The circadian clock – a system of coupled oscillators



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The environmental external oscillator

entrains

our internal oscillator

(the circadian clock)



Molecular Chronobiology



The circadian oscillator



Reppert and Weaver, 2001

Molecular Chronobiology

Measurements



Vanselow et al., Genes & Dev, 2006

Coupled oscillators

1. Synergy of feedback loops



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2. Oscillator networks





Clock genes and feedback loops

Proc. Nat. Acad. Sci. USA Vol. 68, No. 9, pp. 2112-2116, September 1971

Clock Mutants of Drosophila melanogaster

(eclosion/circadian/rhythms/X chromosome)

RONALD J. KONOPKA AND SEYMOUR BENZER

Feedback of the *Drosophila period* gene product on circadian cycling of its messenger RNA levels

Paul E. Hardin**, Jeffrey C. Hall* & Michael Rosbash**



E-boxes, ROR-elements and D-boxes drive clock genes



H Ukai, HR Ueda: Annu Rev Physiol 72: 579-603 (2010)

Transcriptional Architecture and Chromatin Landscape of the Core Circadian Clock in Mammals

Nobuya Koike,¹ Seung-Hee Yoo,¹ Hung-Chung Huang,¹ Vivek Kumar,¹ Choogon Lee,² Tae-Kyung Kim,¹ Joseph S. Takahashi^{1,3*}



Science 19, 349-354, 2012

Construction of a core clock model using

- representative genes: activators (Bmal1, Dbp)+ early inhibitors (Per2, Rev-Erb)+late inhibitor (Cry1)
- experimentally verified binding sites
- known degradation rates
- reasonable delays
- fitted transcriptional parameters

Core-clock model from expression profiles and promoters



Model design and global optimization



$$egin{aligned} \mathsf{score} &= rac{(\mathsf{period}_{\mathsf{sim}} - \mathsf{period}_{\mathsf{exp}})^2}{\mathsf{tol}_{\mathsf{period}}^2} + \sum rac{(\mathsf{phase}_{\mathsf{sim}} - \mathsf{phase}_{\mathsf{exp}})^2}{\mathsf{tol}_{\mathsf{phase}}^2} \ &+ \sum rac{(\mathsf{foldch}_{\mathsf{sim}} - \mathsf{foldch}_{\mathsf{exp}})^2}{\mathsf{tol}_{\mathsf{foldch}}^2} \end{aligned}$$

- Delays (h): [0,6]
- Degradation rates: [0, 1]

5 DDE model can reproduce expression profiles



Pett et al., submitted

Global optimization finds multiple parameter sets

P. Pett et al.: Co-existing feedback loops generate tissue-specific circadian rhythms, submitted

data							
tissue specific gene-expression							
VFOPSO							
models							
parameter sets							
targeted							
essential feedback loops							
synergies of loops							

	$\operatorname{adrenal}$	kidney	liver	heart	ske-	lung	brown	white	SCN	cere-
	gland				letal		adi-	adi-		bellum
					muscle		pose	pose		
number of	100	93	57	57	58	31	62	45	153	58
runs										
runs with	66	59	52	44	35	21	36	22	46	39
score < 10										
mean	3.84	4.48	1.58	3.74	5.17	3.04	4.00	3.24	7.21	3.99
score										

Synergy of feedback loops allows tissue specificity



P. Pett et al., submitted

Large tissue diversity of peripheral clocks



Clock-controlled genes in peripheral organs



Korencic 2014

Summary Part 1

How to design a minimal core clock model?

- Five genes represent most regulations
- DDEs require few parameters
- Transcriptional regulations remain heuristic
- Per/Cry loops, Rev-Erba loop and repressilator possible
- Peripheral tissues: comparable core clock but different clock-controlled genes and tissue-specific timing

Outline

1. Synergy of feedback loops



2. Oscillator networks



3. Entrainment phase (chronotypes)

Paradigm 2004: single cells are self-sustained, periods vary from 20 to 28 hours, weak coupling

Nonlinear dynamics: tori, chaos ... expected

Observations: - 20000 neurons in the SCN are robustly synchronized

- "splitting" rare

Bifurcation diagram of coupled Goodwin models

Synchronization of Circadian Oscillators



Gonze et al. Biophysical J. 2005

Sloppy oscillators synchronize well independent of specific coupling scheme

60 r **D**

20

22 24

48

period (h)

of oscillators

لم 20

Local Local Laboration 1.5 F

12 24 36 48 60 72

K=0.9

time (h)

168

192 216

40

24.3±1.22

26

time (h)



S. Bernard, D. Gonze, B. Cajavec, H. Herzel, and A. Kramer: Synchronization-Induced Rhythmicity of Circadian Oscillators in the Suprachiasmatic Nucleus, PLoS Comp. Biol. (2007) 3:e68.

Damped oscillators synchronize well independent of specific coupling scheme



S. Bernard, D. Gonze, B. Cajavec, H. Herzel, and A. Kramer: Synchronization-Induced Rhythmicity of Circadian Oscillators in the Suprachiasmatic Nucleus, PLoS Comp. Biol. (2007) 3:e68.



