

Chasing patterns: diffusion-driven instabilities in networked and high-order systems

Riccardo Muolo, Namur Institute for Complex Systems (naXys),
Department of Mathematics, Université de Namur (Belgium)

funded by



ACADEMIE ROYALE
DES SCIENCES, DES LETTRES ET DES BEAUX-ARTS
DE BELGIQUE



UNIVERSITÉ
DE NAMUR

My background

BSc Physics and MSc Applied Mathematics
Firenze

PhD Systems Biology (1 year - quit)
Amsterdam



Teaching assistant Mathematics
Namur

Since Jan 2020
PhD Applied Mathematics (exp. 2023)
Namur



Université de Namur - naXys



Prof. Teo Carletti

Dynamics on networks and beyond group

pattern-formation, random walks,
synchronization and more



group web page



INSTITUTO DE MATEMÁTICA
Universidade Federal do Rio de Janeiro



Possibility of joint Master Thesis and co-supervised PhDs

Outline

Dynamical systems on networks

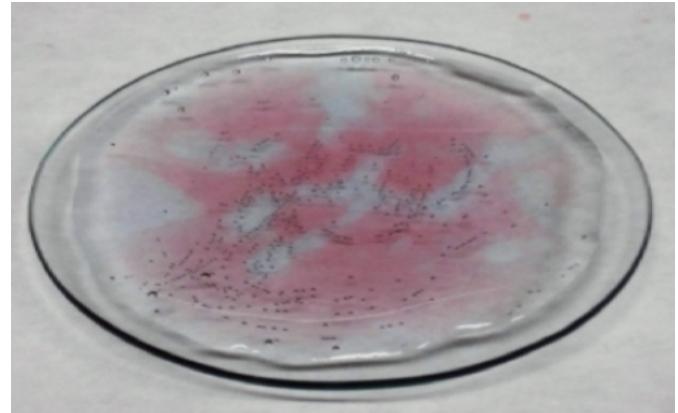
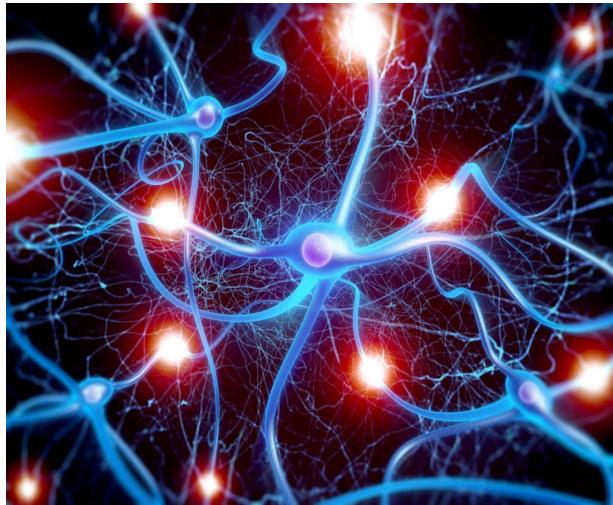
Turing theory of pattern formation

Turing theory on networks

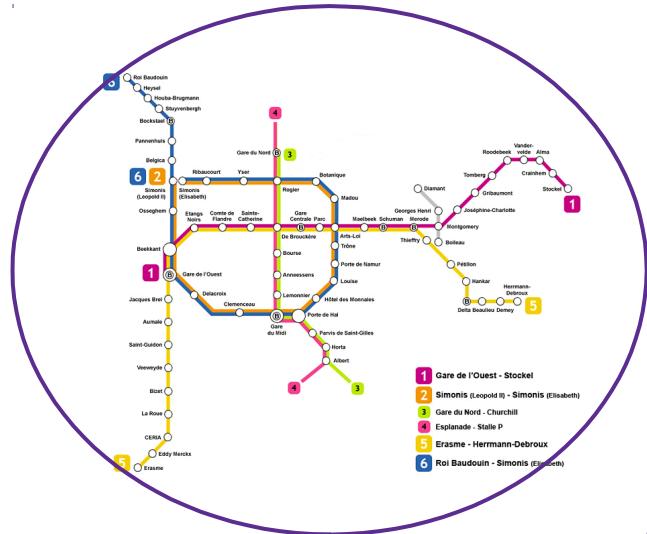
Effects of non-normality

High-order interactions

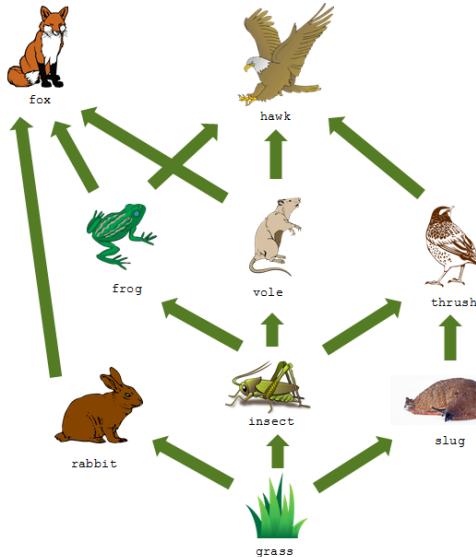
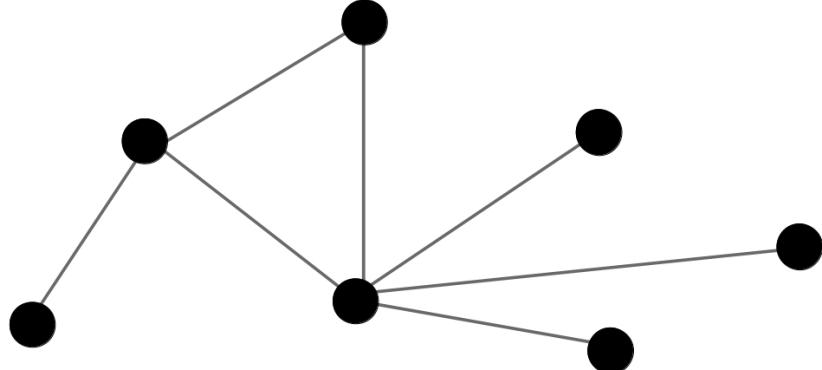
Patterns in nature



Networks



symmetric (undirected)



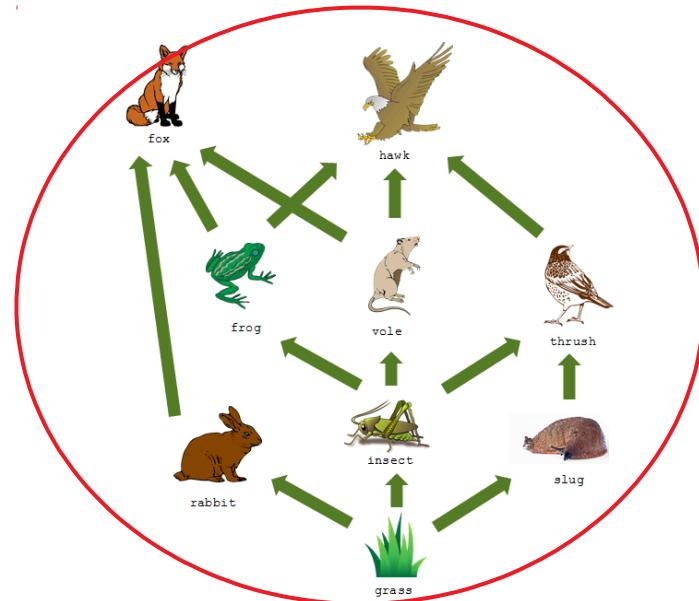
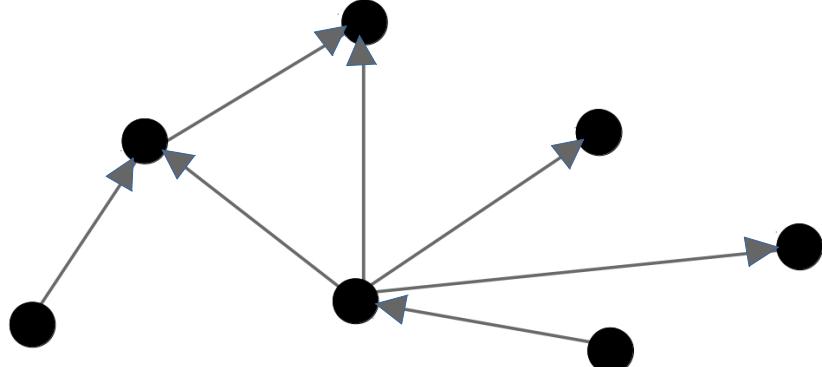
$$A_{ij} = \begin{cases} w_{ij} \in \mathbb{R}^+ \\ 0 \end{cases}$$

if there is a link
between nodes
i and j

Networks



asymmetric (directed)



$$A_{ij} = \begin{cases} w_{ij} \in \mathbb{R}^+ \\ 0 \end{cases}$$

if there is a directed link
from node j
to node i

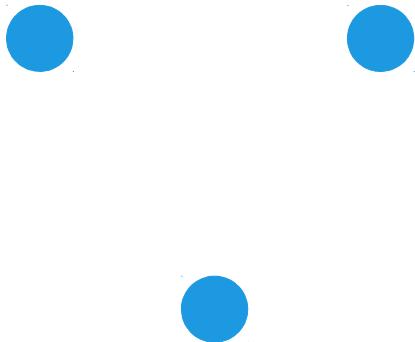
Coupled oscillators on networks

$$\dot{\vec{x}}_i = \vec{f}(\vec{x}_i)$$

Coupled oscillators on networks

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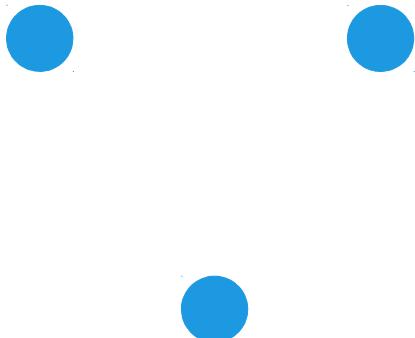
dynamics of x_i



Coupled oscillators on networks

$$\dot{\vec{x}}_i = \vec{f}(\vec{x}_i) + \sigma_1 \sum_j A_{ij}^{(1)} \vec{g}^{(1)}(\vec{x}_i, \vec{x}_j)$$

dynamics of x_i



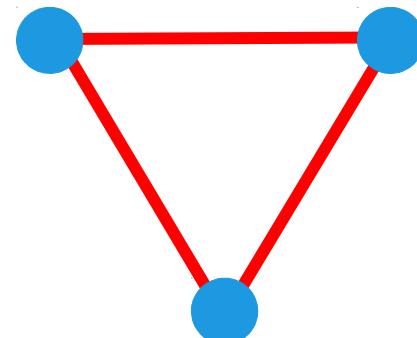
Coupled oscillators on networks

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dynamics of x_i

pairwise coupling

A blue circle contains the text "dynamics of x_i ". A blue arrow points downwards from this circle to the term $\vec{f}(\vec{x}_i)$ in the equation. A red oval encloses the term $\sigma_1 \sum_j A_{ij}^{(1)} \vec{g}^{(1)}(\vec{x}_i, \vec{x}_j)$. A red arrow points from this oval to a diagram of three blue circles arranged in a triangle, representing a network of three coupled oscillators.



