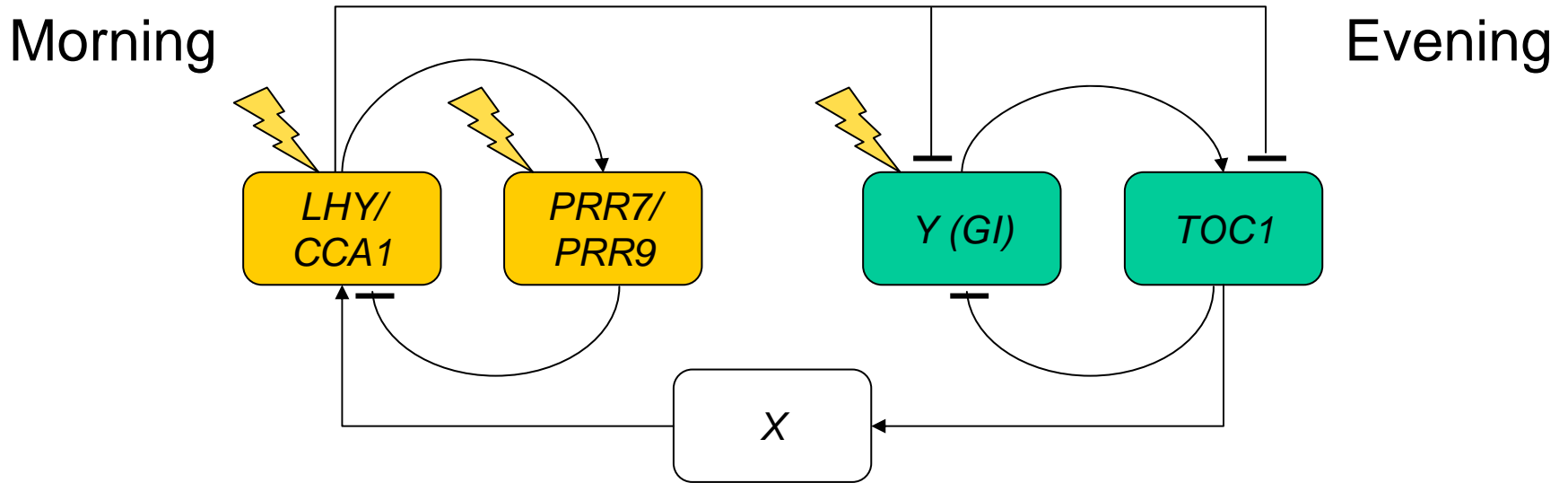
## Simulation



## Data

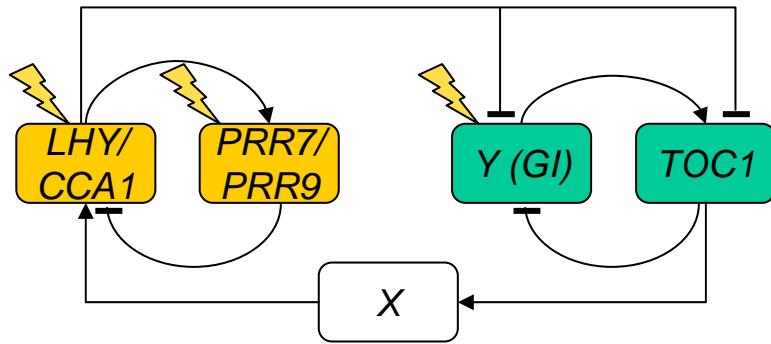


# Three-loop model for the plant clock

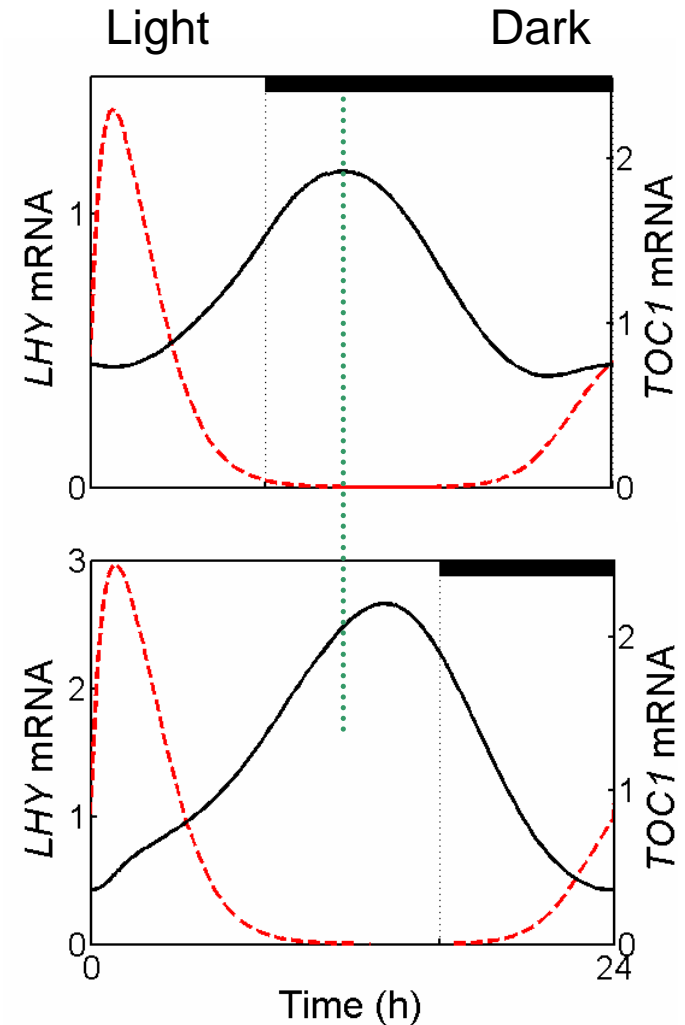


- *PRR9*, *PRR7* genes are *TOC1* (= *PRR1*) paralogues
- Form a feedback loop with *LHY/CCA1* (Farré *et al.* 2005)
- Add *PRR9* and *PRR7* (combined) to form 3-loop model
- Better match to *gi* and *toc1* mutant data, in addition to earlier data

# Three-loop model: change relative peak times



- Compare simulations of long and short day length
- *LHY* peak constant relative to light-on
