

Self-Organization in Complex Systems: The Past, Present and Future of Synergetics  
Symposium in Honour of Prof. Hermann Haken's 85th Birthday

Delmenhorst 15. 11. 2012

# CONTROL OF SELF-ORGANIZING COMPLEX SYSTEMS AND NETWORKS WITH TIME-DELAY



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Germany



<http://www.itp.tu-berlin.de/schoell>

*Happy Birthday to Hermann Haken!*

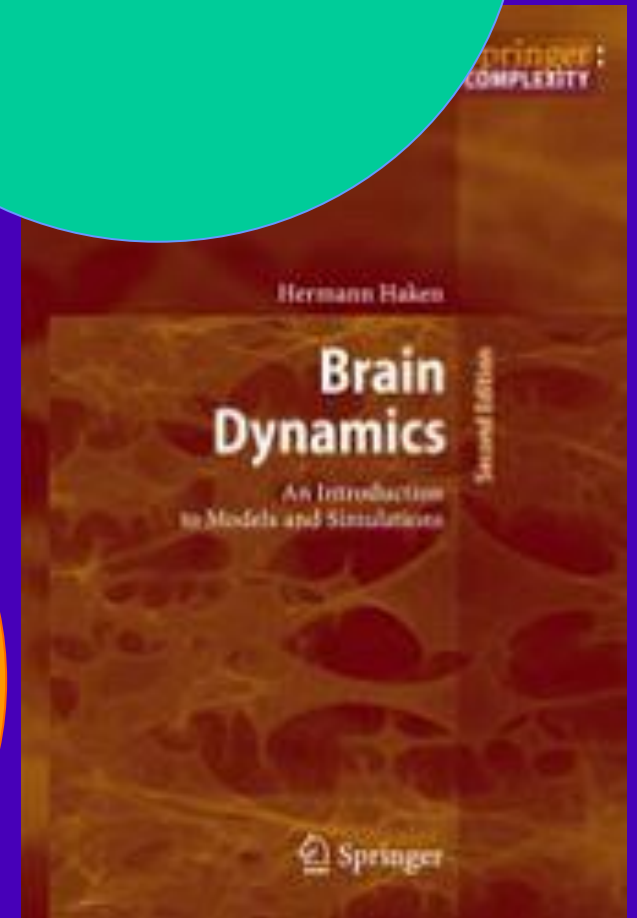


**Laser**

**Semiconductors**

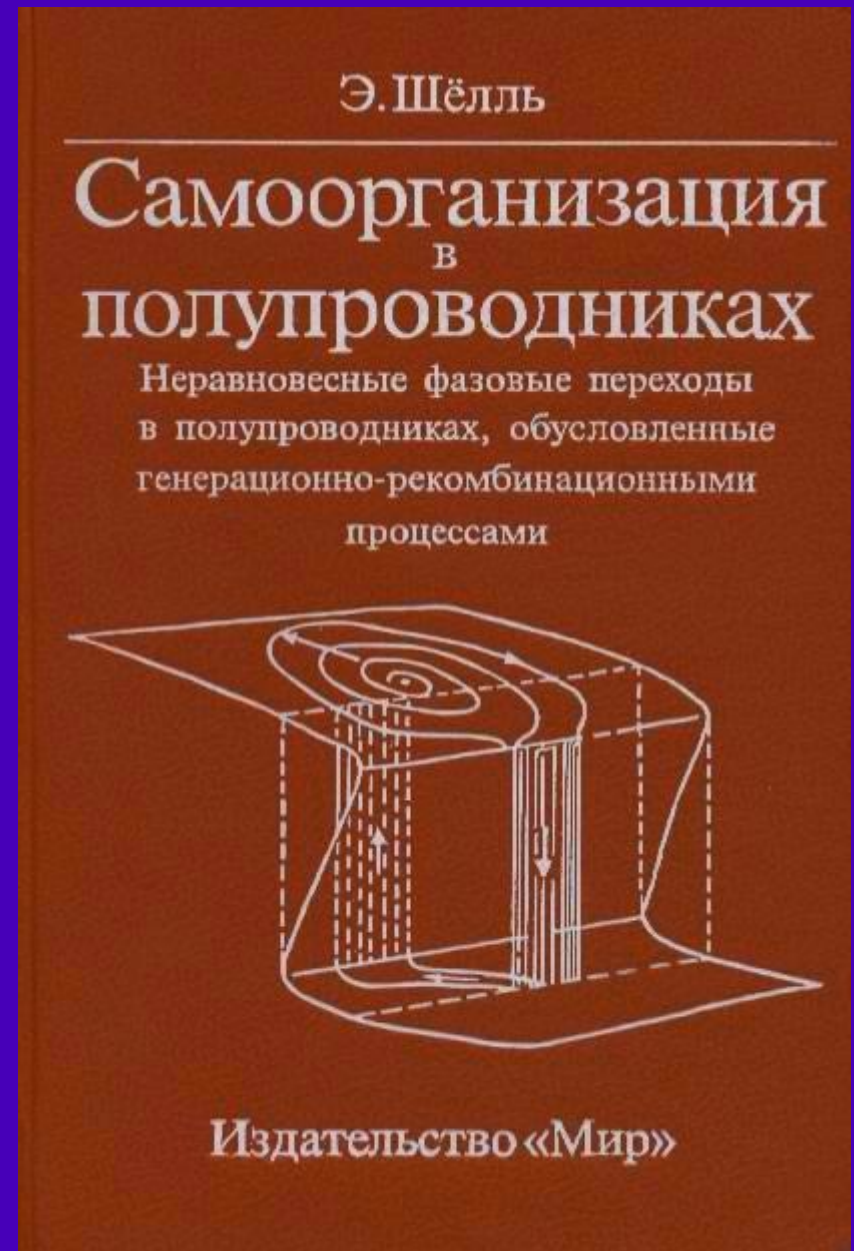
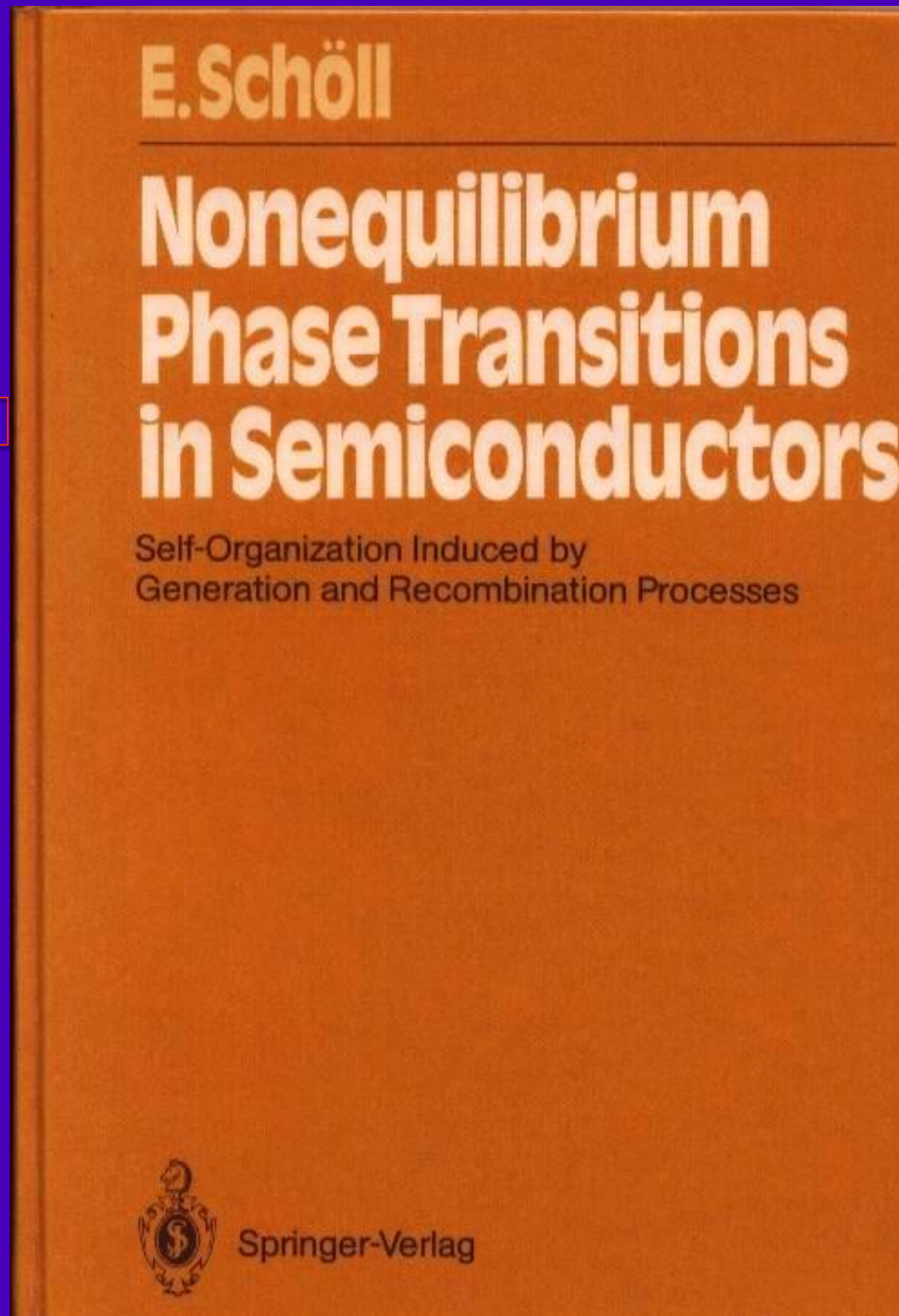
**Synergetics**

**Brain**



# Springer Series in Synergetics Vol. 35 (1987)

Russian translation (1991):



# Outline

- **Introduction: Delay in nonlinear systems and networks**
- ◻ • **Universal classification of delay-coupled networks for large time delay: stability of synchronization**
- **Application to neural networks and coupled lasers**
- **Controlling synchrony in delay-coupled networks: from in-phase to splay and cluster states**
- ◻ • **Adaptive control**

# Delay in nonlinear systems is ubiquitous

- mechanical systems: **balancing, segway**
- electronic systems: **capacitive effects** ( $\tau=RC$ )



**latency time** due to processing

- optical systems: **signal transmission times**  
**travelling waves + reflections**
  - ▶ **laser coupled to external cavity (Fabry-Perot)**□□□
  - ▶ **laser with optical injection or feedback (mirror)**
  - ▶ **optically coupled lasers**
- biological systems: **cell cycle time**  
**biological clocks**
  - ▶ **neural networks: delayed coupling, delayed feedback**

# Why is delay interesting in dynamics?

- Delay increases the dimension of a differential equation to infinity:



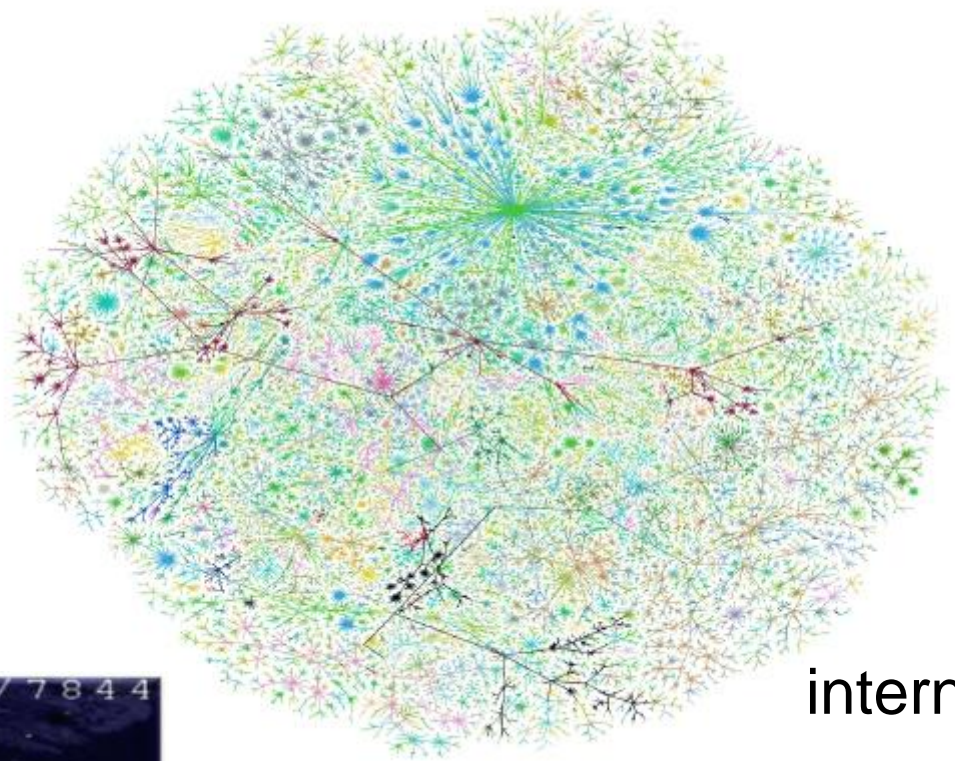
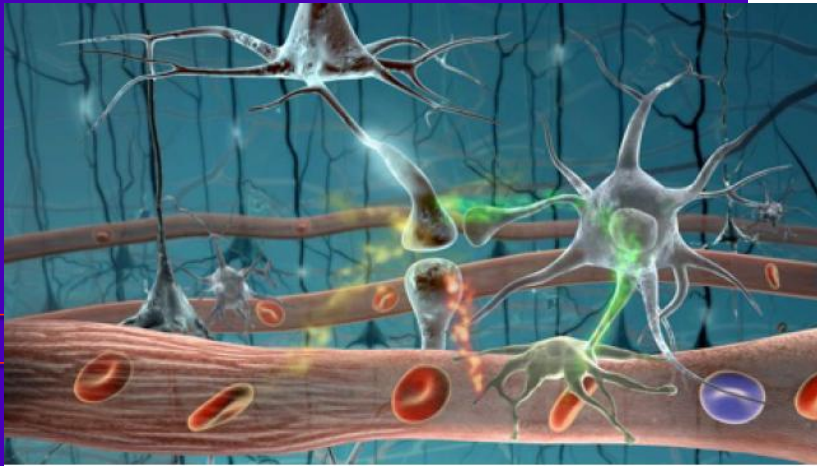
$$\dot{x}(t) = -ax(t) + bx(t - \tau)$$

delay  $\tau$  generates **infinitely many eigenmodes**

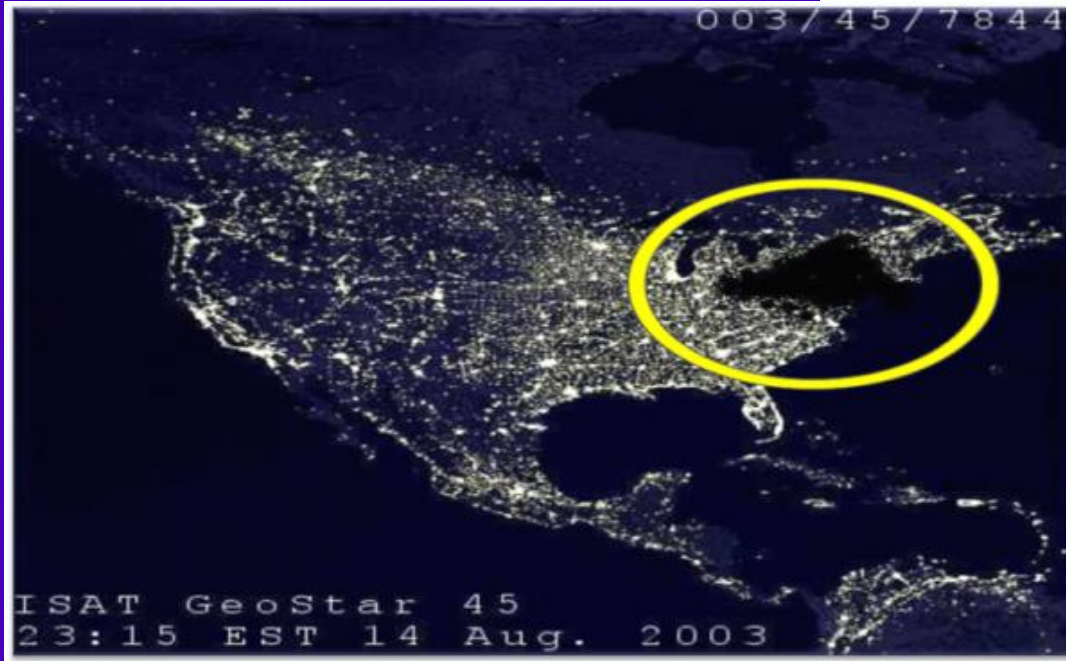
- Simple equations produce very **complex** behavior:
  - delay-induced **bifurcations**
  - delay-induced **multistability**
  - stabilization of **unstable periodic or stationary states**

# Examples of complex systems (networks)

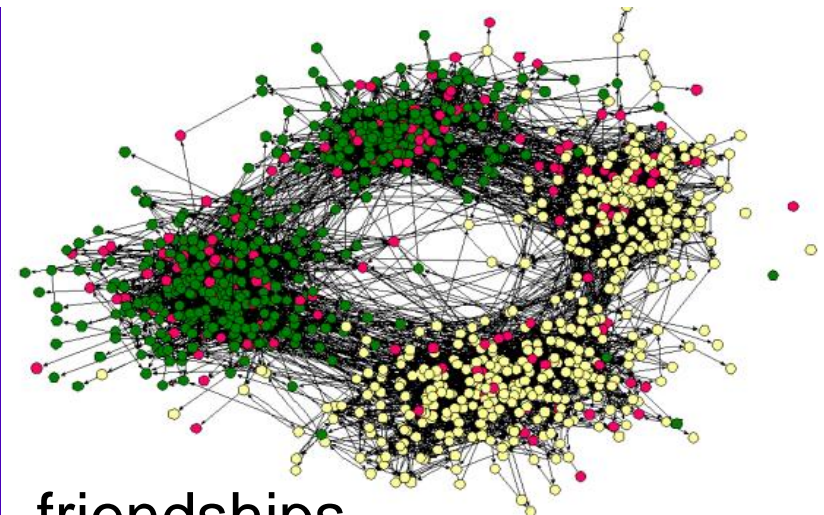
brain



power grid



internet



friendships



# Synchronization in complex networks

## ■ Synchronization and Desynchronization

### ■ Constructive role for strongly coherent fields:

- Laser system, ...