Master Stability Function (MSF)

VOLUME 80, NUMBER 10

PHYSICAL REVIEW LETTERS

9 MARCH 1998

Master Stability Functions for Synchronized Coupled Systems

Louis M. Pecora and Thomas L. Carroll

Code 6343, Naval Research Laboratory, Washington, D.C. 20375

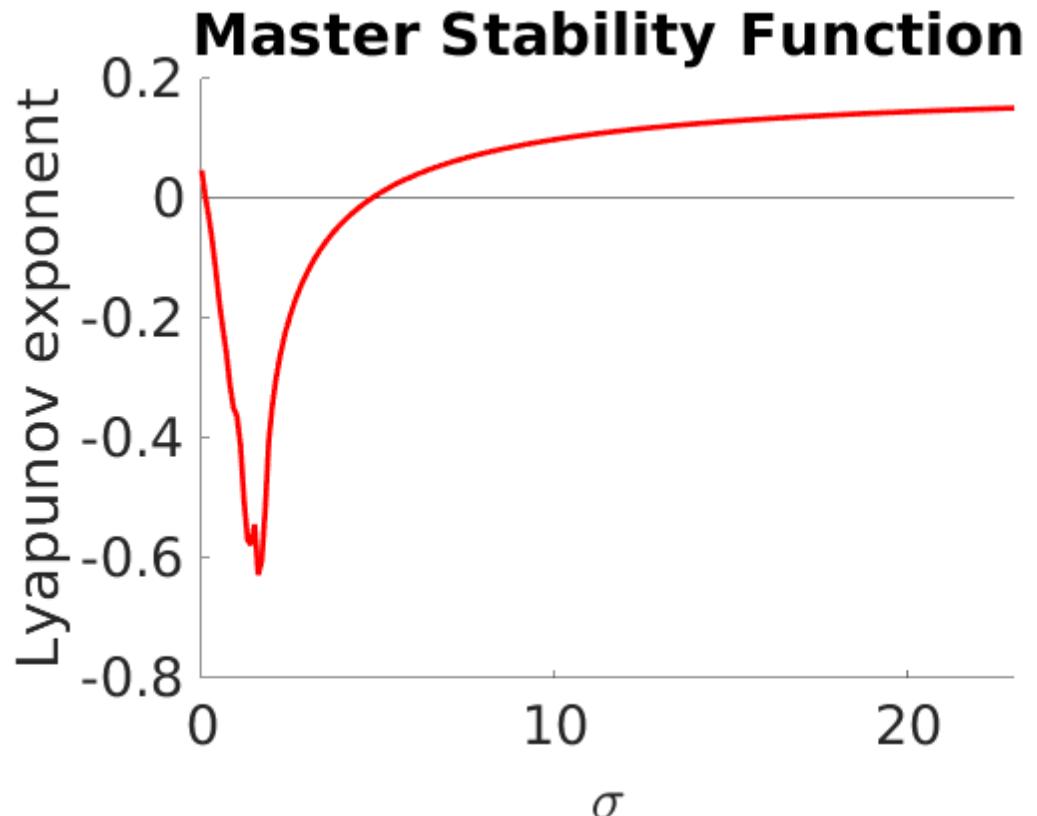
(Received 7 July 1997)

$$\dot{\xi} = [\mathbf{1}_N \otimes D\mathbf{F} + \sigma \mathbf{G} \otimes D\mathbf{H}] \xi$$

$$\dot{\xi}_k = [D\mathbf{F} + \sigma \gamma_k D\mathbf{H}] \xi_k$$

Rössler

$$\begin{cases} \dot{x}_i = -y_i - z_i + \sigma \sum_{j=1}^N L_{ij} x_j \\ \dot{y}_i = x_i + a y_i \\ \dot{z}_i = b + z_i(x_i - c) \end{cases}$$



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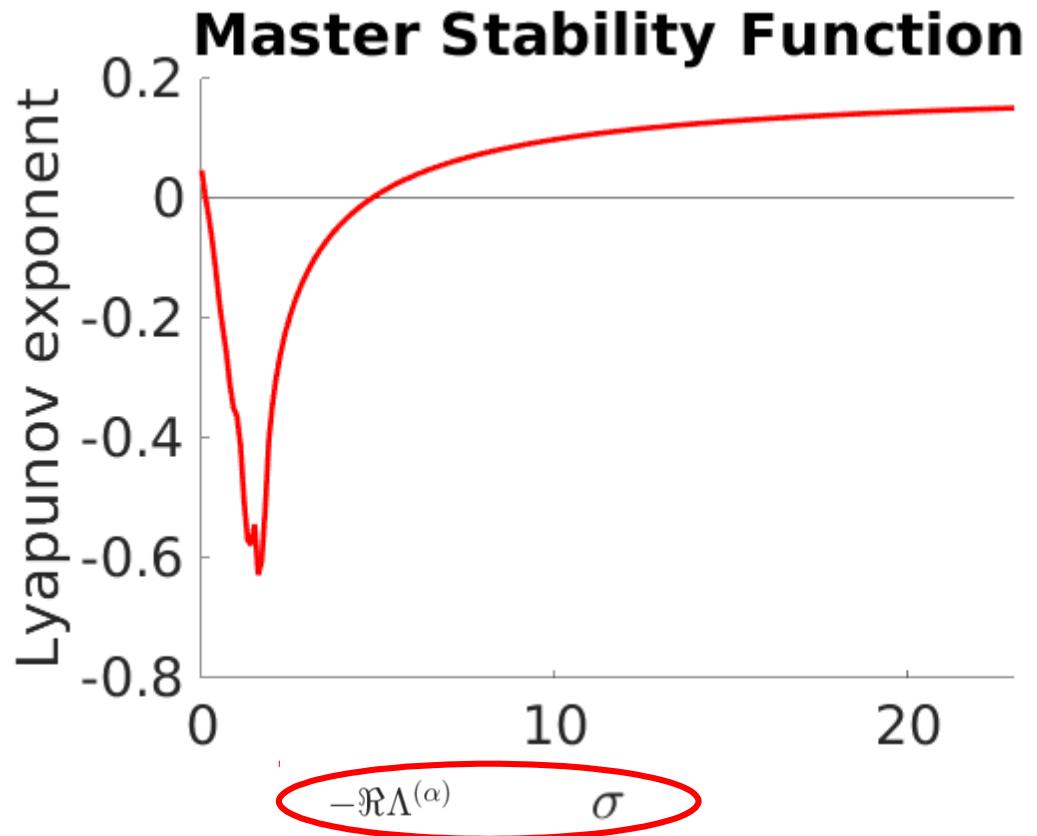
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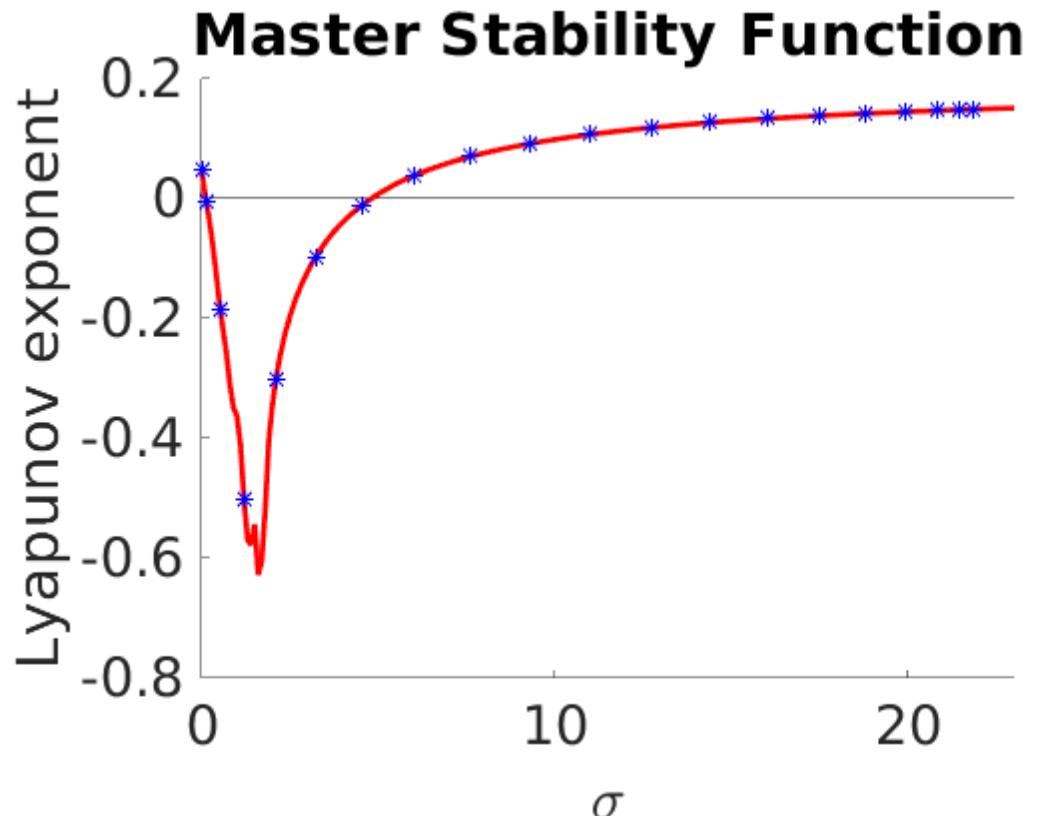
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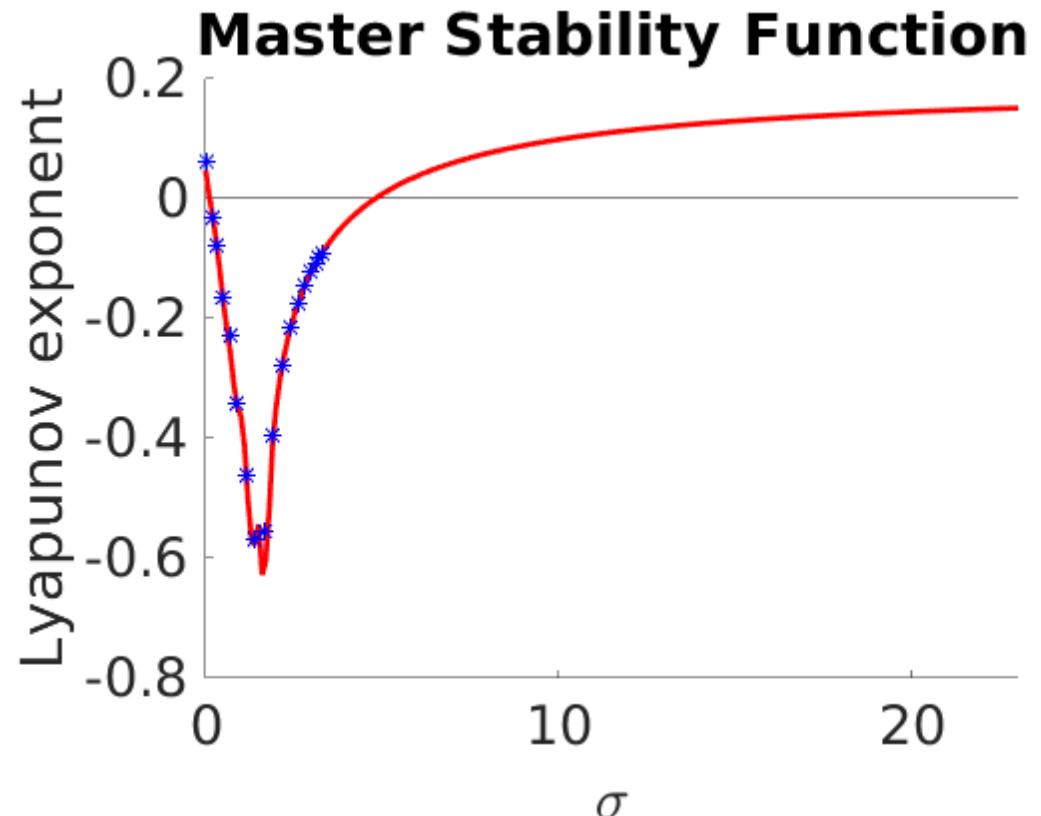
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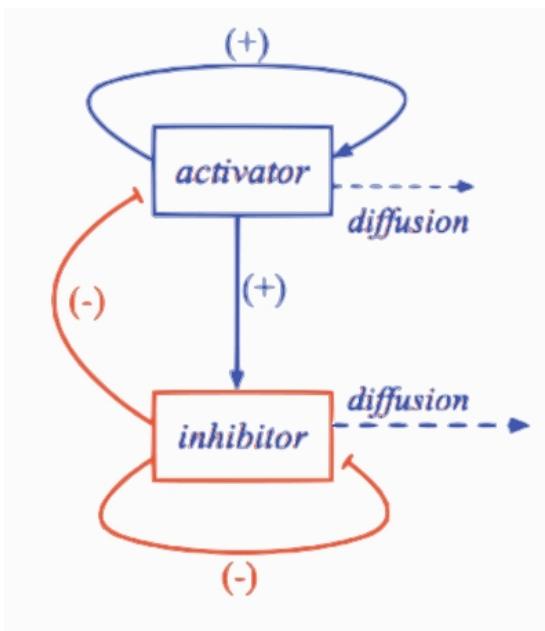
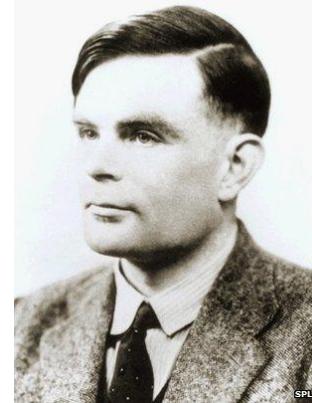