- *TOC1* peak also responds to light-off
- Observed in recent data
- Design similar to neural clocks in animals
  - Morning and evening cells
- Intracellular in plants
  - no cell-cell coupling



# The Clock Shop

- Multiple genes  
*LHY, CCA1*
- Multiple loops  
>3 in plant clock
- Multiple clocks  
>1 per cell?

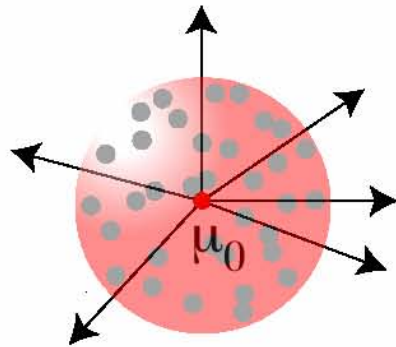
## Why such complexity?

- Flexibility
  - Cycle to cycle
  - **In evolution**
- Robustness
  - Stochastic noise
  - Temperature compensation



Photo by Martin Lange

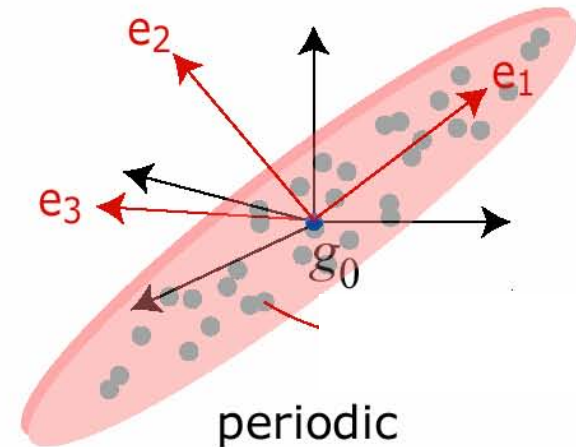
# Flexibility: Principal Component Analysis or SVD