### ■ **Synchronization**

- **A. Pikovsky, et al., *Synchronization*, Cambridge, 2001**

### ■ On occasion, undesirable phenomenon:

- Parkinsonian tremor
- Swaying motion of London's Millennium Bridge

### ■ **Desynchronization**

**Tass, *Biol. Cybern.*, 89, 81 (2003)**

**Rosenblum et al., *Phys. Rev. Lett.* 92, 114102 (2004)**

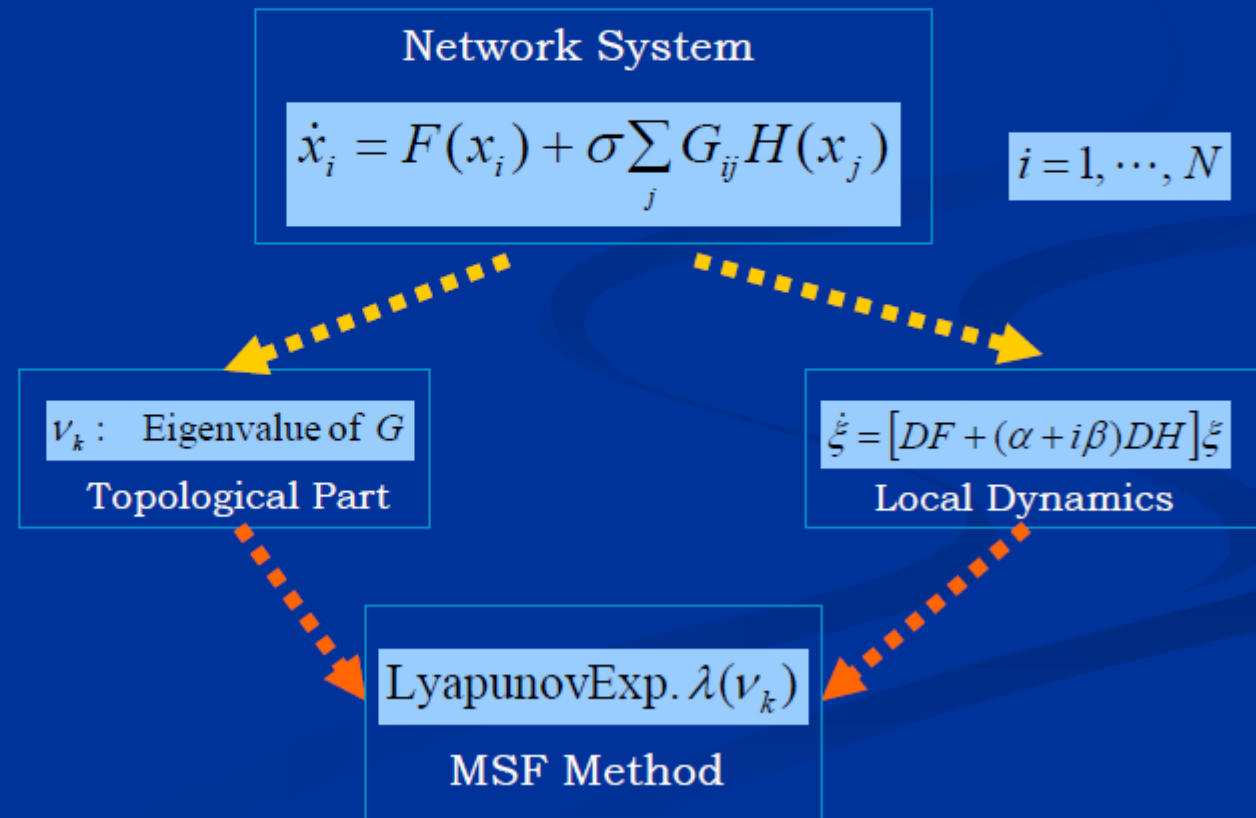
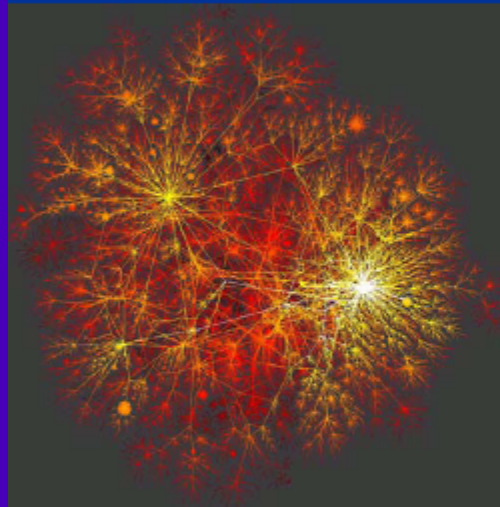
**Popovych et al., *Phys. Rev. Lett.* 94, 164102 (2005)**



# Stability of synchronous solutions

## ■ Master Stability Function (MSF)

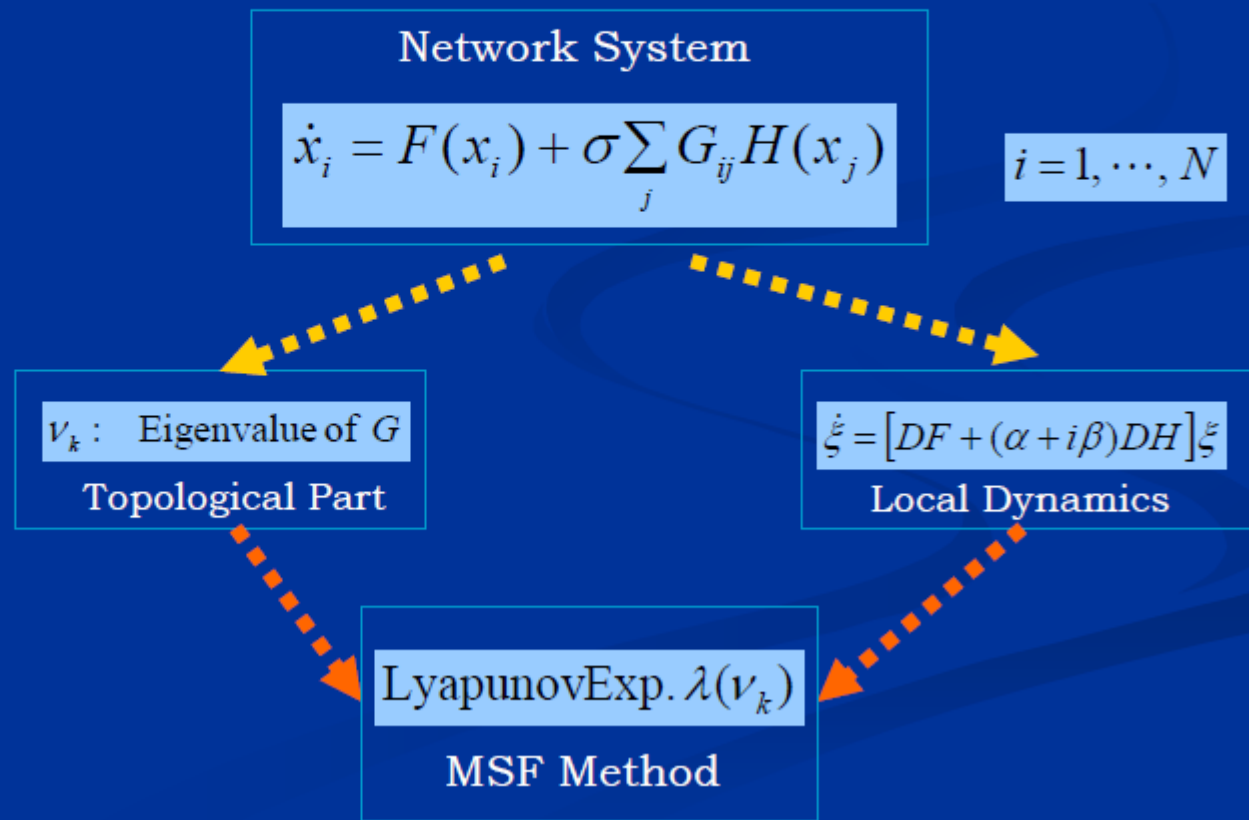
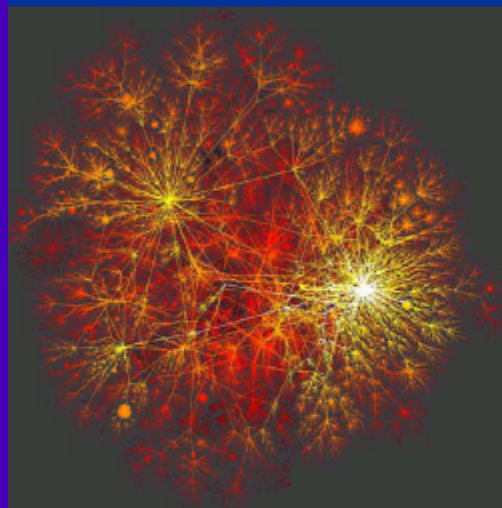
● *L. M. Pecora and T. L. Carroll: Phys. Rev. Lett. 80, 2109 (1998).*



# Stability of synchronous solutions

## ■ Master Stability Function (MSF)

● *L. M. Pecora and T. L. Carroll: Phys. Rev. Lett. 80, 2109 (1998).*



Extend to  
delayed  
coupling:

$$\dot{x}_i = \mathbf{F}(x_i(t)) + \sigma \sum_j G_{ij} \mathbf{H} [x_j(t - \tau) - x_i(t)]$$

# Synchronization in delay-coupled networks

## Synchronization and delay

Synchronization in networks:

- ▶ Synchronization of neurons in the brain:  
cognition, learning, Parkinson's, epilepsy
- ▶ Chaos synchronization of lasers  
chaos communication, encryption

Delays play a crucial role in realistic networks:

delay  $\longleftrightarrow$  synchronization

# Synchronization in delay-coupled networks

- \* M. Dhamala, V. K. Jirsa, M. Ding, PRL 92, 074104 (2004)
- \* I. Fischer, R. Vicente, J.M. Buldu, M. Peil, C. Mirasso, M. Torrent, J. Garcia-Ojalvo: PRL 97, 123902 (2006)
- \* W. Kinzel, A.Englert, G.Reents, M.Zigzag, I. Kanter, PRE 79, 056207 (2009)
- \* V. Flunkert, S.Yanchuk,T. Dahms, E.Schöll: PRL 105, 254101 (2010)

....

## Theme Issue on Delayed Complex Systems

W. Just, A. Pelster, M. Schanz, and E. Schöll (Eds.):

Phil. Trans. Royal Soc. A 368, 301 (2010)



# Synchronization in delay-coupled networks

## Master stability function (MSF)

- ▶ Network of delay-coupled elements (for simplicity use maps):

$$x_{t+1}^i = f(x_t^i) + \sum_{j=1}^N g_{ij} h(x_{t-\tau}^j) \quad (x^i \in \mathbb{R}^d)$$

$$\sigma = \sum_{j=1}^N g_{ij} \quad \text{row sum of the coupling matrix } G$$

$$\gamma_1 \dots \gamma_{N-1} \quad \text{transverse eigenvalues of } G$$

- ▶ Small perturbations  $\xi^i$  around synchronized solution:

$$x_t^i = \bar{x}_t + \xi_t^i$$

- ▶ Linearization and diagonalization of  $G$

→ variational equations

$$\xi_{t+1} = Df(\bar{x}_t) \xi_t + \sigma Dh(\bar{x}_{t-\tau}) \xi_{t-\tau},$$

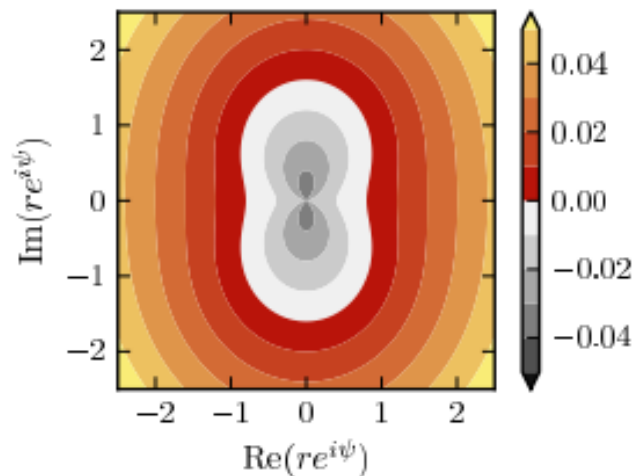
$$\xi_{t+1} = Df(\bar{x}_t) \xi_t + \gamma_n Dh(\bar{x}_{t-\tau}) \xi_{t-\tau}$$

# Synchronization in delay-coupled networks

## Master stability function (MSF) II

MSF = largest Lyapunov exponent  $\lambda_{\max}(r e^{i\psi})$  that arises from the variational equation

$$\xi_{t+1} = Df(\bar{x}_t) \xi_t + r e^{i\psi} Dh(\bar{x}_{t-\tau}) \xi_{t-\tau}$$



---

$\lambda_{\max}(\sigma) > 0$  system chaotic

$\lambda_{\max}(\sigma) < 0$  system non-chaotic

$\lambda_{\max}(\gamma_n) < 0$  synchronization stable

$\lambda_{\max}(\gamma_n) > 0$  synchronization unstable

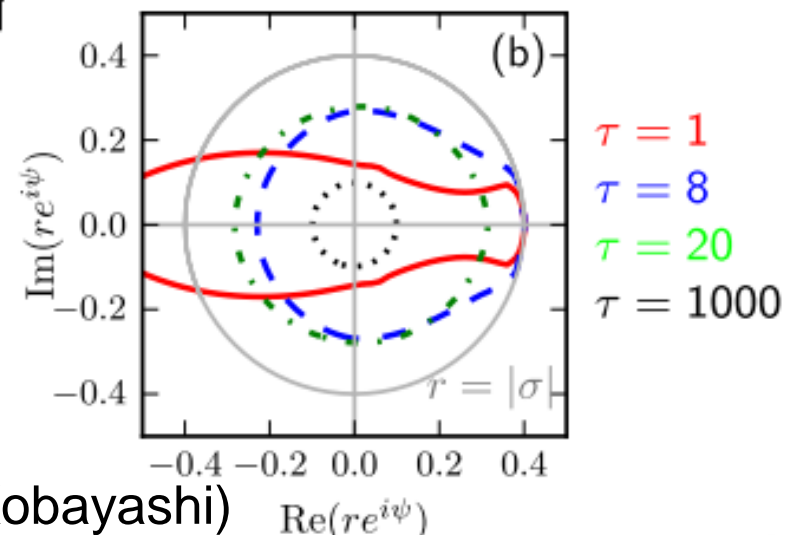
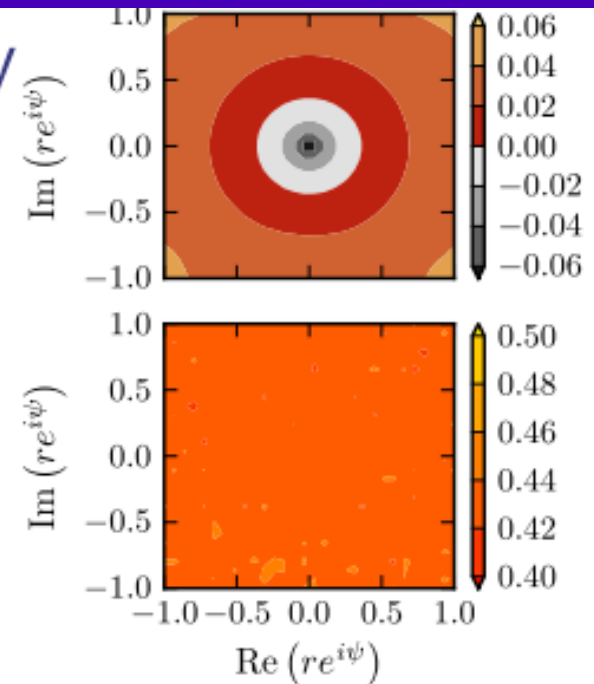
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# Synchronization in networks with large delay

Structure of the MSF for large delay

$$\lambda_{\max}(re^{i\psi})$$

- ▶ Rotationally symmetric around the origin, i.e. independent of  $\psi$
- ▶ Either negative at the origin and monotonically increasing with  $r$   
 $\rightarrow \lambda_{\max}$  changes sign at a critical radius  $r_0$
- ▶ Or positive at the origin and then constant everywhere  
[Local Lyapunov exponent]



Coupled semiconductor lasers (Lang-Kobayashi)



# Synchronization in networks with large delay

## Universal classification of networks

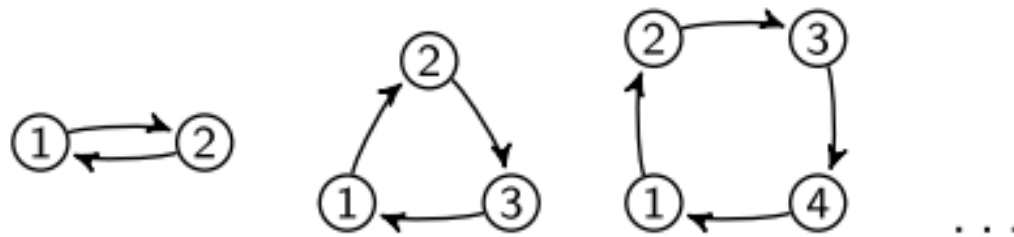
class	chaotic synchronized dynamics ( $r_0 <  \sigma $ )	non-chaotic synchronized dynamics ( $r_0 >  \sigma $ )
(A) $ \gamma_{\max}  <  \sigma $	synchr. stable iff $ \gamma_{\max}  < r_0$	synchr. stable
(B) $ \gamma_{\max}  =  \sigma $	synchr. unstable	synchr. stable
(C) $ \gamma_{\max}  >  \sigma $	synchr. unstable	synchr. stable iff $ \gamma_{\max}  < r_0$

$$\sigma = \sum_{j=1}^N g_{ij} \quad \text{row sum of the coupling matrix } G$$
$$\gamma_1 \dots \gamma_{N-1} \quad \text{transverse eigenvalues of } G$$

# Synchronization in networks with large delay

Class B and C – no chaos synchronization possible

- ▶ Rings of unidirectionally coupled elements



- ▶ Networks with zero row sum ( $\sigma = 0$ )

[W. Kinzel *et al.*, Phys. Rev. E **79**, 056207 (2009)]

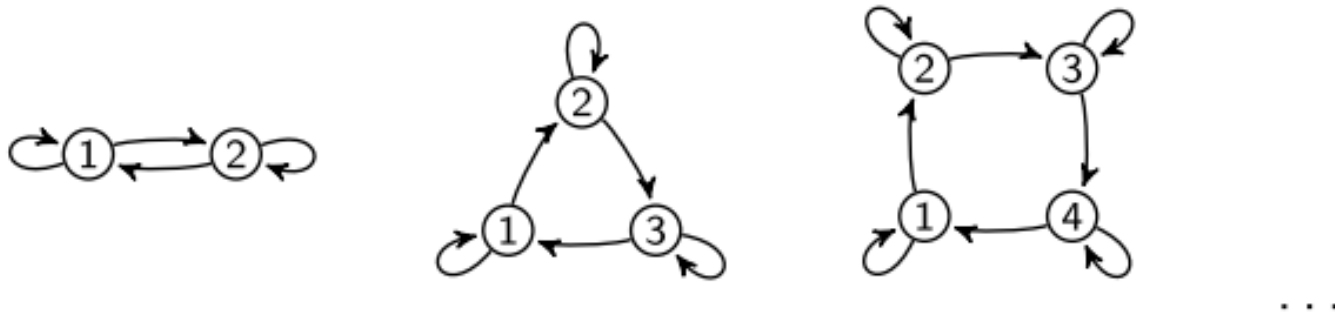
Lasers (including role of phases):

V. Flunkert, E. Schöll: *New J. Phys.* **14**, 033039 (2012)

# Synchronization in networks with large delay

Class A – chaos synchronization possible,  
non-chaotic synchronization stable

- ▶ Rings of unidirectionally coupled elements with self-feedback



- ▶ Rings with bidirectional coupling
- ▶ Mean-field coupled systems
- ▶ Networks with only inhibitory or only excitatory coupling (class A or B)

# Networks of chaotic lasers

$$\dot{\mathbf{x}}_i^{(k)} = \mathbf{F}(\mathbf{x}_i^{(k)}) + \sigma \sum_{n=1}^M \sum_{j=1}^{N_n} A_{ij}^{(kn)} \mathbf{H}^{(kn)} \mathbf{x}_j^{(n)}(t - \tau^{(kn)})$$

## The Lang-Kobayashi model for semiconductor lasers

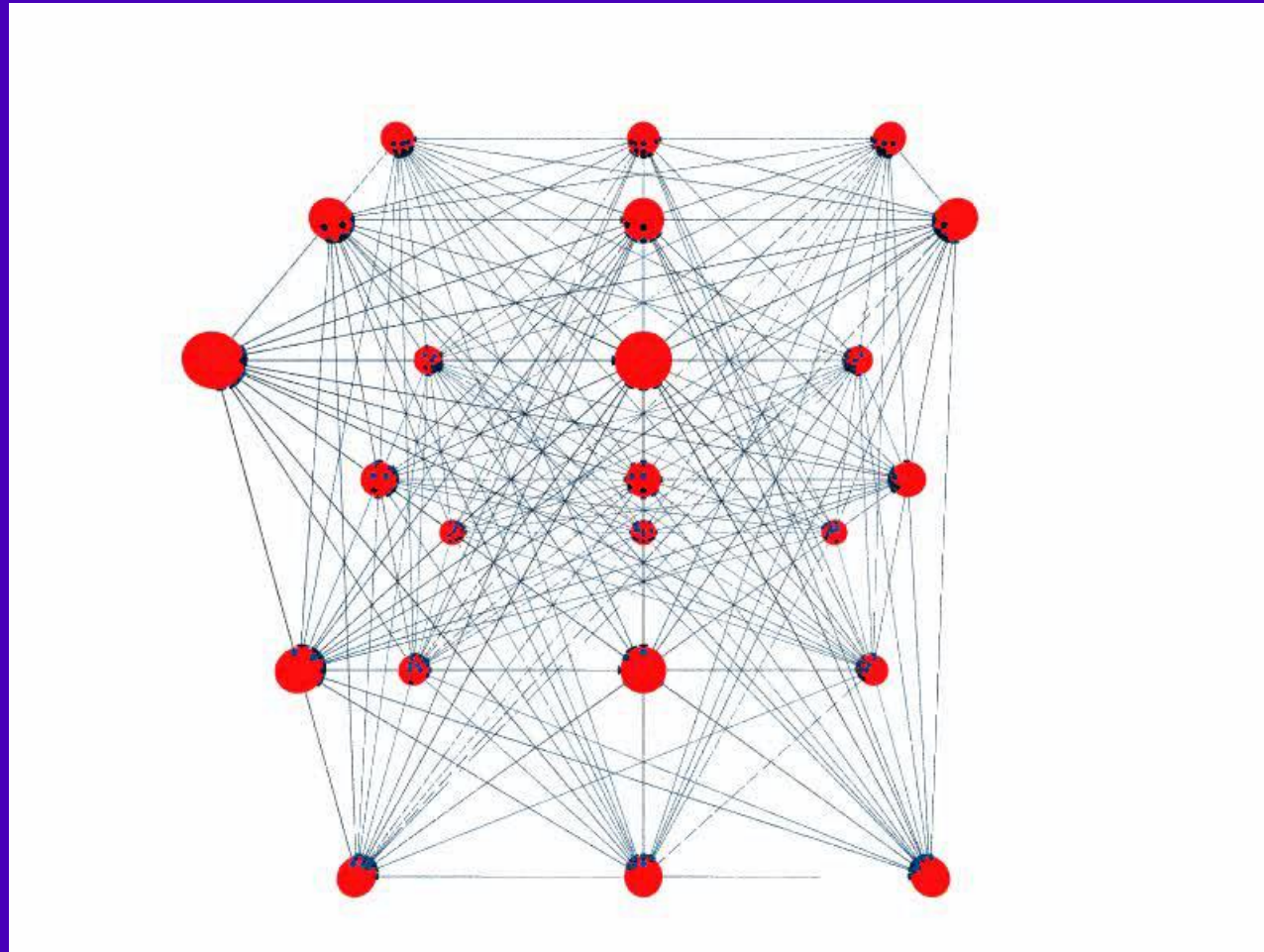
with carrier inversion  $n$ , electric field  $E = x + iy$ :  $\mathbf{x} = (n, x, y)^T$

$$\mathbf{F}(\mathbf{x}) = \begin{pmatrix} \frac{1}{T} [I - n - (1 + n)(x^2 + y^2)] \\ \frac{n}{2}(x - \alpha y) \\ \frac{n}{2}(\alpha x + y) \end{pmatrix}, \quad \mathbf{H} = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$$

