

~~Benzo[a]pyrene detox~~

Property Driven Models: Experimental Validations and Simplifications

Gilles Bernot

University of Nice sophia antipolis, I3S laboratory, France

Menu

1. Models and Formal Logic
2. Gene Networks and Temporal Logic
3. Extracting Experiments from Models
4. Model Simplifications
5. Circadian Circle, Seasons and Jet-lag

Mathematical models: what for ?

- ▶ Models as “Data Base” to store biological knowledge
- ▶ Models as design tools
- ▶ Models as logical analysis of causality chains
- ▶ Models as guidelines for the choice of experiments

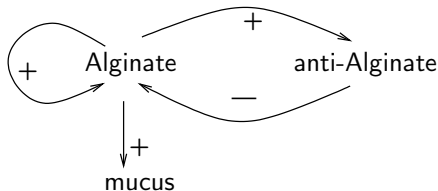
For the 2 last purposes, models can deviate far from biological descriptions but remain very useful: “Kleenex” models !

Static Graph v.s. Dynamic Behaviour

Difficulty to predict the result of combined regulations

Difficulty to measure the strength of a given regulation

Example of “competitor” circuits

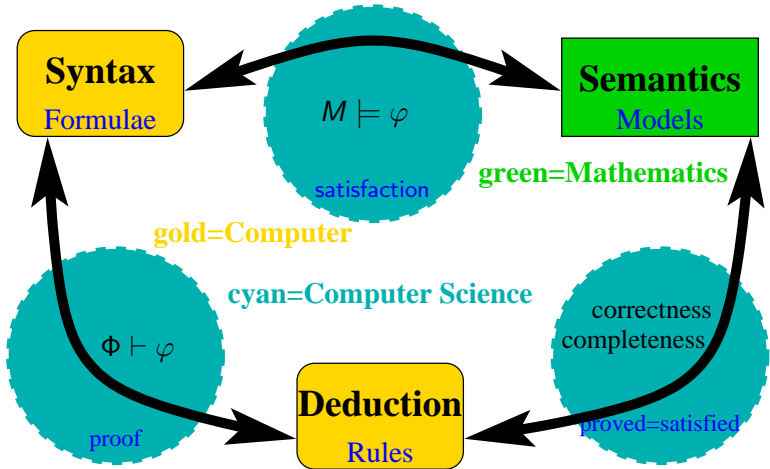


Multistationarity ?

Homeostasy ?

Many underlying models \approx 700 qualitative behaviours

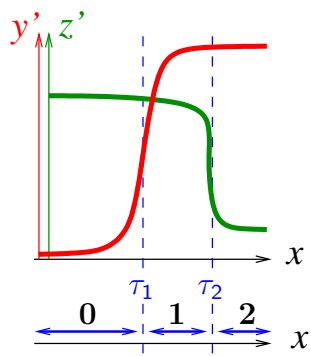
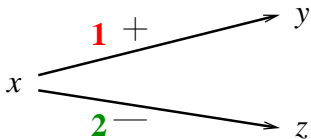
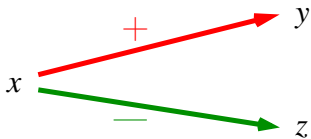
Formal Logic: syntax/semantics/deduction



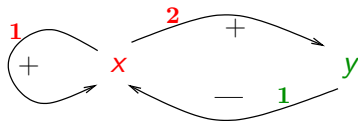
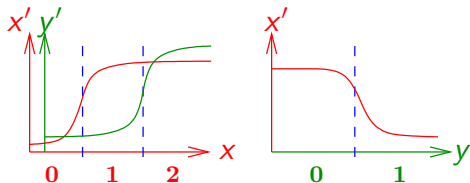
Menu

1. Models and Formal Logic
2. Gene Networks and Temporal Logic
3. Extracting Experiments from Models
4. Model Simplifications
5. Circadian Circle, Seasons and Jet-lag