Intermezzo: Turing theory

The Chemical Basis of Morphogenesis

A. M. Turing

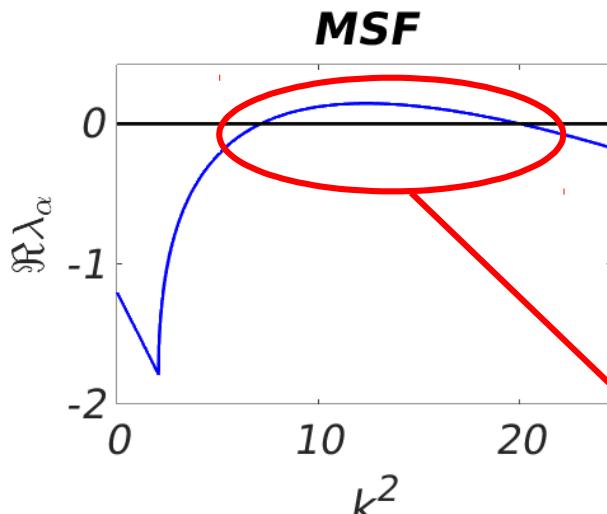
Philosophical Transactions of the Royal Society of London. Series B, Biological Sciences, Vol. 237, No. 641. (Aug. 14, 1952), pp. 37-72.



$$\begin{cases} \frac{\partial u}{\partial t}(x, t) = f(u, v) + D_u \nabla^2 u(x, t) \\ \frac{\partial v}{\partial t}(x, t) = g(u, v) + D_v \nabla^2 v(x, t) \end{cases}$$

- + boundary conditions
- + domain of the Laplacian
- +

Turing theory in a nutshell



reaction-diffusion system of two species
(activator u and inhibitor v)

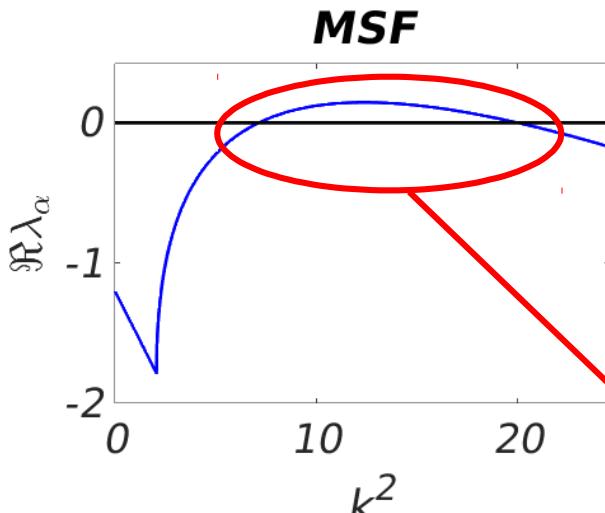
homogeneous stable state (fixed point)

inhomogeneous perturbations

exponential instability (diffusion-driven)

patterns $D_v > D_u$

Turing theory in a nutshell



unstable modes

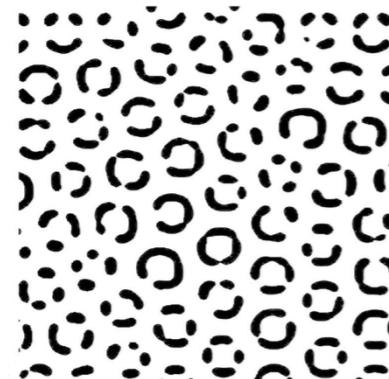
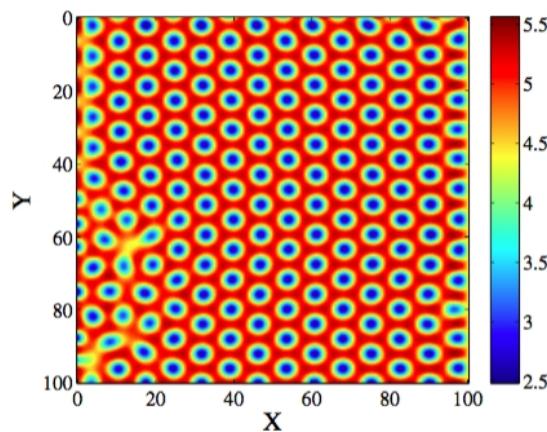
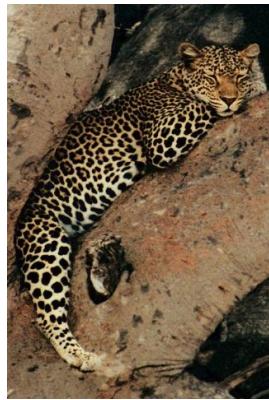
reaction-diffusion system of two species
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inhomogeneous perturbations

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patterns $D_v > D_u$



Many applications

© 2020. Published by The Company of Biologists Ltd | Development (2020) 147, dev183699. doi:10.1242/dev.183699



RESEARCH ARTICLE

A dot-stripe Turing model of joint patterning in the tetrapod limb

Jake Cornwall Scoones¹ and Tom W. Hiscock^{2,3,*}

Article | [Published: 08 July 2021](#)

Nanoscale Turing patterns in a bismuth monolayer

[Yuki Fuseya](#) [Hiroyasu Katsuno](#), [Kamran Behnia](#) & [Aharon Kapitulnik](#)

[Nature Physics](#) **17**, 1031–1036 (2021) | [Cite this article](#)

[PHYSICAL REVIEW RESEARCH](#) **3**, 023241 (2021)

Linguistic evolution driven by network heterogeneity and the Turing mechanism

Sayat Mimar , ¹Mariamo Mussa Juane,²Jorge Mira , ³Juyong Park,⁴Alberto P. Muñozuri , ²and Gourab Ghoshal ^{1,*}

¹*Department of Physics & Astronomy, University of Rochester, Rochester, New York 14607, USA*

²*Group of Nonlinear Physics, Universidade de Santiago de Compostela, 15782 Santiago de Compostela, Spain*

³*Departamento de Física Aplicada, Universidade de Santiago de Compostela, 15782 Santiago de Compostela, Spain*

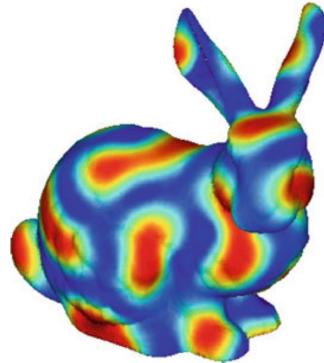
⁴*Graduate School of Culture Technology, Korea Advanced Institute of Science and Technology, Daejon, 305-701, Korea*

scientific reports

OPEN **Turing instability in quantum activator–inhibitor systems**

[Yuzuru Kato](#) & [Hiroya Nakao](#) ²

Many applications



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scientific reports

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⁴*Graduate School of Culture Technology, Korea Advanced Institute of Science and Technology, Daejon, 305-701, Korea*

Extension on networks

J. theor. Biol. (1971) **32**, 507–537



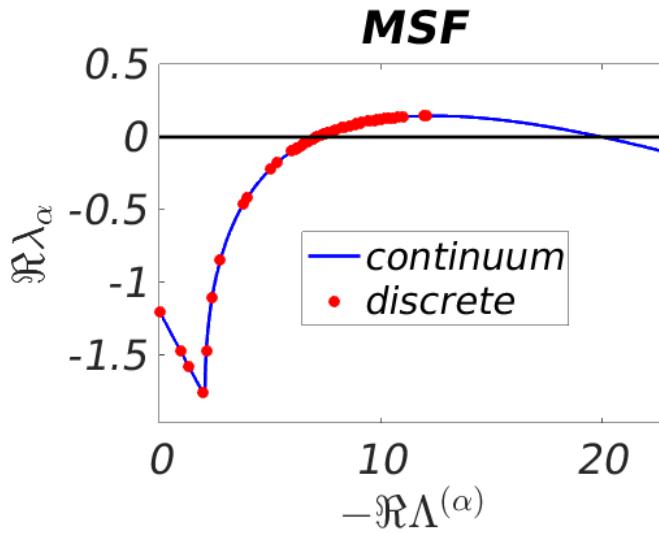
Turing patterns in network-organized activator-inhibitor systems