## Why networks of lasers?

- ▶ Chaotic dynamics as information carrier
- ▶ Secure communication
- ▶ Lang-Kobayashi as paradigmatic model in nonlinear dynamics

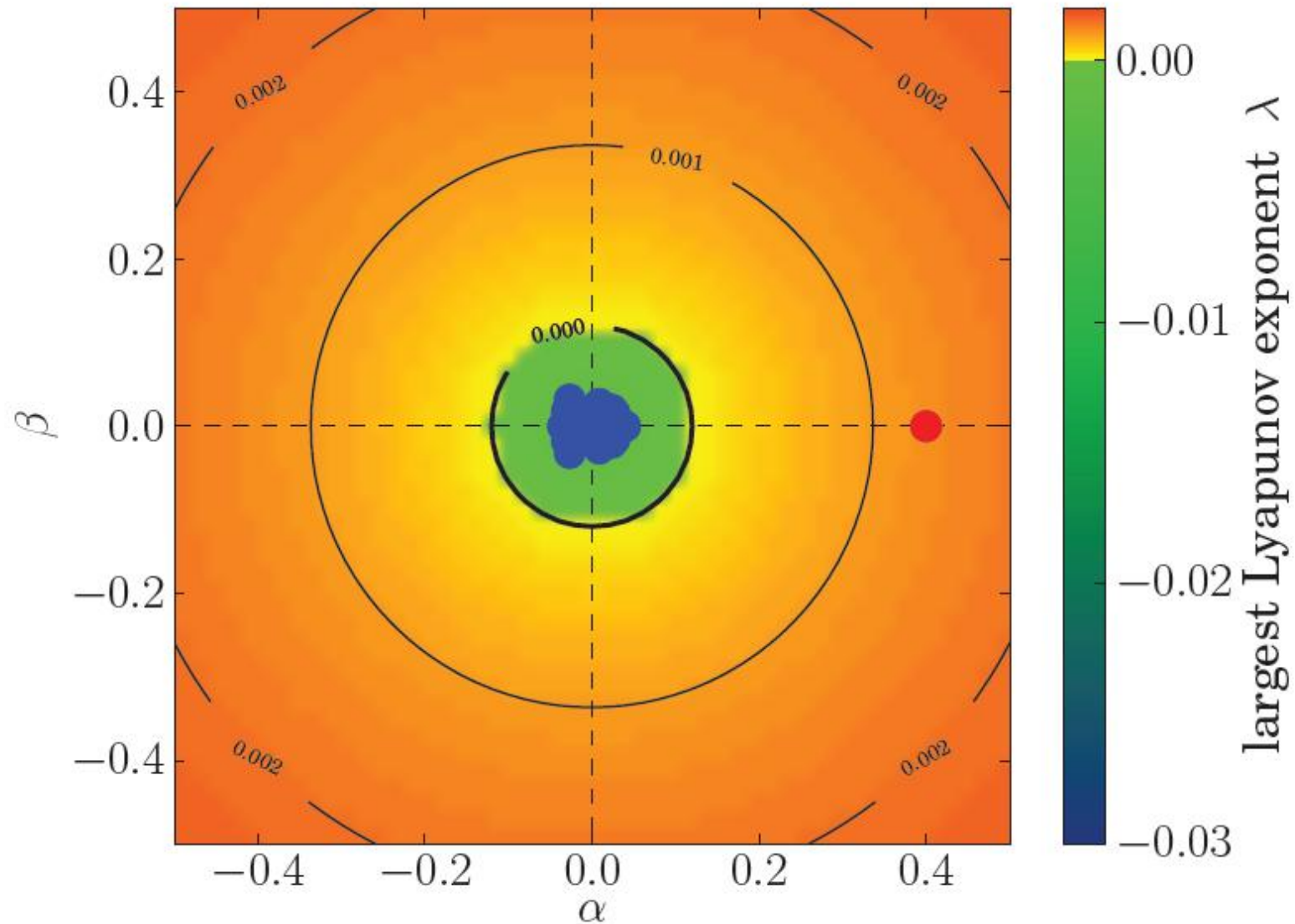
# Isochronous chaotic synchronization



**Example: isochronous synchronization in a random network,  $N = 25$  lasers,  $p = 0.8$**   $\tau = 1000$  (1 ns)

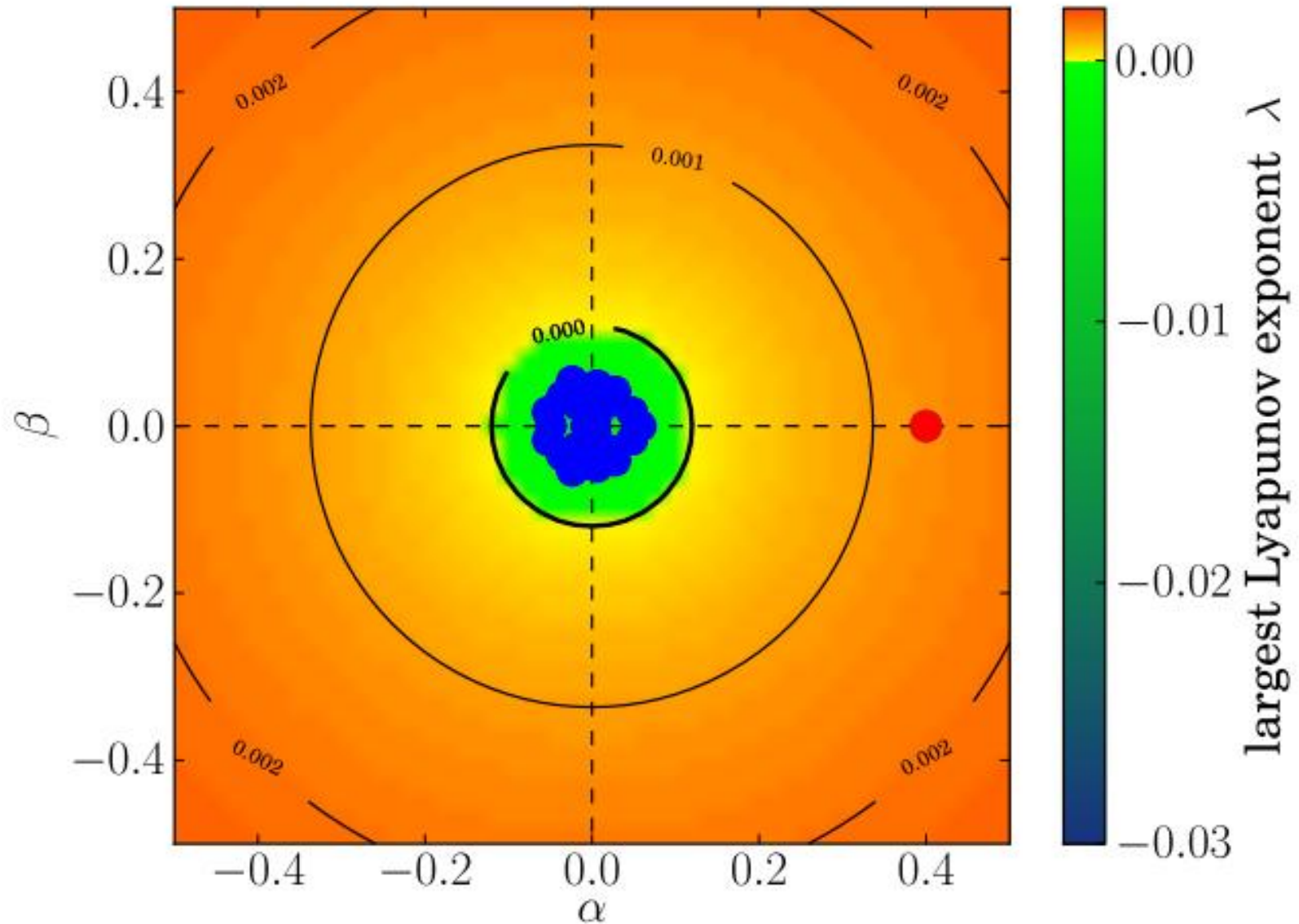
# Master stability function

Example: random network:  $p = 0.8$



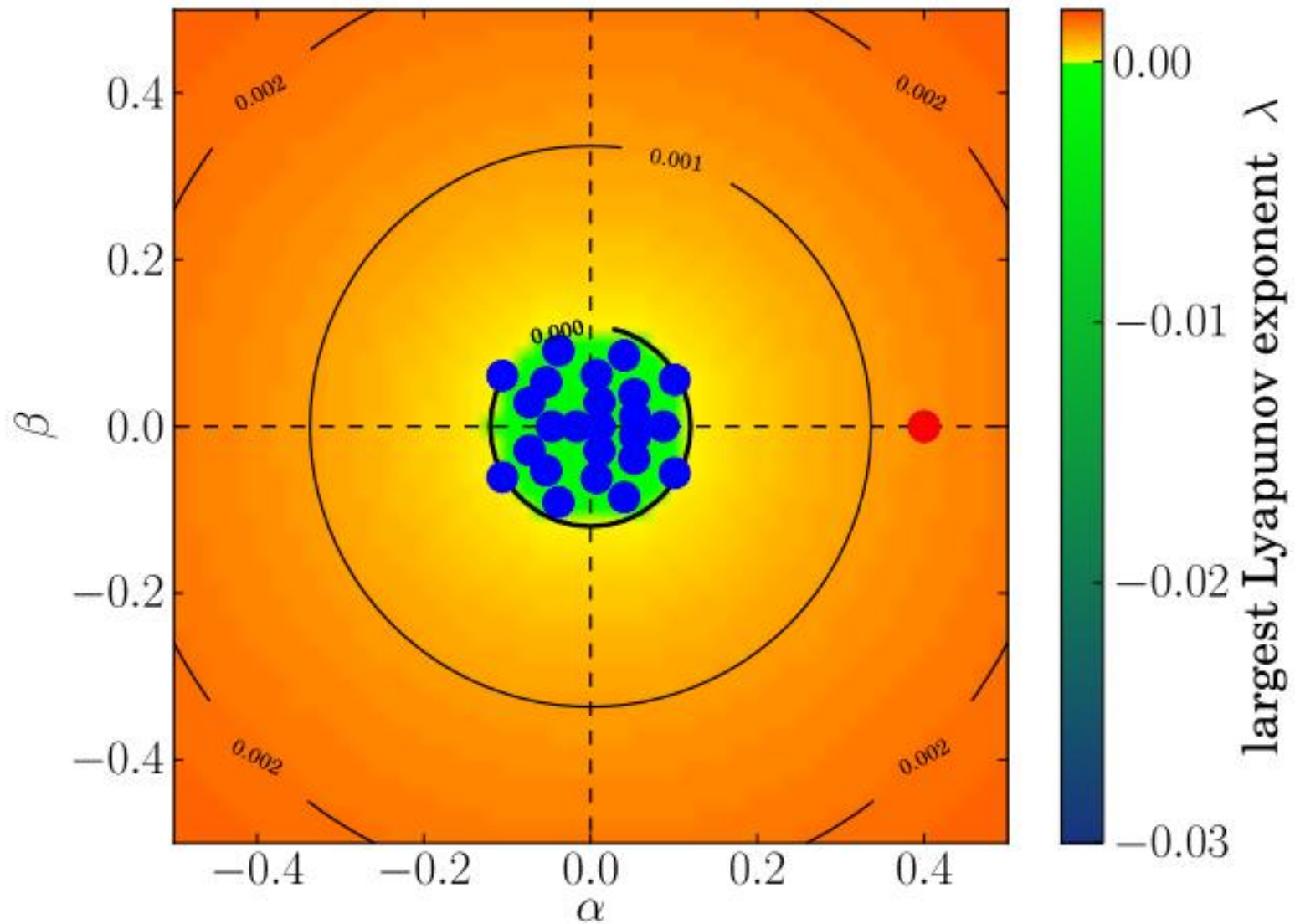
# Master stability function

Example: random network:  $p = 0.6$



# Master stability function

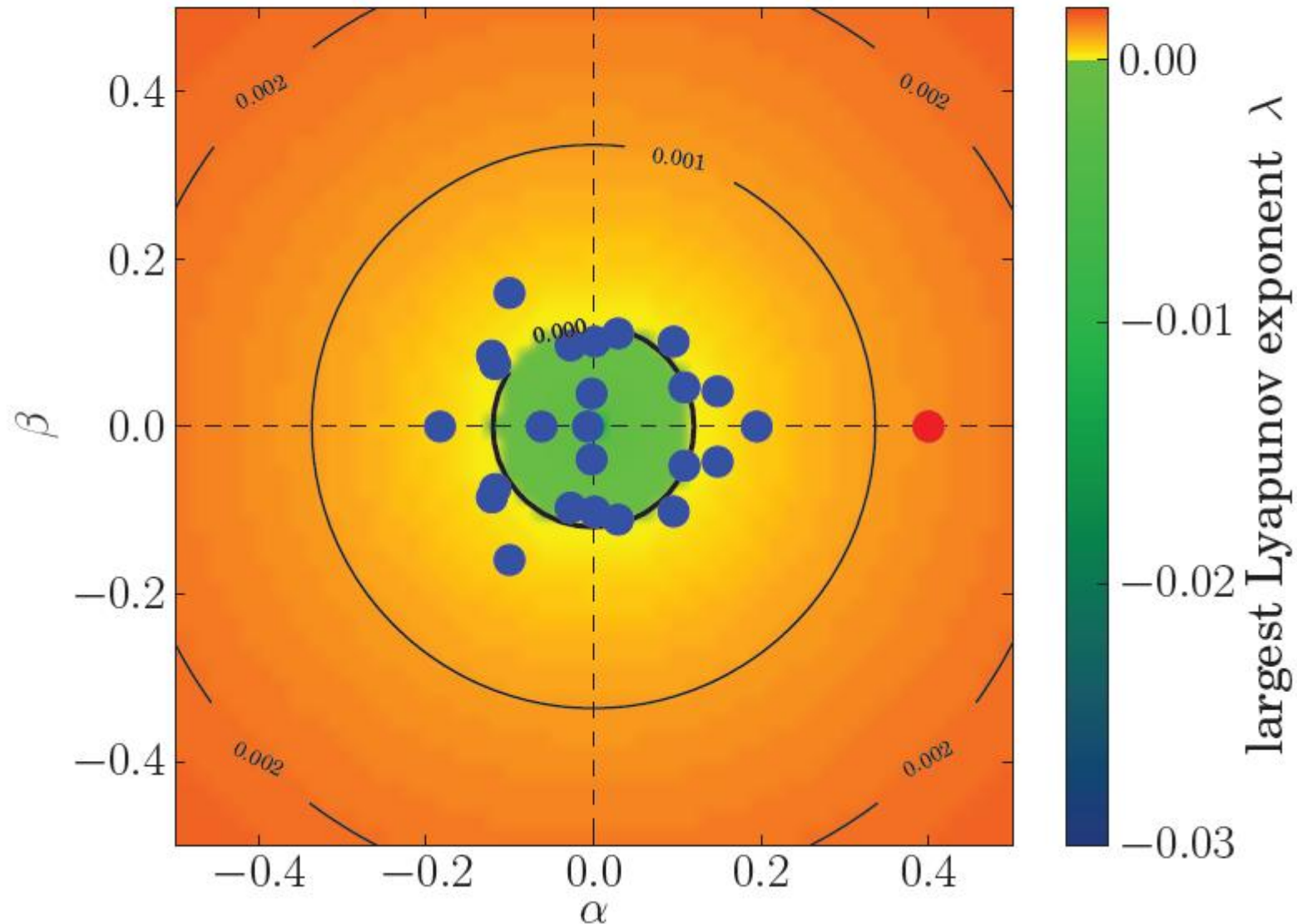
Example: random network:  $p = 0.4$



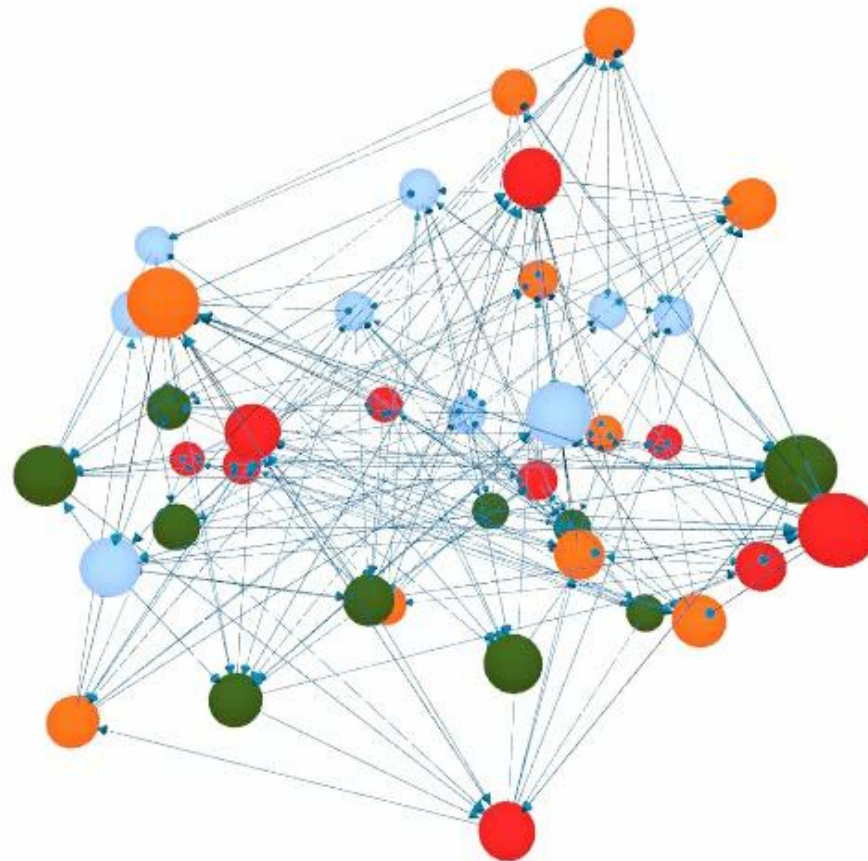


# Master stability function

Example: random network:  $p = 0.2$



# Group synchrony



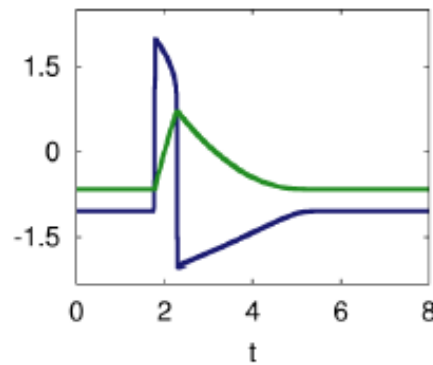
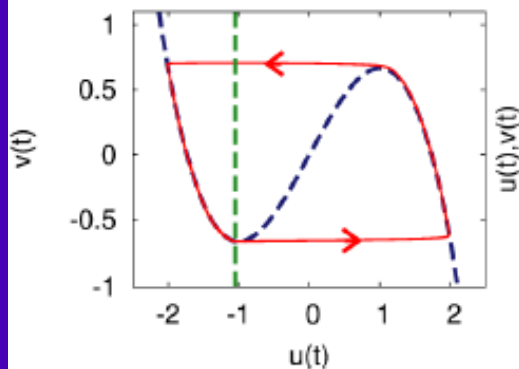
T. Dahms, J. Lehnert, E. Schöll: Phys. Rev. E 86, 016202 (2012)

# Synchronization in neural networks

## The FitzHugh-Nagumo model for neuronal activity

with activator  $u$ , inhibitor  $v$ :  $\mathbf{x} = (u, v)^T$

$$\mathbf{F}(\mathbf{x}) = \begin{pmatrix} \frac{1}{\epsilon} \left( u - \frac{u^3}{3} - v \right) \\ u + a \end{pmatrix}, \quad \mathbf{H} = \begin{pmatrix} 1/\epsilon & 0 \\ 0 & 0 \end{pmatrix}$$



excitability type-II

- ▶ operation in the excitable regime
- ▶ uncoupled neurons rest in fixed point
- ▶ network coupling induces **periodic** spiking
- ▶ time delay sets period

