

Systems and models in chronobiology

Modeling and analysis of the circadian rhythm

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Outline

Introduction

Mathematical models in (chrono)biology

- Historical origins

- Why is it useful?

- Biological modeling for the circadian oscillator

Systems viewpoint

- Why is it useful?

- How to deal with the problem? Recent approaches...

Conclusion

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Definition and origin

Biological rhythms

Periodic variation of a measurable biological quantity (protein concentration, mRNA concentration, number of cells...)

Origin

Regulation and interaction phenomena (either positive or negative) at different levels:

- ▶ enzymes (activation, inhibition)
- ▶ receptors (desensibilization)
- ▶ ionic channels (inactivation)
- ▶ transport
- ▶ genes (induction, repression)

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Main biological rhythms

Rhythm	Period τ
Neural rhythms*	0.001s – 10s (and more?)
Cardiac rhythms*	1s
Calcium oscillations*	1s – 1min
Mitotic cycle*	10min – 15h
Biochemical oscillations*	1min – 20min
Hormonal rhythms*, ⁺	10min – 5h
Circadian rhythms*	24h
Ovarian cycle ⁺	28 days
Annual rhythms ⁺	1 year
Epidemiology and ecological oscillation	years

* Cellular rhythms

+ Poorly known rhythms

Circadian rhythms (1)

Definition and roles

Definition

Biological rhythms with a period $\tau \sim 24\text{h}$

Favorite organisms

Neurospora, drosophila, cyanobacteria, Chlamydomonas, hamsters and mice.

Roles

Circadian rhythms control

- ▶ Sleep
- ▶ Muscular activity and metabolism
- ▶ Food ingestion
- ▶ ...

Moreover, there are possible links with various pathologies

Circadian rhythms (2)

Properties

Property	Comment
Ubiquitous	All eukaryotes and some prokaryotes
Entrainment	Zeitgeber=light/temperature cycles
Genetic mechanisms	Single-gene clock mutants isolated
Precision	$\Delta\tau < 0.1\%$
Robustness	T° , IC...
Cellular nature	A cell-autonomous circadian oscillator mechanism exists and appears to be a fundamental unit even among multicellular organisms

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Historical flags

"Prehistory"

Jean-Jacques d'Ortous de Mairan (1729), *Lotka-Volterra* (1920-1925), *Hodgkin-Huxley* (1952)

"Middle-age"

- ▶ *Winfree* (1960-1990): qualitative description
First emphasis on interconnection and synchronisation
- ▶ *Goodwin* (1965): first biochemical model
Coupling (2 oscillators)

"Modern age"

Developments of genetics and technology (microarrays...)

Goldbeter (1996): one of the first quantitative biochemical model

Goals

Goals

Using **mathematical models** coupled with **experimental data** (intuition is not enough) to

- ▶ analyze *principles* and *mechanisms* (unification, key parameters, links with other phenomena)
- ▶ make *quantitative prediction* on the system (sometimes inaccessible to experiments)

→ possibility to drive **future experiments**

But...

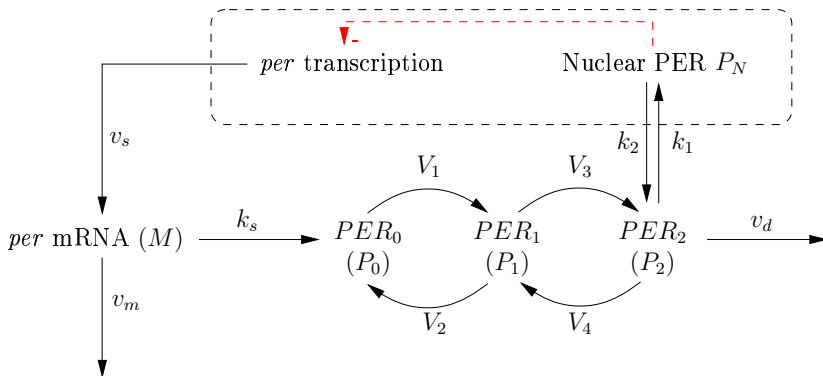
Most biologists are still suspicious about mathematical modelling because

- ▶ most biological process at the cellular level should be regarded as **stochastic processes (molecular noise)**
- ▶ very often, few information is known about real **parameter values** or even range
- ▶ real curves are always **less smooth**, and less reproducible

HOWEVER these models don't claim to represent the reality but are just **tools** we can use to better *understand* the phenomena and make some *predictions*.