Hiroya Nakao^{1,2*} and Alexander S. Mikhailov^{3*}

Instability and Dynamic Pattern in Cellular Networks

H. G. OTHMER† AND L. E. SCRIVEN‡

Department of Chemical Engineering and Materials Science
Institute of Technology, University of Minnesota,
Minneapolis, Minnesota 55455, U.S.A.



$$L_{ij} = A_{ij} - k_i \delta_{ij}$$

$$\begin{cases} \frac{du_i}{dt} = f(u_i, v_i) + D_u \sum_{j=1}^{\text{nodes}} L_{ij} u_j \\ \frac{dv_i}{dt} = g(u_i, v_i) + D_v \sum_{j=1}^{\text{nodes}} L_{ij} v_j \end{cases}$$

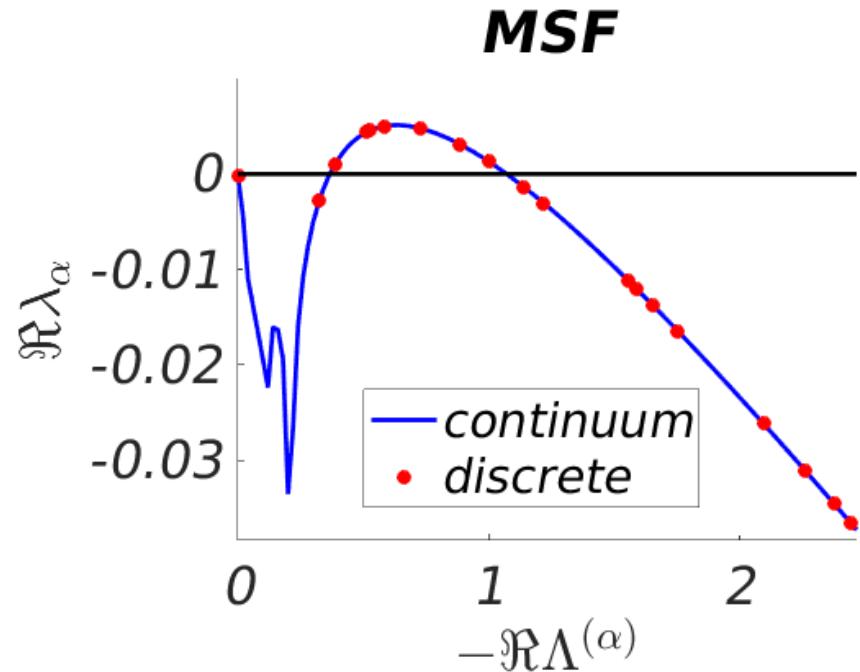
Turing-like instability

PHYSICAL REVIEW E **92**, 022818 (2015)

Turing-like instabilities from a limit cycle

Joseph D. Challenger,^{1,2} Raffaella Burioni,³ and Duccio Fanelli²

the homogeneous stable state is a **limit cycle**



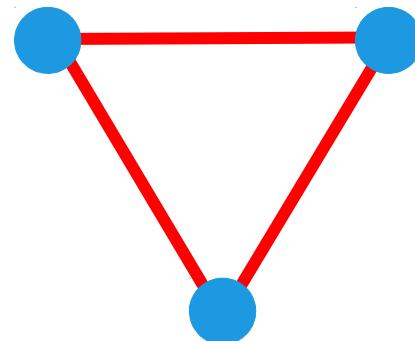
Coupled oscillators on networks (!)

$$\dot{\vec{x}}_i = \vec{f}(\vec{x}_i) + \sigma_1 \sum_j A_{ij}^{(1)} \vec{g}^{(1)}(\vec{x}_i, \vec{x}_j)$$

dynamics of x_i

chaotic, oscillating,
Fixed point, etc...

pairwise coupling
in general diffusive like



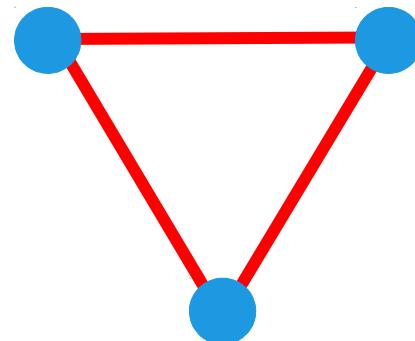
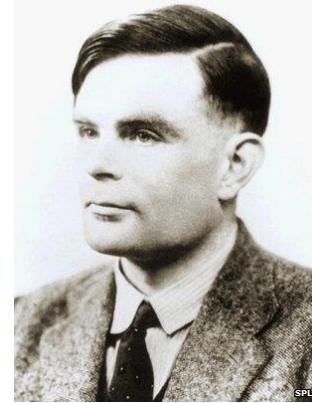
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Extensions of Turing theory

PHYSICAL REVIEW E **92**, 022818 (2015)

Turing-like instabilities from a limit cycle

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Patterns of non-normality in networked systems

Riccardo Muolo^a, Malbor Asllani^{b,c,*}, Duccio Fanelli^d, Philip K. Maini^b, Timoteo Carletti^e



ARTICLE

Received 5 Feb 2014 | Accepted 26 Jun 2014 | Published 31 Jul 2014

DOI: 10.1038/ncomms5517

The theory of pattern formation on directed networks

Malbor Asllani^{1,2}, Joseph D. Challenger², Francesco Saverio Pavone^{2,3,4}, Leonardo Sacconi^{3,4} & Duccio Fanelli²

OPEN ACCESS



PAPER

Finite propagation enhances Turing patterns in reaction-diffusion networked systems

Timoteo Carletti^c and Riccardo Muolo

Department of Mathematics & naXys, Namur Institute for Complex Systems, University of Namur, rue Grafé 2, 5000 Namur, Belgium

* Author to whom any correspondence should be addressed.

E-mail: timoteo.carletti@unamur.be

Journal of Physics: Complexity

Chaos, Solitons and Fractals **134** (2020) 109707

Generalized patterns from local and non local reactions

Giulia Cencetti^a, Federico Battiston^b, Timoteo Carletti^c, Duccio Fanelli^{d,*}



Directed Networks



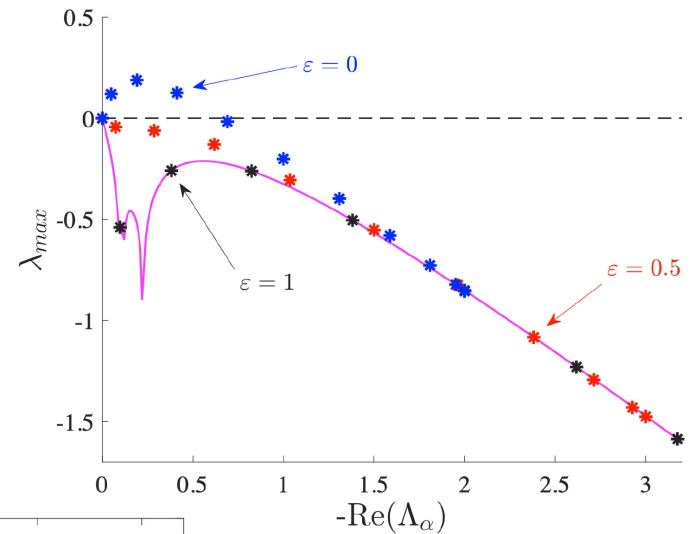
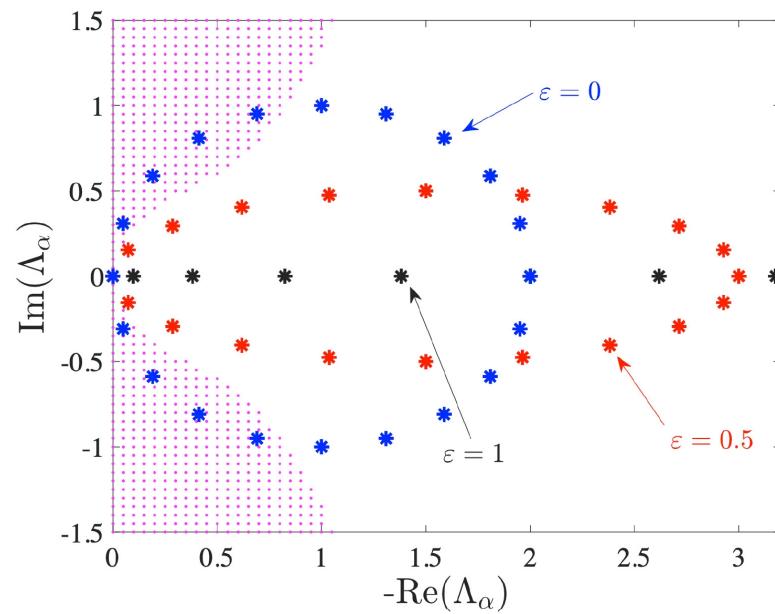
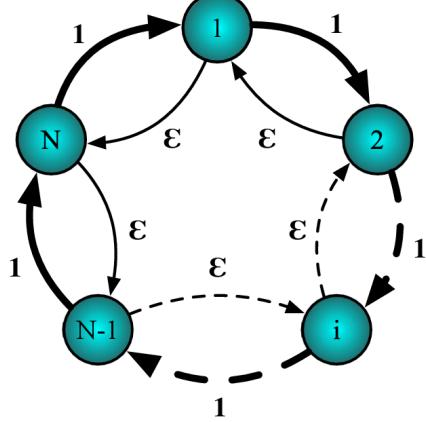
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Non-normal Networks

A network is non-normal
when $A^*A \neq AA^*$

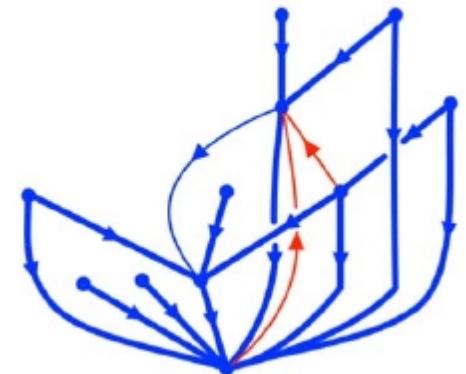
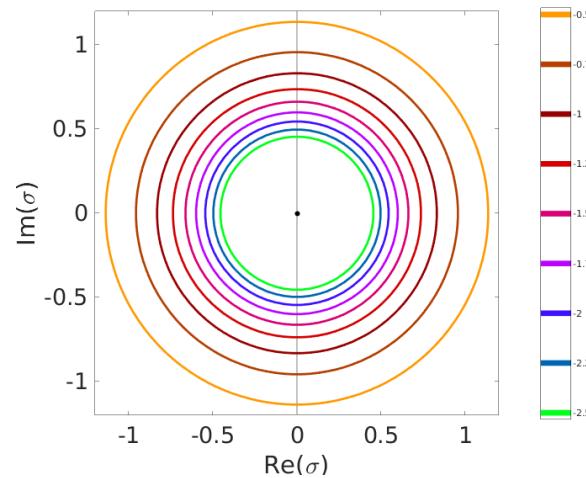
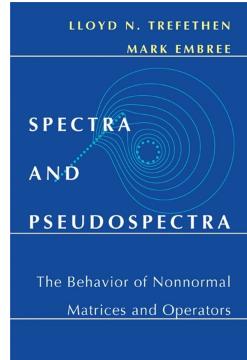
RESEARCH ARTICLE | NETWORK SCIENCE

