### Sync and desync in higher-order networks and several other topics

Hiroshi KORI 郡宏

Department of complexity science and engineering University of Tokyo

(Talk in DDAP13 on July 3, 2025)



## Self introduction

- $\sim$  2003: Kyoto Univ. (master and PhD courses)
	- Supervised by Yoshiki Kuramoto
	- DDAP2 in Hangzhou, my first international conference
- $\sim$  2006: Fritz Haber institute in Berlin (postdoc)
	- In the group of Alexander Mikhailov
	- Observing BPO rhythm every week
	- Playing fussball every week
	- Start collaboration with chemists
- $\sim$  2008: Hokkaido univ. (postdoc)
	- In the group of Yasumasa Nishiura
	- Playing with snow
	- Start collaboration with biologists
- $\sim$  2018: Ochanomizu univ (assistant, associate professor)



 $\sim$  Now: Univ Tokyo  $2\,$ 



#### Venue

Takeda Hall The University of Tokyo

Tokyo, Japan





#### Yoshiki Kuramoto will give a talk (in person!)

https://sites.google.com/edu.k.u-tokyo.ac.jp/ecc11/home





4

### Synchronization of metronomes: pay attention to interesting transient behavior



Youtube: Synchronization of four metronomes on a suspension bridge

#### Circadian clock  $\Box$ Defining the molecular basis of circadian timing in mammals has





 $\mu$ in chhair a weavel, 2002 in p

extence rhythms in culture; the black and white bars along the  $\alpha$  $\alpha$ indicate at the time of time of time of time of time  $\alpha$  $\mathcal{L}$  explant rhythm persists for weeks in culture, whereas the liver explanation  $\mathcal{L}$ damaguchi et al, Science 2003) (Reppert & Weaver, 2002 Nature) Synchronization of clock gene expression among<br>SCN salls (Yamagushi at al. Saianea 2003)

#### Circadian clock in jet lag

When a mouse is subjected to advancing phase shift of light-dark cycles (similar to a trip from Europe to Japan), oscillations of gene expression disappear for a while: when a mouse is subjected to advancing phase shift of



This "oscillation quenching" is thought to be a primal cause of heavy jet-lag symptoms.

## My wish is to conduct theoretical research that will be useful in the real world

- Developing theoretical frameworks for data-driven approaches
	- Network inference from rhythmic signals [Matsuki, HK, Kobayashi, to be submitted] Poster
	- Network inference from spike data [Mori & HK, PNAS (2022)] (talk on Thursday)
	- Forecasting dynamics using reservoir computing [Kuno & HK, arxiv]
- Oscillation quenching
	- Metronomes [Kato & HK, Sci. Rep. (2023)]
	- Kuramoto model with stochastic turnover [Ozawa & HK, to appear in PRL]
- Energetics of synchronization
	- Coupled Heat engines [Yin, Izumida, HK, PRR (2023)]
- Higher order networks
	- Slow desynchronization process in noisy oscillators [Marui & HK, arxiv]

### Developing theoretical frameworks for data-driven approaches

### network inference

Suppose that we may observe oscillatory signals  $x_i(t)$ from a network of noisy oscillators and want to infer coupling network between oscillators.





## Inference using phase models

One idea:



by which coupling strength *Ki* and noise strength *Di* may be inferred.

Many studies have been conducted along this line [Tokuda et al (2007); Kralemann et al (2012); Stankovsky et al. (2012); Ota, Aoyagi (2018); …]

#### Inference does NOT work for well-synchronized networks S\ ncnror ן<br>**"**  $\ddot{\mathbf{i}}$



19



#### Inference of coupling and noise strength using only spike data [Mori&HK, PNAS (2022)]  $\mathbf{C}$  $\blacksquare$  $\ldots$   $\ldots$



This method works for well-synchronized oscillators the variance *V*<sup>1</sup> was derived from the system in Eq. 4 by means *d*(θcp) FitzHugh–Nagumo model in Eq. **14**. The SDs, ζ, of the spike time lag between two oscillators are similar in cases i and ii. (*B*) Simultaneous inferences of effective noise intensity *aD* and effective coupling strength *|c|*κ for the

Fumito Mori will give a talk on Friday **FUMILO IVIOFI WIII give a taik on Friday** 24 and <sub>24</sub> *V*1(θcp) = *C*<sup>1</sup> + *C*<sup>2</sup> where  $C_1$  and  $C_2$  are independent of  $C_1$  and  $C_2$  are independent of  $C_1$  $F_{\rm eff}$  in  $F_{\rm eff}$  in  $\sim$   $\frac{1}{2}$ . These inferences were achieved inferences were achieved in  $\sim$ 

1

(i)

### Forecasting a better shiftwork scheduling using Reservoir computing

[Kuno & HK, arxiv 2024]