parameter space

*high-dimensional*  
*~ 100 for mammals*

*differential equation*



periodic orbit space

*infinite-dimensional*

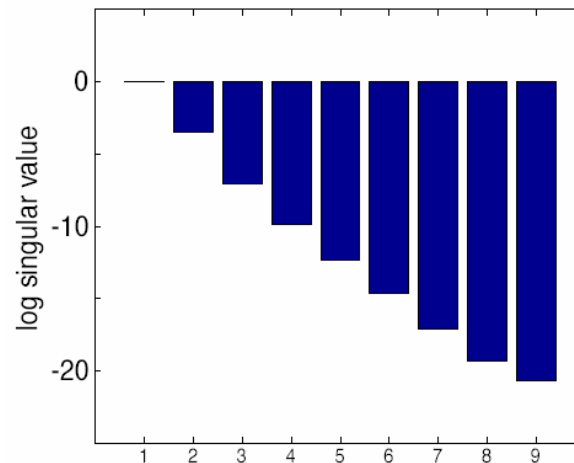
## Leloup *et al.* fly model

10 variables

41 parameters

**1 dimension flexibility**  
**(phase or period)**

(from  $\leq 1\%$   $\mu$  perturbations under LD cycles)



Singular value	% of Variance
1.041425287	97.023028951
0.031026676	2.890559794
0.000870290	0.081079393
0.000052507	0.004891725
0.000004254	0.000396276
0.000000428	0.000039912
0.000000036	0.000003352
0.000000004	0.000000418
0.000000001	0.000000066
0.000000000	0.000000027

Rand *et al.*,  
*Interface*, 2004



# Flexibility in evolution: examples for clock models

Model	Variables	Loops (parts)	Parameters	Flexibility threshold	
				95%	99.9%
Tyson <i>et al.</i> <i>Drosophila</i>	2	1	9	1	1, 1, 1
Leloup <i>et al.</i> <i>Neurospora</i>	3	1	10	1	2, 3, 4
Leloup <i>et al.</i> <i>Drosophila</i>	10	1 (2)	38	2	3, 3, 6
Ueda <i>et al.</i> <i>Drosophila</i>	10	2 (3)	55	1	1, 1, 2
Leloup <i>et al.</i> mouse	16	3 (4)	53	1	2, 2, 5
Forger <i>et al.</i> mouse	73	5 (16)	36*	5	7, 9, 10