Simple model

Biochemical principle



from Goldbeter, *Biochemical oscillations and cellular rhythms*, Cambridge University Press, 1996

Simple model

Equations

$$\dot{M} = v_s \frac{K_I^n}{K_I^n + P_N^n} - v_m \frac{M}{k_m + M}$$

$$\dot{P}_0 = k_s M - V_1 \frac{P_0}{K_1 + P_0} + V_2 \frac{P_1}{K_2 + P_1}$$

$$\dot{P}_1 = V_1 \frac{P_0}{K_1 + P_0} - V_2 \frac{P_1}{K_2 + P_1} - V_3 \frac{P_1}{K_3 + P_1} + V_4 \frac{P_2}{K_4 + P_2}$$

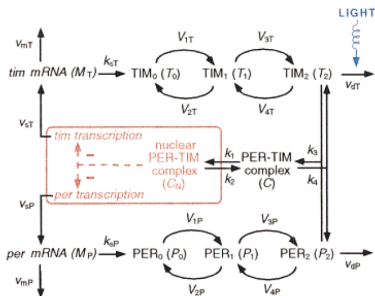
$$\dot{P}_2 = V_3 \frac{P_1}{K_3 + P_1} - V_4 \frac{P_2}{K_4 + P_2} - k_1 P_2 + k_2 P_N - v_d \frac{P_2}{k_d + P_2}$$

$$\dot{P}_N = k_1 P_2 - k_2 P_N$$

- ▶ 5 nonlinear ODEs
- ▶ 17 parameters

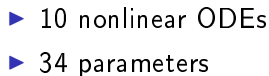
Evolutions of the model

Drosophila



- 10 nonlinear ODEs
- 34 parameters

Drosophila

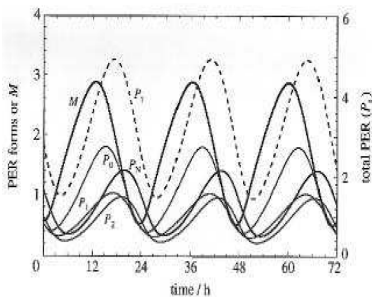


- ▶ 19 nonlinear ODEs
- ▶ 59 parameters

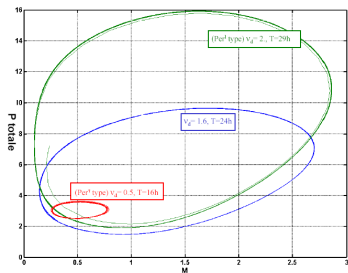
Results (1)

Oscillations and limit cycle

Oscillations

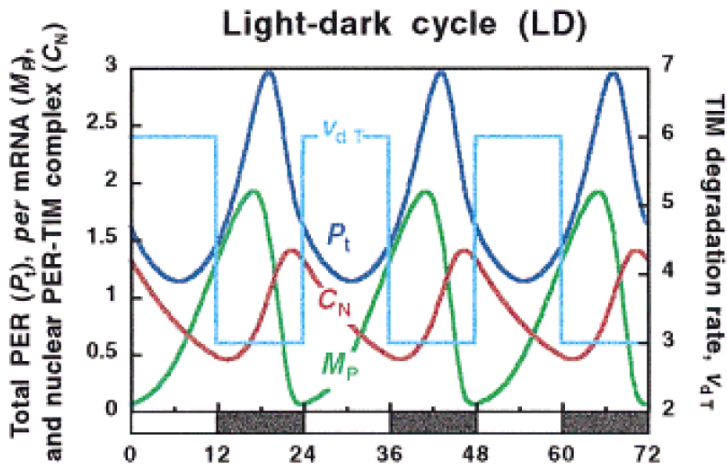


Limit Cycle



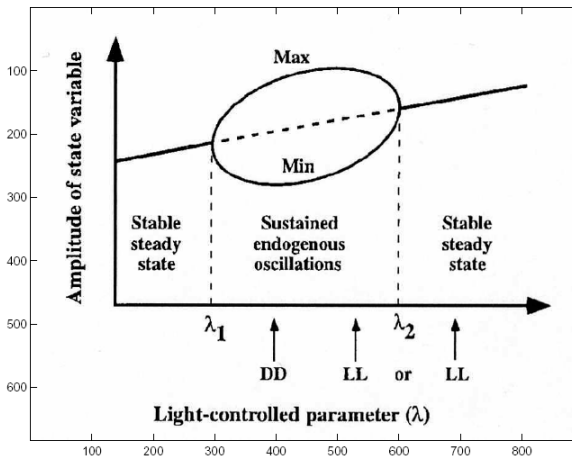
Results (2)