# Problems in shift working

- Shift workers are known to be at an increased risk of certain diseases
- They are supposed to be in "chronic jet lag", which is thought to have a significant impact on their well-being and health

#### Mathematical models help<sup>12</sup>qualitative understandings and predictions about jet lag adaptation under jet lag conditions. Our model is based on our previous model is further simplified, thus is f<br>Is further simplified, thus is further simplified, thus further simplified, thus is further simplified, thus i ialichialical inducis licip $_{\rm 24}$ yualicalivc tally verified our method using micrearchic micrearchic micrearchic micrearchic micrearchic micrearchic micrear<br>The re-entrainment with our micrearchic micrearchic micrearchic micrearchic micrearchic micrearchic micrearchi mathematical predictions. We also discuss a relevant application of our study to shi! work. **Model** the jet lag and *t*jetlag is the time at which jet lag occurs. In the context of long-distance trips, *t* and *t*+ *δ* are the local **Example 24 and design places**  $\mathbb{R}^n$  and  $\mathbb{R}^n$  and  $\mathbb{R}^n$  and  $\mathbb{R}^n$  and  $\mathbb{R}^n$  and  $\mathbb{R}^n$  and  $\mathbb{R}^n$  are  $\mathbb{R}^n$  and  $\mathbb{R}^n$  and  $\mathbb{R}^n$  and  $\mathbb{R}^n$  are  $\mathbb{R}^n$  and  $\mathbb{R}^n$   $\begin{array}{c} \n\frac{12}{24} \\
\end{array}$ #e second term in equation (1a) describes the in'uence of the LD cycle on oscillator 0, where *K*0 is interpreduct of the preduction of the sensitivity and the sensitivity and the sensitivity of  $\mathcal{L}$



Wake understand to as "jet than usual on the day of the Wake up 4 hours earlier than usual on the day of the eastbound flight!

#### Mathematical models help qualitative understandings and predictions also for shiftwork scheduling (unpublished)







Our model predicts a better way to spend holidays

But I consider that this does not work for everyone. A data-driven approach is needed to provide a reliable prediction to each individual.

### Can we assist in schedule decisionmaking using machine learning? [Kuno&HK, arxiv]

Suppose that a person who has experienced a certain schedule of shift working will at some point change to a new, different schedule. Our aim is to forecast the dynamics of the circadian clock for the new schedule on the basis of past data and the new schedule of sleepwake cycles.

Specifically, in this study, we asked whether Reservoir Computing (RC) can predict the dynamics of limit-cycle oscillators subjected to a periodic drive with frequent and abrupt phase shifts.





## Oscillation quenching

Sometimes, oscillation is desired. Sometimes, oscillation is harmful, e.g., trembles in Parkinson 's disease.

We would like to know the design and control principle of a system producing (or suppressing) oscillations

### Coupled metronomes



Movie taken by a friend of mine

$$
x_i = O(1), \dot{x}_i = O(1), \dot{\mu}_i = \dot{\overline{O}}[\overline{\psi}, \mathcal{B}_i^{\dagger} = \mathcal{D}(1), \kappa = O(1), \rho = O(1) \qquad g_i(x_i, \dot{x}_i) = O(1)
$$



es of in-phase. anti-phase sync. oscillation quenching are obtained.  $(\overline{x}_1(0), \overline{x}_1(0), \overline{x}_2(0), \overline{x}_2(0)) \equiv (\overline{2.8}, 0, 2.7, 0)$  for an and  $(\overline{x}_1(0), \overline{x}_1(0), \overline{x}_2(0), \overline{x}_2(0)) \equiv (2.8, 0, 2.7, 0)$ Novel interesting behavior, out-of-phase sync and beating phenomen**വ്ലൂഷ്ട്ര**പ്പിലിയി.  $\frac{m_1(\sigma), m_1(\sigma), m_2(\sigma), m_2(\sigma)}{m_1(\sigma), m_1(\sigma), m_2(\sigma)}$  (26)  $\sigma$ ,  $\frac{m_1(\sigma), m_1(\sigma), m_2(\sigma)}{m_1(\sigma)}$ Novel interesting behavior, out-of-phase sync and beating phenomenpaure potentiol. Boundaries of in-phase, anti-phase sync, oscillation quenching are obtained,

#### Coupled oscillators with metabolism [Ozawa & HK, to appear in PRL] n schillators with voltrigto, with polawa & HR, to appear affect the period length, the period length, the phosphorylatic length, the phosphorylatic length,  $\mathbf{r}$ metaholism components of the TTO models, including  $\sim$  not cyanobacteria (2, 3). phonosphorylation on latin  $\mathbf{p}_1$