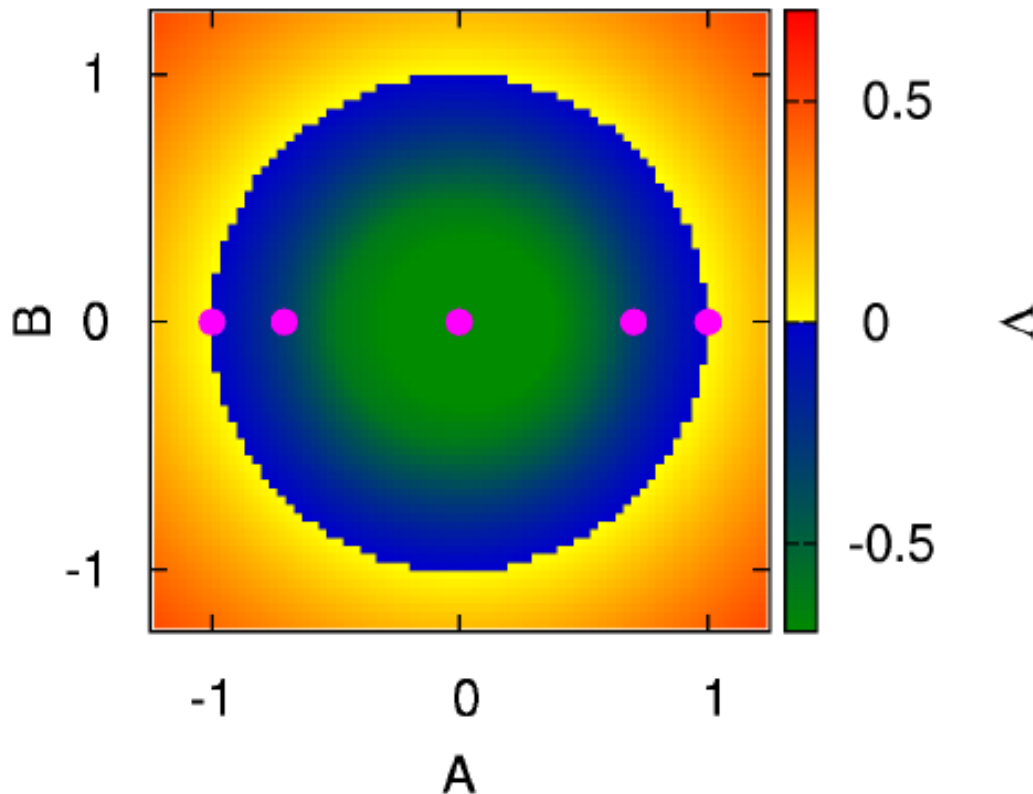
$$\dot{\mathbf{x}}_i = \mathbf{F}(\mathbf{x}_i(t)) + \sigma \sum_j G_{ij} \mathbf{H} [\mathbf{x}_j(t - \tau) - \mathbf{x}_i(t)]$$

# In-phase synchronization of FHN model

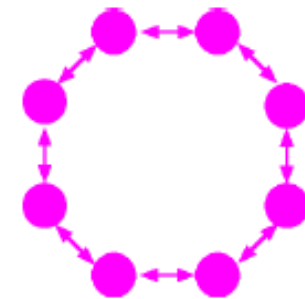
Master stability function

$$\dot{\xi} = (DF + gC)\xi + C(A + iB)H\xi\tau$$

Stability does not depend on  $\tau$  or  $C$  but exclusively on the topology!!!



real coupling  $C$

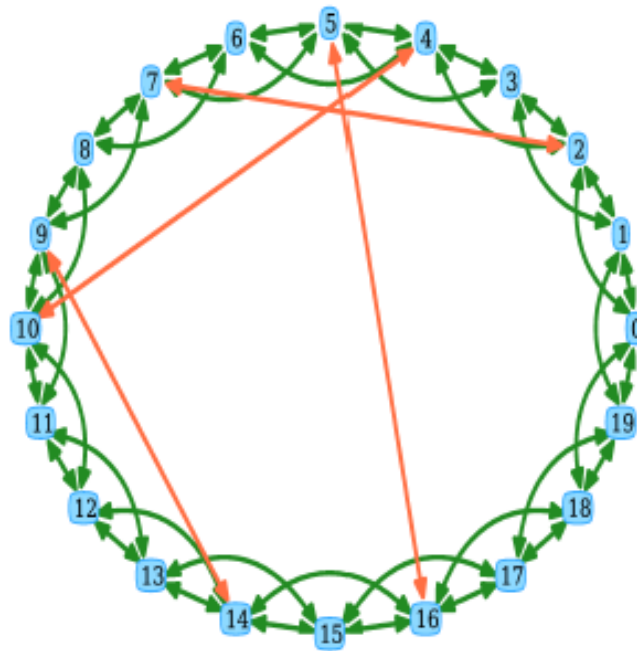


Class B: stable periodic sync

Maximum Lyapunov exponents as a continuous function of the eigenvalues (topology!)

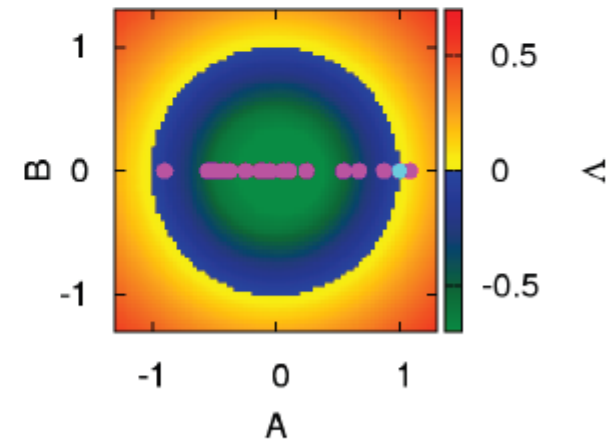
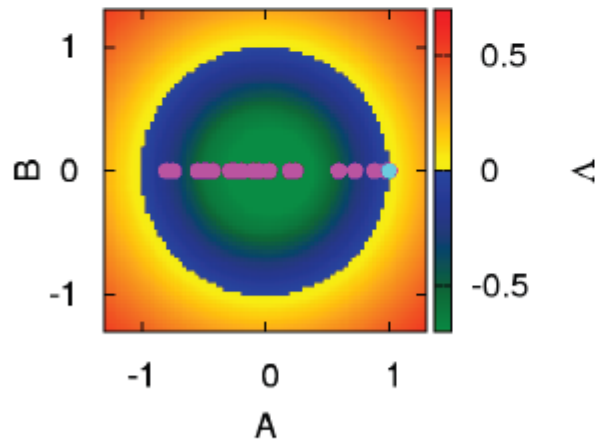
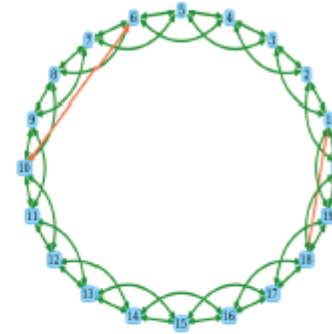
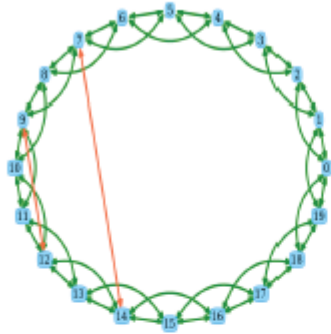
# Small-world network with inhibitory coupling

- Regular network of excitatory coupled neurons
- Add randomly for each excitatory link with probability  $p$  an inhibitory one (no rewiring!)
- Example:  $N = 20$ , next-nearest neighbors  $k = 2$ ,  $p = 0.1$



# Eigenvalue spectrum of coupling matrix

$N = 20, k = 2, p = 0.05$

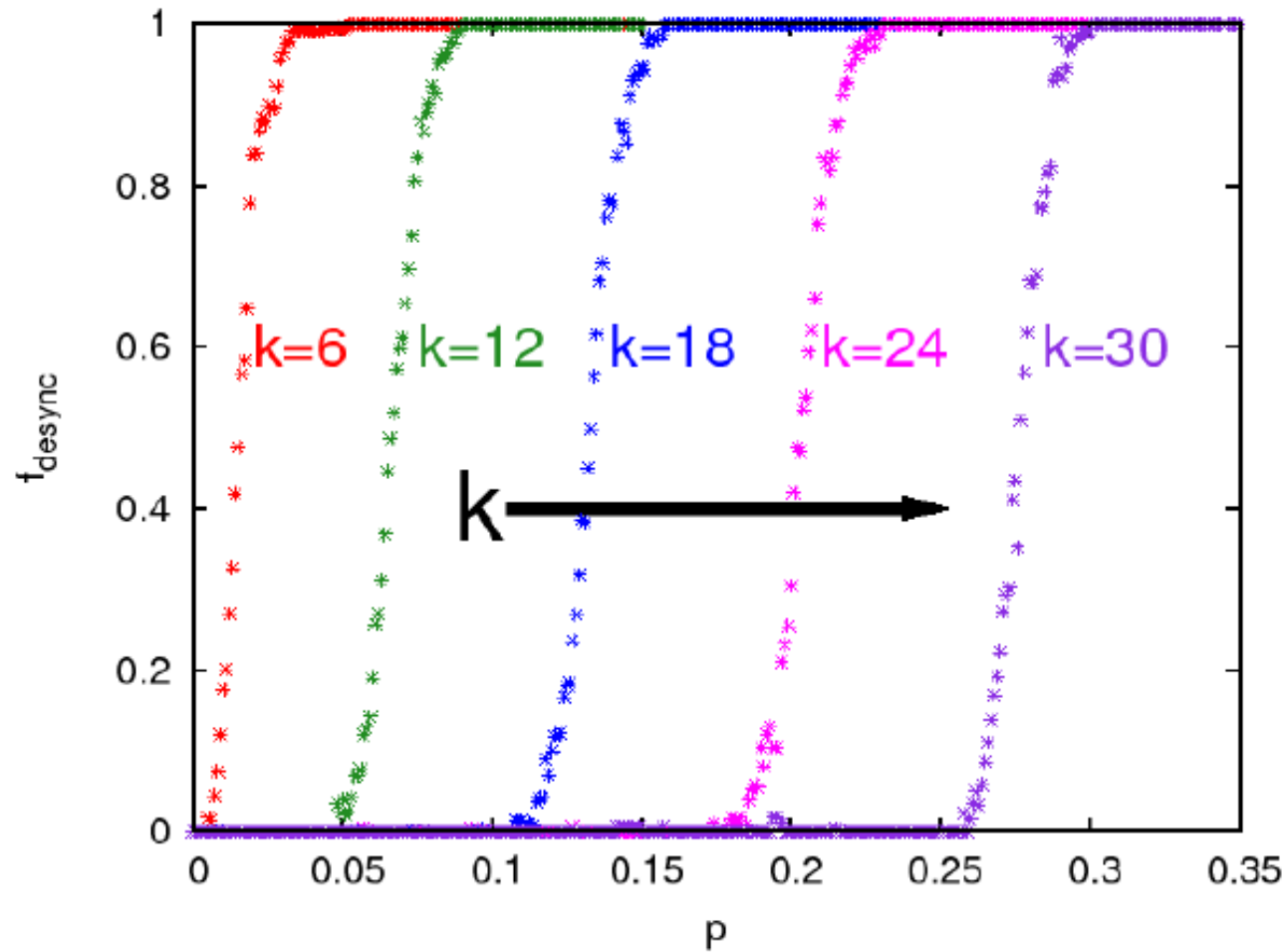


Synchronization

Desynchronization

# Desynchronization phase transition

Fraction of desynchronized networks ( $N = 100$ )

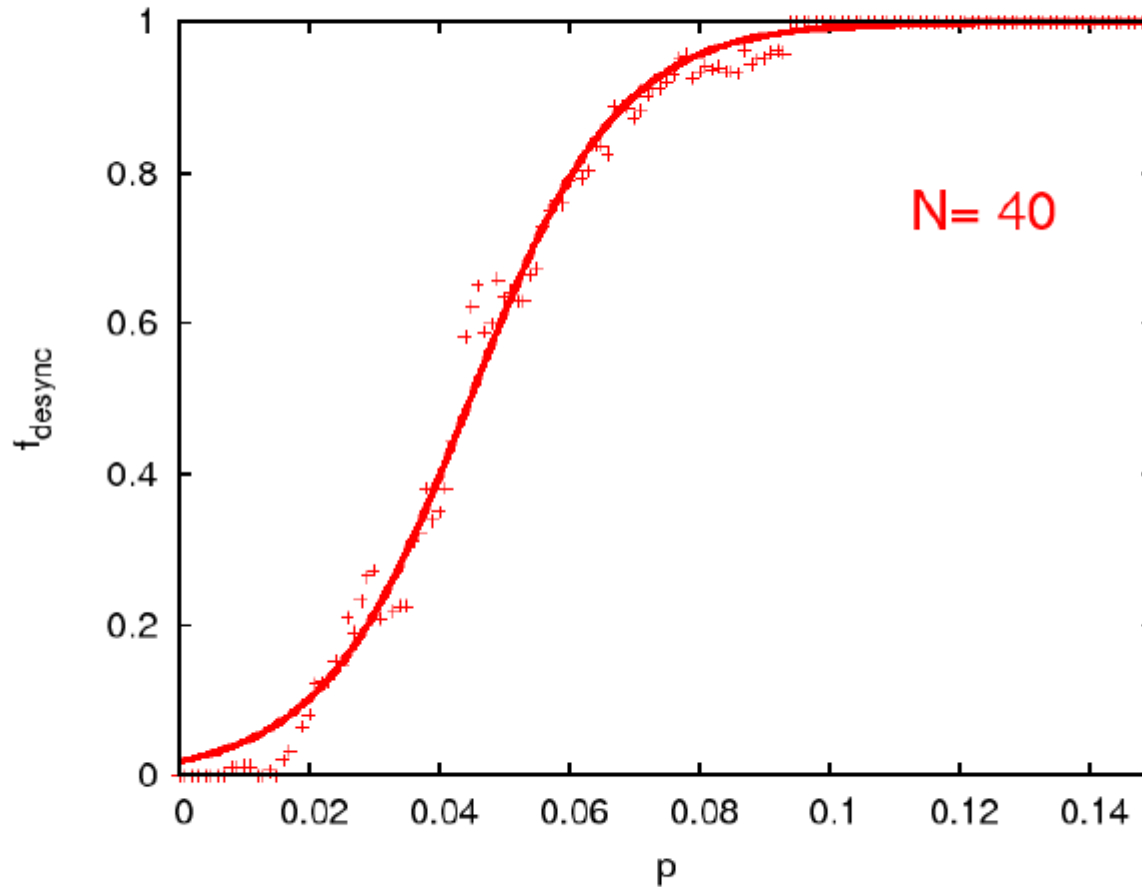


Inhibitory links introduce desynchronization

# Thermodynamic limit of phase transition

Fraction of desynchronized networks:

$$N/k = 10$$

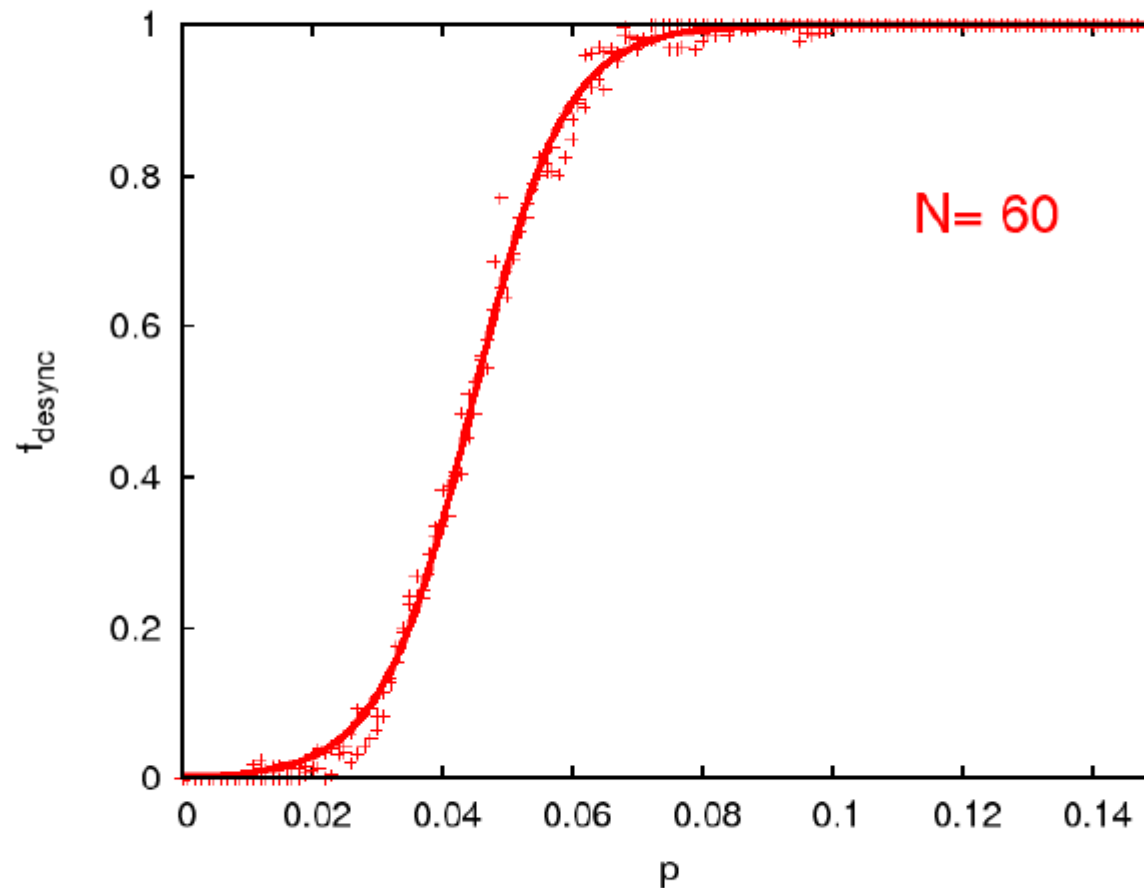




# Thermodynamic limit of phase transition

Fraction of desynchronized networks:

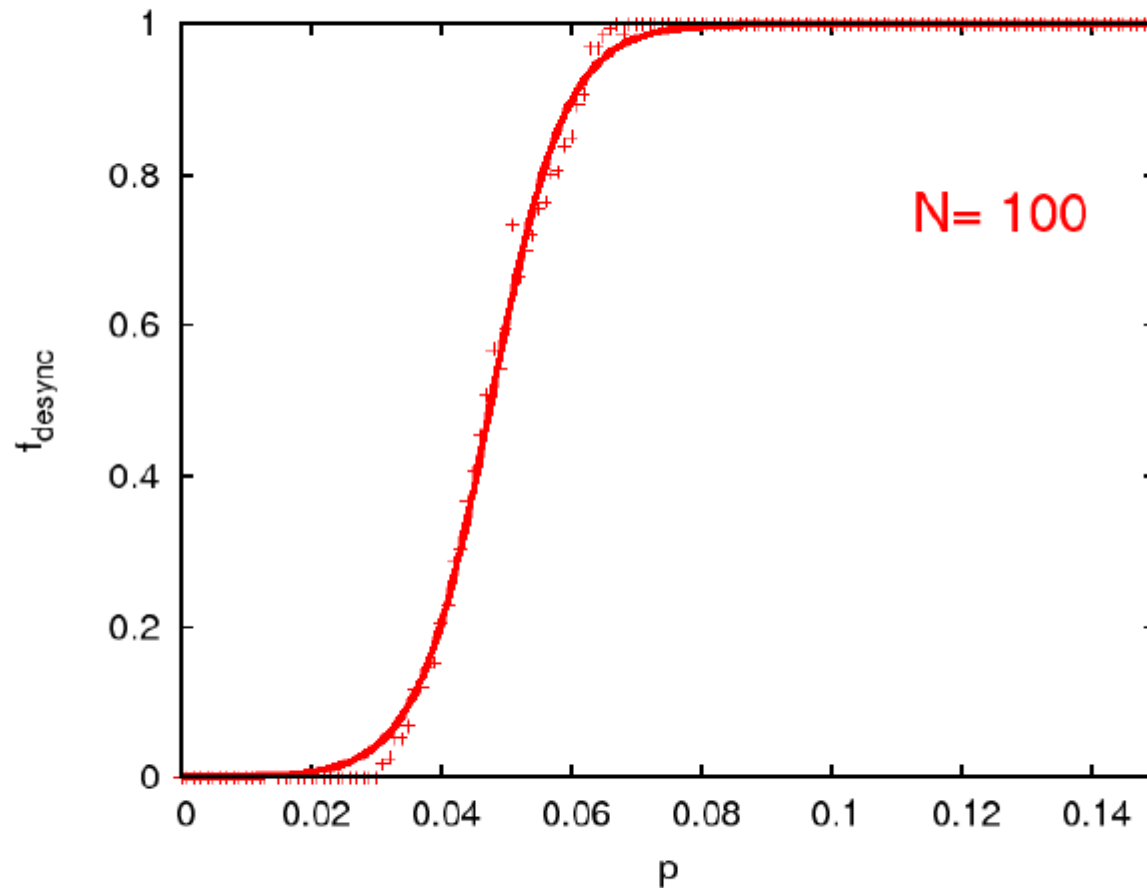
$$N/k = 10$$



# Thermodynamic limit of phase transition

Fraction of desynchronized networks:

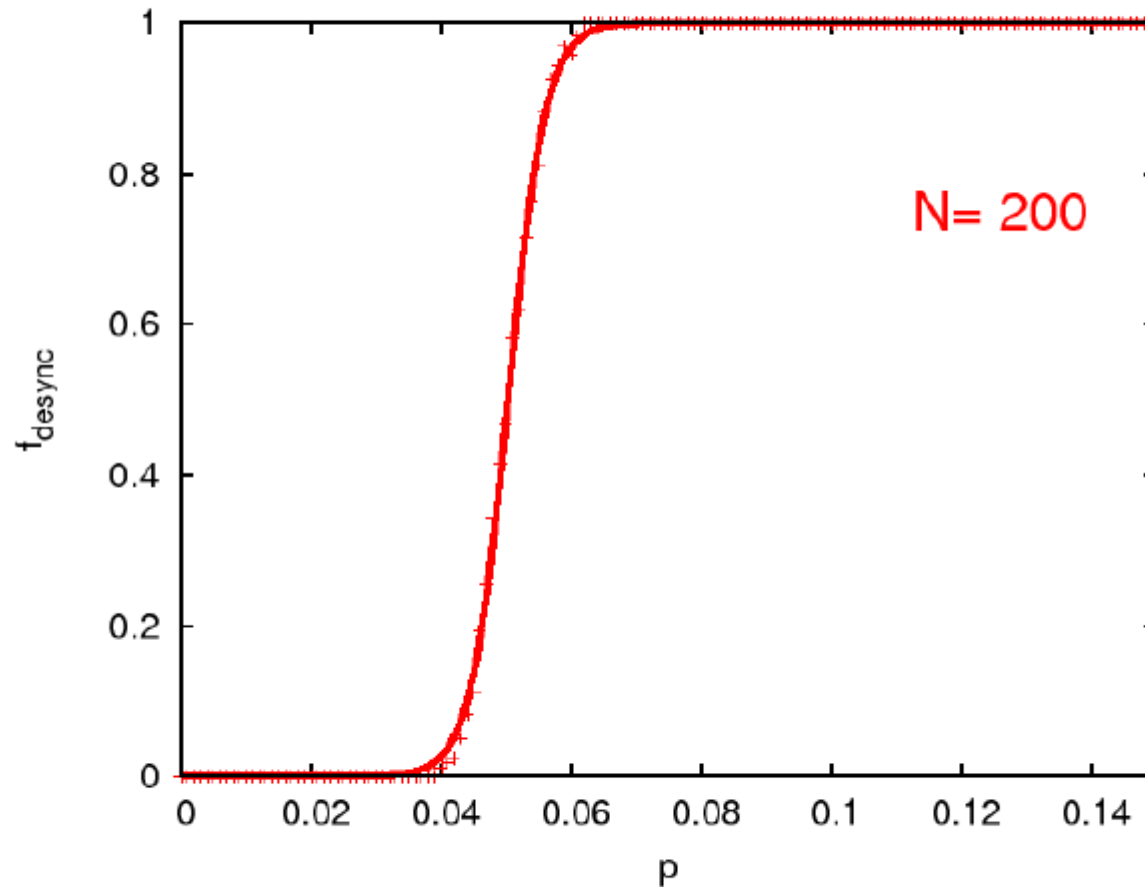
$$N/k = 10$$



# Thermodynamic limit of phase transition

Fraction of desynchronized networks:

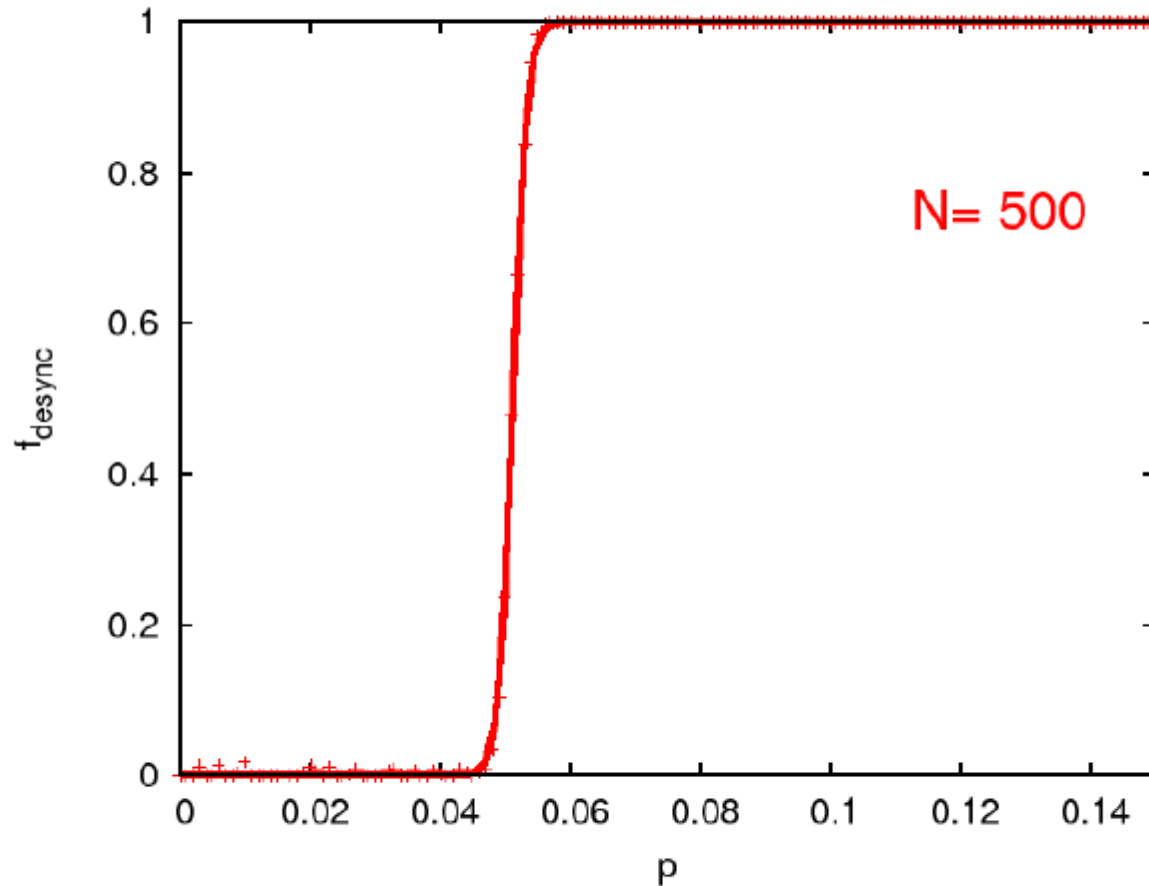
$$N/k = 10$$



# Thermodynamic limit of phase transition

Fraction of desynchronized networks:

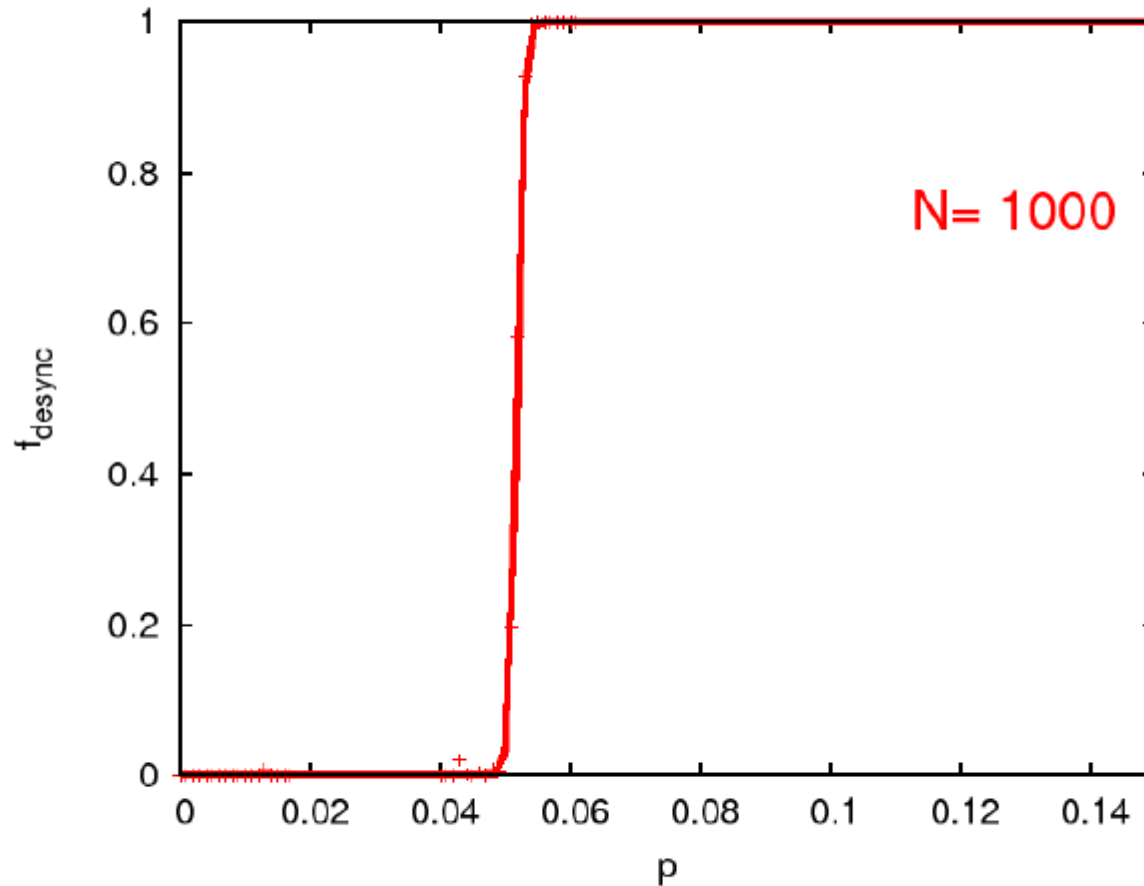
$$N/k = 10$$



# Thermodynamic limit of phase transition

Fraction of desynchronized networks:

$$N/k = 10$$



# Excitability type-I: SNIPER or SNIC (saddle-node infinite period bifurcation)

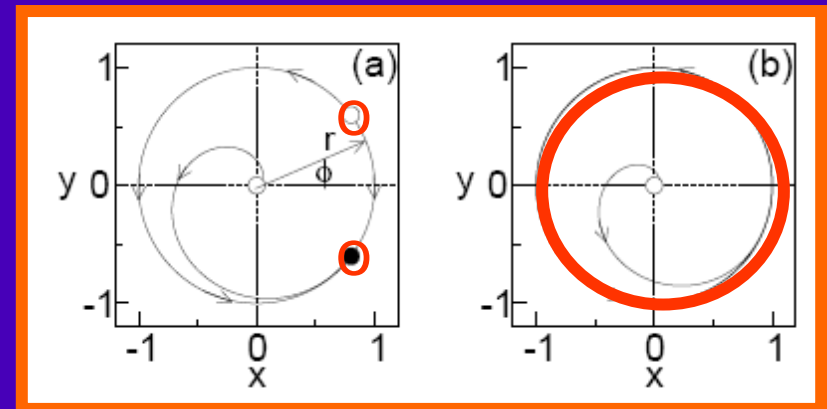
Global bifurcation of limit cycle for  $b=1$  (SNIPER)  
frequency of limit cycle scales as  $f \sim (b-1)^{1/2}$

$$\begin{aligned}\dot{x} &= x(1 - x^2 - y^2) + y(x - b) \\ \dot{y} &= y(1 - x^2 - y^2) - x(x - b)\end{aligned}$$

$$\begin{aligned}\dot{r} &= r(1 - r^2) \\ \dot{\varphi} &= b - r \cos \varphi\end{aligned}$$

$b < 1$

$b > 1$



Gang Hu, Ditzinger, Ning, Haken, PRL 71, 807 (1993)

**Excitable system exhibiting coherence resonance for  $b < 1$**   
(similar: Hindmarsh-Rose model for neurons)

# Coherence Resonance

Gang Hu, Ditzinger, Ning, Haken, PRL 71, 807 (1993)  
Pikovsky, Kurths, PRL 78, 775 (1997)

## PHYSICAL REVIEW LETTERS

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NUMBER 6

### Stochastic Resonance without External Periodic Force

Hu Gang

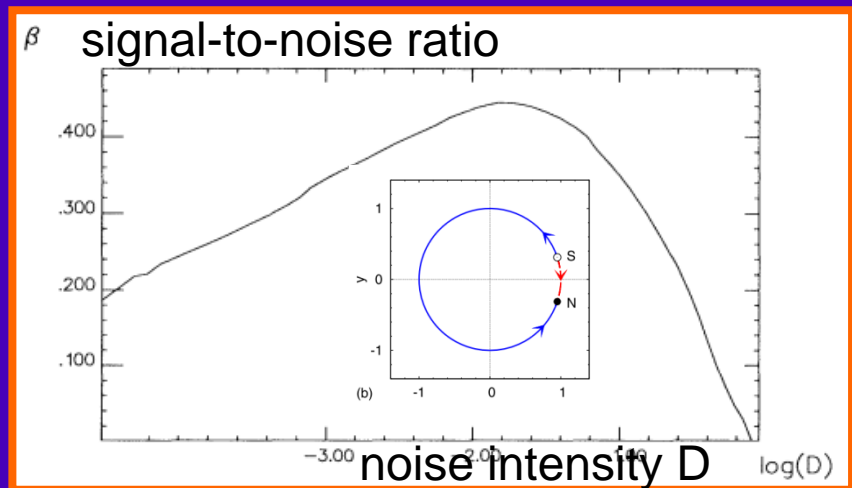
*International Centre for Theoretical Physics, Trieste 34100, Italy  
and Physics Department, Beijing Normal University, Beijing 100875, People's Republic of China*

T. Ditzinger,\* C. Z. Ning, and H. Haken

*Institut für Theoretische Physik und Synergetik, Universität Stuttgart, Pfaffenwaldring 57/IV,  
D-7000 Stuttgart 80, Federal Republic of Germany*

$$\begin{aligned}\dot{x} &= x(1 - x^2 - y^2) + y(x - b) + D\xi \\ \dot{y} &= y(1 - x^2 - y^2) - x(x - b) + D\xi\end{aligned}$$

Optimal coherence at finite noise  $D$

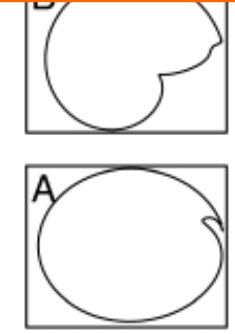
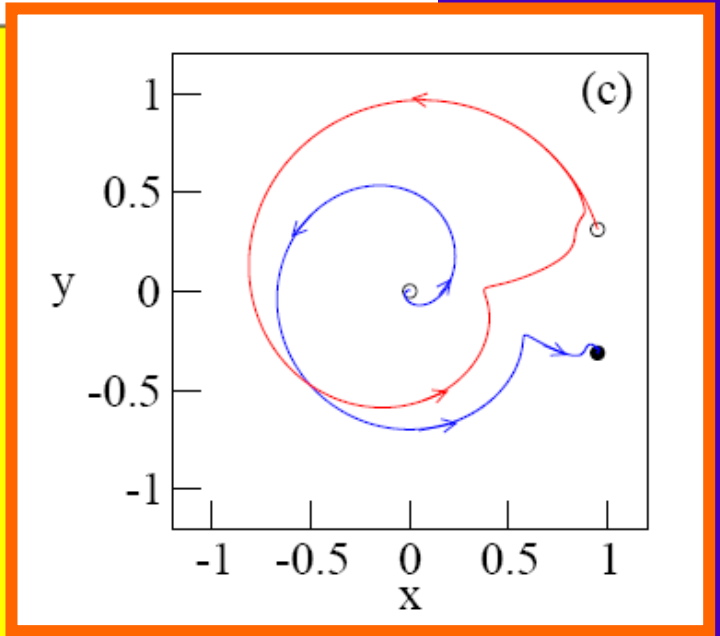
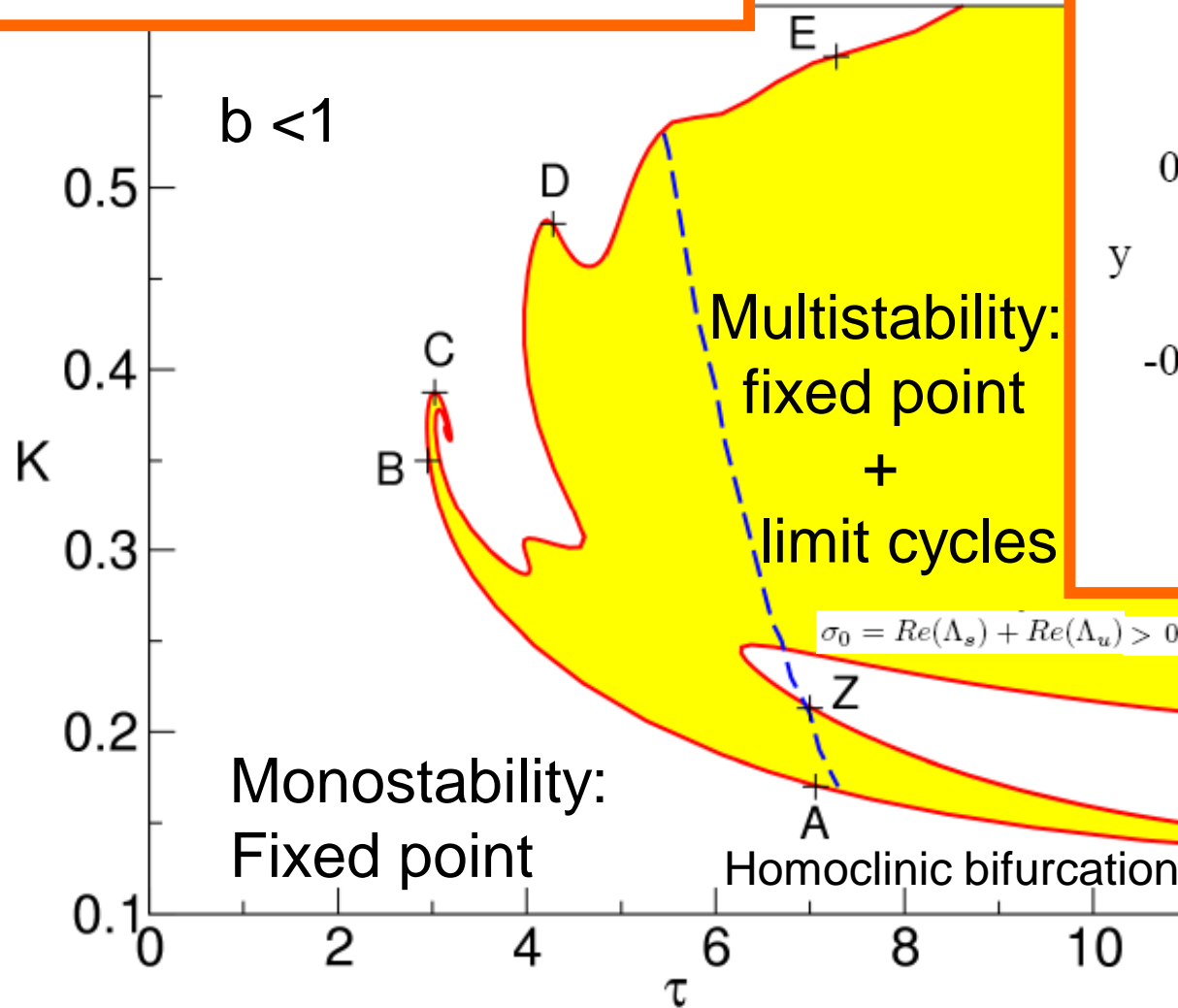


# Delay-induced multistability near SNIPER

$$\dot{x} = x(1 - x^2 - y^2) + y(x - b) - K(x - x_\tau)$$

$$\dot{y} = y(1 - x^2 - y^2) - x(x - b) - K(y - y_\tau)$$

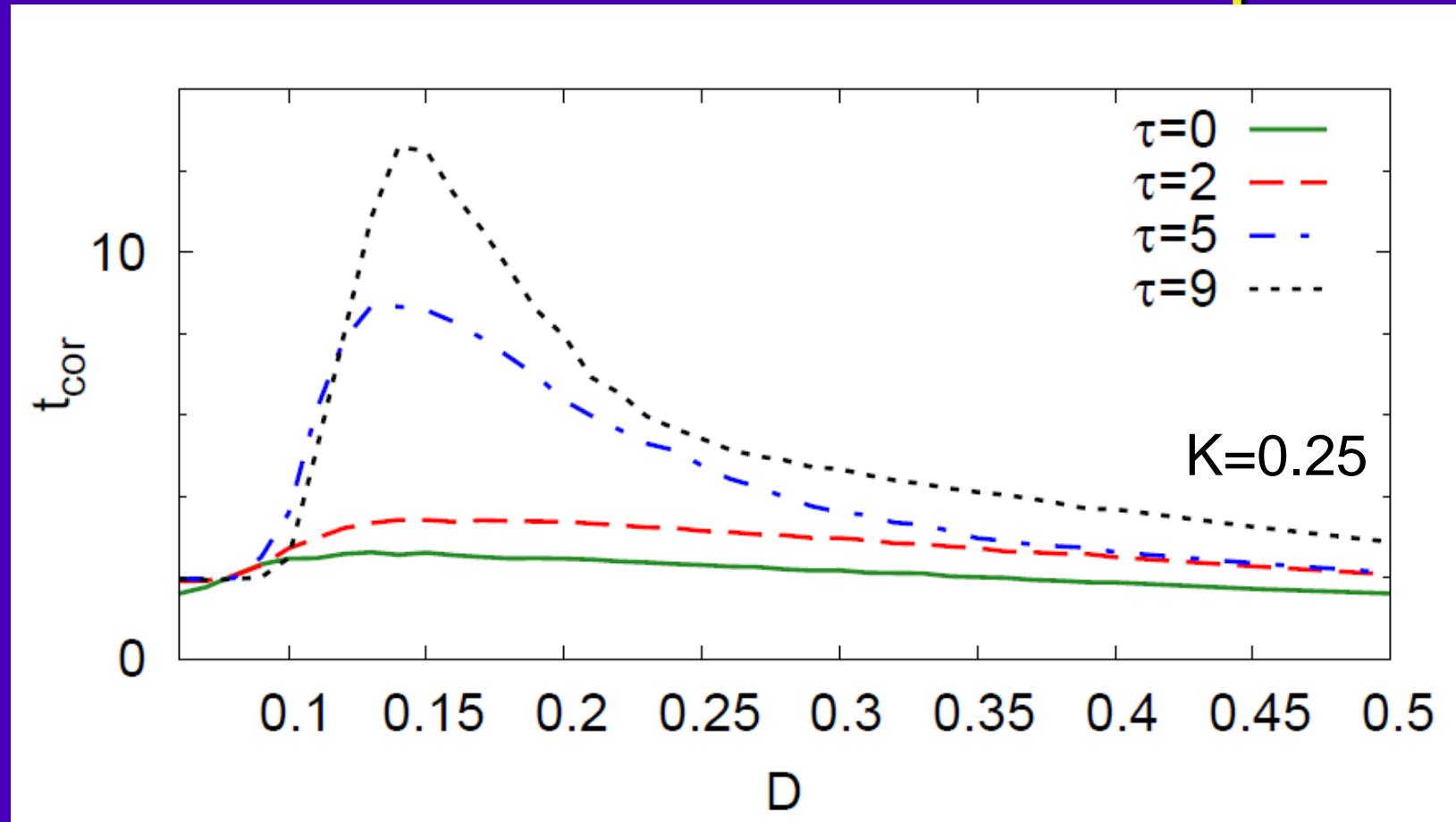
$K=0$ : Global bifurcation (SNIPER)