Intrinsic, nondeterministic circadian rhythm generation in identified mammalian neurons

Alexis B. Webb^a, Nikhil Angelo^a, James E. Huettner^b, and Erik D. Herzog^{a,1}

makers. Instead, these results indicate that AVP, VIP, and other SCN neurons are intrinsic but unstable circadian oscillators that rely on network interactions to stabilize their otherwise noisy cycling.

Coupling can even synchronize Cry-DKO neonatal SCN



D. Ono, S. Honma, K. Honma Nature Communications 2013

Coupling phase controls synchronization



Implications for dual role of GABA (J. Evans, Neuron 2013) and synchrony of neonatal versus adult SCN slices (Honma, Nature Communications 2013)

B. Ananthasubramaniam, E. D. Herzog, H. Herzel. PLoS Comp. Biol. 2014

SCN slice data from wildtype and knockouts



Network simulations with varying coupling phases



Isao Tokuda et al. Biophys. J. 2015

Synchronization of noisy oscillators (WT and DKO)



CV about 1

CV above 1



Coupling strength enhances sync

Coupling phase matters strongly

I.T.Tokuda et al. Biophys. J. 2015



Part 2: Summary and outlook

- Many SCN neurons might be noisy weakly damped oscillators
- Ensembles of damped oscillators are easily synchronized and entrained
- Coupling phase as essential as coupling strength
- **Outlook:** Dominant coupling mechanisms?
 - Quantification of coupling strength?
 - Role of spatial heterogeneities?
 - Control of entrainment phases ("chronotypes")

Outline

1. Synergy of feedback loops

2. Oscillator networks



3. Entrainment phase (chronotypes)

Hallmarks of entrainment



Period of the entrained oscillator becomes equal to the Zeitgeber period

The phase-angle between Zeitgeber cycle and entrained oscillator is constant (i.e. **the phase of entrainment <-> chronotype**)







Brown et al., PNAS 2008

Fibroblast Period Length and Fibroblast Transcriptional Phase Correlate Under Entrained Conditions



Brown et al., PNAS 2008

Circadian period τ , phase of entrainment ψ in humans



small variations in T (+- 0.2 hrs) and wide range of chronotypes (+- 1.5 hrs)

 \rightarrow 7-fold ratio of $\Delta \psi$ to $\Delta \tau$

Small entrainment range implies large phase variability



A. Granada et al. 2013

Test of theory using genetic network models

Katharina Imkeller, Master thesis 2013



modified Goodwin model (3 ODEs) Gonze et al. Biophys. J. 89 (2005) two-loop model (19 ODEs) Relogio et al. PLoS Comp. Biol. 7 (2011)

Entrainment phase as a function of mismatch

large phase variations

smaller phase variability



Increasing entrainment range and phase variability with Zeitgeber strength in lizards



Abb. 5. Phasenwinkeldifferenzen zwischen Temperaturcyclus und biologischer Periodik in Abhängigkeit von der Spontanperiode der circadianen Periodik für vier Temperaturcyclen. Die berechneten Regressionsgeraden sind gestrichelt eingezeichnet $(b = b_{x,y})$. Man erkennt, daß sie mit abnehmender Amplitude des Temperaturcyclus steiler werden. Die — zur Berechnung der Regressionsgeraden nicht heran-

K. Hoffmann Z. vergl. Physiologie 62, 93-100 (1969)

PRC/PTC as iterated map: stable entrainment phase varies by 12 hours



Figure 5: Sinusoidal phase response curve (PRC) and associated phase transition curves (PTCs) according to Eq. (5). Applying *T*-periodic pulses, stationary entrainment phases are given by the intersections of the PTC with the diagonal $\psi_{n+1} = \psi_n$ (Glass and Mackey, 1988). Upper graphs: Vanishing frequency mismatch $\Omega = 0$ leads to a stable entrainment phase $\psi = 12$ h. Lower graphs: Period mismatches $\tau - T = \pm 1.5$ correspond to the borderlines of the entrainment range. The corresponding entrainment phases of 18 h and 6 h are associated to the extrema of the sin-function and are 12 h (or 180°) apart.

Periodically driven damped oscillators exhibit phase jump of 180° around resonance



Figure 6: Amplitude and phase of a periodically driven weakly damped oscillator. The amplitude (left) shows a resonance peak near the intrinsic frequency $\omega_0 = \frac{2\pi}{24}$. Near the resonance the phase difference between the oscillator and the driver is changing by about 180° (right).

Uncoupled circadian systems have a smaller ratio of $\Delta \psi$ to $\Delta \tau$



Aschoff and Pohl, 1978

Circadian period τ , phase of entrainment ψ in humans



small variations in τ (+- 0.2 hrs) lead to wide range of chronotypes (+- 1.5 hrs) since the SCN is a "strong oscillator" due to coupling

Granada et al. PLoS One 2013

Photoperiod (day length) effects entrainment range



Simulations of amplitude-phase oscillator (C. Schmal et al. 2015)

Arnold onion quantifies seasonality



C. Schmal et al.: A theoretical study on seasonality (2015)

Summary Part 3

- Coupling leads to "strong oscillators" with small PRC, narrow entrainment range and variable phases
- Models predict dependencies of entrainment phases on period mismatch, Zeitgeber strength/amplitude and photoperiods
- Theory explains wide range of chronotypes (see also Wever 1964)
- Mammals: Robust oscillator implies flexible phase