Multivalued Regulatory Graphs



Regulatory Networks (R. Thomas)



No help : K_x

x helps : $K_{x,x}$

Absent y helps : $K_{x,\bar{y}}$

Both : $K_{x,x\bar{y}}$

K_y

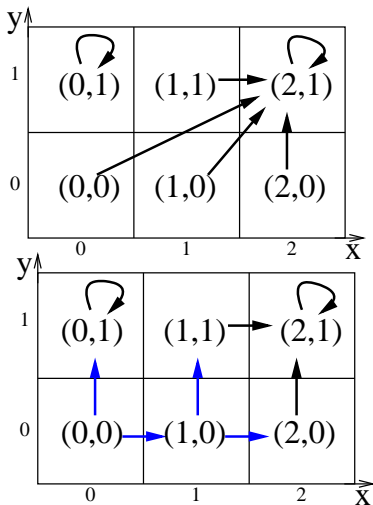
$K_{y,x}$

| (x,y) | <i>Focal Point</i> |
|---------|-----------------------------|
| $(0,0)$ | $(K_{x,\bar{y}}, K_y)$ |
| $(0,1)$ | (K_x, K_y) |
| $(1,0)$ | $(K_{x,x\bar{y}}, K_y)$ |
| $(1,1)$ | $(K_{x,x}, K_y)$ |
| $(2,0)$ | $(K_{x,x\bar{y}}, K_{y,x})$ |
| $(2,1)$ | $(K_{x,x}, K_{y,x})$ |

State Graphs

| (x,y) | <i>Focal Point</i> |
|---------|-----------------------------------|
| (0,0) | $(K_{x,\bar{y}}, K_y)=(2,1)$ |
| (0,1) | $(K_x, K_y)=(0,1)$ |
| (1,0) | $(K_{x,x\bar{y}}, K_y)=(2,1)$ |
| (1,1) | $(K_{x,x}, K_y)=(2,1)$ |
| (2,0) | $(K_{x,x\bar{y}}, K_{y,x})=(2,1)$ |
| (2,1) | $(K_{x,x}, K_{y,x})=(2,1)$ |

“desynchronization” \longrightarrow
by units of Manhattan distance



CTL = Computation Tree Logic

Atoms = comparisons : $(x=2)$ $(y>0)$...

Logical connectives: $(\varphi_1 \wedge \varphi_2)$ $(\varphi_1 \implies \varphi_2)$...

Temporal modalities: made of 2 characters

| <u>first character</u> | <u>second character</u> |
|------------------------------------|---|
| A = for A ll path choices | X = ne X t state |
| E = there E xist a choice | F = for some F uture state |
| | G = for all future states (G lobally) |
| | U = U ntil |

$AX(y = 1)$: the concentration level of y belongs to the interval 1 in all states directly following the considered initial state.

$EG(x = 0)$: there exists at least one path from the considered initial state where x always belongs to its lower interval.

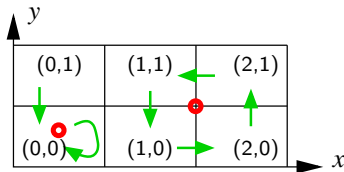
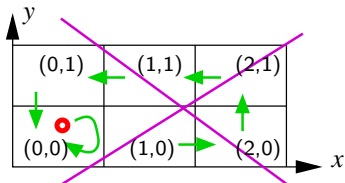
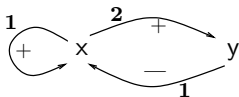
CTL to encode Biological Properties

Common properties:

“functionality” of a sub-graph

Special role of “feedback loops”

- positive: *multistationnarity* (even number of —)
- negative: *homeostasy* (odd number of —)



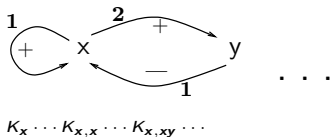
Characteristic properties: $\begin{cases} (x = 2) \implies AG(\neg(x = 0)) \\ (x = 0) \implies AG(\neg(x = 2)) \end{cases}$

They express “the positive feedback loop is functional”

(satisfaction of these formulae relies on the parameters $K...$)

The Two Questions

$\Phi = \{\varphi_1, \varphi_2, \dots, \varphi_n, H\}$ and $\mathcal{M} =$



1. Is it possible that Φ and \mathcal{M} ?

Consistency of knowledge and hypotheses. Means to select models belonging to the schemas that satisfy Φ .

