

# STATISTICAL MECHANICS FOR COMPLEXITY

## A CELEBRATION OF THE 80TH BIRTHDAY OF CONSTANTINO TSALLIS

RIO DE JANEIRO, 6 TO 10 NOVEMBER 2023



# Footprints of $q$ -Statistics at the ‘Edge of Chaos’

Other fragments from the last 20-years of collaboration with  
Constantino

**Alessandro Pluchino**

Department of Physics and Astronomy “E.Majorana”  
University of Catania and INFN sezione di Catania, Italy



2002

work-time-line



International Workshop  
**Anomalous distributions, non-linear dynamics and non-extensivity**  
Santa Fè, New Mexico (USA)

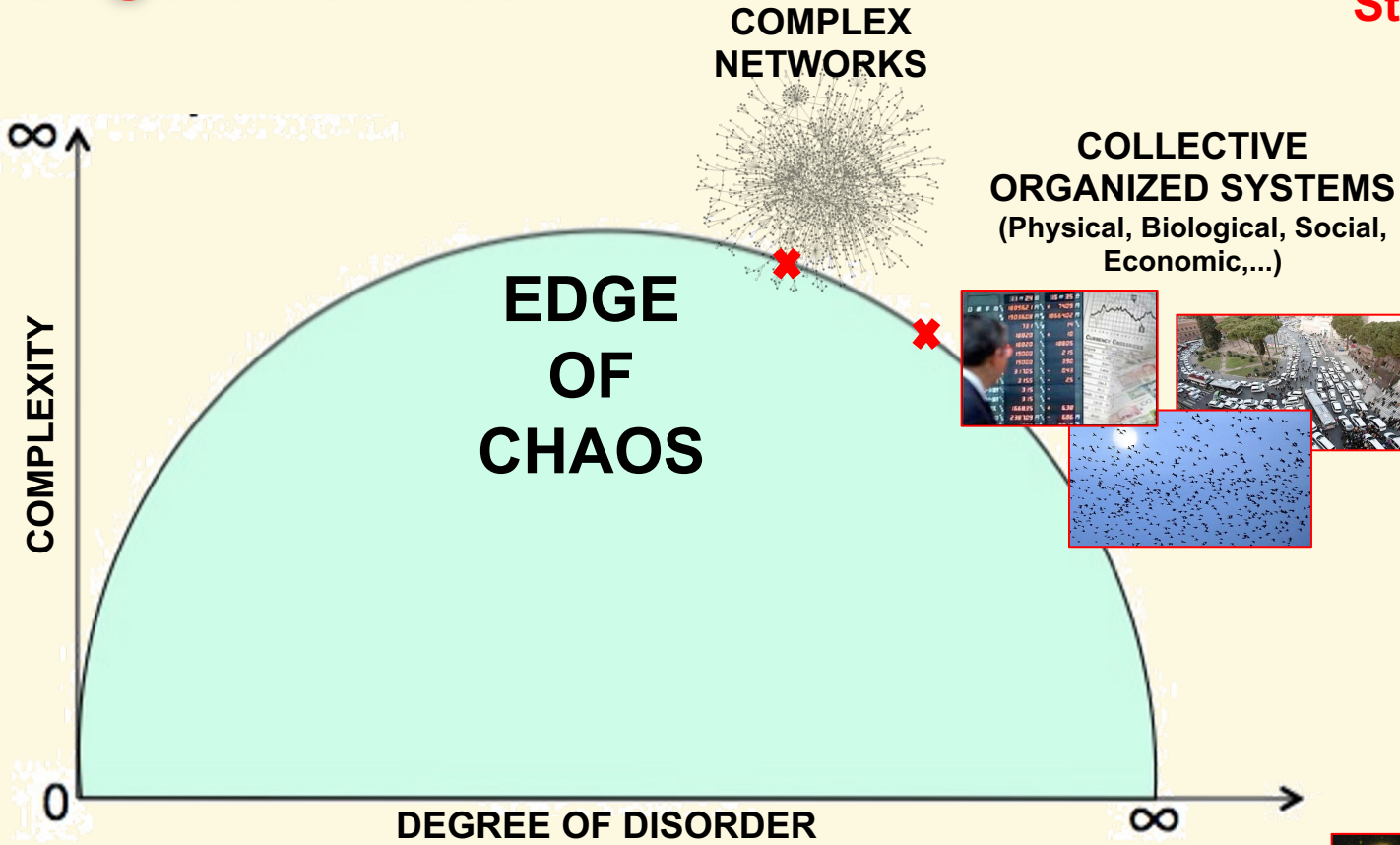
**Econophysics Colloquium**  
Lipari (Italy)

2023



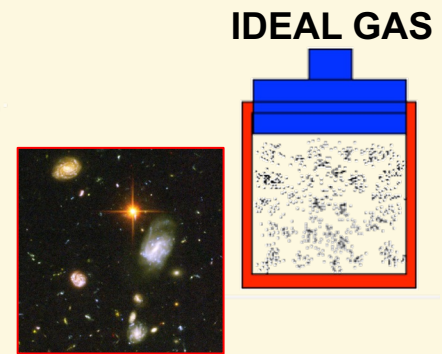
# A Long-standing Journey at the 'Edge of Chaos'

**Tsallis**  
**Statistical Mechanics**



**Boltzmann-Gibbs**  
**Statistical Mechanics**

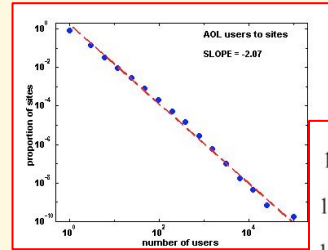
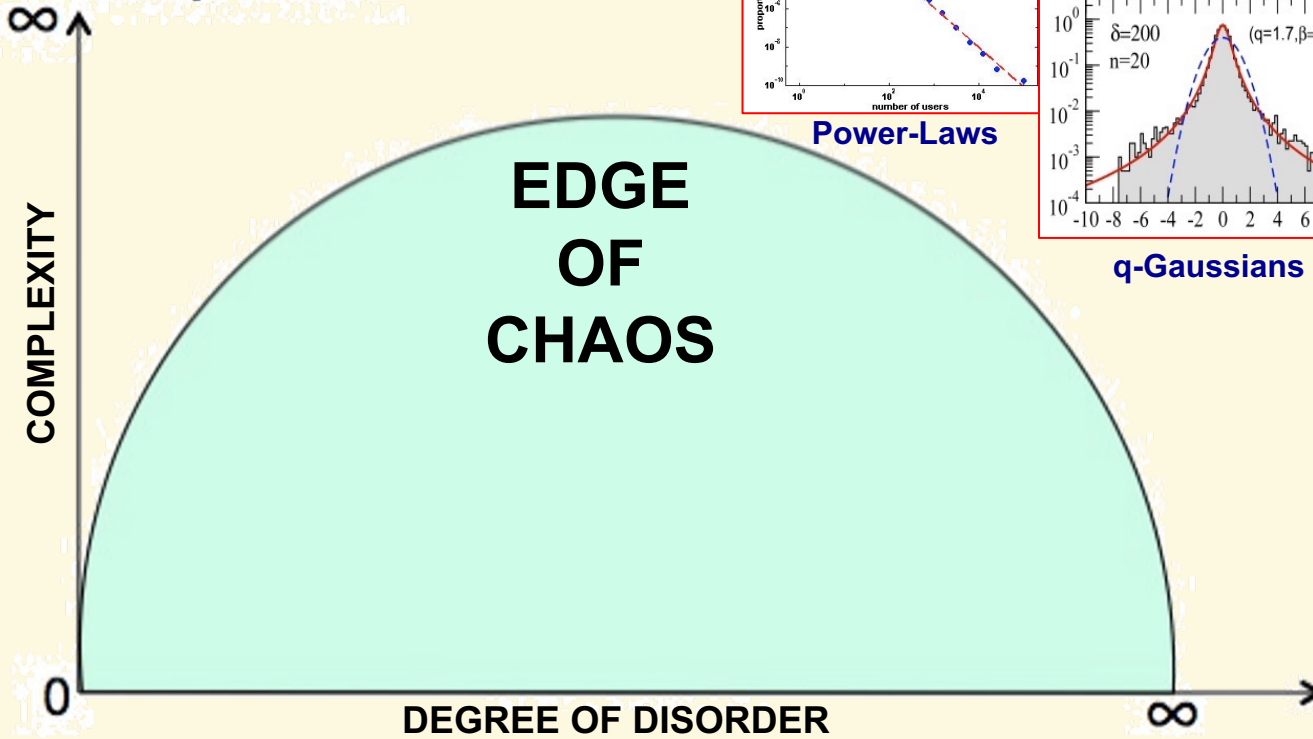
**STRONG**  
**CHAOS**



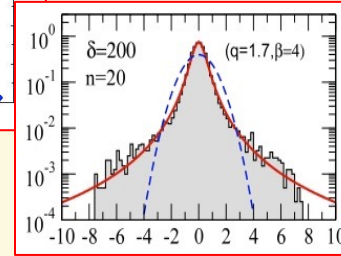
**UNIVERSE AS AN IDEAL GAS OF GALAXIES**

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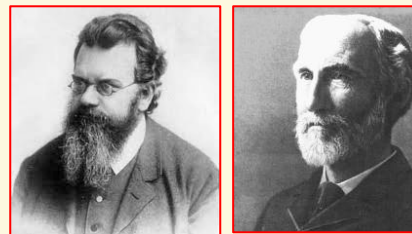
**Tsallis  
Statistical Mechanics**



**Power-Laws**

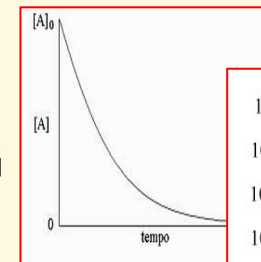


**q-Gaussians**

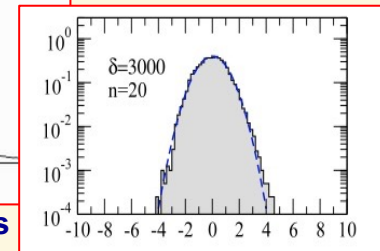


**Boltzmann-Gibbs  
Statistical Mechanics**

**STRONG  
CHAOS**



**Exponentials**



**Gaussians**

# A Long-standing Journey at the 'Edge of Chaos'

**Tsallis**  
**Statistical Mechanics**

UNIVERSITÀ DEGLI STUDI DI CATANIA  
DOTTORATO DI RICERCA IN FISICA

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ALESSANDRO PLUCHINO

METASTABILITY, NONEXTENSIVITY  
AND GLASSY DYNAMICS  
IN A CLASS OF LONG-RANGE HAMILTONIAN  
MODELS



TUTOR: CHIAR.MO PROF.A.RAPISARDA




TESI PER IL CONSEGUIMENTO DEL TITOLO

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XVII CICLO, 2001-2004

## My PhD Thesis 2002-2004

- 
- 2004** - A Pluchino, V Latora, A Rapisarda  
**Dynamics and thermodynamics of a model with long-range interactions**  
Continuum Mechanics and Thermodynamics 16, 245-255
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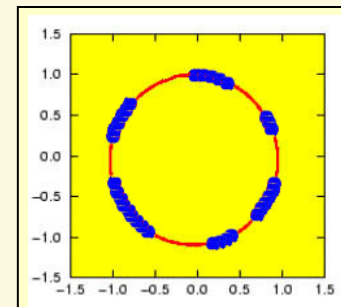
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**Talk of  
Andrea Rapisarda**

## First Step



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**2020** - A Greco, **C Tsallis**, A Rapisarda, A Pluchino, G Fichera, L Contrafatto

Acoustic emissions in compression of building materials: q-statistics enables the anticipation of the breakdown point.