Structure and dynamical behavior of non-normal networks

Malbor Asllani^{1,2}, Renaud Lambiotte¹ and Timoteo Carletti^{2,*}

+ See all authors and affiliations

Science Advances 12 Dec 2018:
Vol. 4, no. 12, eaau9403
DOI: 10.1126/sciadv.aau9403

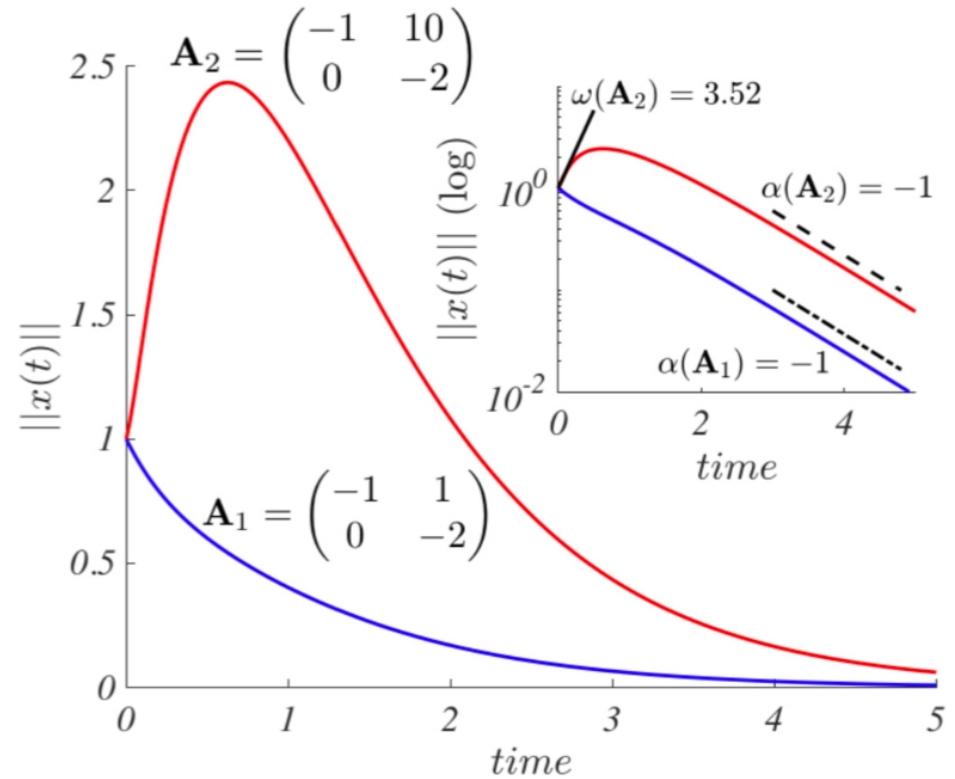


$$\beta\text{-pseudospectrum } \lambda_\beta(A) \rightarrow \lambda(A + B) \quad ||B|| < \beta$$

Effects on the dynamics

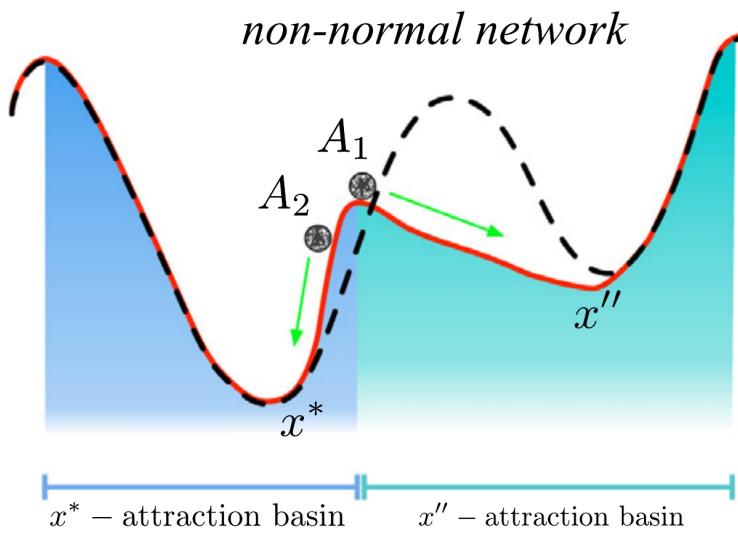
ω largest eigenvalue of the hermitian (symmetric) part

Linear dynamics

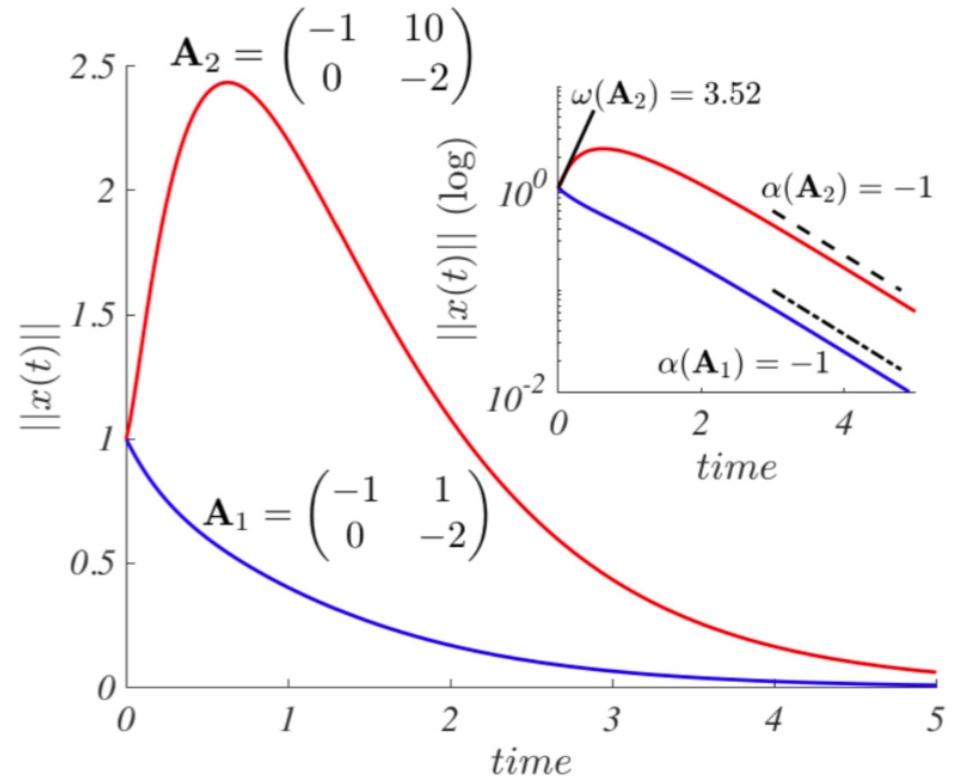


Effects on the dynamics

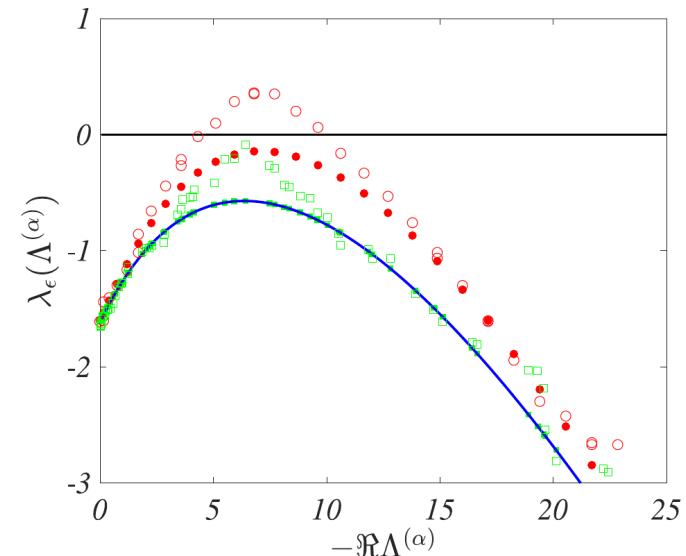
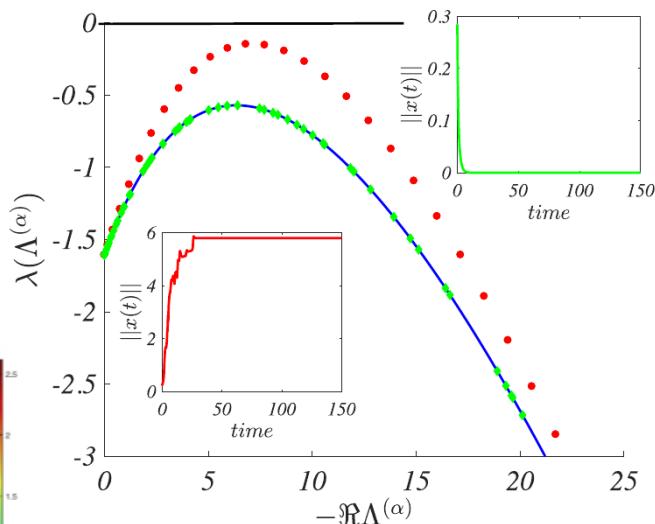
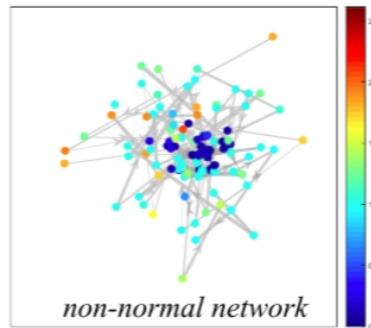
Non-linear dynamics



Linear dynamics



Patterns of Non-normality

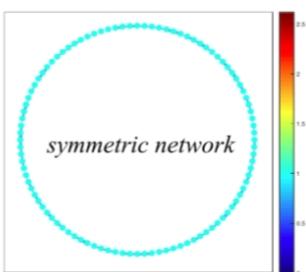


Journal of Theoretical Biology 480 (2019) 81–91

Contents lists available at ScienceDirect

Journal of Theoretical Biology

journal homepage: www.elsevier.com/locate/jtb



Patterns of non-normality in networked systems

Riccardo Muolo^a, Malbor Asllani^{b,c,*}, Duccio Fanelli^d, Philip K. Maini^b, Timoteo Carletti^e