- Flexibility  $\ll$  Parameters
- Flexibility  $\sim$  Loop complexity



# Flexibility to evolve towards multiple targets

---

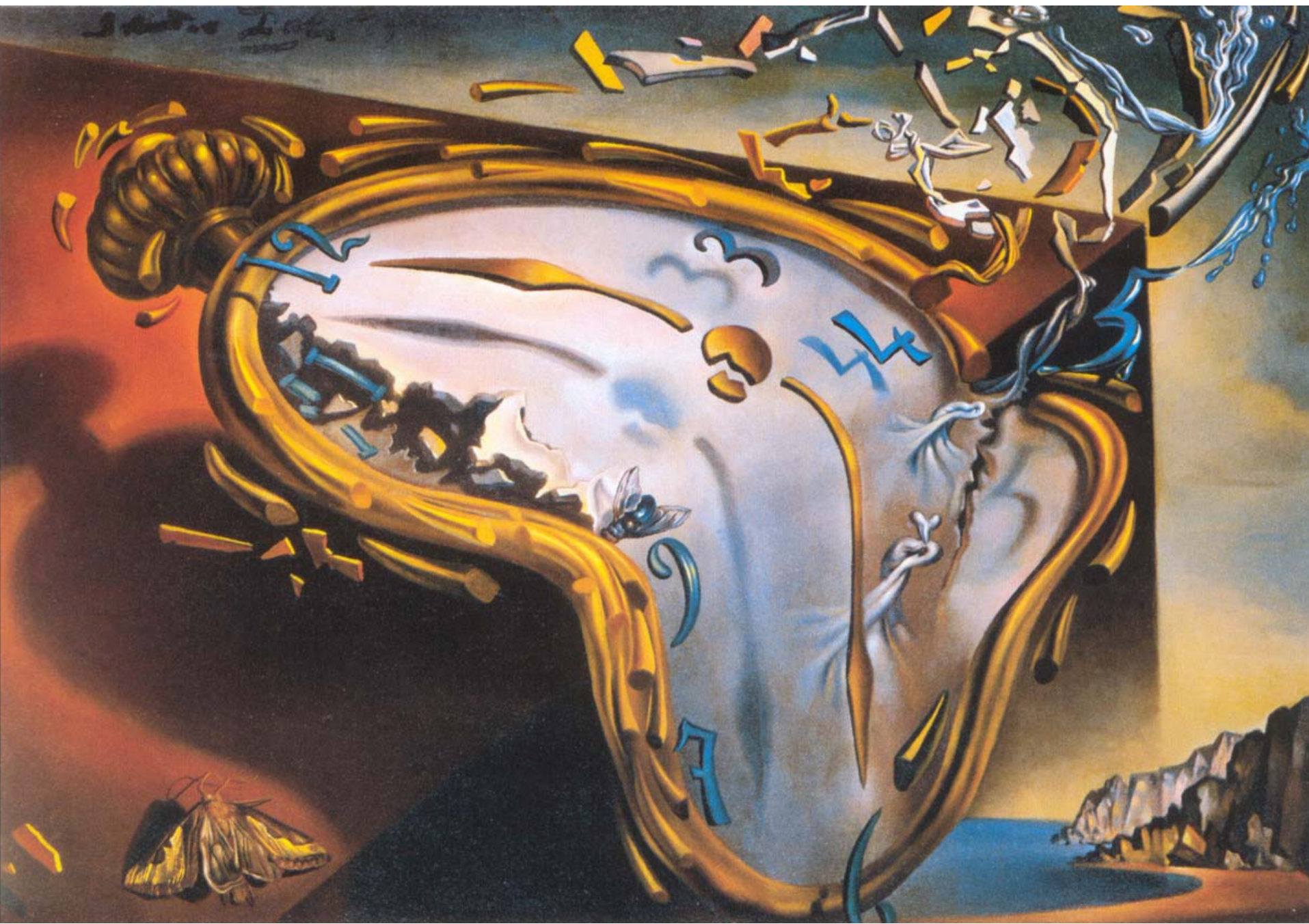
- Flexibility of single clock loops is low
  - evolution is constrained
- **Design principle:**  
Interlocking loops increase flexibility
  - biochemical mechanisms can vary, inter- or intracellular
  - deterministic
- Advantage for interlocking loops in evolution
  - if there is selective pressure on several, independent output properties (phases, temperature compensation, dawn/dusk tracking)

# World Alliance for Clock Systems Biology

---

- Vision: Integrate clock systems research worldwide
  - Develop circadian system models for many species
- Aims
  - Shared informatics resources: data + models + tools
  - Stimulate data acquisition, computational tools
  - Enhance experimental – theoretical collaborations
  - Promote standards
  - Training, outreach: increase visibility
- Interim Steering Group
  - Hiroki Ueda (RIKEN)
  - John Hogenesch (U. Penn.)
  - Andrew Millar (CSBE, Edinburgh)





# Next steps

---

- Regional committees, cross subjects
  - Needed now, for fundraising
- Working groups, cross regions
  - Later, develop standards etc.
- Informal meeting Grand Sandestin lobby, 12:30
- Launch at ICSB Yokohama October 2006

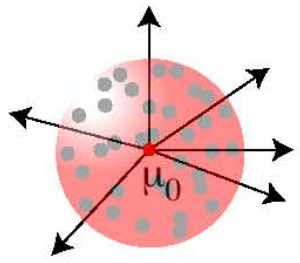
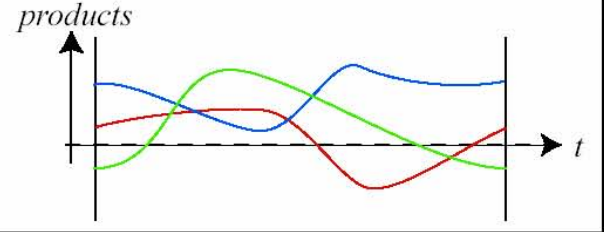