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**2023** - S Vinciguerra, A Greco, A Pluchino, A Rapisarda, **C Tsallis**

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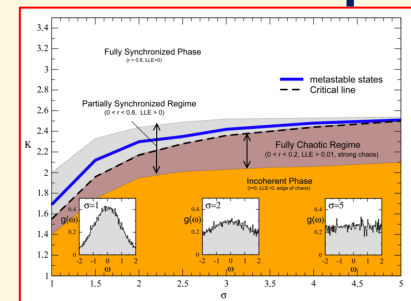
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## Second Step



 **symmetry**

**Special Issue**

**"Hamiltonian and Overdamped Complex Systems"**

Guest Editors:  
Prof. Dr. Antonio Rodriguez, Prof. Dr. Alessandro Pluchino, Prof. Dr. Ugur Tirnakli

Deadline for manuscript submissions: **31 March 2024**

**IMPACT FACTOR 2.645**

**CITESCORE 2.5 SCOPUS**

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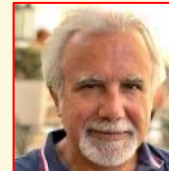
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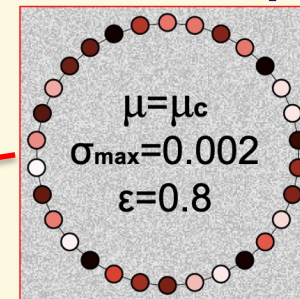
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### Third Step



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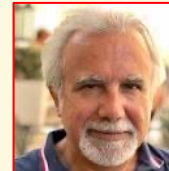
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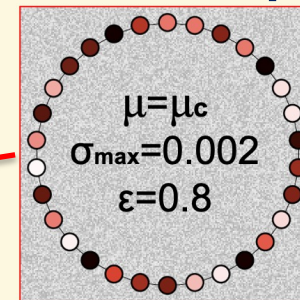
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## Third Step



Talk of  
Annalisa Greco

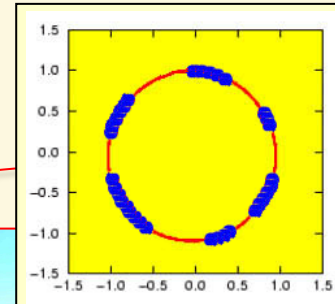


**2002**

**work-time-line**



**2004-2006**



**2023**



# Hamiltonian Mean-Field (HMF) Model and the Statistical Mechanics of Coupled Oscillators

$$H = K + V = \sum_{i=1}^N \frac{p_i^2}{2} + \frac{1}{2N} \sum_{i,j=1}^N [1 - \cos(\vartheta_i - \vartheta_j)]$$

Antoni and Ruffo PRE 52 (1995) 2361

order parameter

$$\vec{M} = \frac{1}{N} \sum_{i=1}^N \vec{S}_i = M e^{i\phi}$$

$F$  = free energy density

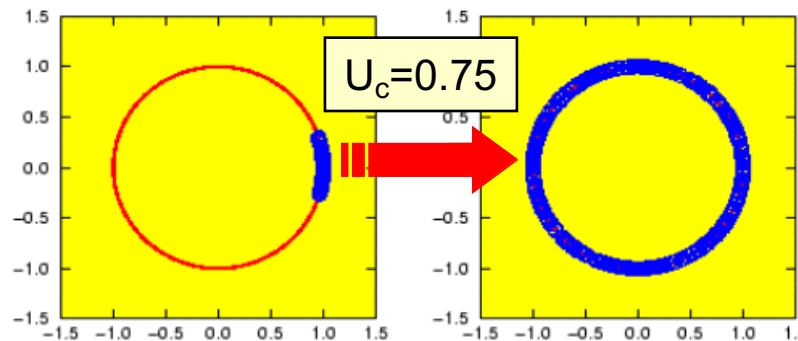
$$\beta = \frac{1}{T} \quad (k_B = 1)$$

$T$  = temperature

Caloric Curve  $\Rightarrow$

$$U = \frac{H}{N} = \frac{\partial(\beta F)}{\partial \beta} = \frac{1}{2\beta} + \frac{1}{2}(1 - M^2)$$

**AT EQUILIBRIUM...**



$M \sim 1$   
 $U < U_c$   
 Condensed Phase

$M \sim 0$   
 $U > U_c$   
 Homogeneous Phase

# Hamiltonian Mean-Field (HMF) Model and the Statistical Mechanics of Coupled Oscillators

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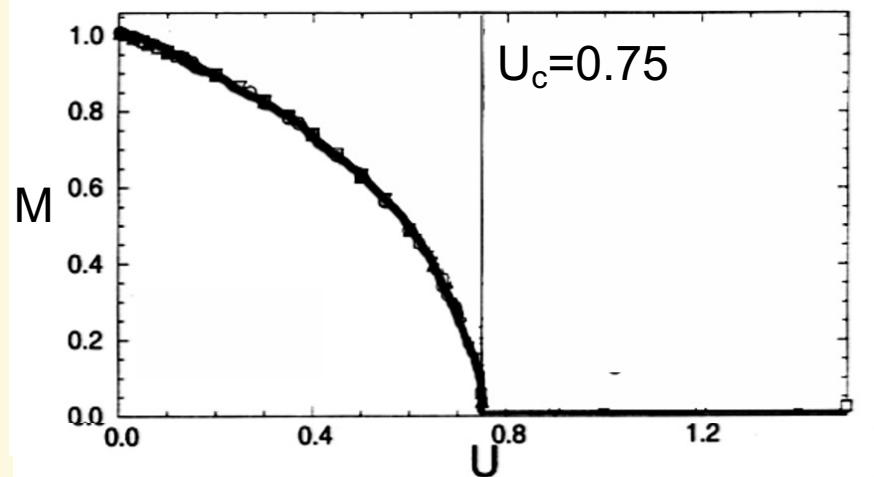
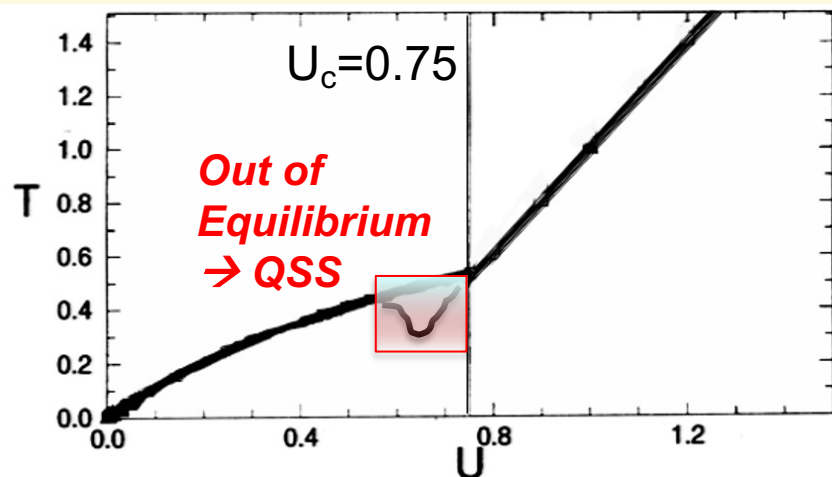
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Caloric Curve



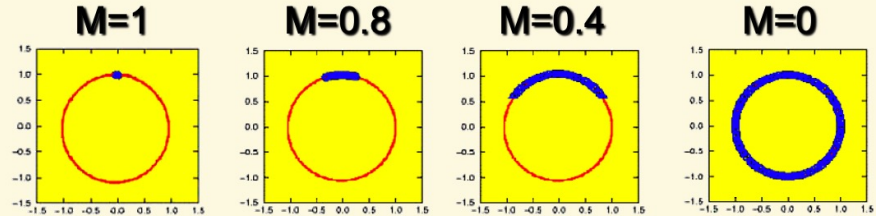
**AT EQUILIBRIUM...**



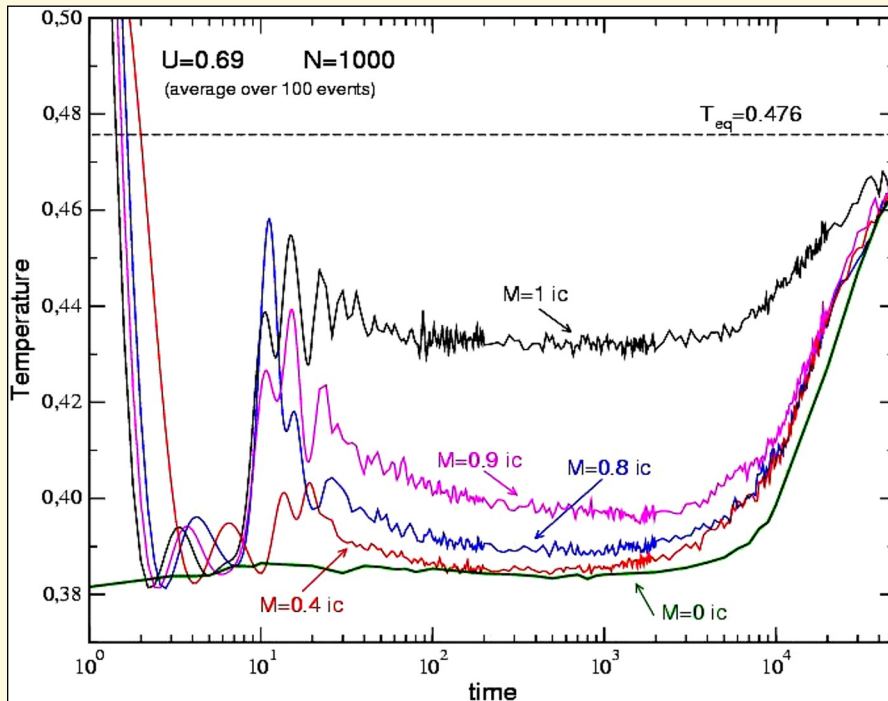
# Correlations and Glassy dynamics in the QSS Regime of the HMF Model

Decoupled equations of motion:

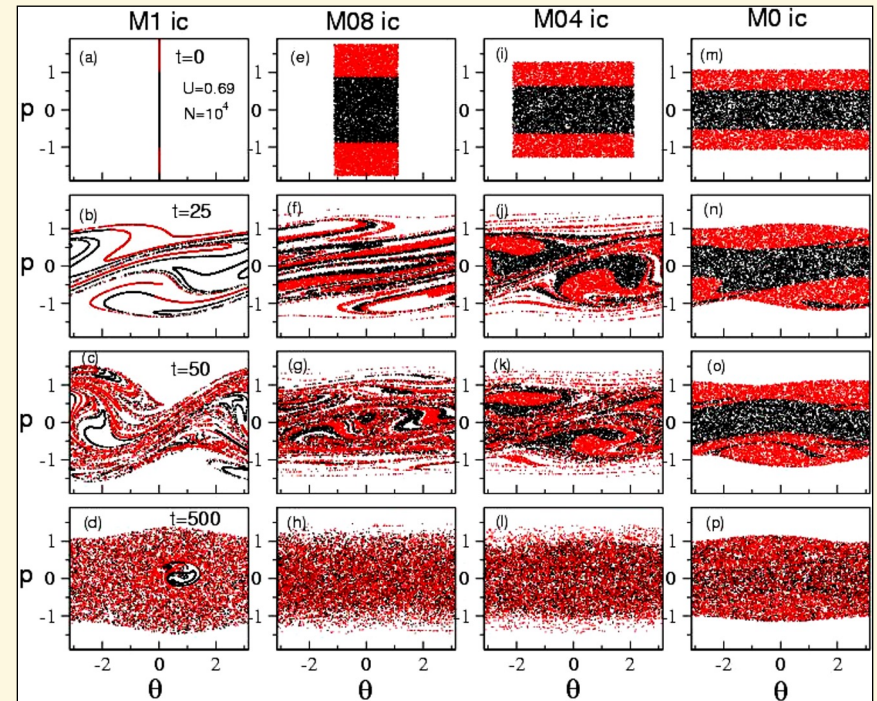
$$\ddot{\theta}_i + M \sin(\theta_i - \phi) = 0 \quad i = 1, \dots, N$$



QSS Regime for several IC

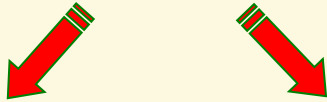
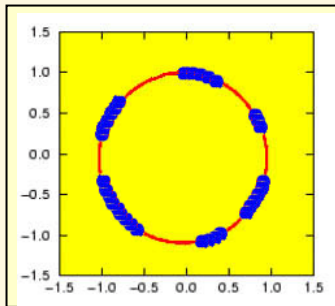