($\exists? M \in \mathcal{M} \mid M \models \Phi$)

2. If so, is it true *in vivo* that Φ and \mathcal{M} ?

Compatibility of one of the selected models with the biological object. Require to propose experiments to **validate** or **refute** the selected model(s).

→ Computer aided *proofs and validations*

Theoretical Models \leftrightarrow Experiments

CTL formulae are satisfied (or refuted) w.r.t. a set of paths from a given initial state

- ▶ They can be tested against the possible paths of the theoretical models ($M \models_{\text{Model Checking}} \varphi$)
- ▶ They can be tested against the biological experiments ($\text{Biological_Object} \models_{\text{Experiment}} \varphi$)

CTL is a bridge between theoretical models and biological objects

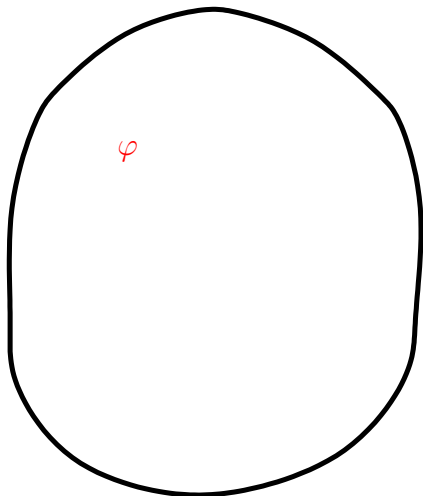
Menu

1. Models and Formal Logic
2. Gene Networks and Temporal Logic
3. **Extracting Experiments from Models**
4. Model Simplifications
5. Circadian Circle, Seasons and Jet-lag

Generation of biological experiments (1)

Set of all the formulae:

φ = hypothesis

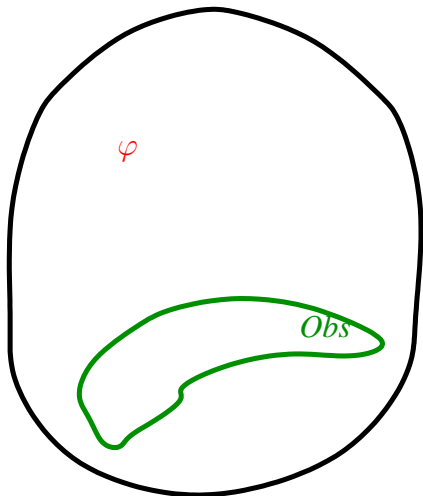


Generation of biological experiments (2)

Set of all the formulae:

φ = hypothesis

Obs = possible experiments



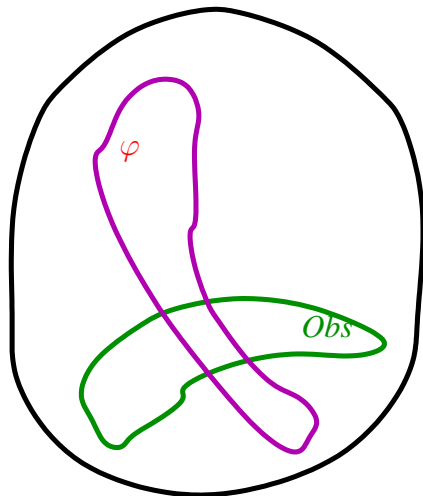
Generation of biological experiments (3)

Set of all the formulae:

φ = hypothesis

Obs = possible experiments

$Th(\varphi)$ = φ inferences



Generation of biological experiments (4)

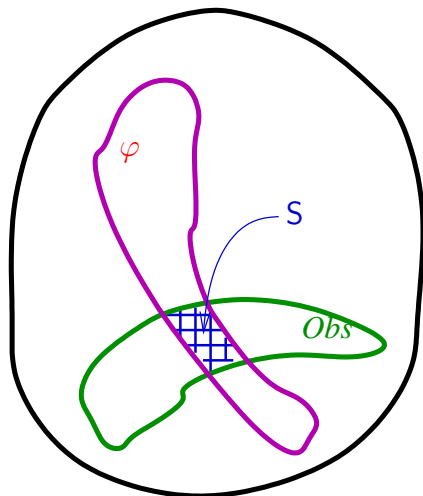
Set of all the formulae:

φ = hypothesis

Obs = possible experiments

$Th(\varphi)$ = φ inferences

S = sensible experiments



Generation of biological experiments (5)

Set of all the formulae:

φ = hypothesis

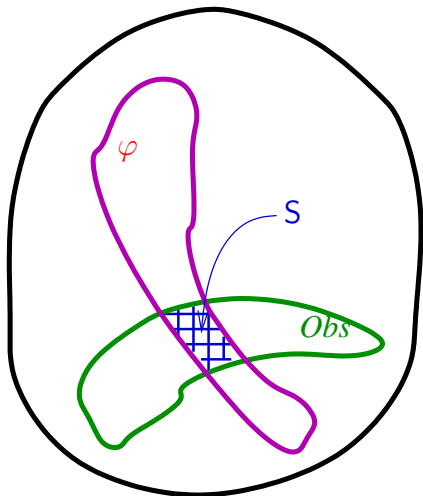
Obs = possible experiments

$Th(\varphi)$ = φ inferences

S = sensible experiments

Refutability:

$$S \implies \varphi ?$$



Generation of biological experiments

Set of all the formulae:

φ = hypothesis

Obs = possible experiments

$Th(\varphi)$ = φ inferences

S = sensible experiments

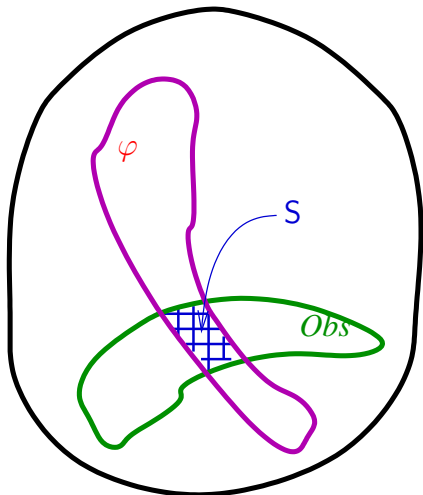
Refutability:

$$S \implies \varphi ?$$

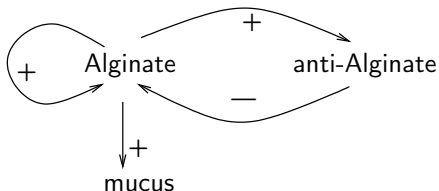
Best refutations:

Choice of experiments in *S* ?

... optimisations



How to validate a multistationnarity



$$\text{Hypotheses: } \begin{cases} (\text{Alginate} = 2) \implies AG(\text{Alginate} = 2) \\ (\text{Alginate} = 0) \implies AG(\text{Alginate} < 2) \end{cases}$$

Assume that only *mucus* can be observed:

Lemma: $AG(\text{Alginate} = 2) \iff AFAG(\text{mucus} = 1)$

(... formal proof by computer ...)