Synchronization and non-normality



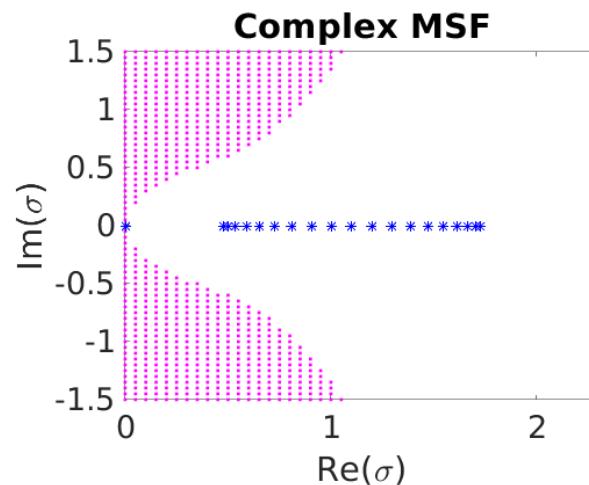
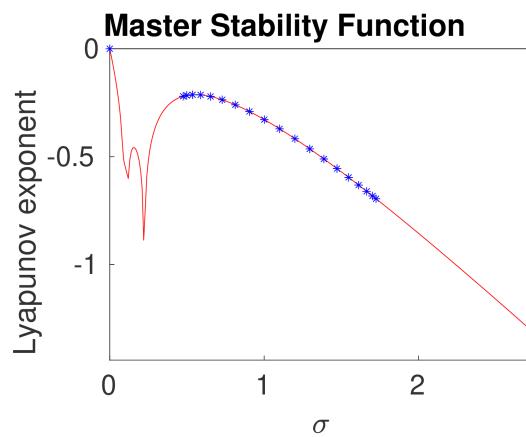
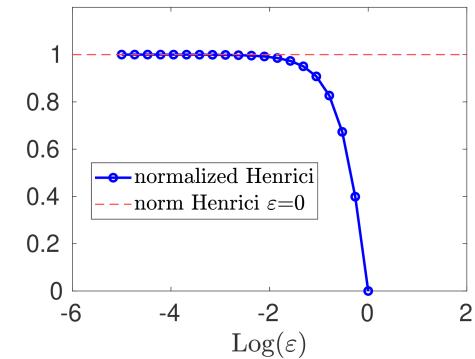
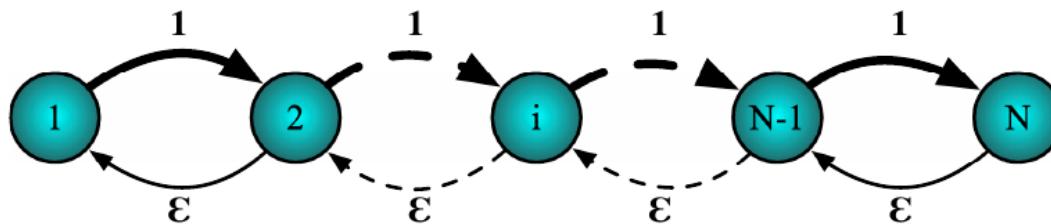
Entropy 2021, 23, 36.



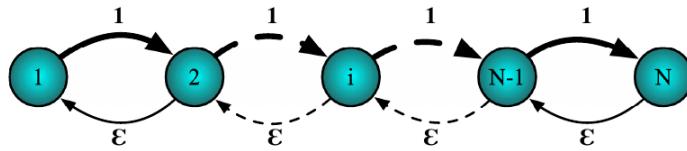
Article

Synchronization Dynamics in Non-Normal Networks: The Trade-Off for Optimality

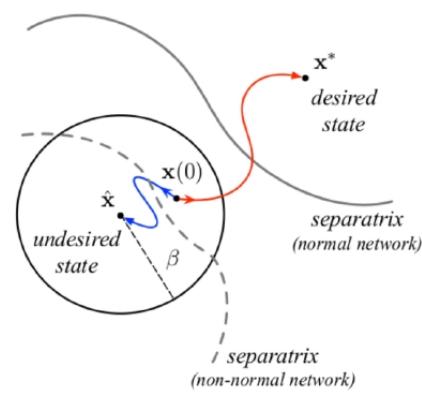
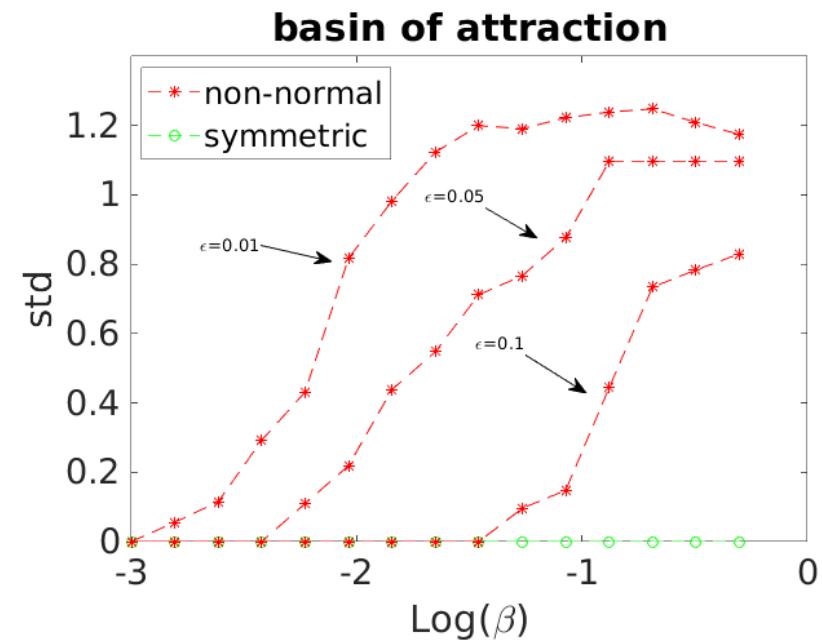
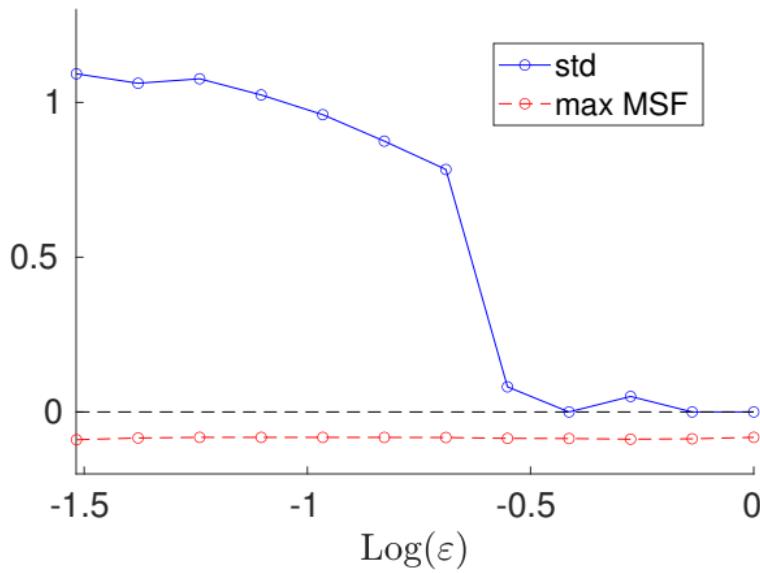
Riccardo Muolo ^{1,*}, Timoteo Carletti ¹, James P. Gleeson ² and Malbor Asllani ^{1,2}



De-synchronization



MSF vs non-linear behavior



Debate on optimal networks



Article

Synchronization Dynamics in Non-Normal Networks: The Trade-Off for Optimality

Riccardo Muolo^{1,*}, Timoteo Carletti¹, James P. Gleeson² and Malbor Asllani^{1,2}

Comment on “Synchronization dynamics in non-normal networks: the trade-off for optimality”

Takashi Nishikawa,^{1,2,*} Adilson E. Motter,^{1,2} and Louis M. Pecora³

Reply to Comment on “Synchronization dynamics in non-normal networks: the trade-off for optimality”

Riccardo Muolo¹, Timoteo Carletti¹, James P. Gleeson², Malbor Asllani³

Comment on “Synchronization dynamics in non-normal networks: the trade-off for optimality”