$\mu$ -Space Correlations for several IC



# Correlations and Glassy dynamics in the QSS Regime of the HMF Model

Clusters Competition



**NON  
EXTENSIVE  
EFFECTS**

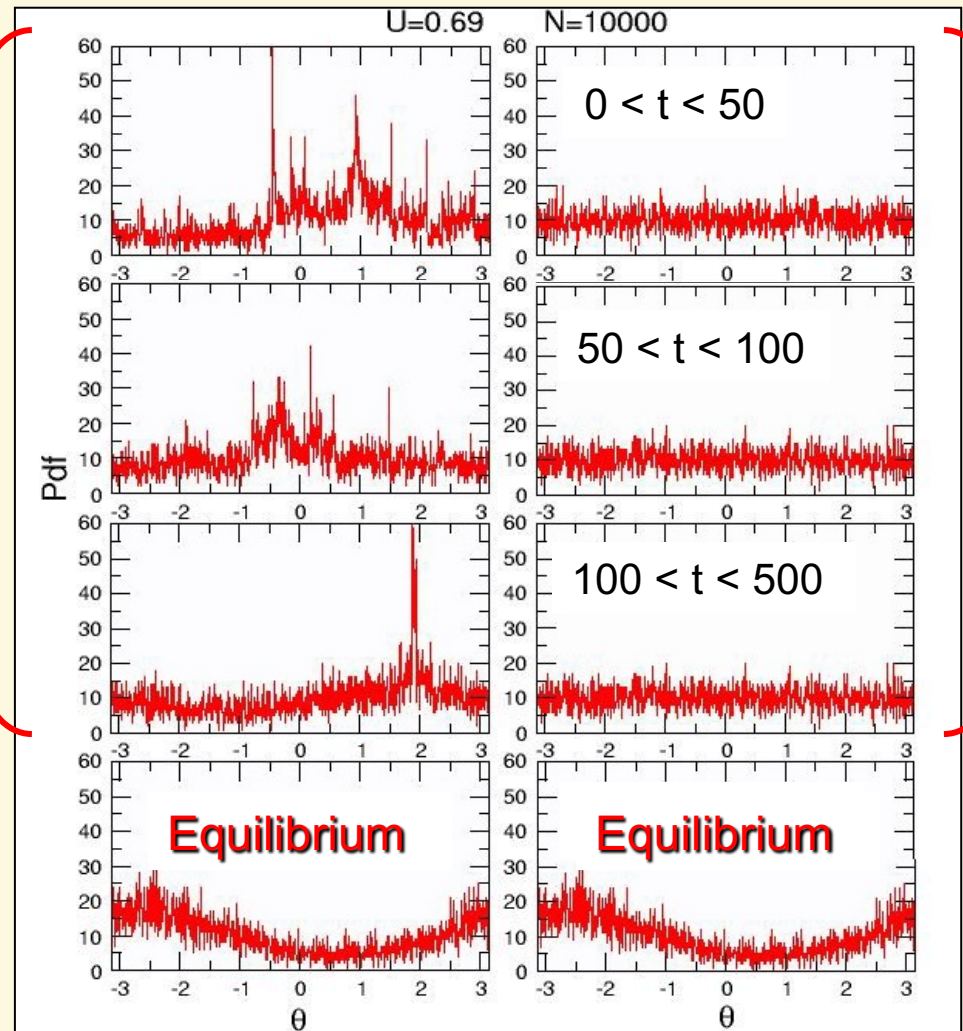
Andrea's Talk

**DYNAMICAL  
FRUSTRATION**

**QSS Regime**

M1 IC

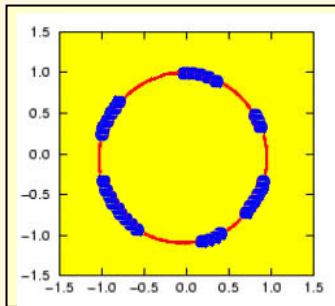
M0 IC





# Correlations and Glassy dynamics in the QSS Regime of the HMF Model

## Clusters Competition



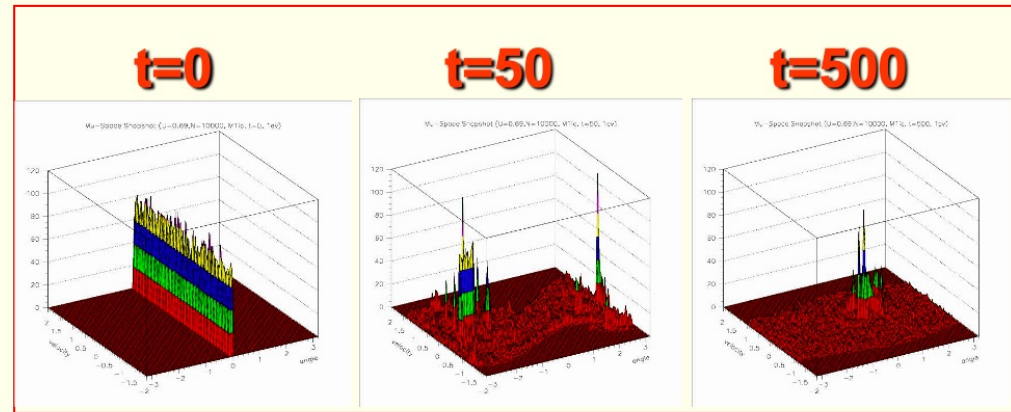
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Andrea's Talk

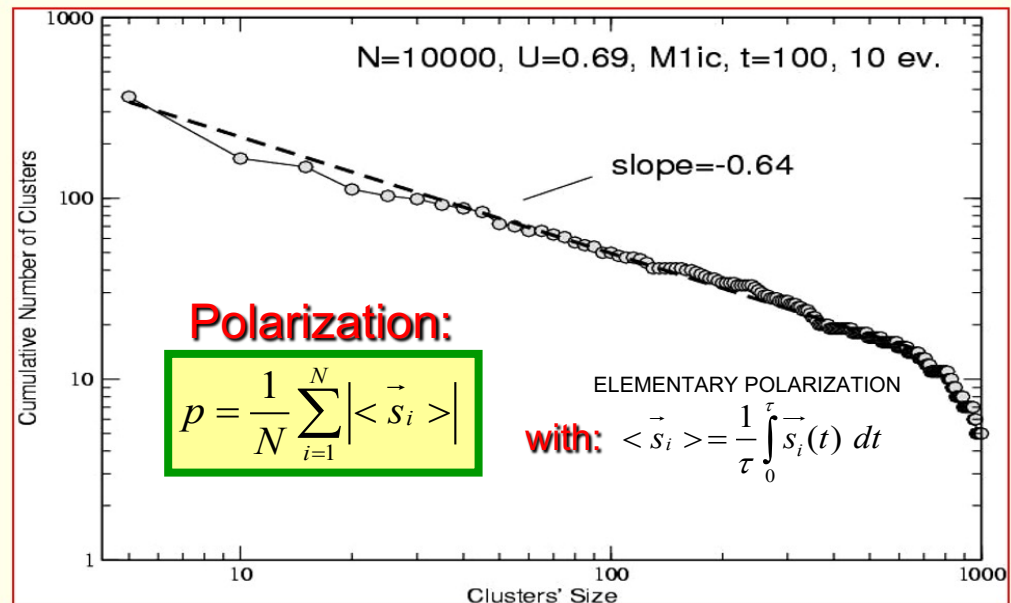
**DYNAMICAL  
FRUSTRATION**



**WEAK ERGODICITY  
BREAKING**

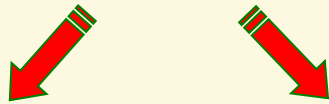
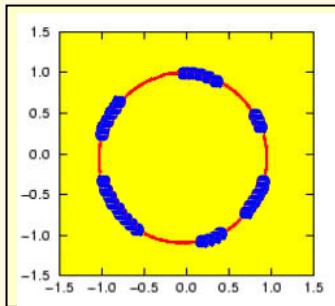


## Cumulative Number of Clusters



# Correlations and Glassy dynamics in the QSS Regime of the HMF Model

## Clusters Competition



**NON  
EXTENSIVE  
EFFECTS**

Andrea's Talk

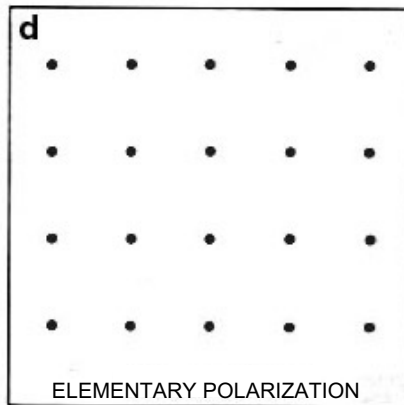
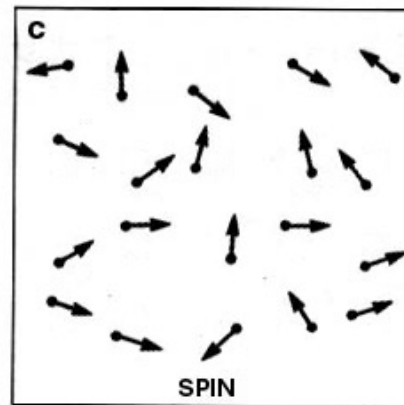
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**WEAK ERGODICITY  
BREAKING**

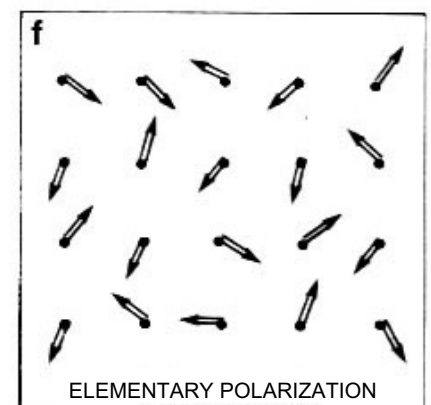
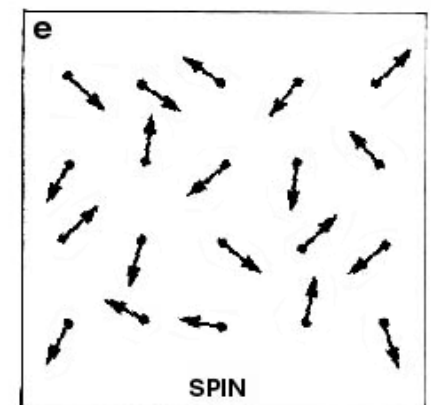
**HOMOGENEOUS  
PHASE:**

$$M = p \sim 0$$



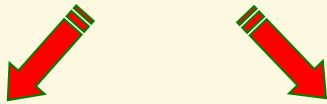
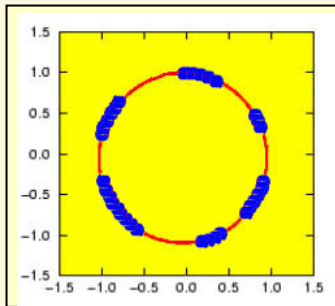
**SPIN GLASS  
PHASE:**