→ To validate: $(\text{Alginate} = 2) \implies AXAG(\text{mucus} = 1)$

$$(Alginate = 2) \implies AXAG(mucus = 1)$$

Karl Popper:

to validate = to try to refute

thus A=false is useless

experiments must begin with a pulse

| | | |
|----------------|-------------|--------------|
| $A \implies B$ | <i>true</i> | <i>false</i> |
| <i>true</i> | true | false |
| <i>false</i> | true | true |

The pulse forces the bacteria to reach the initial state $Alginate = 2$.
If the state is not directly controlable we need to prove **lemmas**:

$$(something\ reachable) \implies (Alginate = 2)$$

General form of a test:

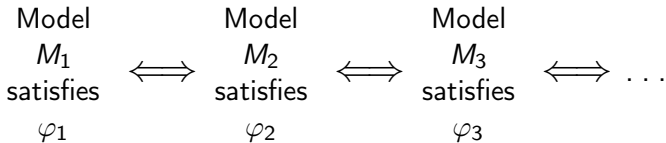
$$(something\ reachable) \implies (something\ observable)$$

Menu

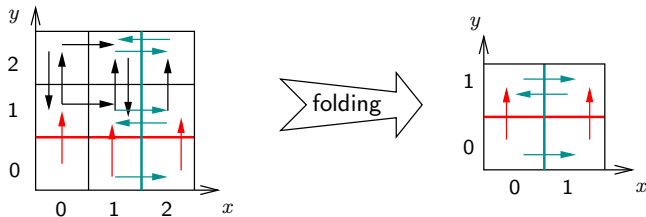
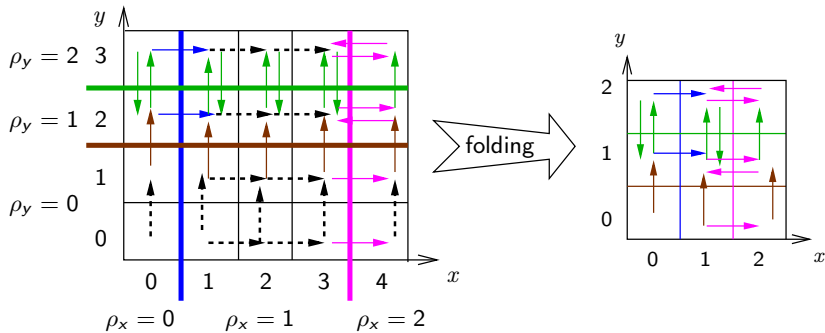
1. Models and Formal Logic
2. Gene Networks and Temporal Logic
3. Extracting Experiments from Models
4. **Model Simplifications**
5. Circadian Circle, Seasons and Jet-lag

Hypothesis driven model simplifications

Successive simplified views of the studied biological object:

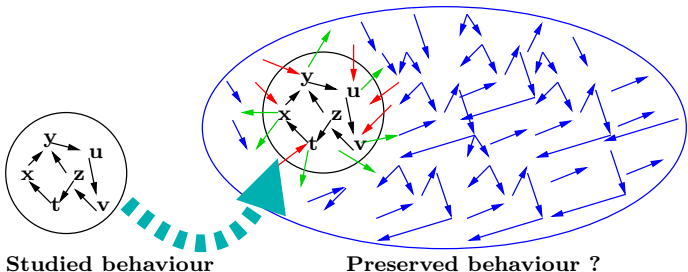


Simplifications via level folding



Simplifications *via* subgraphs

Embeddings of Regulatory Networks:



Necessary and sufficient condition on the *local* dynamics of the "input frontier"

... Also *fusion of genes, etc.*

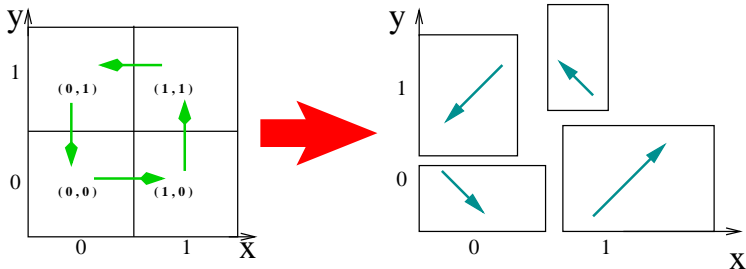
Menu

1. Models and Formal Logic
2. Gene Networks and Temporal Logic
3. Extracting Experiments from Models
4. Model Simplifications
5. Circadian Circle, Seasons and Jet-lag

The target question

Impact of the day length on the persistence of the circadian circle ?