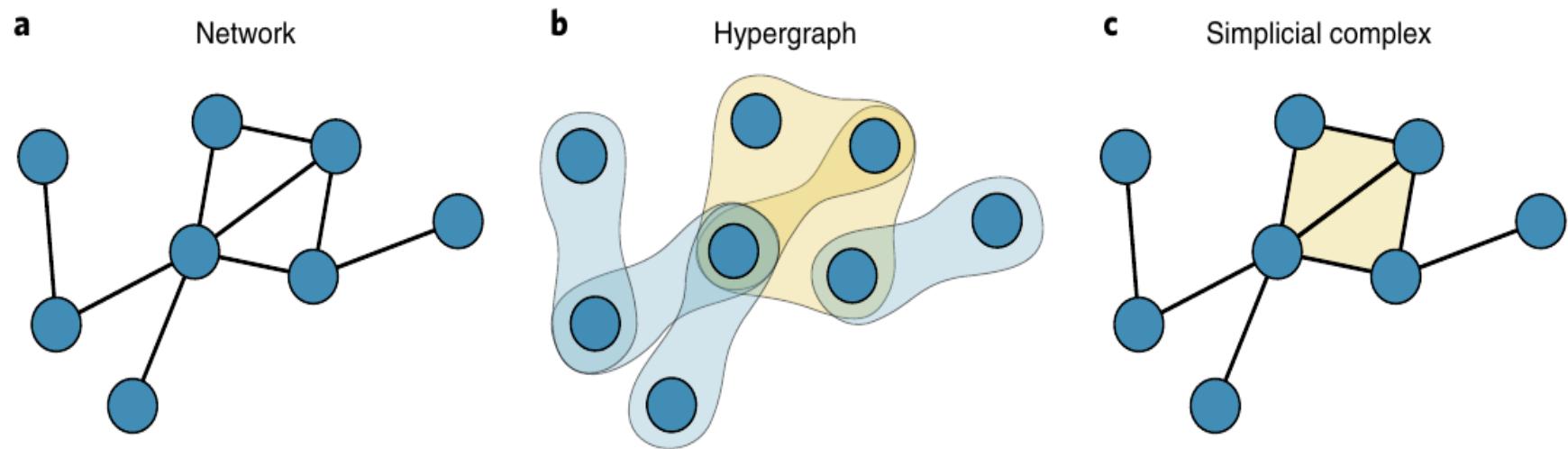
Francesco Sorrentino and Chad Nathe

Non-normality, optimality and synchronization

Jeremie Fish*

Erik M. Bollt

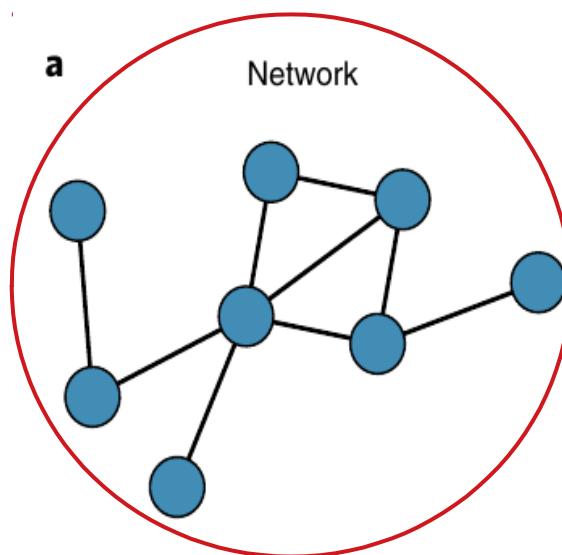
High-order Structures



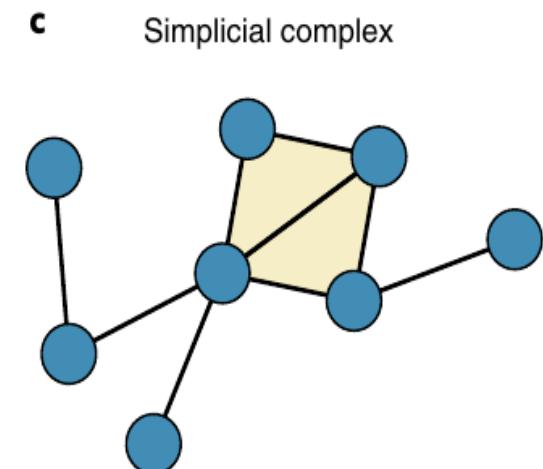
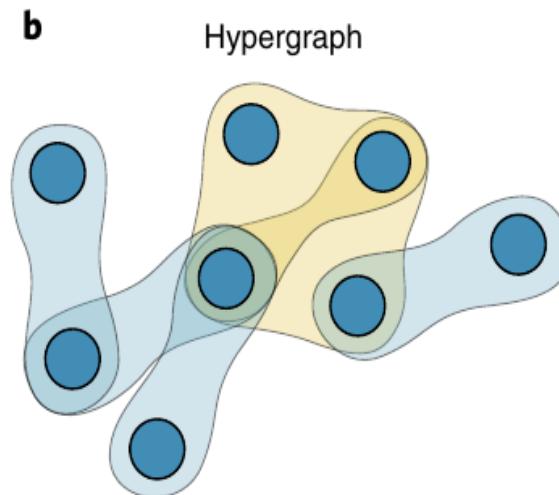
Battiston et al., Nat. Phys., 2021

High-order Structures

adjacency matrix



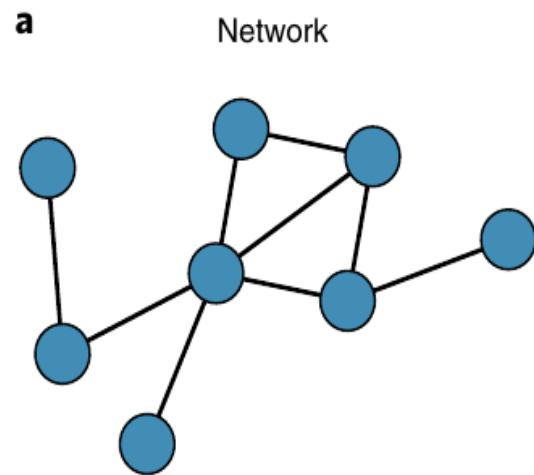
adjacency tensors



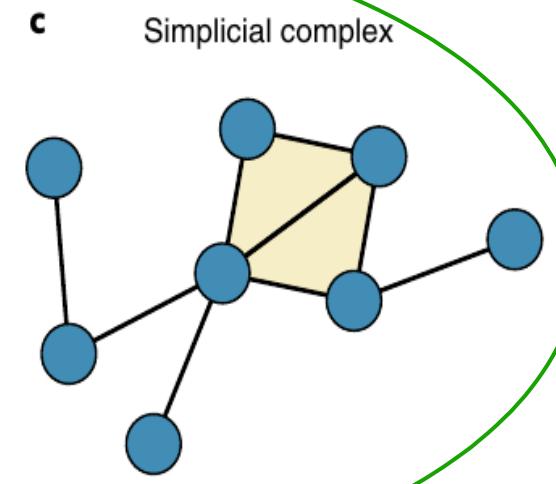
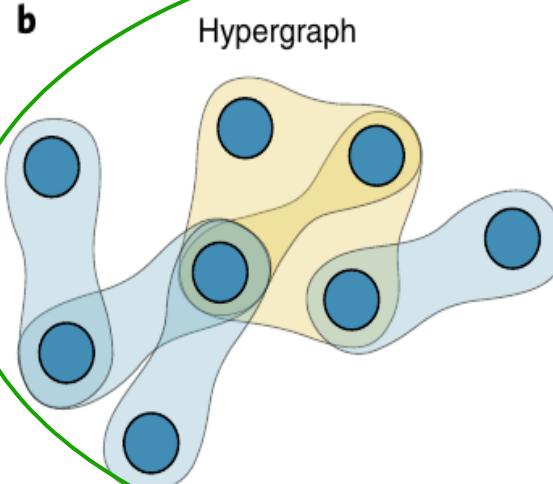
Battiston et al., Nat. Phys., 2021

High-order Structures

adjacency matrix



adjacency tensors



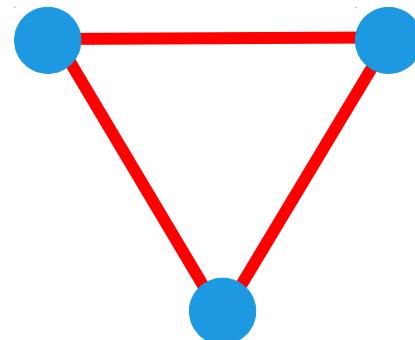
Battiston et al., Nat. Phys., 2021

High-order coupled oscillators

$$\dot{\vec{x}}_i = \vec{f}(\vec{x}_i) + \sigma_1 \sum_j A_{ij}^{(1)} \vec{g}^{(1)}(\vec{x}_i, \vec{x}_j)$$

dynamics of x_i

pairwise coupling

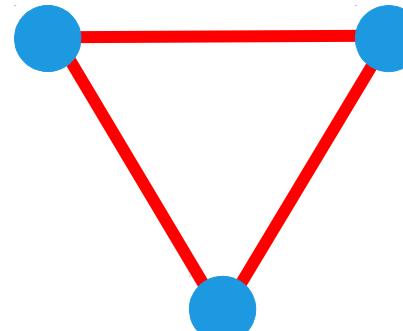


High-order coupled oscillators

$$\dot{\vec{x}}_i = \vec{f}(\vec{x}_i) + \sigma_1 \sum_j A_{ij}^{(1)} \vec{g}^{(1)}(\vec{x}_i, \vec{x}_j) + \sigma_2 \sum_{j,k} A_{ijk}^{(2)} \vec{g}^{(2)}(\vec{x}_i, \vec{x}_j, \vec{x}_k)$$

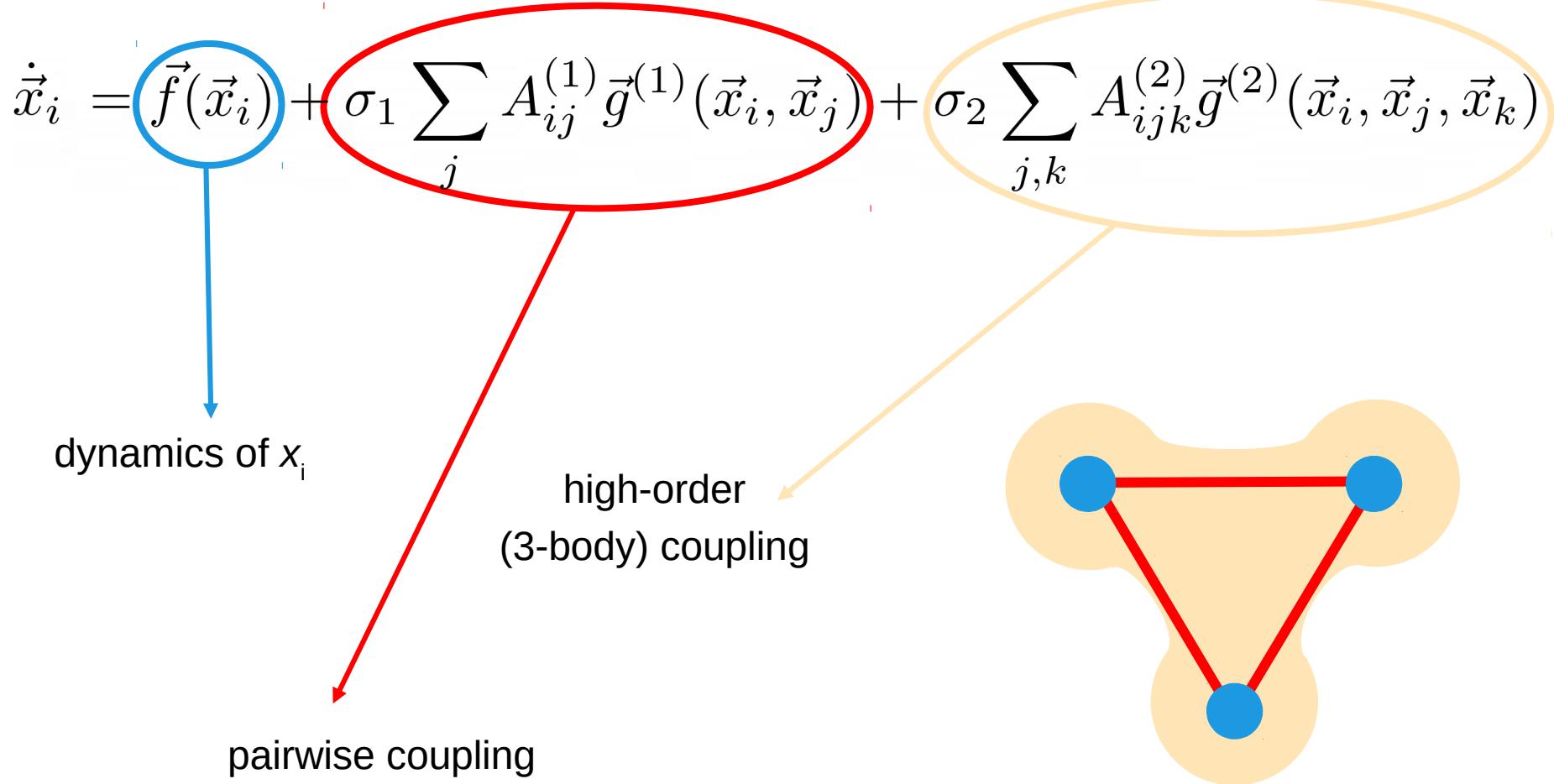
dynamics of x_i

pairwise coupling



The diagram shows a triangular network of three blue circular nodes connected by red lines. The top-left node has a blue arrow pointing downwards to the text 'dynamics of x_i '. A red arrow points from the text 'pairwise coupling' to the bottom edge of the triangle.