Homoclinic orbits:  
Shilnikov Theory



# Delayed feedback control of coherence resonance: enhancement for optimal $\tau$



$$\begin{aligned}\dot{x} &= x(1 - x^2 - y^2) + y(x - b) + D\xi + K(x_\tau - x) \\ \dot{y} &= y(1 - x^2 - y^2) - x(x - b) + D\xi + K(y_\tau - y)\end{aligned}$$

R. Aust, P. Hövel, J. Hizanidis, and E. Schöll: EPJ-ST 187, 77 (2010)

Many other examples: lasers, neural systems, semiconductor nanostructures  
(Handbook of Chaos Control (Eds. E. Schöll, H.G. Schuster), Wiley 2008)

# Networks of type-I excitable systems

$$\dot{\mathbf{x}}_i = \mathbf{f}(\mathbf{x}_i) + \sigma \sum_{j=1}^N G_{ij} \mathbf{H}(\mathbf{x}_j(t - \tau) - \mathbf{x}_i(t))$$

$$\sum_j G_{ij} = 1$$

Synchronous dynamics:

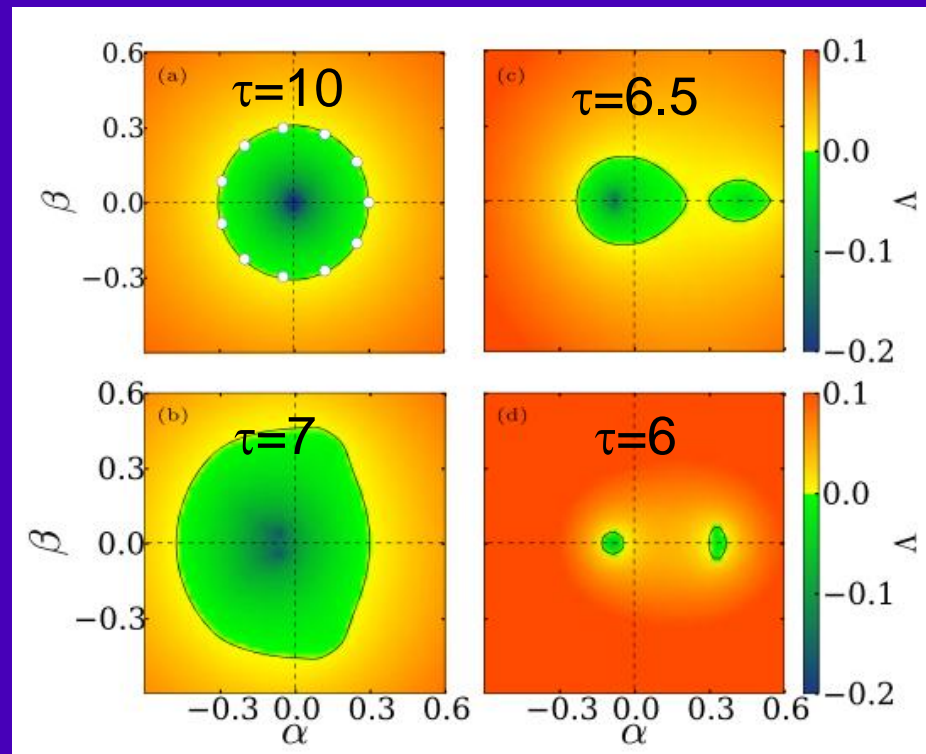
$$\dot{\mathbf{x}}_s = \mathbf{f}(\mathbf{x}_s) + \sigma \mathbf{H}(\mathbf{x}_s(t - \tau) - \mathbf{x}_s(t))$$



Master stability function  $\Lambda$ :  
Stability of zero-lag sync

$$\delta \dot{\mathbf{x}}(t) = [D\mathbf{f}(\mathbf{x}_s) - \sigma \mathbf{H}] \delta \mathbf{x}(t) + (\alpha + i\beta) \mathbf{H} \delta \mathbf{x}(t - \tau)$$

unidirectional ring:  
Stable delay-induced  
periodic sync at  $\tau=10$   
for excitatory coupling

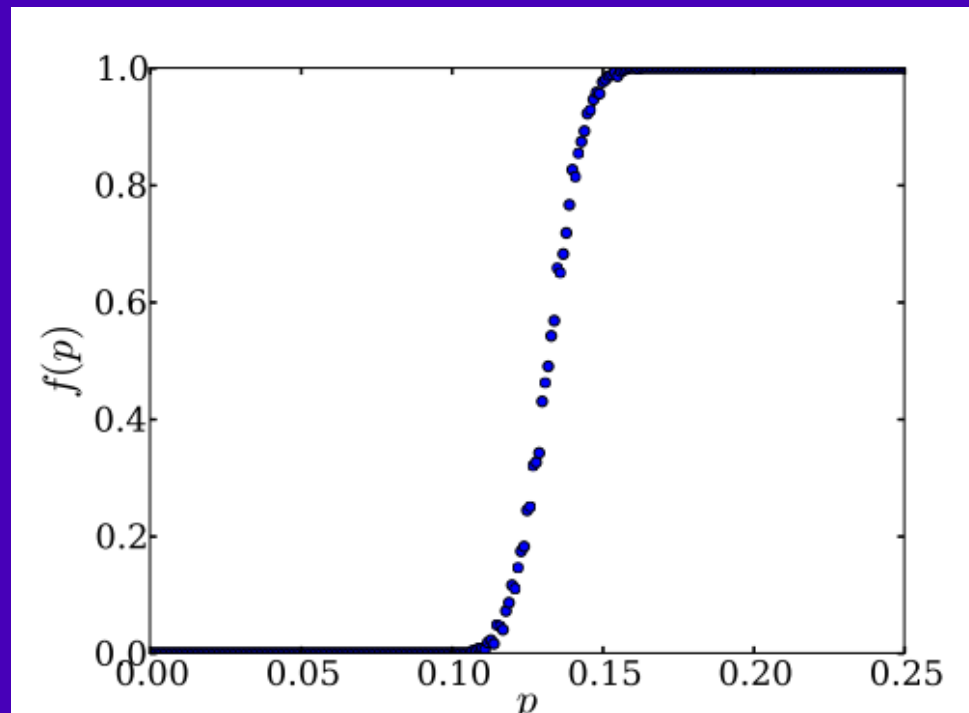


$$\sigma = 0.3$$

# Desynchronization by inhibitory couplings

Start with regular ring with **excitatory** coupling ( $k$  nearest neighbors)

Introducing long-range **inhibitory links** in a small-world like fashion with probability  $p$  can lead to desynchronization



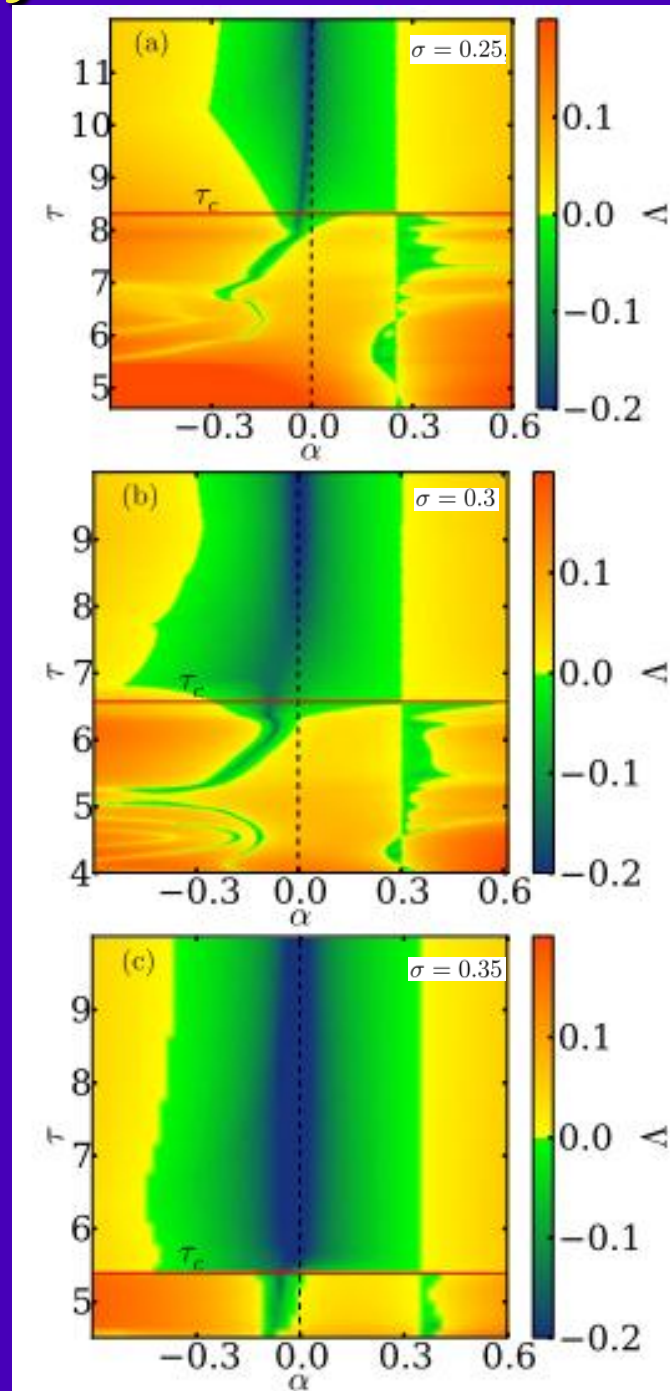
$N = 100$  and  $k = 24$  for  $\sigma = 0.3$ ,  $\tau = 10$ ,  $b = 0.95$ .

# Small delay: Master stability function

Behavior different  
from FHN:

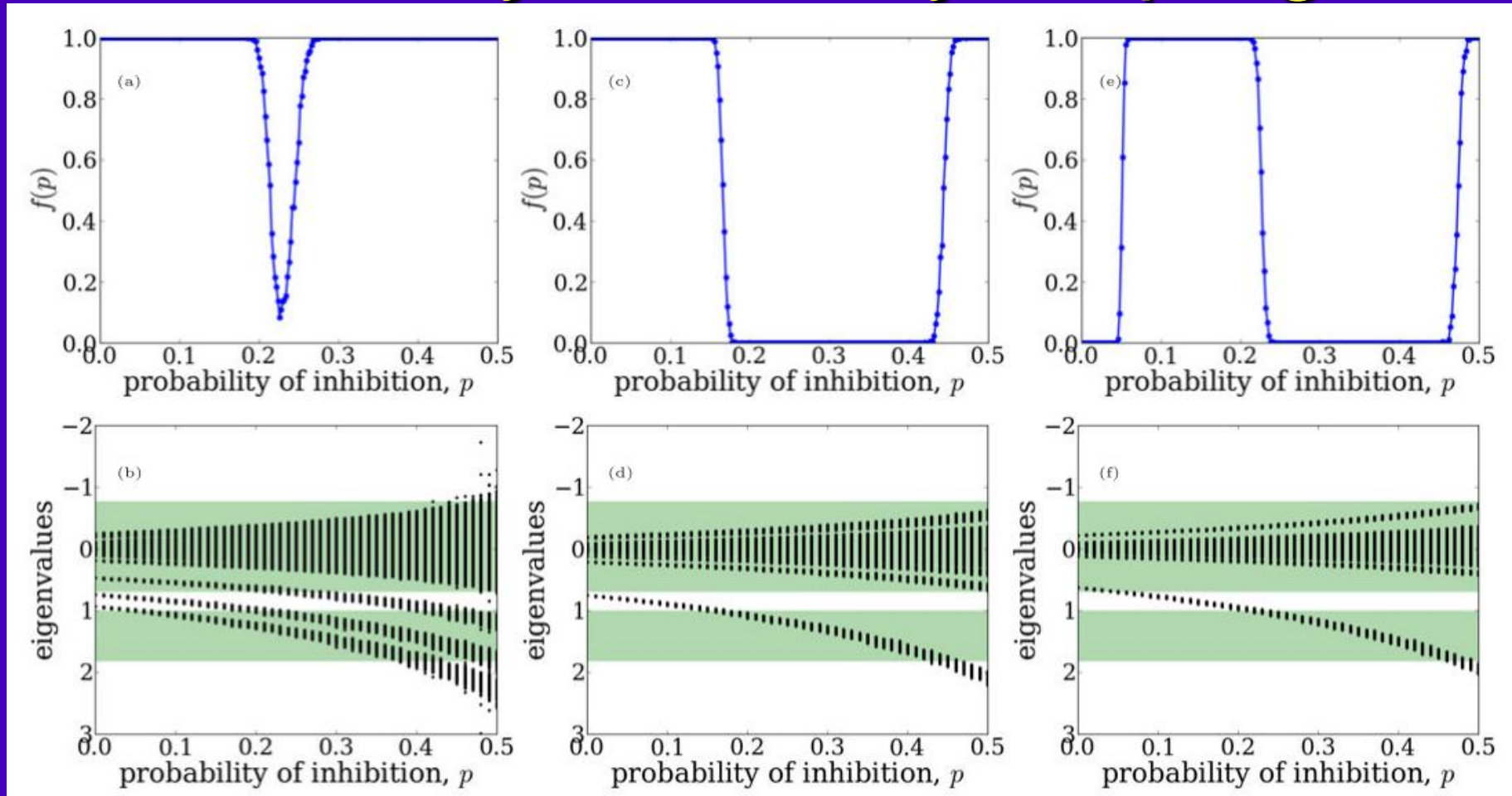
rotational symmetry  
breaks down

disconnected  
stability islands



$(\beta = 0)$

# Control of synchronization by balance of excitatory / inhibitory coupling



(a)  $k = 20$ , (c)  $k = 40$ , and (e)  $k = 50$

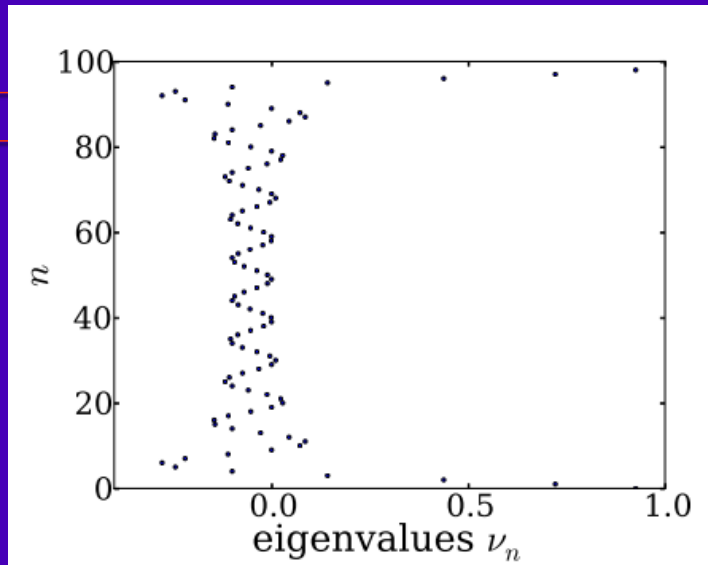
500 realisations of networks of  $N = 200$

$\sigma = 0.3$  and  $\tau = 6.5$ .

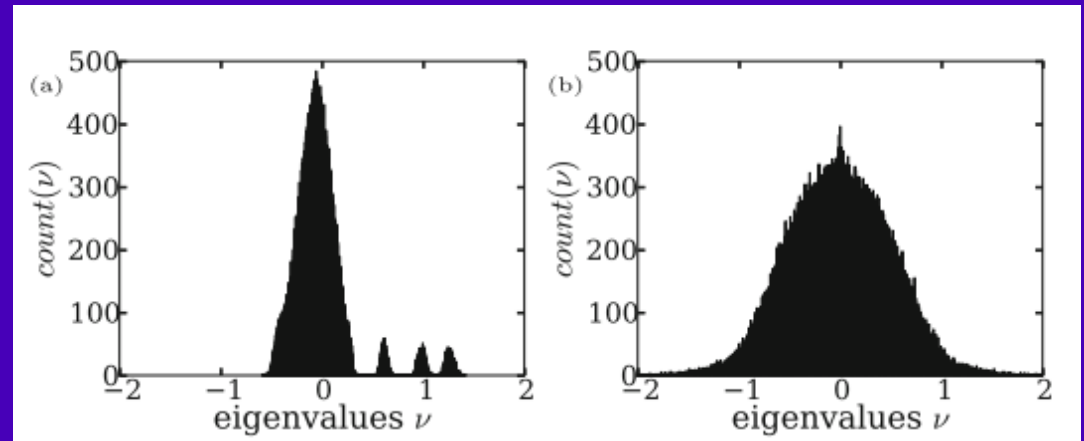
Multiple synchronization/desynchronization transitions:  
increasing inhibition can also re-synchronize!