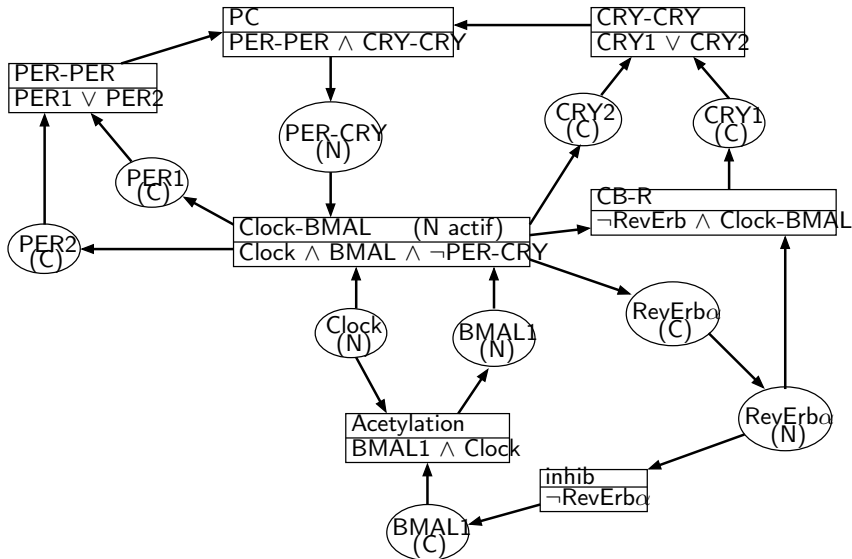
⇒ framework with time delays:



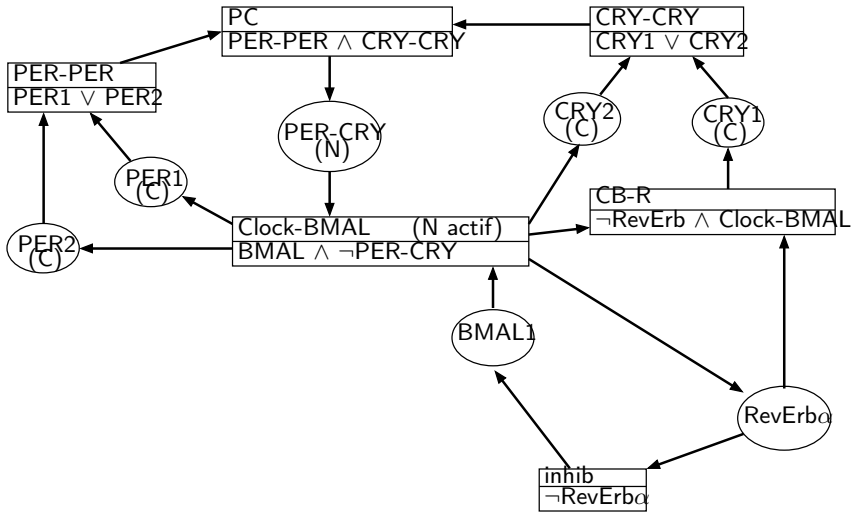
(size of rectangular areas = delays)

+ extension of temporal logic with delays...