# Flexibility

$\mu = (\text{rates, couplings, } \dots)$   
 $\mu_0 = \text{base value}$

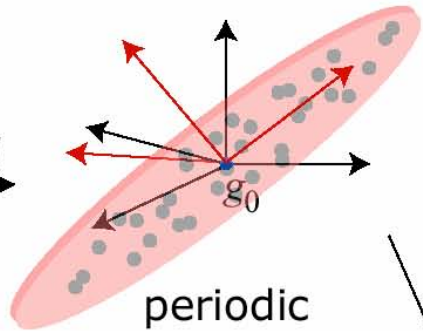
*differential equation*

$g_\mu(t) = \text{periodic orbit}$



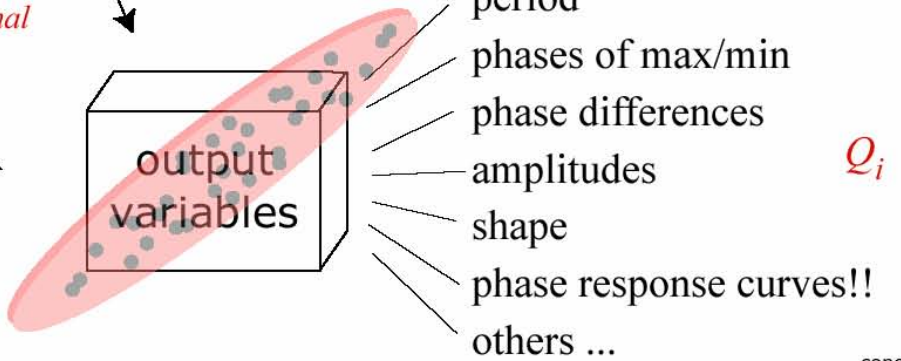
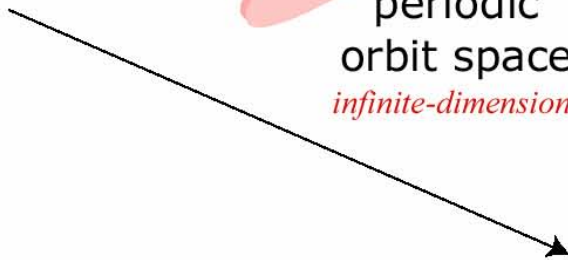
parameter space  
*high-dimensional*  
*~ 100 for mammals*