$$M \sim 0 \quad p \neq 0$$



# Correlations and Glassy dynamics in the QSS Regime of the HMF Model

## Clusters Competition



**NON  
EXTENSIVE  
EFFECTS**

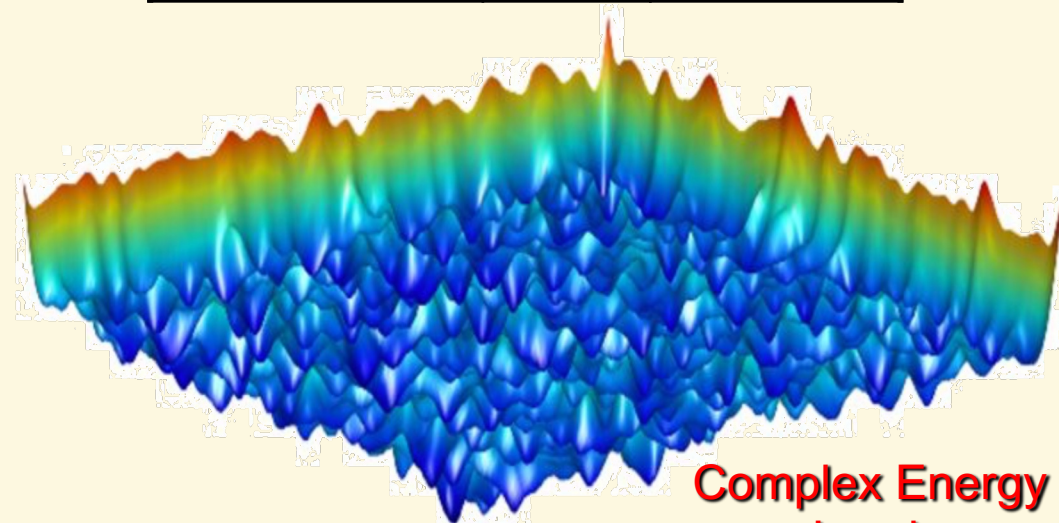
Andrea's Talk

**DYNAMICAL  
FRUSTRATION**



**WEAK ERGODICITY  
BREAKING**

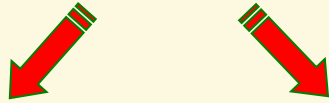
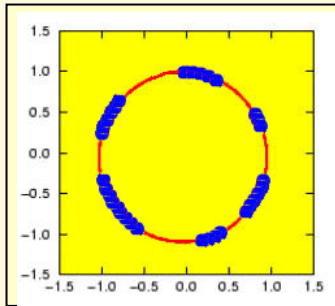
<i>Phase</i>	<i>Order Parameters</i>	
<i>Condensed</i>	$p = M \neq 0$	
<i>Homogeneous</i>	$p = M \sim 0$	
<i>SPIN GLASS (QSS regime)</i>	$p \neq 0$	$M \rightarrow 0$



**Complex Energy  
Landscape**

# Correlations and Glassy dynamics in the QSS Regime of the HMF Model

## Clusters Competition



**NON  
EXTENSIVE  
EFFECTS**

Andrea's Talk

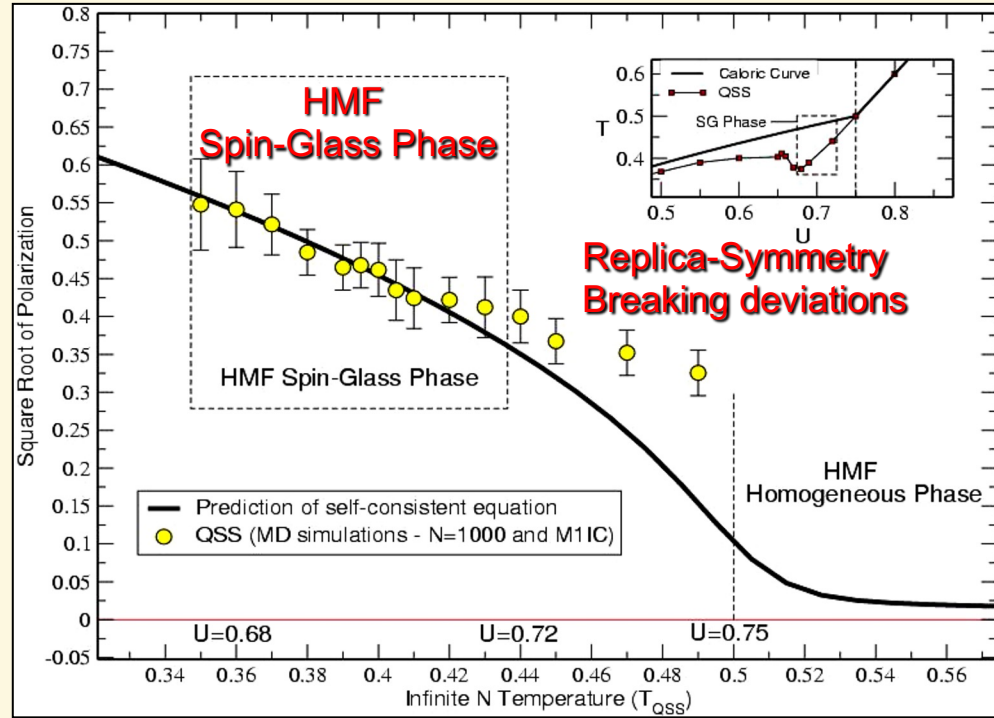
**DYNAMICAL  
FRUSTRATION**



**WEAK ERGODICITY  
BREAKING**



**REPLICA-SYMMETRIC SOLUTION  
FOR THE HMF SPIN-GLASS PHASE**

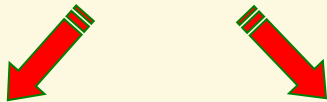
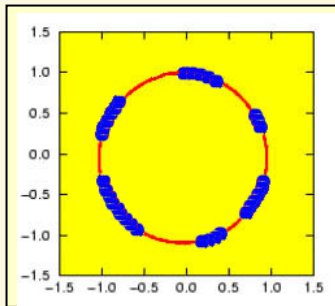


self-consistent equation

$$p = 1 - \sqrt{\frac{2}{p}} \beta^{-1} \int_0^{\infty} r^2 dr \exp\left(-\frac{r^2}{2}\right) \frac{I_1\left[\beta r \sqrt{p/2}\right]}{I_0\left[\beta r \sqrt{p/2}\right]} \quad (8)$$

# Correlations and Glassy dynamics in the QSS Regime of the HMF Model

## Clusters Competition



PRL 102, 097202 (2009)

PHYSICAL REVIEW LETTERS

week ending  
6 MARCH 2009

### Generalized Spin-Glass Relaxation

R. M. Pickup,<sup>1</sup> R. Cywinski,<sup>2,\*</sup> C. Pappas,<sup>3</sup> B. Farago,<sup>4</sup> and P. Fouquet<sup>4</sup>

<sup>1</sup>*School of Physics and Astronomy, University of Leeds, Leeds LS2 9JT, United Kingdom*

<sup>2</sup>*School of Applied Sciences, University of Huddersfield, Huddersfield HD1 3DH, United Kingdom*

<sup>3</sup>*Helmholtz Center Berlin for Materials and Energy, Glienickerstrasse 100, 14109, Berlin, Germany*

<sup>4</sup>*Institut Laue Langevin, 6 rue Jules Horowitz, 38000 Grenoble, France*

(Received 18 July 2008; published 4 March 2009)

Spin relaxation close to the glass temperature of CuMn and AuFe spin glasses is shown, by neutron spin echo, to follow a generalized exponential function which explicitly introduces hierarchically constrained dynamics and macroscopic interactions. The interaction parameter is directly related to the normalized Tsallis nonextensive entropy parameter  $q$  and exhibits universal scaling with reduced temperature. At the glass temperature  $q = 5/3$  corresponding, within Tsallis'  $q$  statistics, to a mathematically defined critical value for the onset of strong disorder and nonlinear dynamics.

DOI: 10.1103/PhysRevLett.102.097202

PACS numbers: 75.50.Lk, 64.70.P-, 75.40.Gb, 76.60.Lz

**NON  
EXTENSIVE  
EFFECTS**

Andrea's Talk

**DYNAMICAL  
FRUSTRATION**



**WEAK ERGODICITY  
BREAKING**

**self-consistent  
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**REPLICA-SYMMETRIC SOLUTION  
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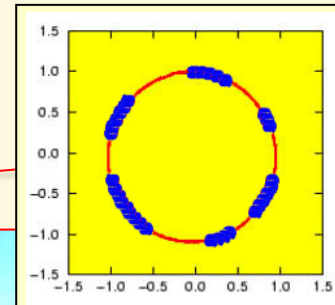
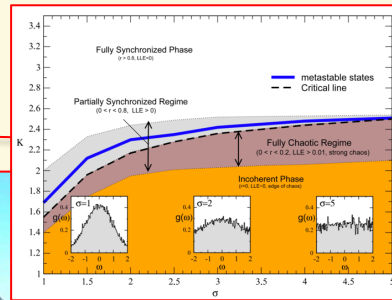
2002

work-time-line



2004-2006

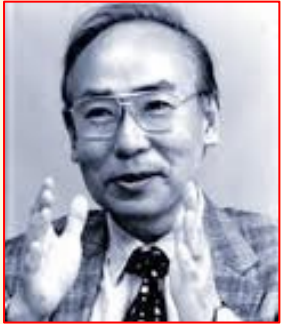
2009



2023



# Kuramoto Model and the Synchronization of Coupled Oscillators

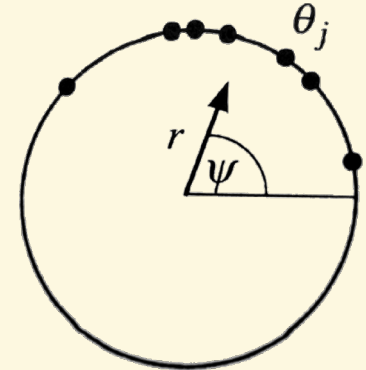


Yoshiki Kuramoto

coupling strength

$$\dot{\theta}_i = \omega_i + \frac{K}{N} \sum_{j=1}^N \sin(\theta_j - \theta_i)$$

natural frequencies



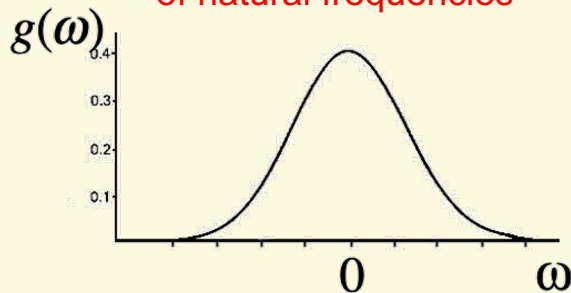
order parameter

Decoupled equations:

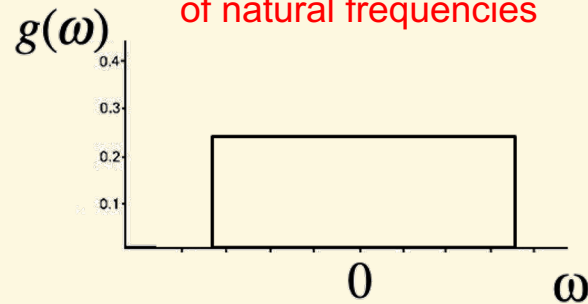
$$\dot{\theta}_i = \omega_i + Kr \sin(\psi - \theta_i), \quad i = 1, \dots, N$$

$$r e^{i\psi} = \frac{1}{N} \sum_{j=1}^N e^{i\theta_j}$$

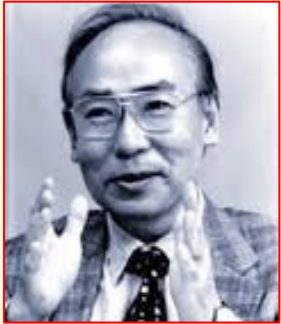
Gaussian Distribution of natural frequencies



Uniform Distribution of natural frequencies



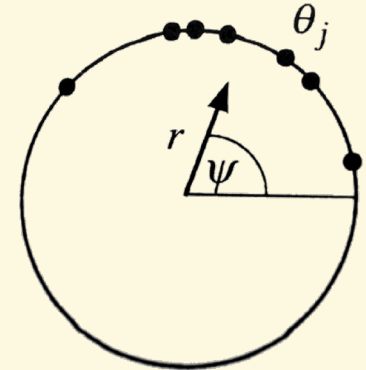
# Kuramoto Model and the Synchronization of Coupled Oscillators