B). These results indicate that oscillation of Synchronization in phosphorylation rhythm of Kai proteins cyanobacterial circadian clock. In addition, In addition, In addition, In addition, In addition, In addition,



[C. Robertson McClung, PNAS (2007)] [Naka

[Nakajima et al, 2005]

Period: about 24 hours Half-life: about 10 hours 0 of turnovers of Kai proteins on synchronization**Ratio of** *in vivo* **( ) and** *in vitro* **( ) P-KaiC Period (***in vitro* **KaiC phosphorylation, h)** In vivo, there should be considerable effect

# Coupled oscillators with metabolism

[Ozawa & HK, to appear in PRL]

$$
d\theta_i = \left[\omega + \frac{\kappa}{N} \sum_{j=1}^N \sin(\theta_j - \theta_i)\right] dt + \left[-\theta_i + \phi_i\right] dP_i(\phi_i; \alpha)
$$

Kuramoto type interaction



Random phase resetting

At each time, oscillators are randomly picked up and reseted (turnonver)





For small coupling strengths, the turnover induces

#### **desynchronization**

For stronger coupling strengths, it may induce **stochastic oscillation quenching**.

## Energetics of Synchronization

What is the merit of synchronization?

Energy should be a key aspect



Image: American Institute of Physics, June 9 (2017)

#### Coupled heat engines and the large that, we will provide a theoretical control of the large control of the large control of the Fourier law

[Yin, Izumida, Kori, PRR 2023] *JQ*<sup>m</sup> = *G*m(θ )(*T*<sup>m</sup> − *T* (θ*,* ω)), where *G*m(θ ) with m = b (or t) ical analysis of the effects of the weak coupling  $[{\sf Yin}]$ 





$$
\frac{d\theta_i}{dt} = \omega_i,
$$
\n
$$
\frac{d\omega_i}{dt} = \sigma \left( \frac{T(\theta_i, \omega_i)}{V(\theta_i)} - P_{\text{air}} \right) \sin \theta_i - \Gamma \omega_i - T_{\text{load}}^{(i)}
$$
\n
$$
-K \sin(\theta_i - \theta_j).
$$

https://www.youtube.com/shorts/YECEFJzvyQY *dt* <sup>=</sup> <sup>ω</sup>*,* (1a)

#### Maximum power and thermal efficiency are achieved when engines are synchronized the first term on the right-hand side of the right-hand side of  $\mathbb{R}^n$  $t_{\text{t}}$  for difference. Since  $\frac{1}{2}$ Eqs. (1a)–(1b) explains the essential characteristics of a real LTD Stirling engine  $\mathbb{R}^n$  , we generalize the above minimal  $\mathbb{R}^n$  , we generalize the above minimal  $\mathbb{R}^n$

model and the state of the lines. [Yin, Izumida, Kori, PRR 2023]



In the current case, we can confirm that the coupling has increased the thermal efficiency of the total system by about 7%. consider the coupling effects on #*P*rel\$. Without loss of gen- $\overline{a}$ Mechanism: Loads to the engines are evenly distributed by synchronization

38

Higher order network of noisy oscillators [Marui & HK, arXiv]

### Higher-order networks are ubiquitous

Neural network



$$
\frac{d}{dt}v_C = f(v_C) + g(v_A) + g(v_B)
$$

Pair-wise network

If neuron C fires only when neuron A and B fire almost simultaneously this is effectively "and circuit":



Figure from https://www.electroniclinic.com/logic-and-gate-working-principle-circuit-diagram/

If we take temporal information into account, some systems can better be modeled as non-pairwise networks

# Oscillators in higher-order network

• Oscillators in higher-order networks have extensively been studied, e.g., Tanaka&Aoyagi (2011), Skardal&Arenas (2019), Millan, Torres,

Bianconi (2020); Chutani, Tadic, Gupte(2021); Kuehn, Bick (2021); Rajwani, Suman, Jalan(2023); Carletti, Giambagli, Bianconi (2023) …

- Emergence of multiple attractors (two cluster states)
- Abrupt desynchronization

• However, noise effects on synchronization in higher-order networks are largely overlooked.