*differential equation*



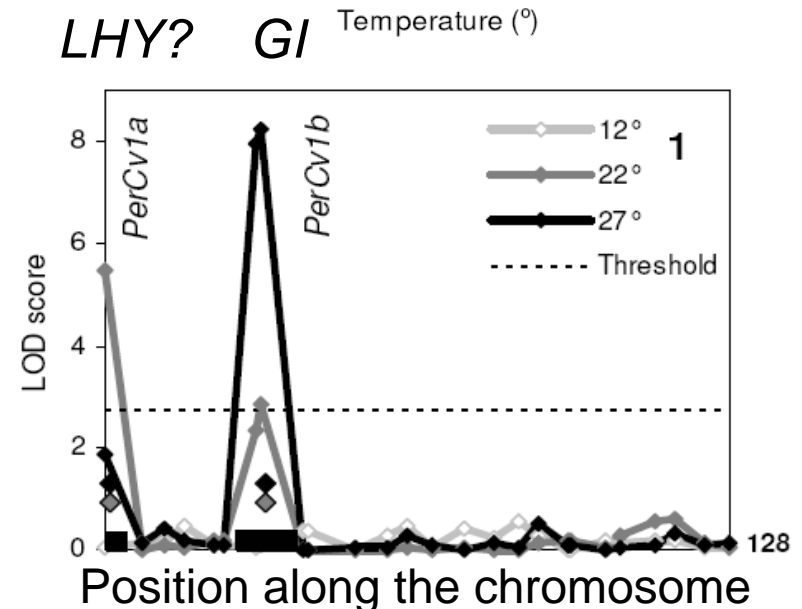
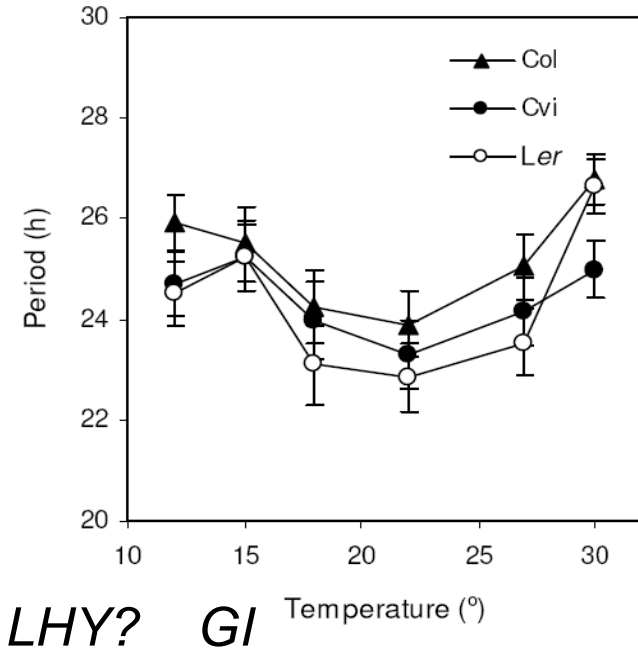
periodic orbit space  
*infinite-dimensional*