Yoshiki Kuramoto

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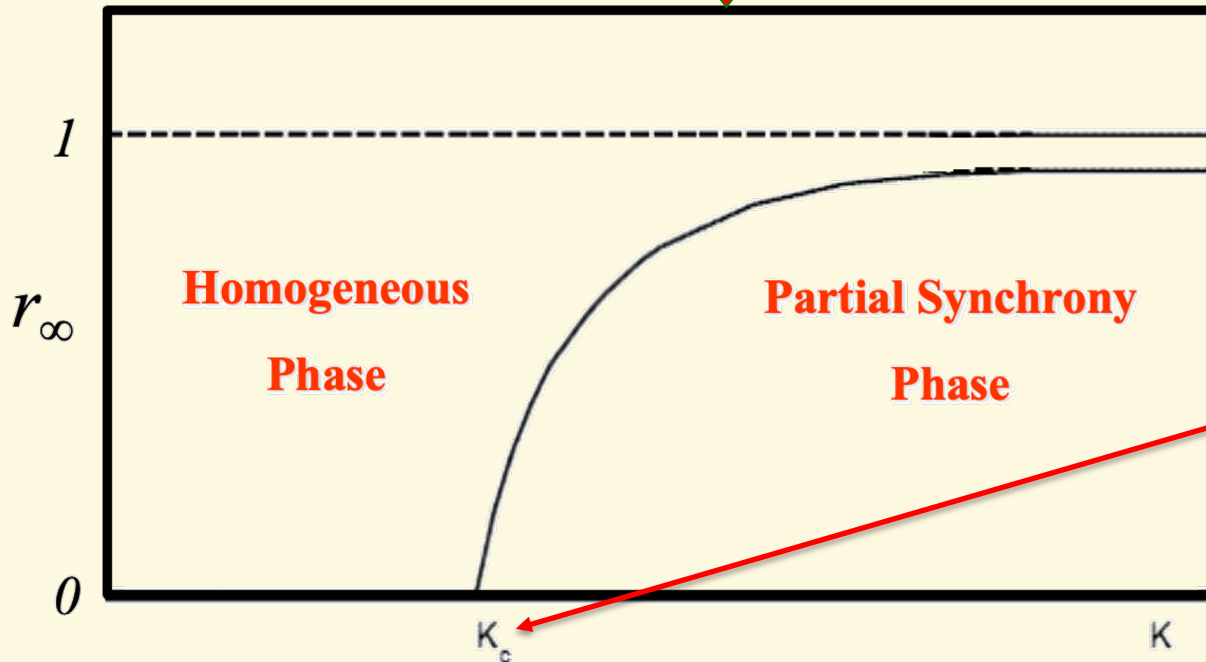


order parameter

$$r e^{i\psi} = \frac{1}{N} \sum_{j=1}^N e^{i\theta_j}$$

critical coupling

$$K_C = \frac{2}{\pi g(0)}$$





# HMF and Kuramoto Model as limiting cases of a Damped-Driven model of Coupled Oscillators

Damped-Driven Oscillators

$$\ddot{\theta}_i + B\dot{\theta}_i + CM \sin(\theta_i - \phi) = \Gamma, \quad i = 1, \dots, N,$$

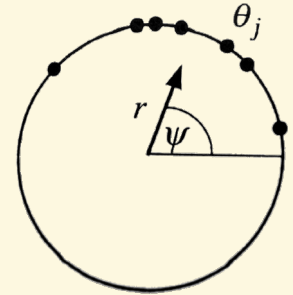
coupling

damping

order parameter

driving

$$M = M e^{i\phi} = \frac{1}{N} \sum_{j=1}^N e^{i\theta_j}$$



## HMF Model

$$\ddot{\theta}_i + M \sin(\theta_i - \phi) = 0$$

Conservative Limit:

$$B = 0$$

$$C = 1$$

$$\Gamma = 0$$

## Kuramoto Model

$$\dot{\theta}_i = \omega_i + Kr \sin(\psi - \theta_i)$$

Overdamped Limit:

$$B \gg 1$$

$$C = K$$

$$\Gamma = \omega$$

$$M = r$$

# Phase Transition and Chaos in the HMF Model

Damped-Driven Oscillators

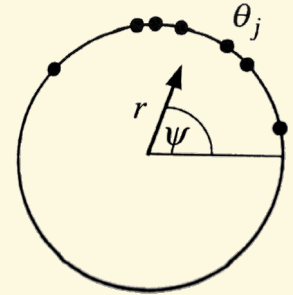
$$\ddot{\theta}_i + B\dot{\theta}_i + CM \sin(\theta_i - \phi) = \Gamma, \quad i = 1, \dots, N,$$

damping

coupling

order parameter

driving



HMF Model

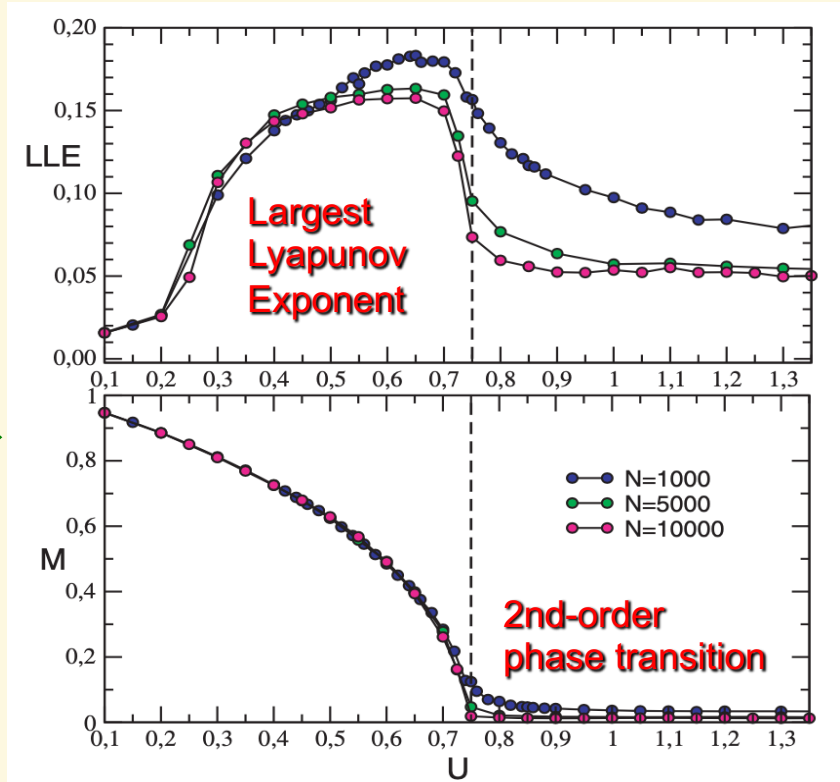
$$\ddot{\theta}_i + M \sin(\theta_i - \phi) = 0$$

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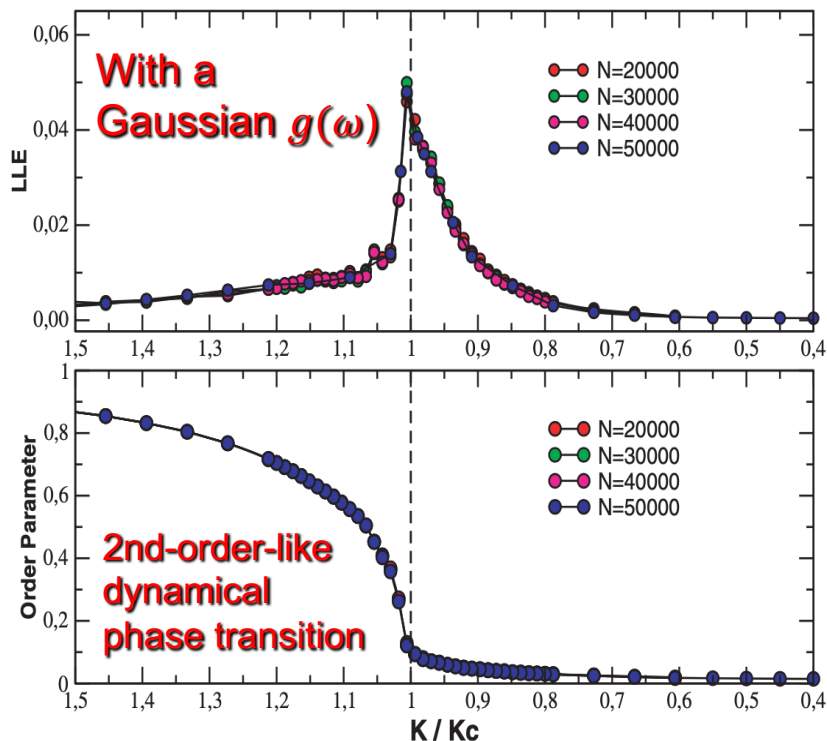
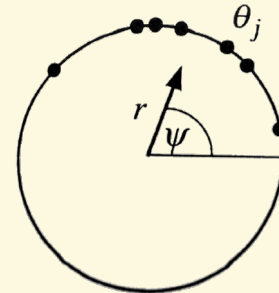
# Phase Transition and Chaos in the Kuramoto Model

Damped-Driven Oscillators

$$\ddot{\theta}_i + B\dot{\theta}_i + CM \sin(\theta_i - \phi) = \Gamma, \quad i = 1, \dots, N,$$

coupling
driving

damping
order parameter



**Kuramoto Model**

$$\dot{\theta}_i = \omega_i + Kr \sin(\psi - \theta_i)$$

**Overdamped Limit:**

$$B \gg 1$$

$$C = K$$

$$\Gamma = \omega$$

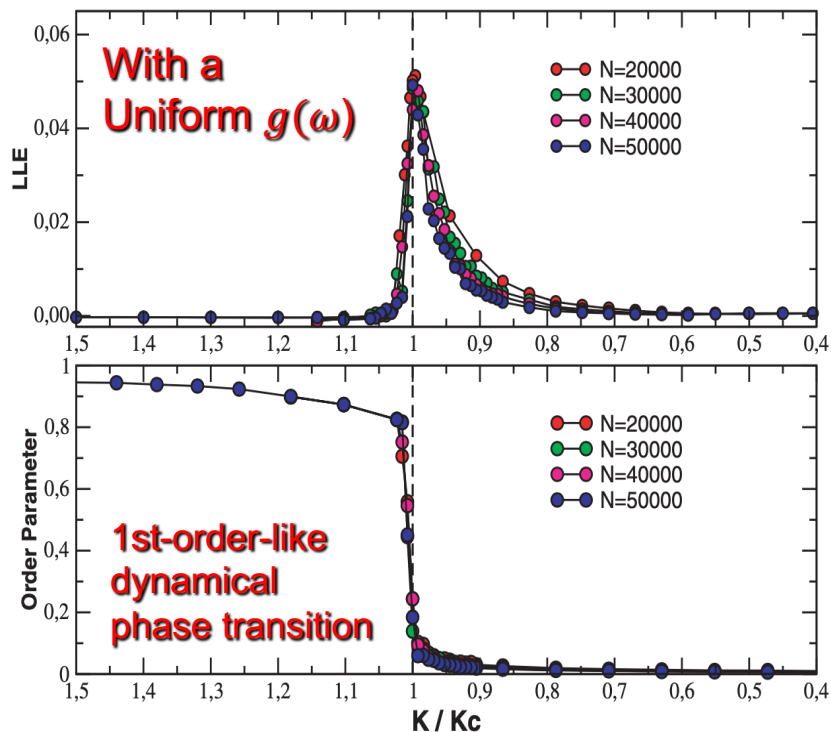
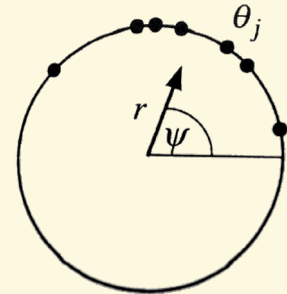
$$M = r$$