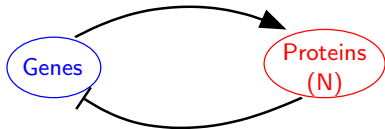
Fold levels and remove PPAR



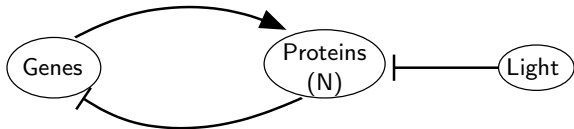
Remove Clock and "tunnel" pathways



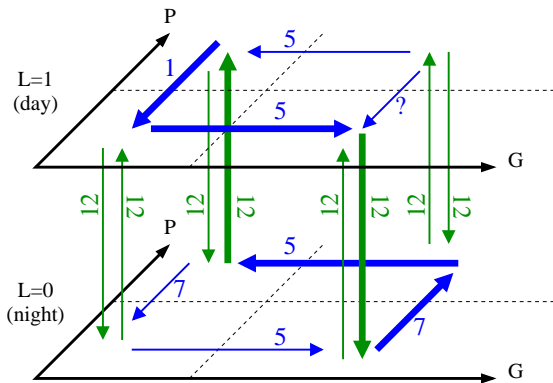
Fusion of all inhibitors



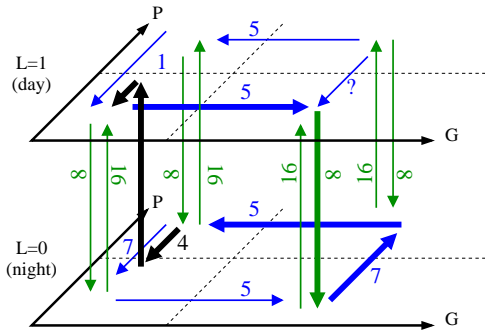
and Light prevents PER-CRY to enter the nucleus:



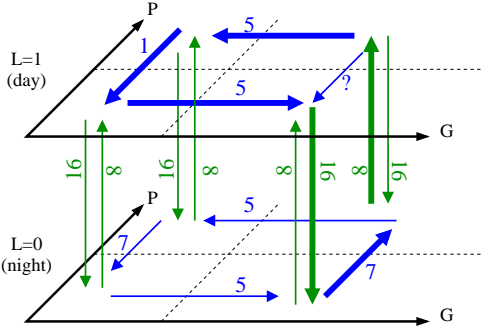
12 hours model



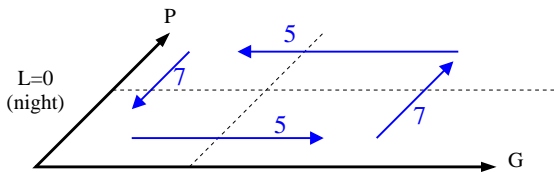
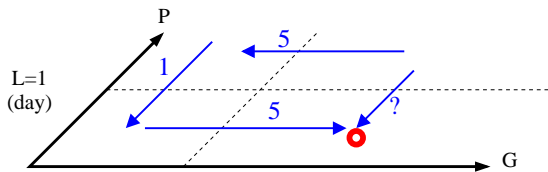
Winter model



Summer model



Jet lag + training



Yet far from automatic simplifications but...

Abstract interpretation at



Model reduction at



Acknowledgements

- ▶ *Observability Group*, Epigenomics Project (Genopole®)
- ▶ Janine Guespin (Rouen)
- ▶ Franck Delaunay (Nice)
- ▶ Jean-Paul Comet (Nice)
- ▶ Camille Massot (Polytech, BIMB)
- ▶ Amélie Cessieux (Polytech, BIMB)



Option BIMB en Génie Biologique

Take Home Messages

Make explicit the hypotheses that motivate your research

A far as possible formalize them to get a computer aided approach

Behavioural *properties* are as much important as *models*

Mathematical models are not reality: let's use this freedom !
(several views of a same biological object)

Modelling is significant only with respect to the considered
experimental *reachability* and *observability* (for refutability)

Formal proofs can suggest wet experiments

“Kleenex” models help understanding main behaviours