*the dimension of the image is the flexibility*

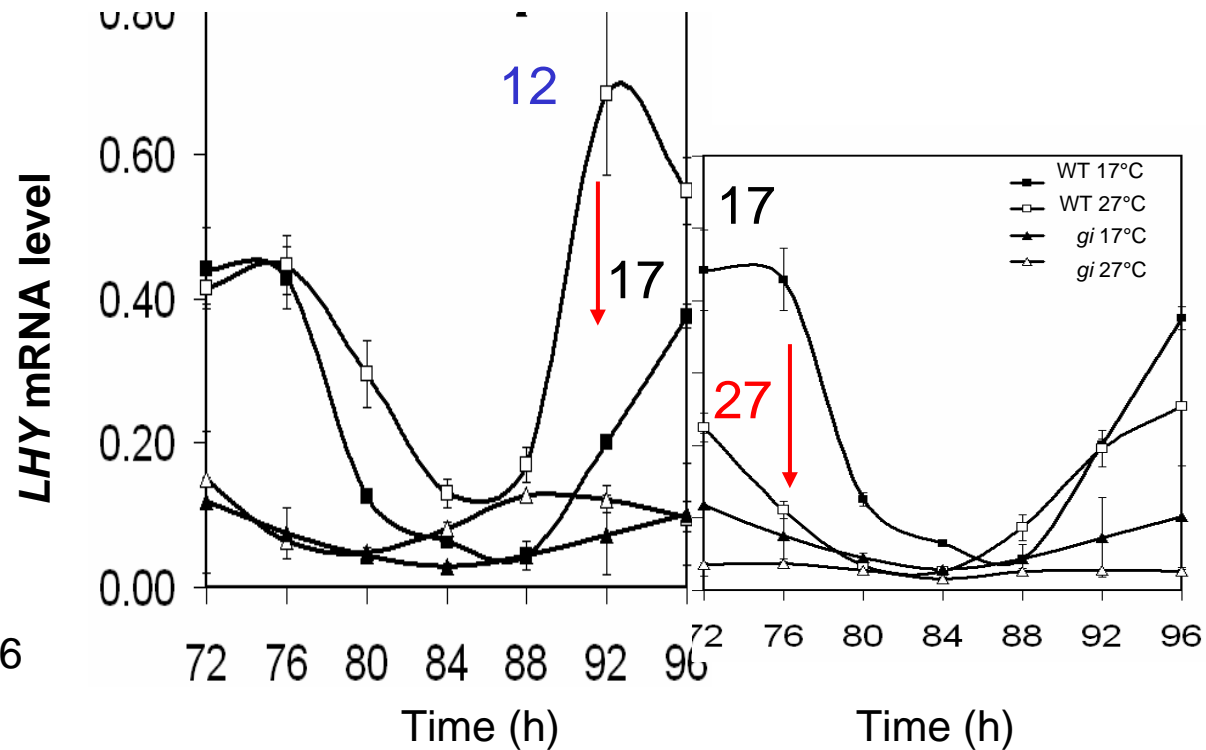


# Clock complexity 2: temperature compensation

- Defining feature of circadian clocks
- Quantitative genetics (QTL) shows multiple genes are involved in Arabidopsis



# Molecular mechanisms of temperature compensation



Gould *et al*,  
Plant Cell 2006

- *LHY* RNA levels fall with temp rise (*CCA1* rises)
- Mutant data confirms *LHY* (or *CCA1*) and *GI* are required
- Temperature-dependent substitution of homologous proteins?
  - To model, now split '*LHY*' to separate *CCA1*

## Clock complexity 2: temperature compensation

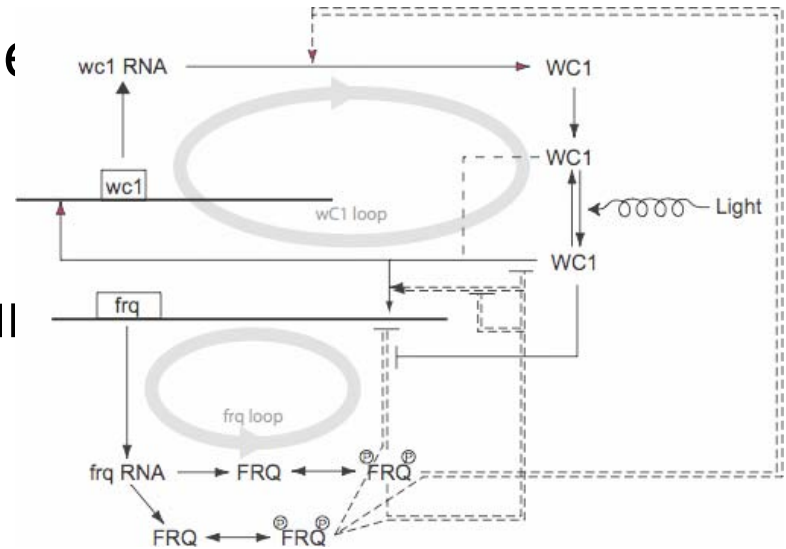
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- Homeostasis of period at a range of constant temperatures, unusual among biochemical oscillators
- Temperature affects many biochemical processes: parameters in the clock models
- ‘Antagonistic balance’ of period-lengthening and period-shortening effects
  - Gives local compensation at a particular temperature
  - Observed compensation covers wide temperature range
- Local constraints on parameters at many temperatures across the range? No, only TWO



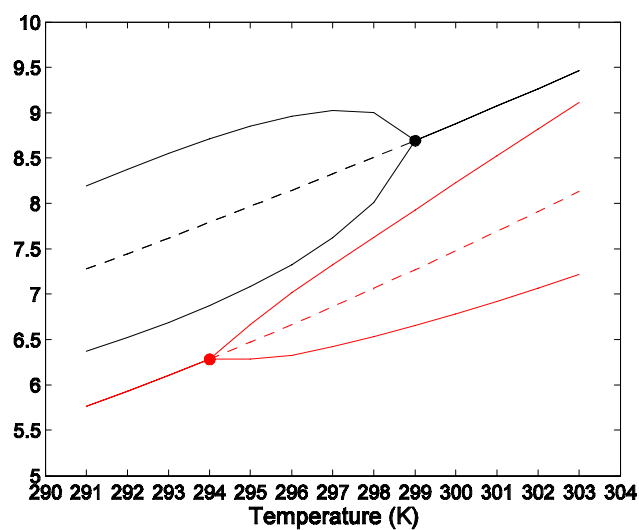
# A switch for simple temperature compensation

- Alternative molecular species
- Identical functions
- One dominates at low, the other at high temperature