# Mechanism for multiple sync/desync transitions

Eigenvalue spectrum  
 $N=100$ ,  $k=10$ ,  $p=0$



Histogram of eigenvalue spectrum  
 $N=100$ ,  $k=10$ ,  $p=0.2$  (1000 realizations)  
small-world      random network



Matching the instability regions with the gaps in the eigenvalue spectrum (small-world)

# Delay-coupled network of Stuart-Landau oscillators

C.U.Choe, T. Dahms, P. Hövel, E. Schöll: Phys. Rev. E 81, 025205 (R) (2010):

**Model:** Delayed networks of super- and subcritical Hopf normal forms

$$\dot{z}_j = [\lambda + i\omega \mp (1 + i\gamma)|z_j(t)|^2] z_j(t) + \sigma \sum_{n=1}^N a_{jn} [z_n(t - \tau) - z_j(t)] \quad z_j = r_j e^{i\varphi_j} \in \mathbb{C}$$

‘-’: supercritical Hopf bifurcation

‘+’: subcritical Hopf bifurcation

$\sigma = K e^{i\beta}$  complex coupling strength

$\beta$  coupling phase

$j = 1, \dots, N$

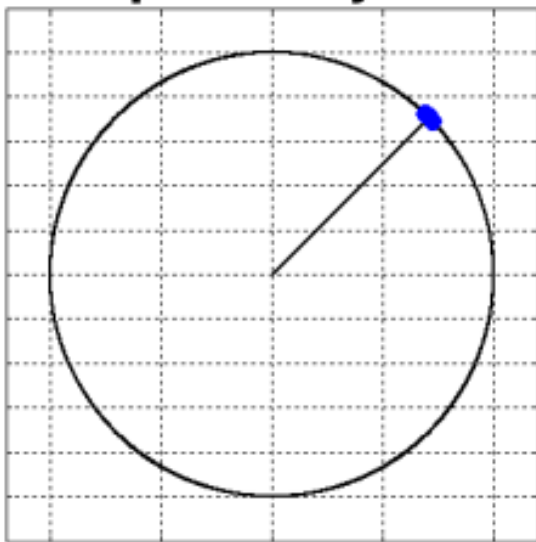
Constant row sum condition:  $-\sum_n a_{jn} =: d_0$

# Tune coupling phase $\beta$ for in-phase / splay / cluster state

By changing the value of  $\beta$  one can provide stability of different states:

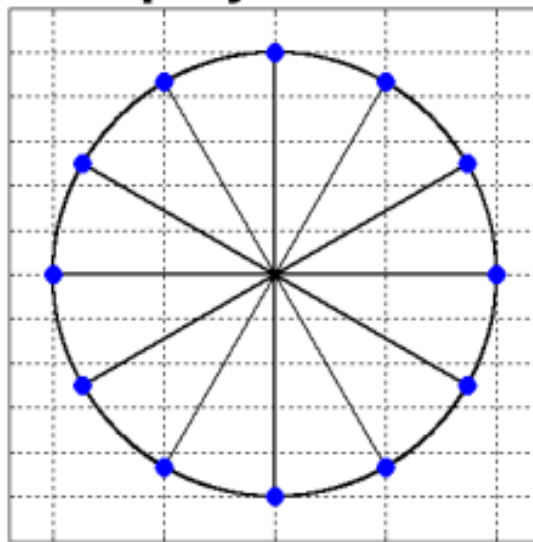
$$\beta = \Omega_0 \tau$$

**In-phase sync**



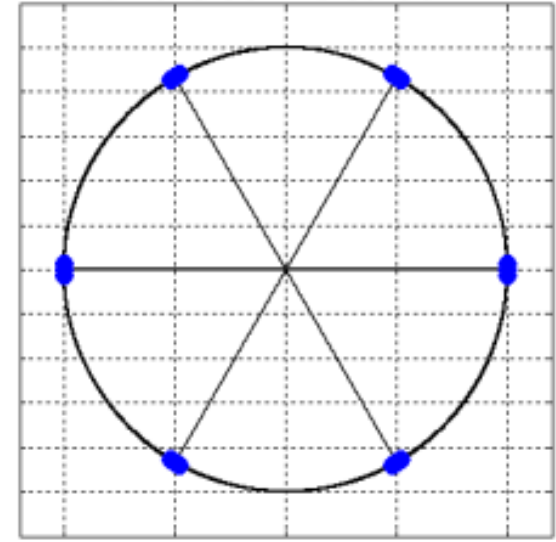
$$\beta = \Omega_1 \tau - \frac{2\pi}{N}$$

**Splay state**



$$\beta = \Omega_m \tau - \frac{2\pi m}{N}$$

**Cluster state**

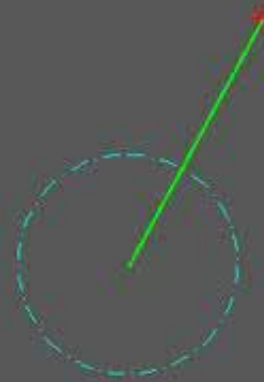




# Simulation of 12 non-identical oscillators

Control of synchronization in Networks of Delay-Coupled Stuart-Landau Oscillators  
 (Unidirectionally Coupled Ring:  $N=12$ ,  $K=0.9$ ,  $\sigma_\omega=0.04$ ,  $\tau=0.1\pi$ )

—●— : Order Parameter



Coupling with	$\beta = 0$	OFF
Control with	$\beta = \Omega\tau$	OFF
Control with	$\beta = \Omega\tau - 1 \cdot 2\pi/N$	OFF
Control with	$\beta = \Omega\tau - 2 \cdot 2\pi/N$	OFF
Control with	$\beta = \Omega\tau - 3 \cdot 2\pi/N$	OFF
Control with	$\beta = \Omega\tau - 4 \cdot 2\pi/N$	OFF
Control with	$\beta = \Omega\tau - 6 \cdot 2\pi/N$	OFF

in-phase  
 splay  
 6-cluster  
 4-cluster  
 3-cluster  
 2-cluster

order parameter  $Re^{i\Theta} \equiv \frac{1}{N} \sum_j \frac{z_j}{|z_j|}$

# Adaptive control

Find phase  $\beta$  by adaptive algorithm:

Minimize goal function  $Q(x(t), t)$  to find optimum coupling phase  $\beta$

Speed-gradient method of control theory: (along trajectory)

control variable  $u$

$$\frac{du}{dt} = -\Gamma \nabla_u \omega(x, u, t)$$

$$\dot{Q} = \omega(x, u, t)$$

$$\dot{x} = F(x, u, t)$$

$u = \beta$ :

$$\frac{d\beta}{dt} = -\Gamma \frac{\partial}{\partial \beta} \omega(x, \beta, t) = -\Gamma \left( \frac{\partial F}{\partial \beta} \right)^T \nabla_x Q(x, t).$$

Possible goal functions for in-phase synchronous state:  $Q(x, t) \geq 0$

$$Q_2 = 1 - \frac{1}{N^2} \sum_{j=1}^N e^{i\varphi_j} \sum_{k=1}^N e^{-i\varphi_k}$$

# Adaptive in-phase synchronization

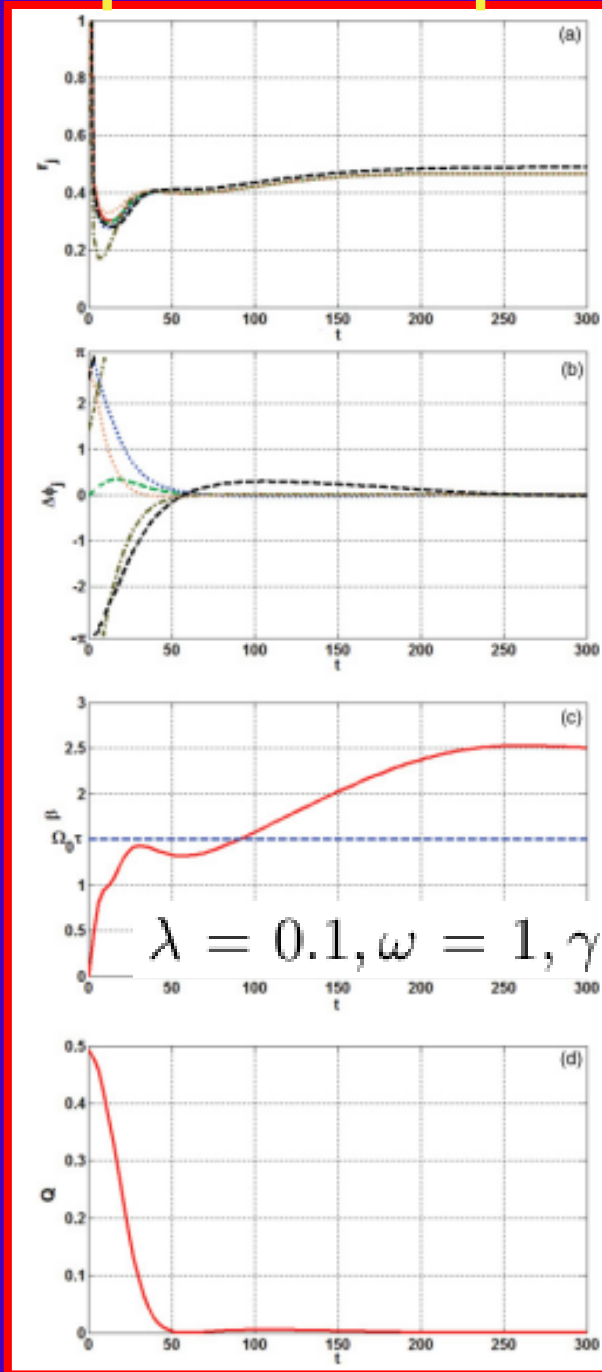
in-phase  
state

radius  $r_j$

phase  
difference  
 $\Delta\phi_j$

coupling  
phase  $\beta$

goal  
function



$$Q_2 = 1 - \frac{1}{N^2} \sum_{j=1}^N e^{i\varphi_j} \sum_{k=1}^N e^{-i\varphi_k}$$

$\Gamma=1$ ,  $N=6$  nodes

Erdős-Rényi random network

different from MSF value  $\Omega_\tau$

$$\lambda = 0.1, \omega = 1, \gamma = 0, K = 0.08, \tau = 0.52\pi, N = 6.$$

A. Selivanov, J. Lehnert, Th. Dahms, P. Hövel, A. Fradkov, E. Schöll:  
Phys. Rev. E 85, 016201 (2012)

# Adaptive cluster synchronization

Choose different goal function to distinguish splay and d-cluster states:

$$Q_4 = 1 - f_d(\varphi)$$

$$f_p(\varphi) = \frac{1}{N^2} \sum_{j=1}^N e^{pi\varphi_j} \sum_{k=1}^N e^{-pi\varphi_k} = 1 \text{ for p-cluster state}$$

Motivation by generalized order parameter:

$$R_d = \frac{1}{N} \left| \sum_{k=1}^N e^{di\varphi_k} \right|$$

# Adaptive cluster synchronization

Choose different goal function to distinguish splay and d-cluster states:

$$Q_d = 1 - f_d(\varphi)$$

all divisors  $p$  of  $d$  also  
satisfy  $f_d = 1$   
-> add penalty

$$f_p(\varphi) = \frac{1}{N^2} \sum_{j=1}^N e^{pi\varphi_j} \sum_{k=1}^N e^{-pi\varphi_k}$$

=1 for  $p$ -cluster state

Motivation by generalized order parameter:

$$R_d = \frac{1}{N} \left| \sum_{k=1}^N e^{di\varphi_k} \right|$$

# Adaptive cluster synchronization

Choose different goal function to distinguish splay and d-cluster states:

$$Q_d = 1 - f_d(\varphi) + \frac{N^2}{2} \sum_{p|d, 1 \leq p < d} f_p(\varphi)$$

all divisors  $p$  of  $d$  also satisfy  $f_d = 1$   
 -> add penalty

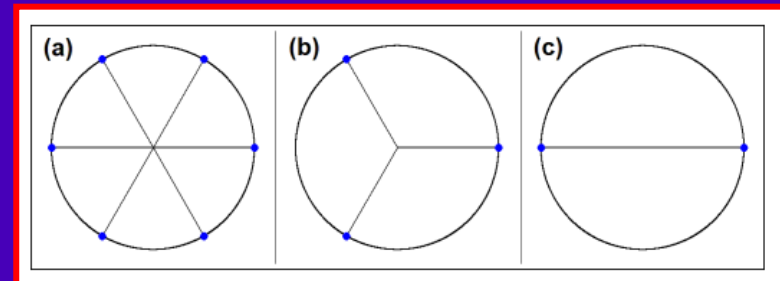
$$f_p(\varphi) = \frac{1}{N^2} \sum_{j=1}^N e^{pi\varphi_j} \sum_{k=1}^N e^{-pi\varphi_k}$$

=1 for  $p$ -cluster state

Motivation by generalized order parameter:

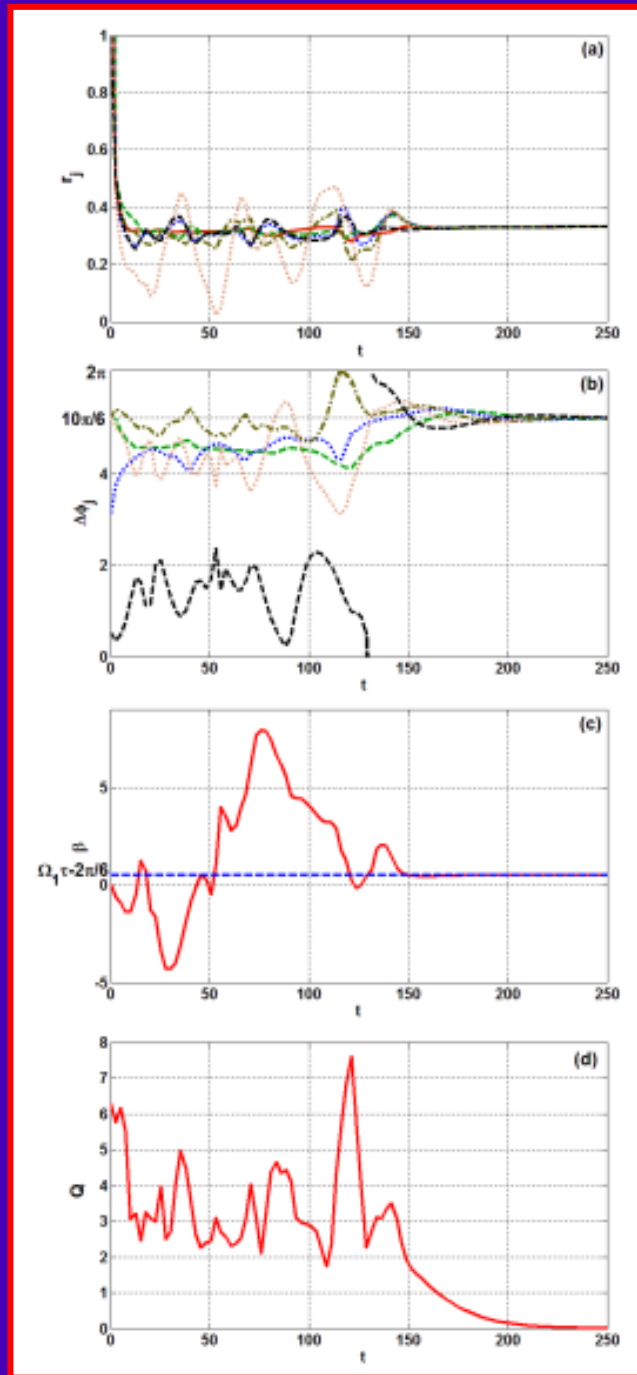
$$R_d = \frac{1}{N} \left| \sum_{k=1}^N e^{di\varphi_k} \right|$$

Splay state    3-cluster    2-cluster

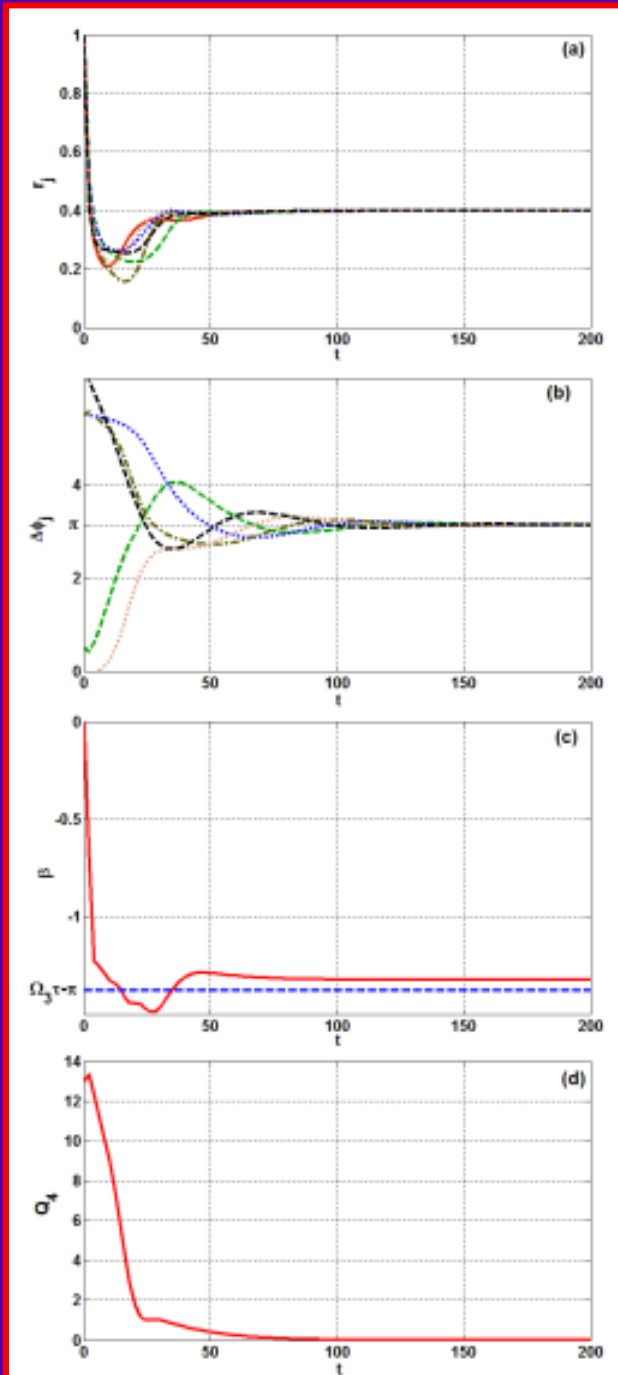


$f_1=f_2=f_3=0$      $f_1=f_2=0, f_3=1$      $f_1=f_3=0, f_2=1$   
 (N=6)

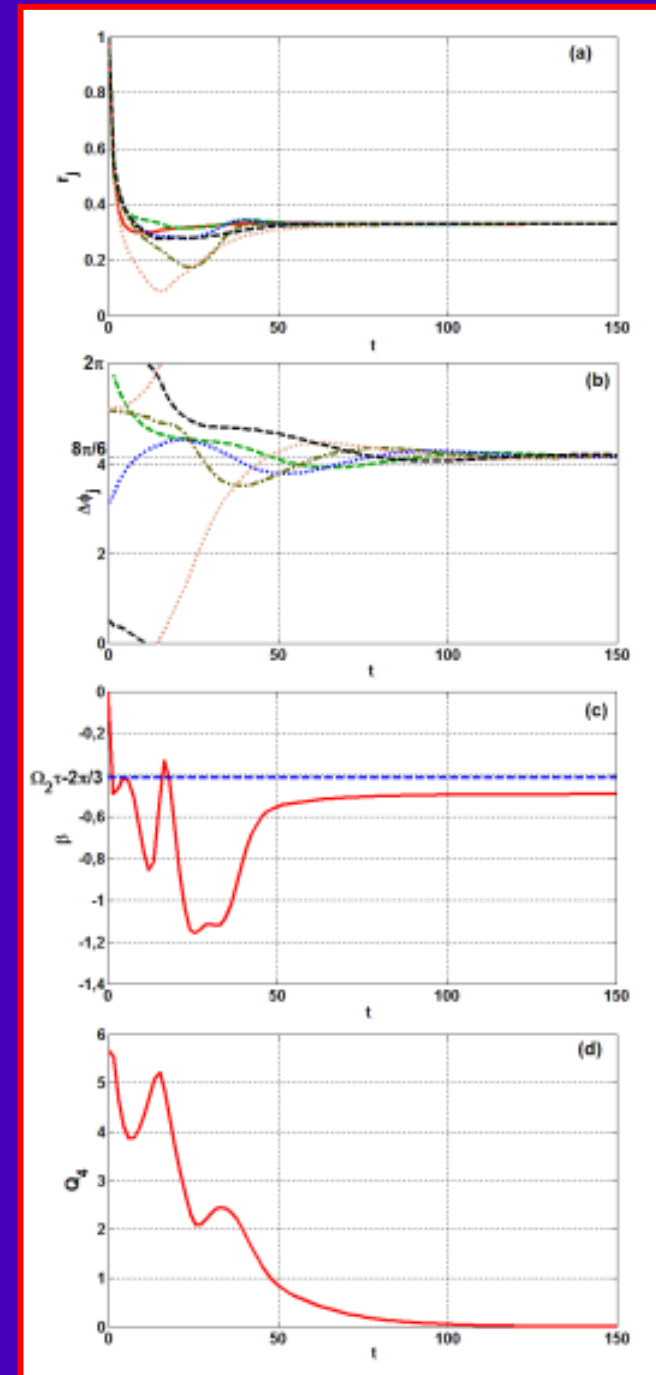
# splay state



# 2-cluster

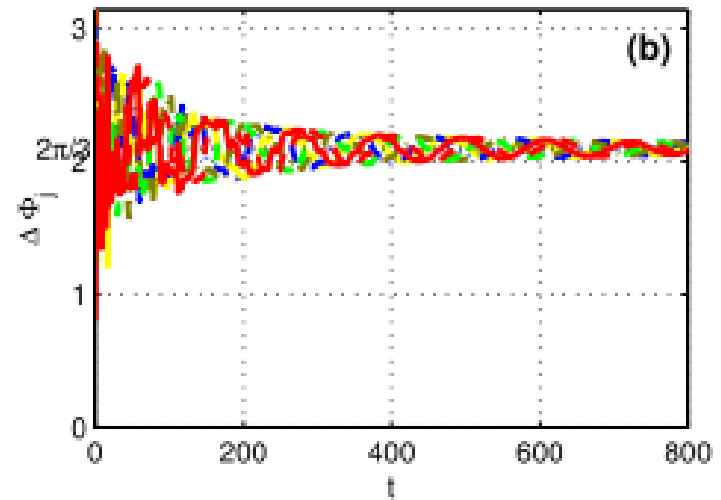
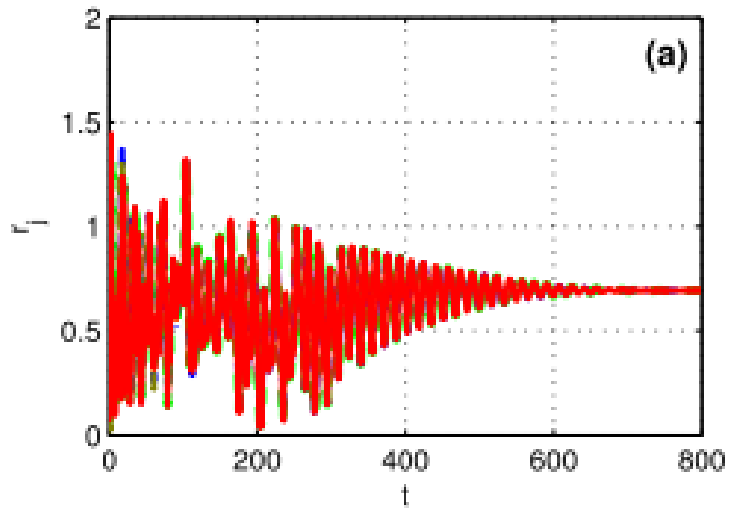