# Phase Transition and Chaos in the Kuramoto Model

Damped-Driven Oscillators

$$\ddot{\theta}_i + B\dot{\theta}_i + CM \sin(\theta_i - \phi) = \Gamma, \quad i = 1, \dots, N,$$

coupling
damping
order parameter
driving



**Kuramoto Model**

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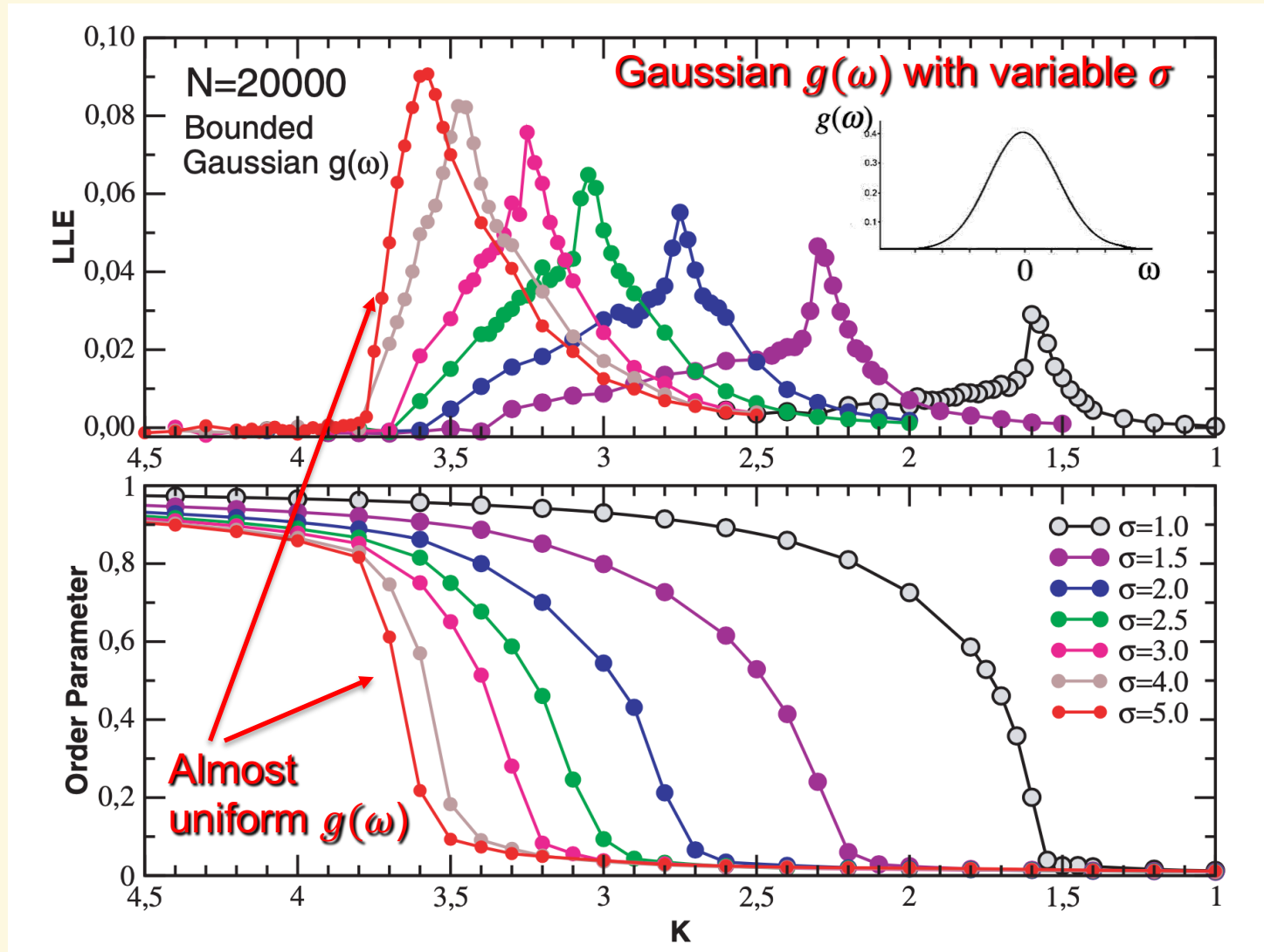
$$B \gg 1$$

$$C = K$$

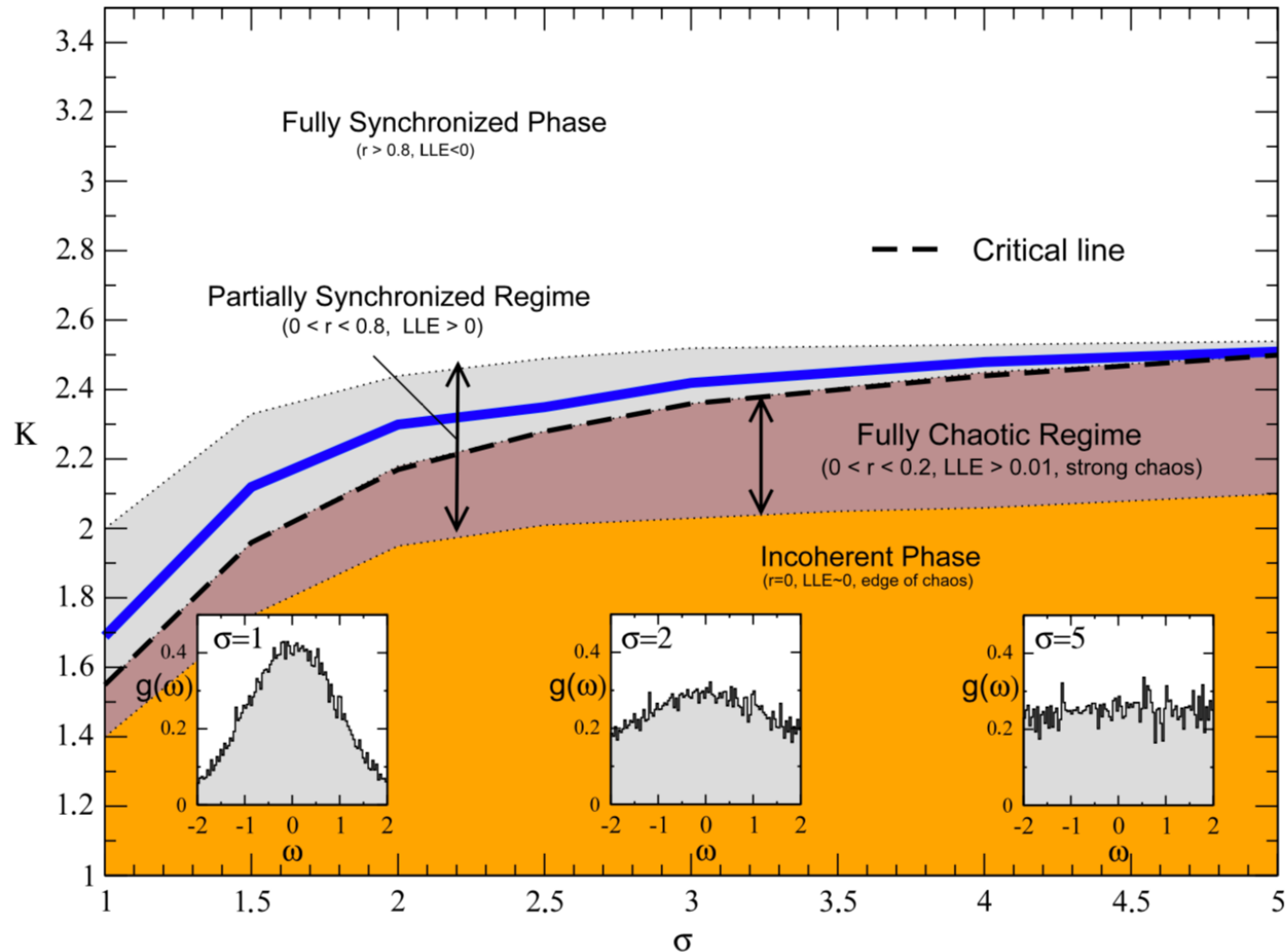
$$\Gamma = \omega$$

$$M = r$$

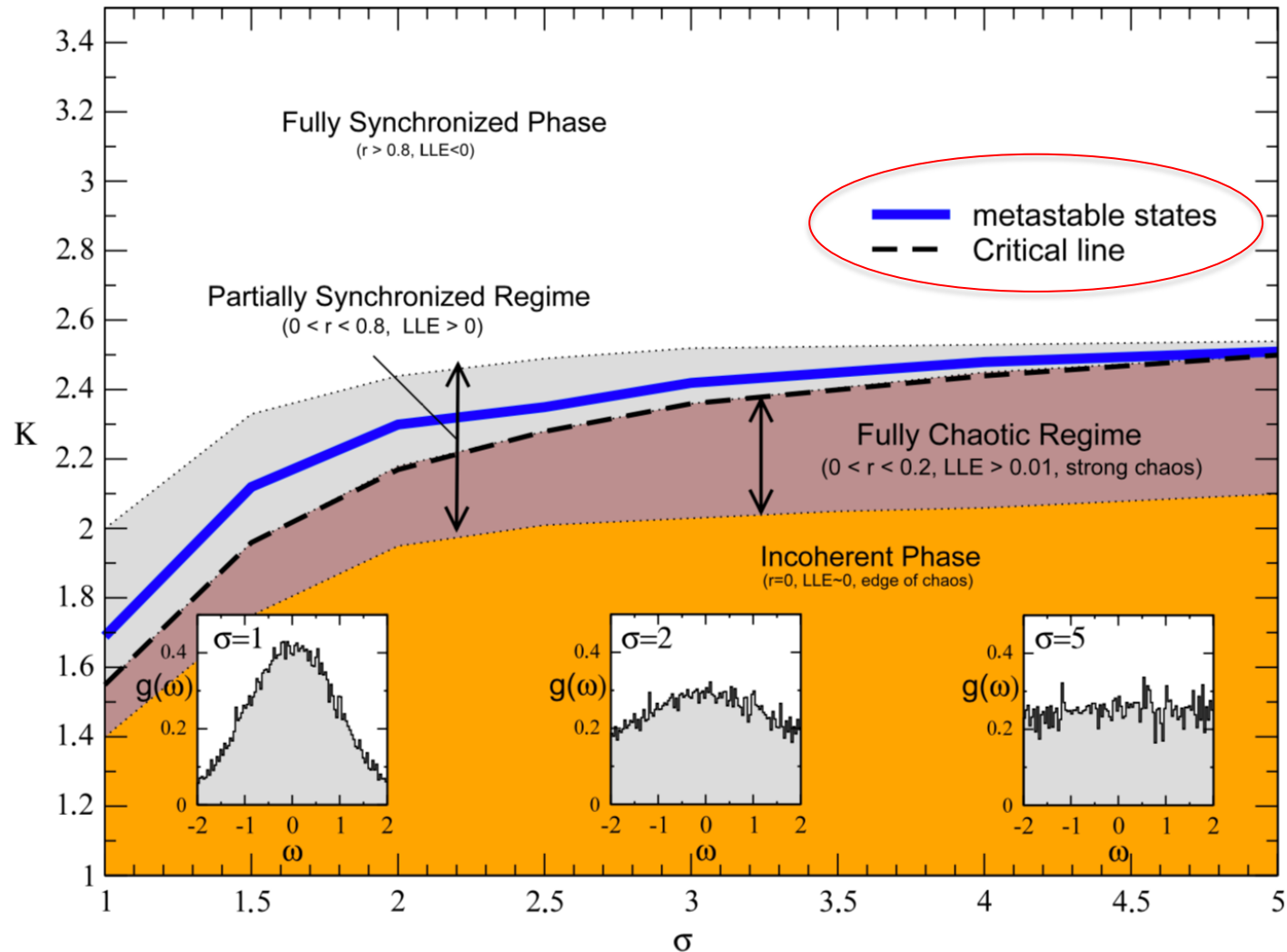
# Phase Transition and Chaos in the Kuramoto Model