High-order coupled oscillators



Dynamics on high-order structures



ARTICLE

<https://doi.org/10.1038/s41467-021-21486-9>

OPEN

Check for updates

Stability of synchronization in simplicial complexes

L. V. Gambuzza^{1,12}, F. Di Patti^{1,12}, L. Gallo^{1,3,4,12}, S. Lepri², M. Romance^{1,5}, R. Criado⁵, M. Frasca^{1,6,13}, V. Latora^{1,3,4,7,8,13} & S. Boccaletti^{1,2,9,10,11,13}

J.Phys.Complex. **1** (2020) 035006 (16pp)

Journal of Physics: Complexity

PAPER

Dynamical systems on hypergraphs

Timoteo Carletti^{1,4}, Duccio Fanelli² and Sara Nicoletti^{2,3}

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Turing theory in high-order systems



arXiv > nlin > arXiv:2207.03985

Nonlinear Sciences > Pattern Formation and Solitons

[Submitted on 8 Jul 2022]

Turing patterns in systems with high-order interactions

Riccardo Muolo, Luca Gallo, Vito Latora, Mattia Frasca, Timoteo Carletti

$$\begin{aligned}\dot{u}_i = & f_1(u_i, v_i) + \sigma_1 D_u^{(1)} \sum_{j_1=1}^N A_{ij_1}^{(1)} (h_1^{(1)}(u_{j_1}) - h_1^{(1)}(u_i)) \\ & + \sigma_2 D_u^{(2)} \sum_{j_1=1}^N \sum_{j_2=1}^N A_{ij_1 j_2}^{(2)} (h_1^{(2)}(u_{j_1}, u_{j_2}) - h_1^{(2)}(u_i, u_i)) \\ \dot{v}_i = & f_2(u_i, v_i) + \sigma_1 D_v^{(1)} \sum_{j_1=1}^N A_{ij_1}^{(1)} (h_2^{(1)}(v_{j_1}) - h_2^{(1)}(v_i)) \\ & + \sigma_2 D_v^{(2)} \sum_{j_1=1}^N \sum_{j_2=1}^N A_{ij_1 j_2}^{(2)} (h_2^{(2)}(v_{j_1}, v_{j_2}) - h_2^{(2)}(v_i, v_i))\end{aligned}$$

Natural coupling

$$\frac{d}{dt} \vec{\xi} = \left(\mathbb{I}_N \otimes \mathbf{J}_0 + \sigma_1 \mathbf{L}^{(1)} \otimes \mathbf{J}_{H^{(1)}} + \sigma_2 \mathbf{L}^{(2)} \otimes \mathbf{J}_{H^{(2)}} \right) \vec{\xi}$$

Natural coupling

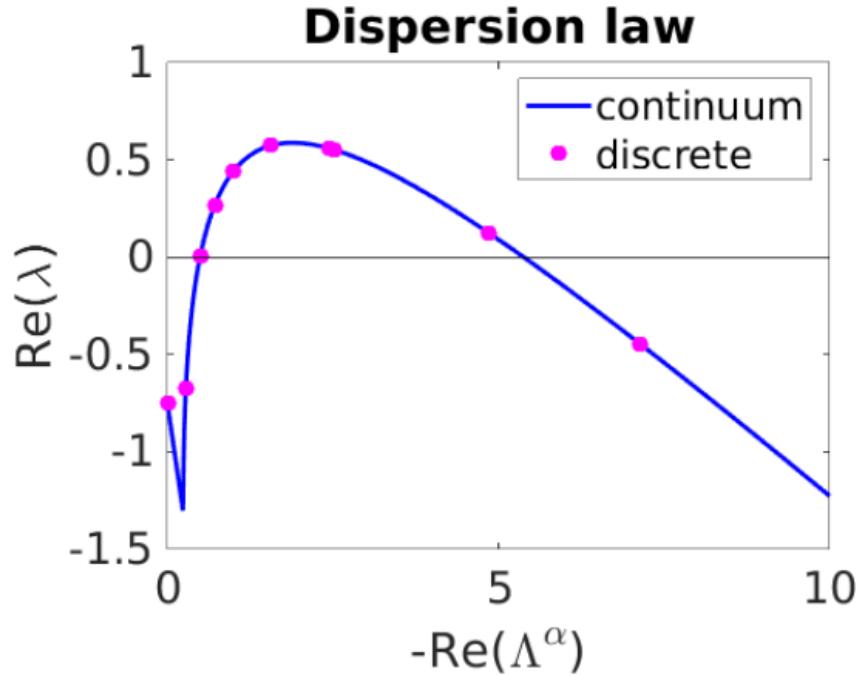
$$\frac{d}{dt} \vec{\xi} = \left(\mathbb{I}_N \otimes \mathbf{J}_0 + \sigma_1 \mathbf{L}^{(1)} \otimes \mathbf{J}_{H^{(1)}} + \sigma_2 \mathbf{L}^{(2)} \otimes \mathbf{J}_{H^{(2)}} \right) \vec{\xi}$$

$$\vec{h}^{(d)}(\vec{x}, \dots, \vec{x}) = \dots = \vec{h}^{(2)}(\vec{x}, \vec{x}) = \vec{h}^{(1)}(\vec{x})$$

same diffusion coefficients
for every order

$$\frac{d}{dt} \vec{\xi} = \left[\mathbb{I}_N \otimes \mathbf{J}_0 + (\sigma_1 \mathbf{L}^{(1)} + \sigma_2 \mathbf{L}^{(2)}) \otimes \mathbf{J}_{H^{(1)}} \right] \vec{\xi}$$

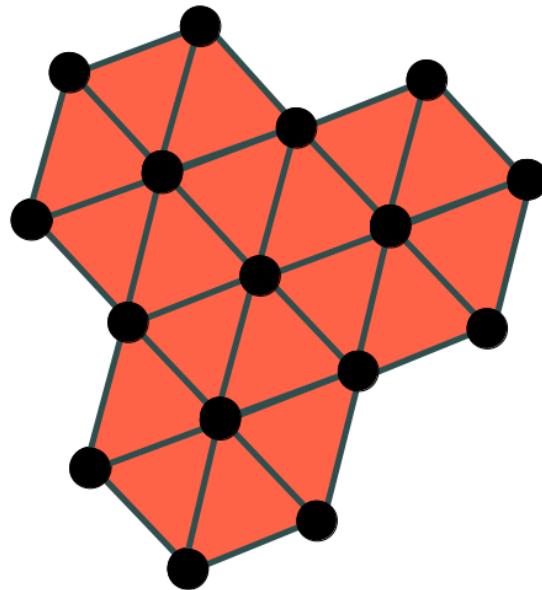
Natural coupling



same diffusion coefficients
for every order

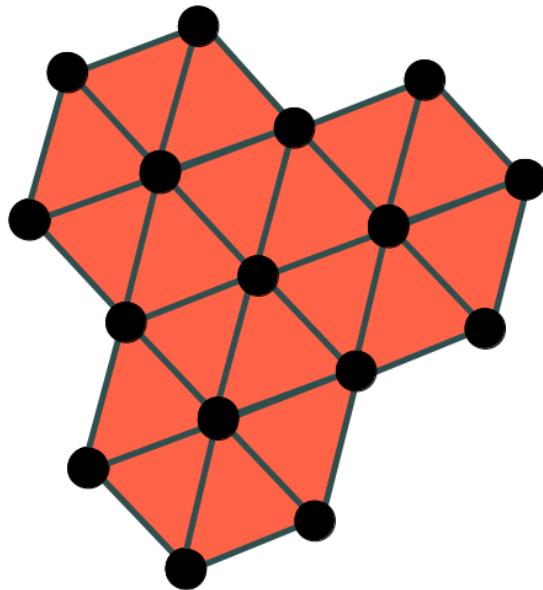
$$\frac{d}{dt} \vec{\xi} = \left[\mathbb{I}_N \otimes \mathbf{J}_0 + (\sigma_1 \mathbf{L}^{(1)} + \sigma_2 \mathbf{L}^{(2)}) \otimes \mathbf{J}_{H^{(1)}} \right] \vec{\xi}$$

Regular topologies

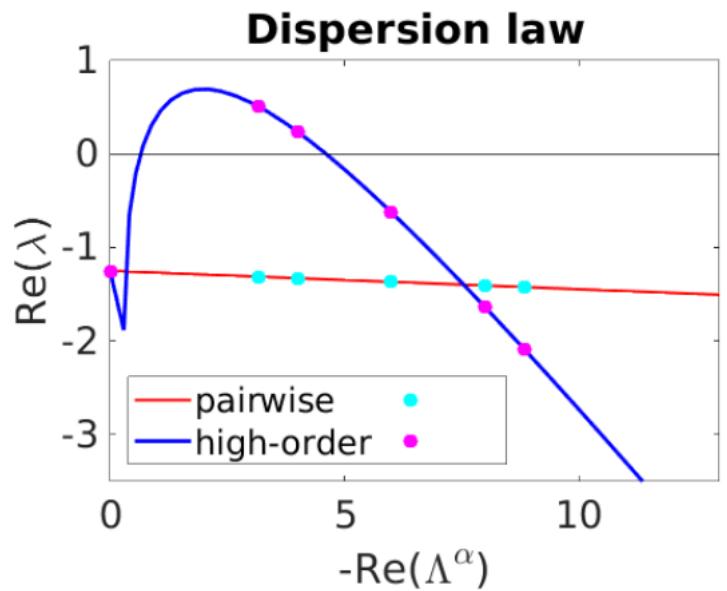


$$\mathbf{L}^{(2)} = 2\mathbf{L}^{(1)}$$

Regular topologies



$$\mathbf{L}^{(2)} = 2\mathbf{L}^{(1)}$$



$$\frac{d}{dt} \vec{\xi} = \left(\mathbb{I}_N \otimes \mathbf{J}_0 + \mathbf{L}^{(1)} \otimes (\sigma_1 \mathbf{J}_{H^{(1)}} + 2\sigma_2 \mathbf{J}_{H^{(2)}}) \right) \vec{\xi}$$

Thank you for your attention

Questions?

Take Home Messages



synchronization of coupled oscillators can be studied in the framework of Turing pattern formation (diffusive coupling)

the topology greatly affects the stability of the synchronized state and a linear stability analysis may fail in its predictions

the theory can be extended in the framework of high-order interactions



LinkedIn Riccardo Muolo