#### Noisy oscillators in a higher-order network [Marui & Kori, arXiv (2023)]

#### Globally coupled phase-oscillators with two- and three-body interactions and independent white noises

$$
\dot{\theta}_m = \omega_m + \frac{K_1}{N} \sum_{j=1}^N \sin(\theta_j - \theta_m) + \frac{K_2}{N^2} \sum_{j,k=1}^N \sin(\theta_j + \theta_k - 2\theta_m) + \xi_m(t),
$$

$$
\langle \xi_m(t) \rangle = 0, \ \langle \xi_m(t) \xi_n(\tau) \rangle = 2D \delta_{mn} \delta(t - \tau),
$$

Using the order parameter  $Z = Re^{i\Theta} =$ the model reduces to 1 *N*  $\sum$ *N j*=1  $e^{il\theta}$ 

$$
\dot{\theta}_m = \omega_m + K_1 R \sin(\Theta - \theta_m) + K_2 R^2 \sin 2(\Theta - \theta_m) + \xi_m(t).
$$

where R is Kuramoto order parameter, Θ is macroscopic phase

### What is the effect of three-body interaction?

$$
\dot{\theta}_m = \omega_m + K_1 R \sin(\Theta - \theta_m) + K_2 R^2 \sin 2(\Theta - \theta_m) + \xi_m(t).
$$

By two-simplex interaction (i.e., three-body interaction), Individual phase  $\theta$  seems to be locked to  $\Theta$  or  $\Theta$  + π (where Θ is mean phase).

Therefore, one can expect that three-body interaction promotes the formation of two-cluster states, which is actually the case in noise-free oscillators

Two cluster states slowly decays and eventually disappear in noisy oscillators with two-simplex interaction alone



This decay occurs even when the noise is infinitesimally weak

#### Two clusters becomes persistent when two-body interaction is additionally introduced





#### Super- or subcritical? Weakly nonlinear analysis

Weakly nonlinear analysis for the bifurcation of  $R = 0$  at  $K_1 = K_c$  is as follows. We set  $K_1 = K_{\rm c}(1+\varepsilon^2)$  and introduce d  $\frac{d}{dt}$ <sup>-></sup>  $\partial$  $\partial t$  $+\varepsilon^2 \frac{\partial}{\partial x}$  $\frac{1}{\partial \tau}$ . The complex order parameter is expanded as

$$
Z=\varepsilon Z_1+\varepsilon^2 Z_2+\cdots,
$$

Note  $R = |Z|$ . Using a standar method [Kuramoto, 1984], we derive  $(a)$ 

0.6

 $R<sub>8</sub>$ 

 $K_1 - \mathbb{R}$ 8

*R*<sup>1</sup>

where

 $\partial$ 

 $\frac{1}{\partial \tau}Z_1(\tau) =$ 



 $\frac{d^{2}Z_{1}}{2\ 0.6}\Big|^{Z_{1}}(\tau)\Big|^{2}Z_{1}(\tau),$ 

#### Lifetime of synchronized states from 0*.*6 (corresponding to ⌘ = 0*.*8) to *R*thre with purple dots. In the region where  $\mathcal{S}$  is a set of the theoretical contract of the total contract of the theoretic chronize d*R*<sup>1</sup>

 $\tau$ 

We have obtained

$$
\dot{R} = -\frac{4K_2R^3}{\pi} \exp\left(-\frac{K_2R^2}{D}\right).
$$

We define the lifetime of the synchronized state by  $\tau_{10.10^2}$ the time within which *R* varies from  $R_0$  to  $R_{\text{thre}}$ :

$$
\tau = \int_{R_0}^{R_{\text{three}}} \frac{\mathrm{d}t}{\mathrm{d}R} \, \mathrm{d}R = \int_{R_{\text{three}}}^{R_0} \frac{\pi \exp\left(\frac{K_2 R^2}{D}\right)}{4K_2 R^3} \, \mathrm{d}R,
$$

where  $R_0 = R(0) = 2\eta(0) - 1$ . Very roughly, we can estimate

$$
\tau \propto \exp\left(\frac{K_2 R_0^2}{D}\right)
$$





Synchronized states persist for long time,

1.000<br>|-<br>| 1.000 increasing exponentially with three-body coupling strength K2.

#### Noisy oscillators in a higher-order network: Summary

When noise is absent,

Oscillators are synchronized into various two-cluster states.

When noise is present, all those synchronized states disappear.

However, the desynchronization process from synchronized state is extremely slow.

One-simplex interaction (two-body coupling) may stabilize the synchrony.

# My wish is to conduct theoretical research that will be useful in the real world

- Developing theoretical frameworks for data-driven approaches
	- Network inference from rhythmic signals [Matsuki, HK, Kobayashi, to be submitted] Poster
	- Network inference from spike data [Mori & HK, PNAS (2022)] (talk on Thursday)
	- Forecasting dynamics using reservoir computing [Kuno & HK, arxiv]
- Oscillation quenching
	- Metronomes [Kato & HK, Sci. Rep. (2023)]
	- Kuramoto model with stochastic turnover [Ozawa & HK, to appear in PRL]
- Energetics of synchronization
	- Coupled Heat engines [Yin, Izumida, HK, PRR (2023)]
- Higher order networks
	- Slow desynchronization process in noisy oscillators [Marui & HK, arxiv]

Many thanks for your attention and Cheers!