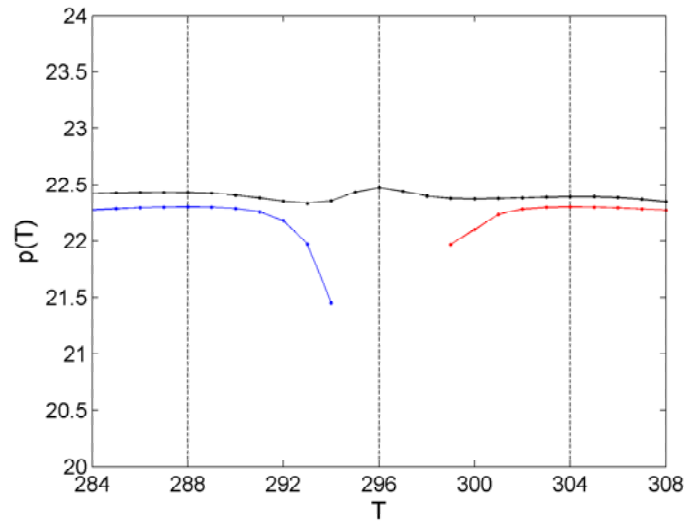


- Parameters affecting one species balance at one low temperature, the other at one high temperature
- Combining the two species gives compensation right across the temperature range

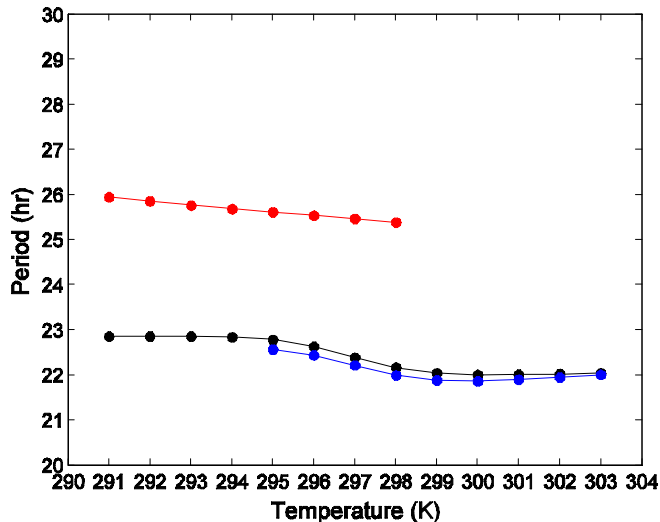
# Switch between two molecular species



- Clock with only one species becomes arrhythmic at non-optimal temperature



- Rhythmicity and global temperature compensation with both species



# Temperature compensation: summary

---

- Avoiding arrhythmia is a major challenge
  - If rhythmicity can be maintained across a temperature range, constant period is less surprising
- **Design principle:**  
Switch between two species allows tuning of some parameters for a high and a low temperature
  - biochemical mechanisms can vary, RNA or protein
  - deterministic
  - now to test experimentally...
- Global (temperature) compensation is readily achievable in evolution
- Long-standing questions...

# Clock models are useful

---

- Inform experimental design
  - Simulation software for clock experiments ([www.amillar.org](http://www.amillar.org))
  - Predict properties of undiscovered components (X and Y)
  - $G/I$  is part of  $Y$  function, another part also required
  - Analyse network properties, e.g. dawn/dusk tracking, temperature compensation
- Extend from clock to:
  - Molecular outputs: genome-wide rhythms at all phases
  - Whole organism: effect on growth via metabolism, morphology

# Requirements for model building

---

- Multiple mutant data were key but will be limiting
  - Measure parameter values
  - Make more use of timeseries data to invalidate models
    - More and better timeseries, protein data
    - Environmental manipulation, e.g. light, nutrition
  - Modelling of species with hard genetics, e.g. crops, trees
- Large-scale informatics infrastructure
  - Organise diverse data, integrate with models, parameter search and analytical tools, High-Performance Computing
  - Coordination among centres should be possible
- Synthetic biological systems to validate models
  - Completely described, well-controlled
  - A biological “wind tunnel”