Entrainment



Results (3)

Bifurcation diagram



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Limitations of current mathematical modeling

- ▶ Very complicated systems (strongly nonlinear, several variables and parameters)
→ restricted to **numerical simulations**
- ▶ Impossible to test all **parameter combinations**
- ▶ Mathematically (and computally) difficult to study **interconnections**
- ▶ **Exhibit** some properties, but NOT **explain** them

System approach

Principle

Developing or using system models and tools for the analysis of biological system (and particular oscillatory systems)

System approach

Links with system question

By nature, cells are **open systems**, i.e. with *inputs* and *outputs*

Many unexplained properties are related to fundamental systems questions:

- ▶ Why is there an **entrainment**?
- ▶ Why is the system **robust** to certain parameters variation (T° , initial conditions...)? Why is it robust to molecular noise? And to external disturbance?
- ▶ How can we guess from observed properties, the values of **unknown parameters**?
- ▶ Why is there a **synchronisation** in networks of oscillators?
What kind of synchronized behaviour may we expect given a particular network configuration?

System approach

Necessity of research

Objective: make a link between *natural properties* and *mathematical structure*

However, those questions are still **open question** for oscillators

There is thus a strong need for **research** in that field!

System approach

Sontag's remarks

- ▶ Not sufficient to merely apply existing theories because, at closer look, biological problems are quite **different of standard system problems**
→ necessity to develop *dedicated tools* for biological modelling
- ▶ Analysis of the **very efficient robustness** of biological system can also influence new development of control theory

First approach: application of existing theories

Classical methods

Classical methods for the analysis of limit cycle

There exist various tools for the (global) analysis of limit cycles:

- ▶ phase plane methods
- ▶ Poincaré-Bendixon theorem
- ▶ Poincaré maps

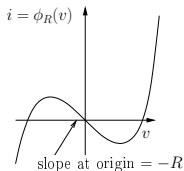
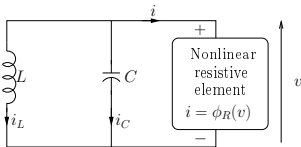
Limitations: either useless in high dimension (and so for interconnections) or unable to handle global treatment

Second approach: abstract models

Using well-known (abstract) oscillating models manipulated so that $\tau \sim 24h$ to modelize circadian rhythm

Example

The Van der Pol oscillator



Second approach: abstract models

The Van der Pol oscillator

$$\begin{aligned}\dot{x} &= y + \epsilon\left(x - \frac{1}{3}x^3\right) & \rightarrow & \quad \frac{12}{\pi}\dot{x} = y + \epsilon\left(x - \frac{4}{3}x^3\right) + B \\ \dot{y} &= -x & & \quad \frac{12}{\pi}\dot{y} = -\left(\frac{24}{\tau}\right)^2 x + By\end{aligned}$$

Very basic low dimensionnal model

Mostly used to analyse interconnection of oscillators (robustness, stability...)

Limitations

Acts more as a “black box” i.e. it is possible to obtain qualitative information, but no quantitative one.

Third approach: development of new methods

A few examples:

- ▶ Monotone Systems (P. de Leenheer, D. Angeli, E. Sontag)
- ▶ Piecewise Linear Systems - PLS (J. Goncalves)
- ▶ Dissipative Systems (R. Sepulchre, G.B. Stan)

Third approach: development of new methods

Dissipative systems

This theory was developed in the control group at the University of Liège.

It relies on the dissipativity (passivity) theory to analyse

- ▶ **global stability** of limit cycles
- ▶ global stability of oscillations and synchronization in **interconnections**

→ first analysis of an oscillatory *mechanism*

Not applicable to Goldbeter's model

My personal research is the continuation of this work, but for another kind of mechanism valid on Goldbeter's model.

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There remains many **unsolved questions** in the exploding field of mathematical biology.

Most of these are **natural** in the framework of **systems modelling**: synchronisation, robustness, entrainment...

Our research group currently develops methods based on an input/output approach (dissipativity) to answer (some of) those questions and **classifiaste** basic oscillatory mechanisms.