# 3-cluster



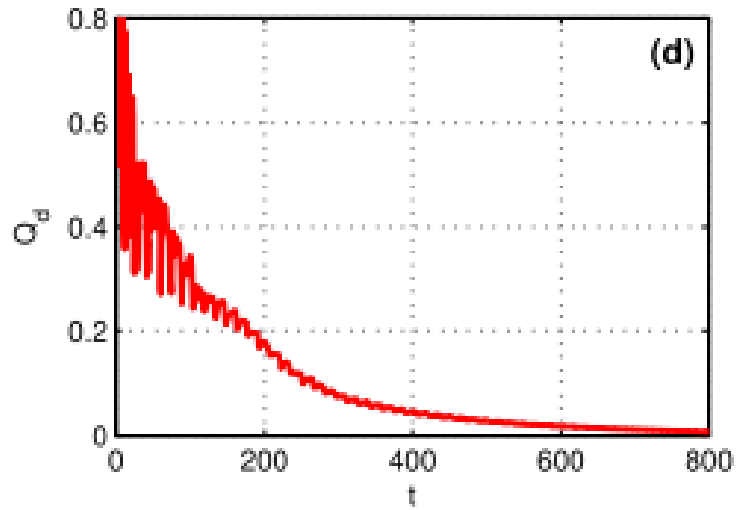
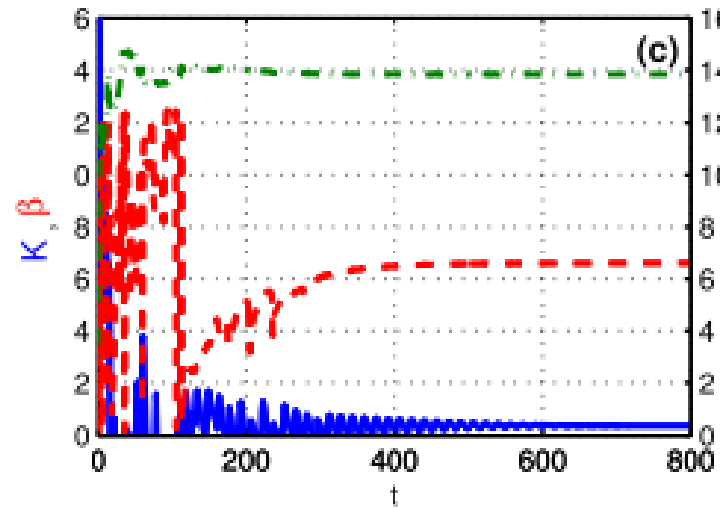
# Controlling $K$ , $\beta$ , $\tau$ simultaneously: 3-cluster

$r_j$



$\Delta\phi_j$

$K, \beta, \tau$



$Q_4$

E. Schöll, A. Selivanov, J. Lehnert, Th. Dahms, P. Hövel, A. Fradkov:  
 Int. J. Mod. Phys. B 26, 1246007 (2012)



# Self-adaptive control of network topology

Use speed-gradient algorithm to self-adaptively adjust the coupling matrix  $G_{ij}$  for a desired synchronization state (zero-lag or cluster)

Goal function for d-cluster state:

$$Q_d = 1 - f_d(\varphi) + \frac{N^2}{2} \sum_{p|d, 1 \leq p < d} f_p(\varphi) + \frac{c}{2} \int_0^t \sum_k \left( \sum_i G_{ki} - 1 \right)^2 dt$$

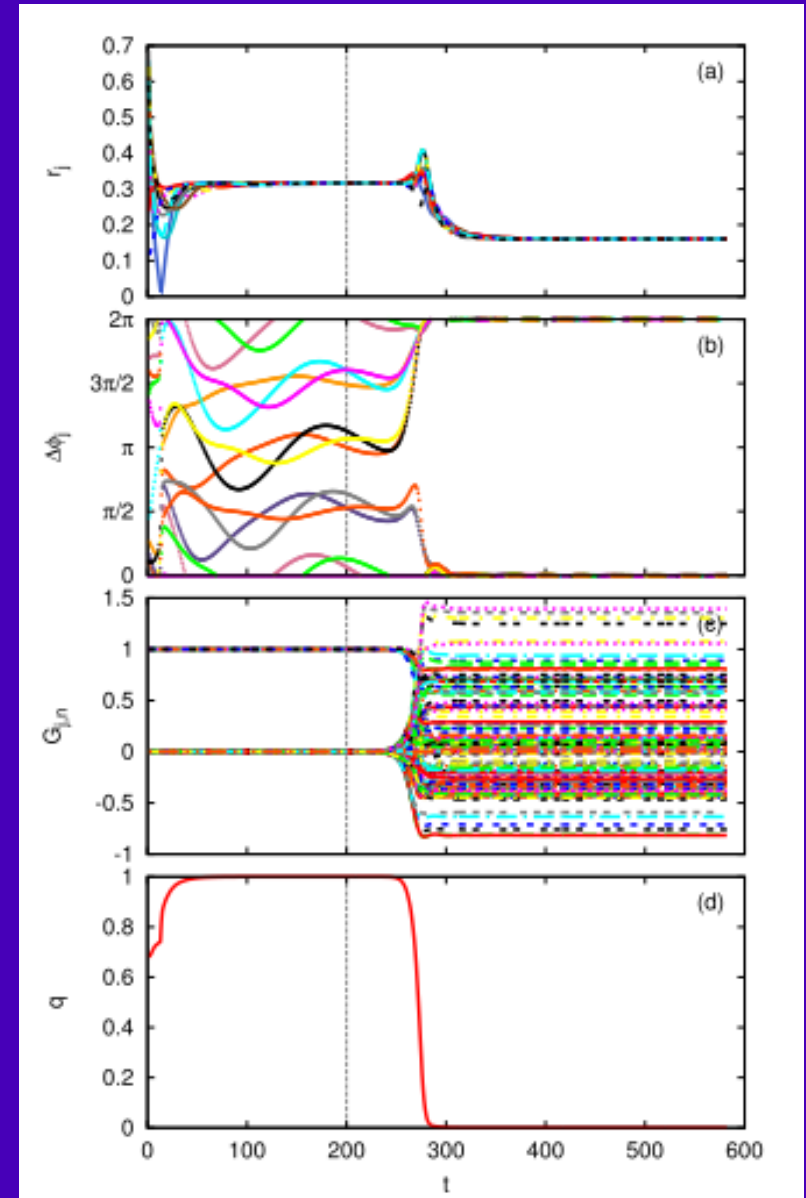
previous goal function  $q$     constant row sum

Result for zero-lag synchronization ( $d=1$ ):

Initial condition: unidirectional ring,  
zero-lag solution unstable,  
4-cluster-synchronization stable

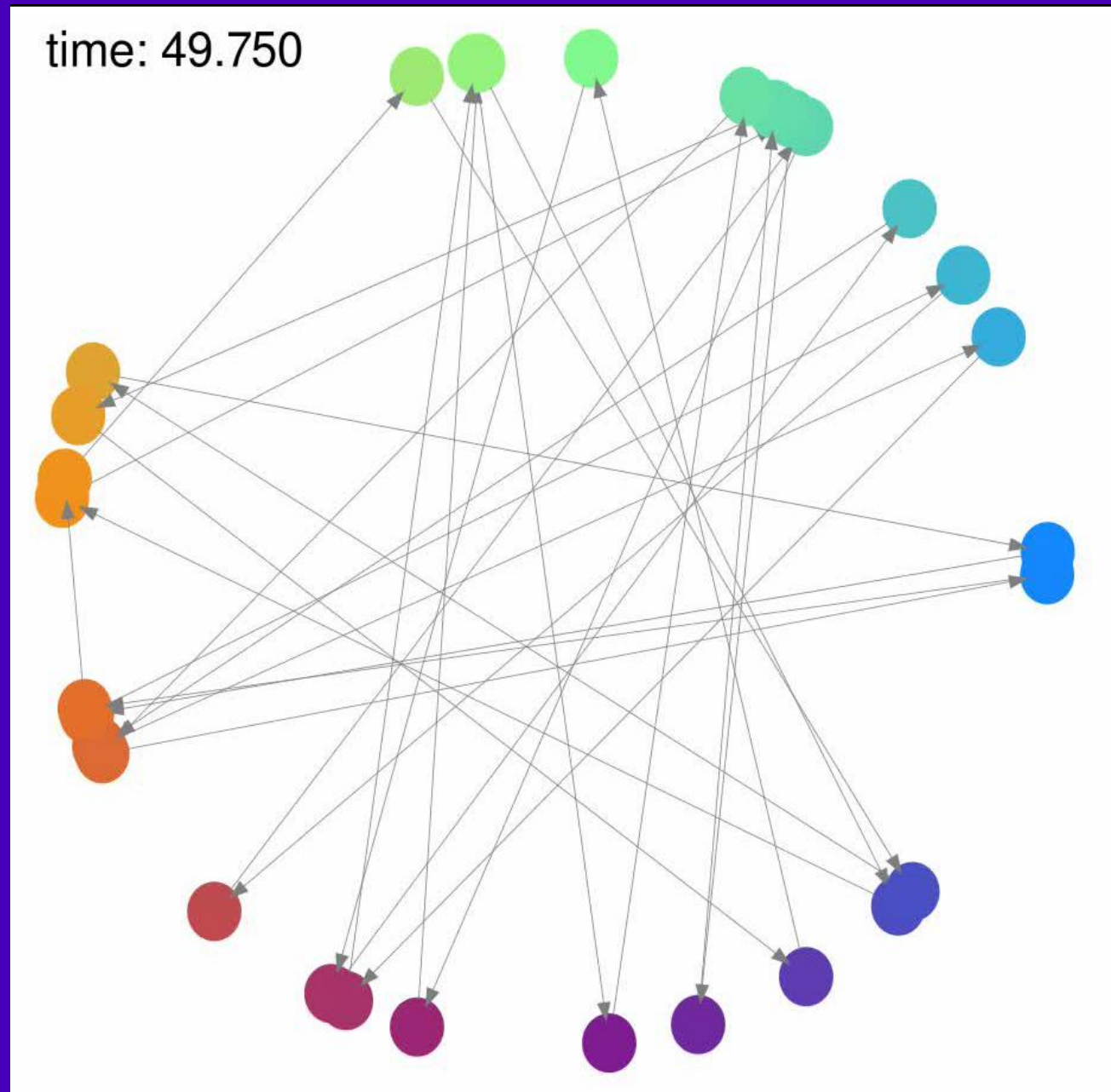
Control switched on at  $t=200$

J. Lehnert, unpublished (2012)



# Self-adaptive control of network topology

Time evolution  
of network  
topology  
(30 nodes):  
6-cluster state



# Conclusions

- ▶ Delay-coupled networks of oscillators
  - ▶ Master Stability Function for delay-coupled networks: universal classification of stable sync for large delay
  - ▶ Application to neural networks and laser networks
  - ▶ Control of synchronization/desynchronization transitions by balance of excitatory and inhibitory couplings
  - ▶ Adaptive synchronization: speed gradient method helps to find suitable coupling phase and coupling strength for in-phase, splay, and cluster states
  - ▶ Adaptive control of network topology

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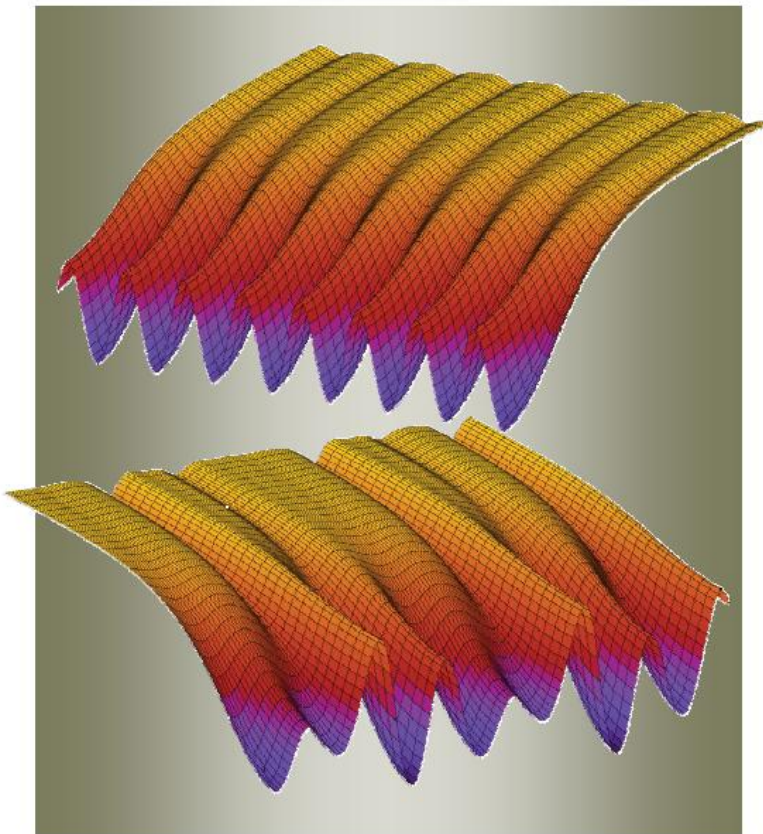
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 WILEY-VCH

# Handbook of Chaos Control

Second, completely revised  
and enlarged edition



Published 2008

Time-delayed feedback  
control of deterministic  
and stochastic systems



# Synchronization in networks with large delay

## Sketch of the proof I - fixed point

Variational equation

$$\xi_{k+1} = Df(\bar{x}_k) \xi_k + r e^{i\psi} Dh(\bar{x}_{k-\tau}) \xi_{k-\tau}.$$

Simplest case:

Fixed point  $\bar{x}_k = \bar{x}$  in the synchronization manifold

$$\xi_{k+1} = A \xi_k + r e^{i\psi} B \xi_{k-\tau}.$$

Ansatz  $\xi_k = z^k \xi_0$  yields eigenvalue equation

$$\det[A - zI + r e^{i\psi} B z^{-\tau}] = 0$$

Synchronization stable iff all solutions  $z$  have  $|z| < 1$ .

# Synchronization in networks with large delay

Sketch of the proof II – eigenvalue spectrum

$$\det[A - zI + re^{i\psi} Bz^{-\tau}] = 0 \quad (1)$$

For large  $\tau$  two types of solutions:

1. strongly unstable spectrum

Solutions of  $\det[A - zI] = 0$  with  $|z| > 1$  are also solutions of Eq. (1).

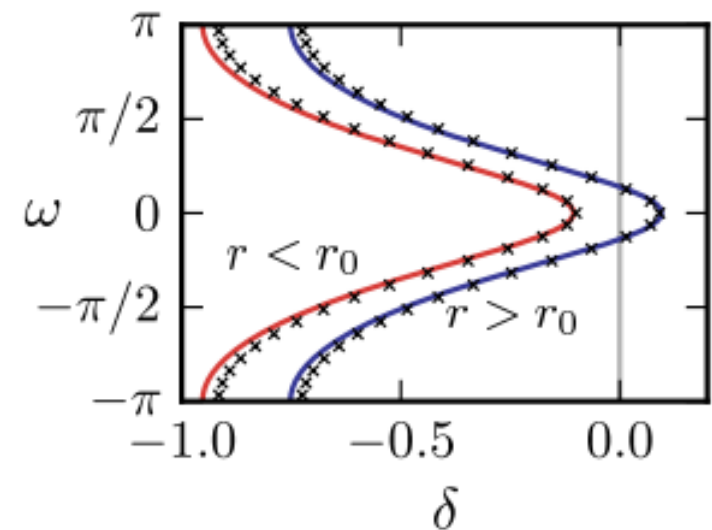
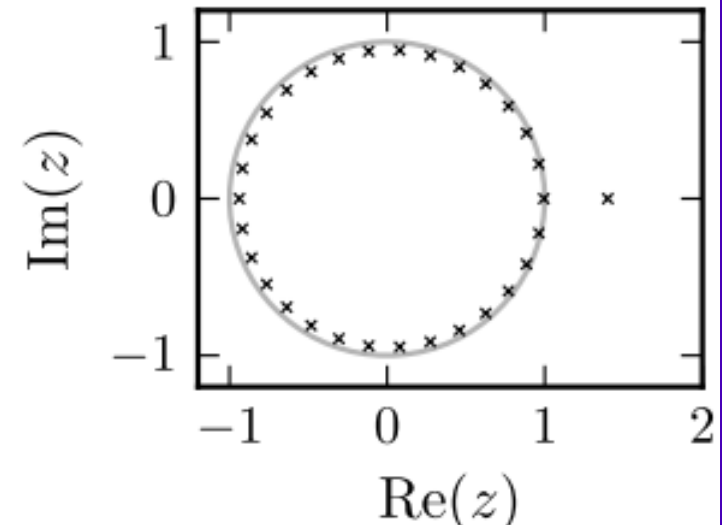
2. pseudo-continuous spectrum

Ansatz

$$z = (1 + \delta/\tau)e^{i\omega}$$

gives solution branches  $\delta(\omega)$  on which the solutions lie densely.

- ▶  $r$  shifts branches right / left
- ▶  $\psi$  shifts branches up / down



See also: S. Yanchuk, M. Wolfrum, P. Hövel, E. Schöll: PRE 74, 026201 (2006);  
S. Yanchuk and P. Perlikowski: PRE 79, 046221 (2009)

# Weak and strong chaos

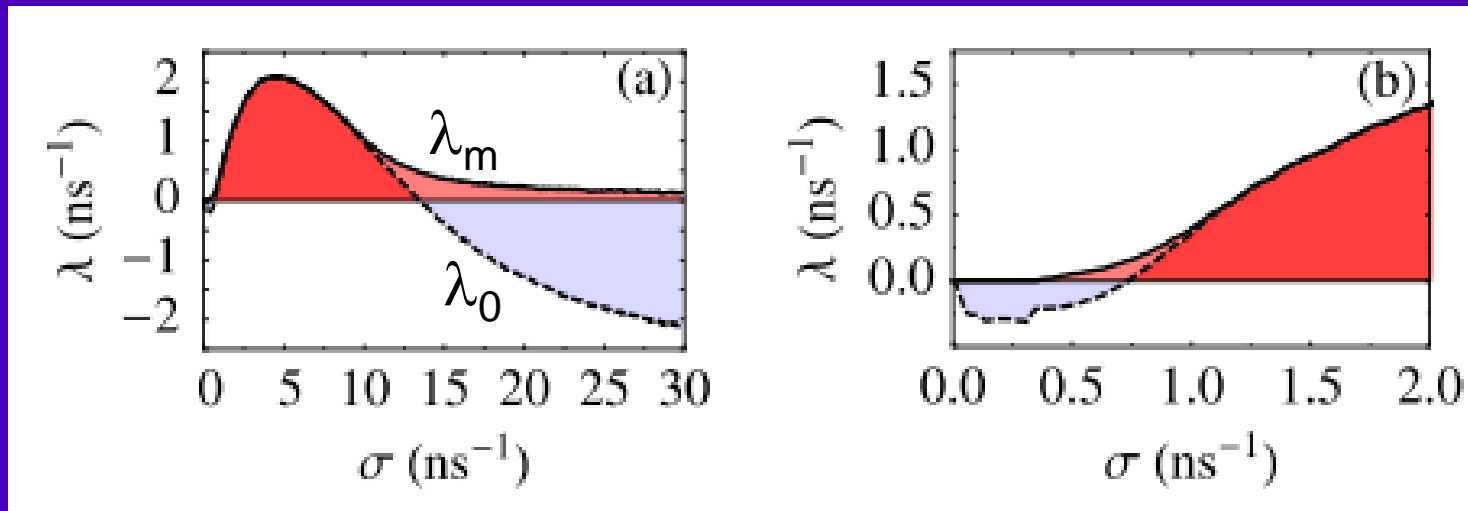


FIG. 2 (color online). (a) Maximum Lyapunov exponents  $\lambda_m$  (solid line) and  $\lambda_0$  (dashed line) of the SM for  $\tau = 10$  ns vs coupling strength  $\sigma$ . (b) Enlarged view for small coupling strengths  $\sigma$ .

## Lang-Kobayashi laser model

Maximum Lyapunov exponent within SM:  $\lambda_m$

Instantaneous Lyapunov exponent (SM without delay term):  $\lambda_0 = \lambda_{\max}(0)$

Weak chaos ( $\lambda_0 < 0$ ): stable chaotic synchronization ( $\lambda_m = \eta/\tau$ )

strong chaos ( $\lambda_0 > 0$ ): no chaotic synchronization ( $\lambda_m \sim \lambda_0$ )

$$r_0 = \sigma e^{-\lambda_m \tau}$$

S. Heilighenthal, T. Dahms, S. Yanchuk, T. Jüngling, V. Flunkert, I. Kanter, E. Schöll, W. Kinzel: PRL 107, 234102 (2011)



# Conclusions

- ▶ Delay-coupled networks of oscillators
  - ▶ Generalization of Master Stability Function for general networks with constant row sum
  - ▶ Control of synchrony by coupling phase: syn- or desynchronization
  - ▶ Unidirectional ring: in-phase / splay / cluster states controlled by coupling phase
  - ▶ Results are robust for slightly non-identical oscillators
- ▶ Synchronization in neural and laser networks
  - ▶ Desynchronization transition in small-world networks with inhibitory coupling
  - ▶ Cluster synchronization in chaotic laser networks