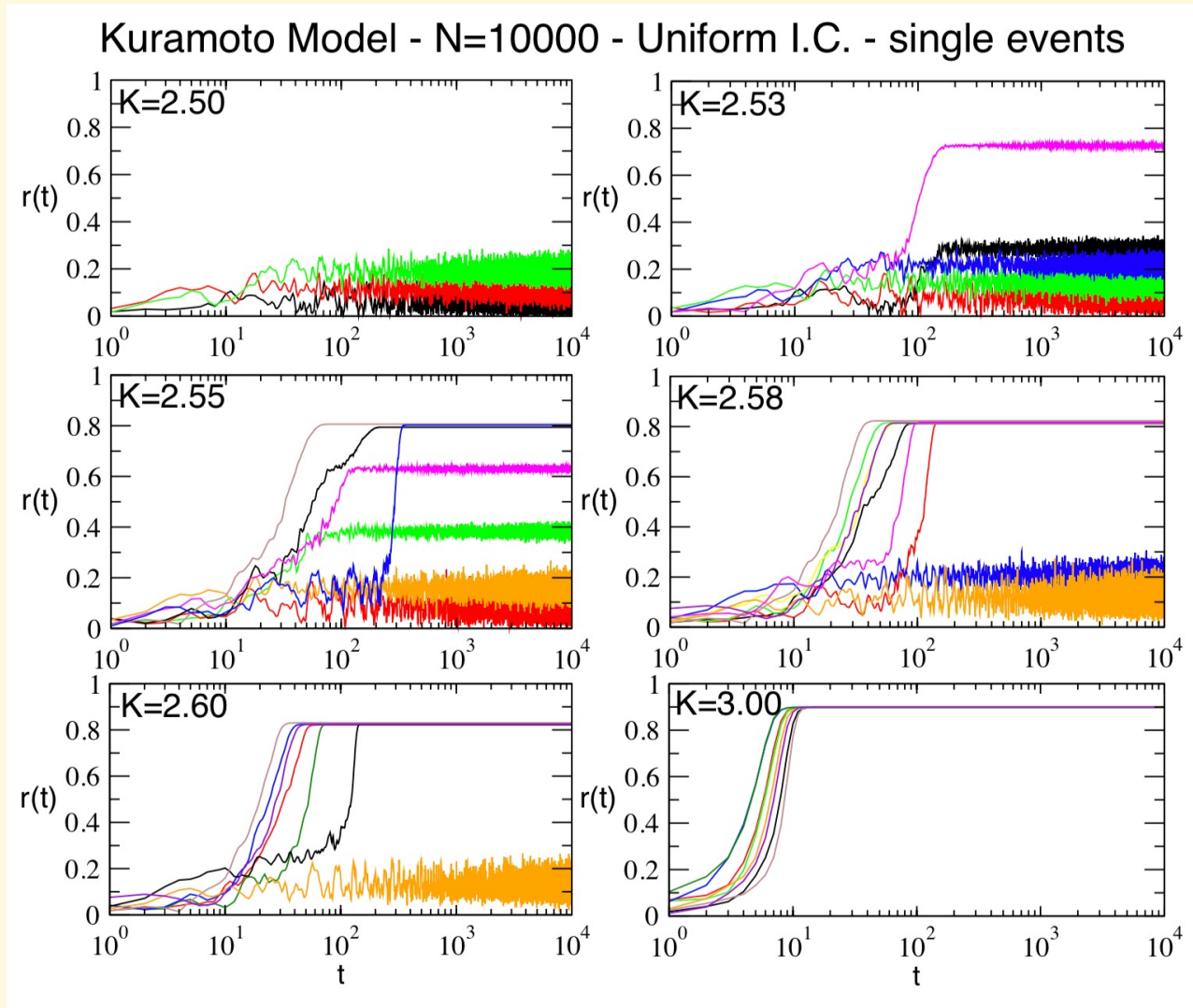
# Phase Diagram of the Kuramoto Model



# Phase Diagram of the Kuramoto Model



# Metastable States in the Kuramoto Model





# Central Limit Behavior in the Kuramoto Model at the “Edge of Chaos”

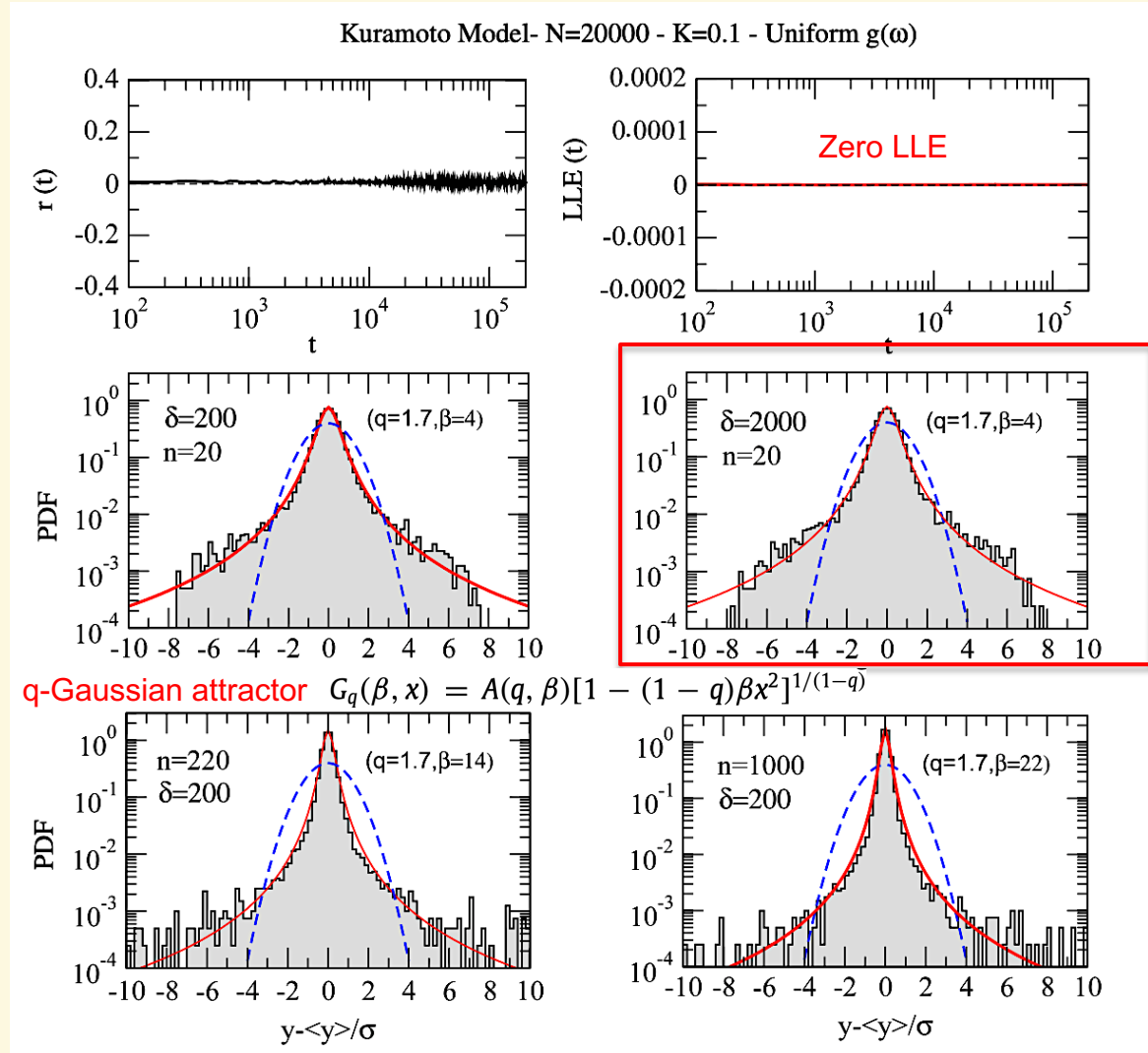
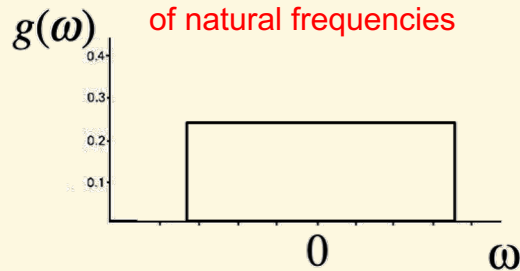
Rescaled sums obtained by picking out, for each oscillator,  $n$  values of the angle  $\theta_i$  at fixed intervals of time  $\delta$  along the deterministic time evolution:

$$y_i = \frac{1}{\sqrt{n}} \sum_{k=1}^n \theta_i(k\delta)$$

U. Tirnakli, C. Beck, C. Tsallis, Phys. Rev. E 75 (2007) 040106(R).

“Edge of Chaos”  
Regime

Uniform Distribution  
of natural frequencies



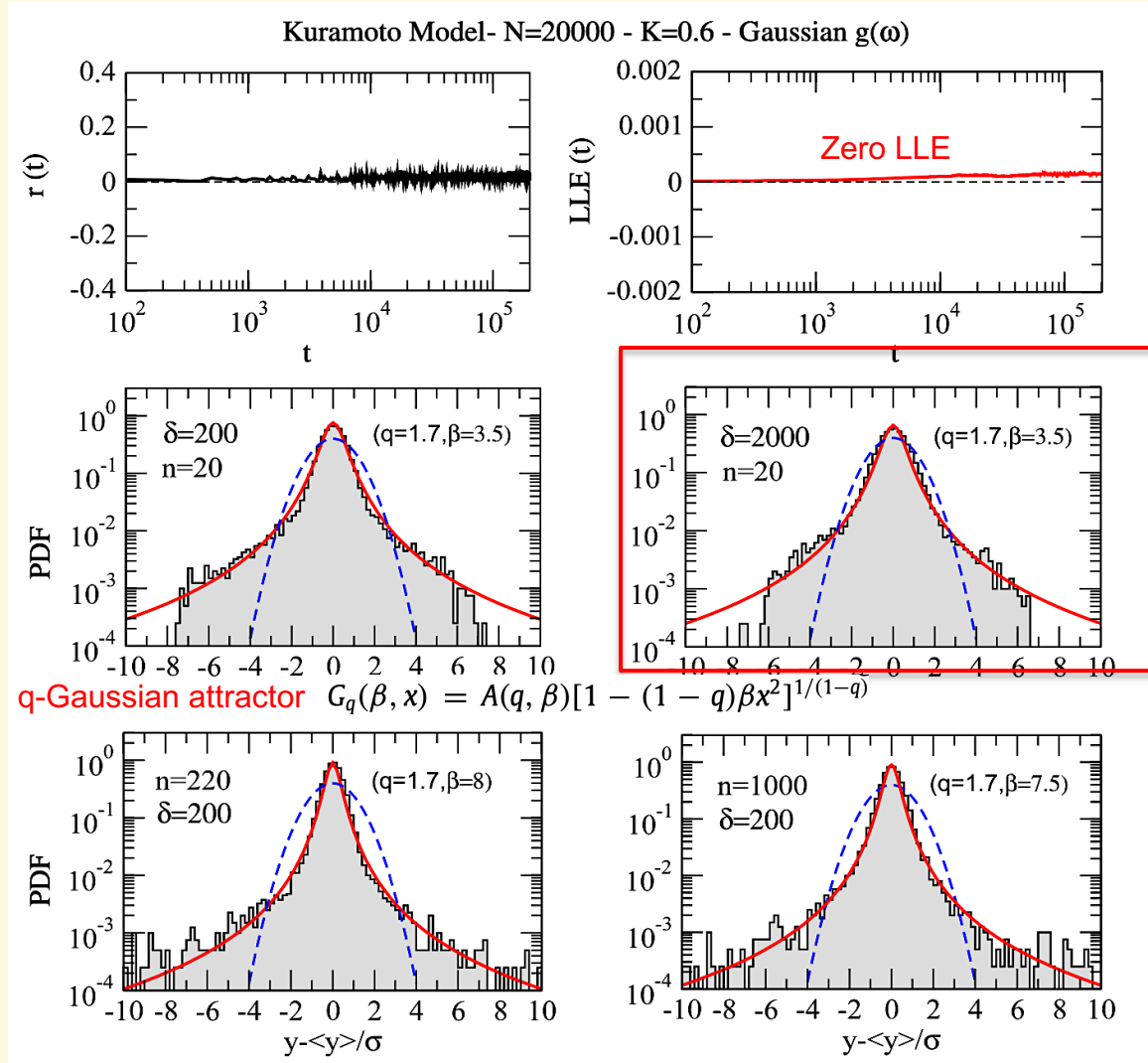
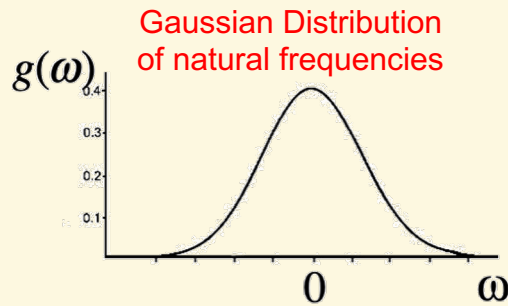
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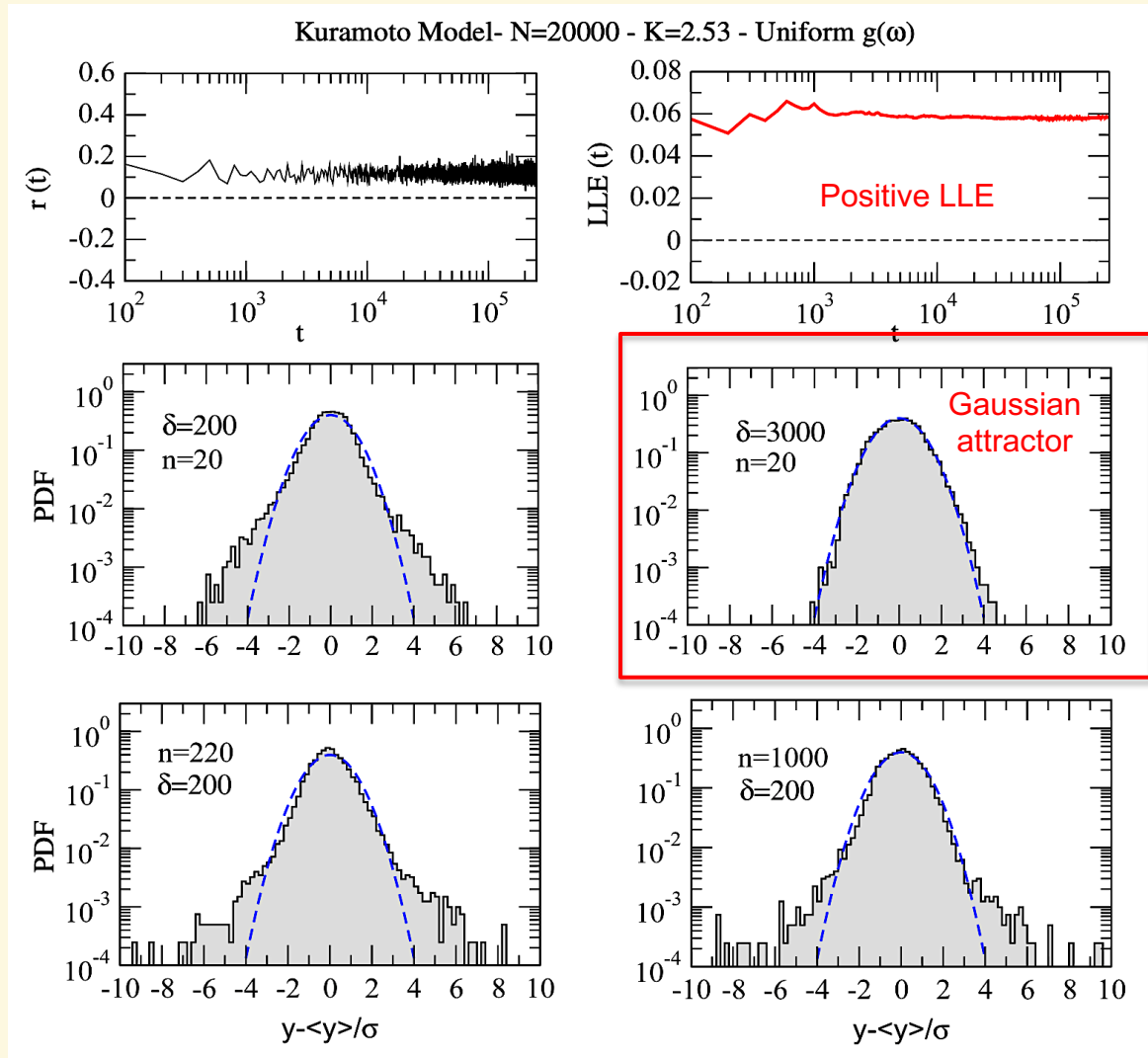
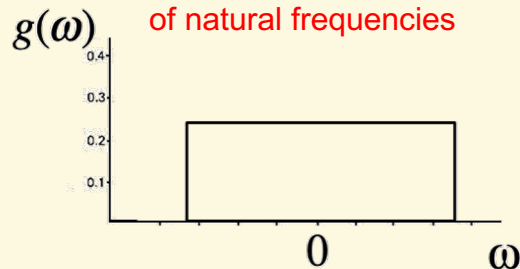
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U. Tirnakli, C. Beck, C. Tsallis, Phys. Rev. E 75 (2007) 040106(R).

## Fully Chaotic Regime

Uniform Distribution of natural frequencies



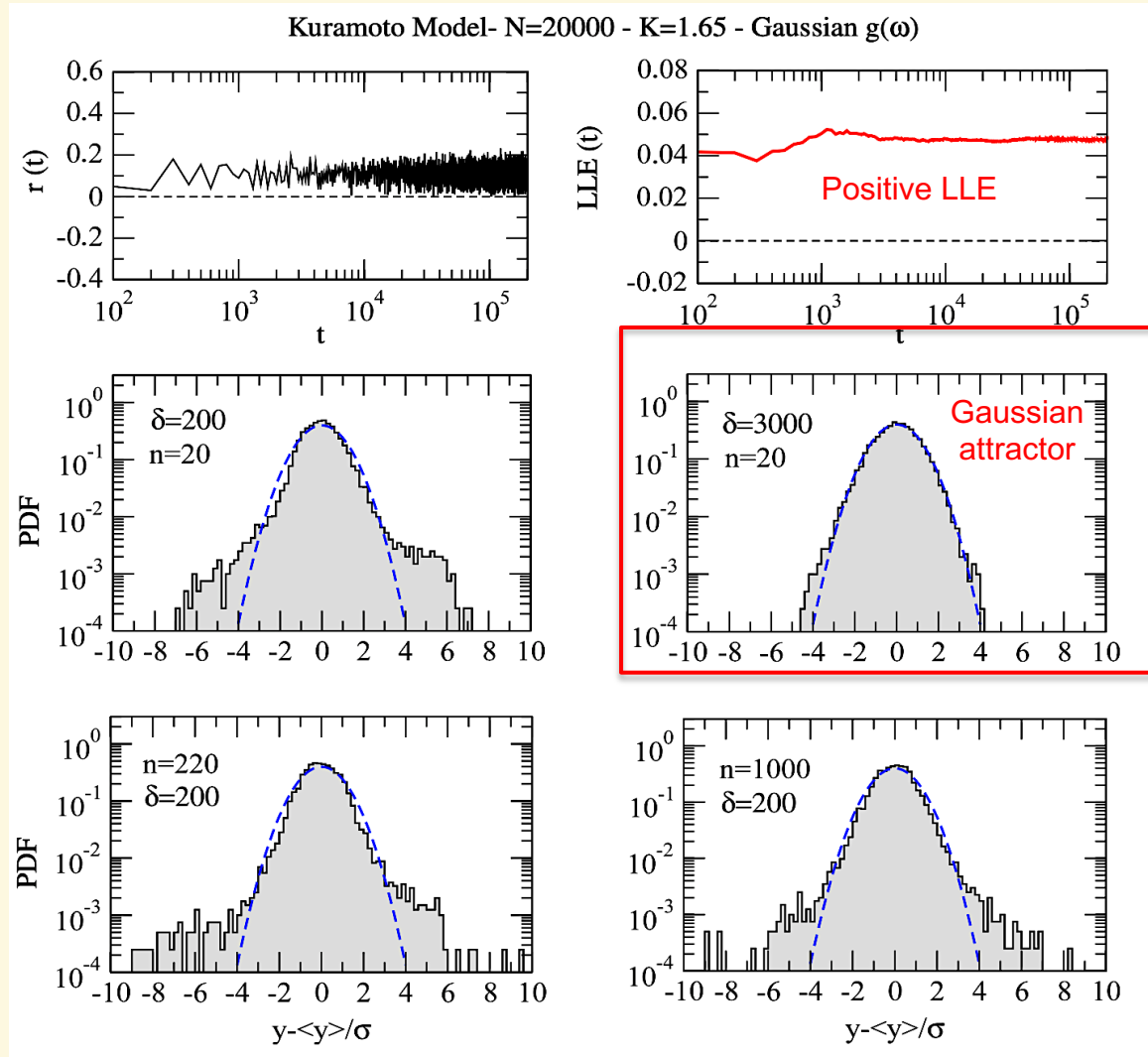
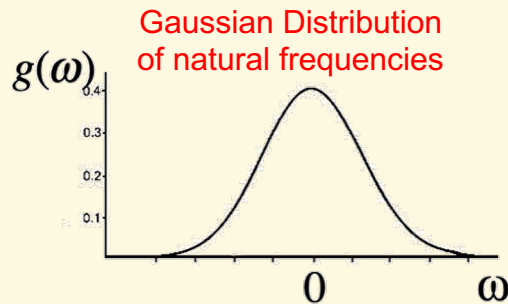
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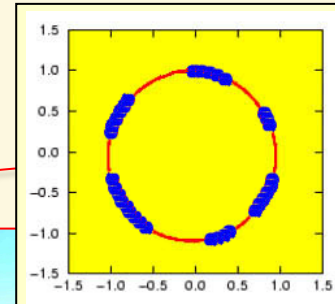


2002

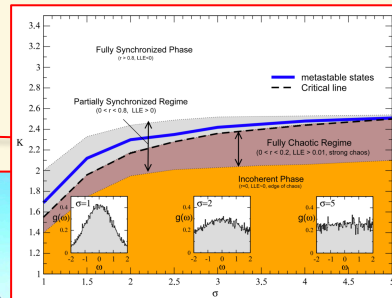
work-time-line



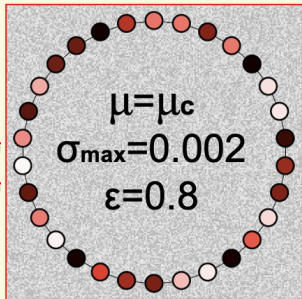
2004-2006



2009



2013



2023



# Noise and Synchronization of Coupled Logistic Maps

**Synchrony** among coupled units has been extensively studied in the past decades providing important insights on the mechanisms that generate **emergent collective behaviors** in many complex systems.

In this context **coupled maps** have often been used as a theoretical model.

- Y. Kuramoto, “*Chemical Oscillations, Waves and Turbulence*” (Springer, New York, 1984)

- A. Pikovsky, M. Rosenblum and J. Kurths, “*Synchronization. A Universal Concept in Nonlinear Sciences*”, (Cambridge 2001)

- S.H. Strogatz, “*Sync: The Emerging Science of Spontaneous Order*”, (Hyperion Books, 2004)

- K. Kaneko , “*Simulating Physics with Coupled Map Lattices*” (World Scientific, Singapore, 1990)

## KANEKO CML MODEL: A 1D LATTICE of LOCALLY COUPLED LOGISTIC MAPS

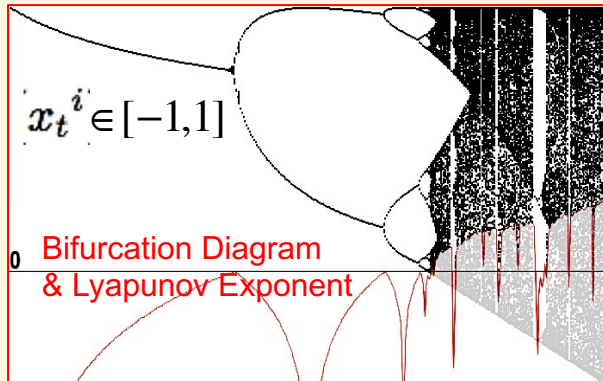
Single Logistic Map

$$f(x_t^i) = 1 - \mu (x_t^i)^2, \text{ with } \mu \in [0, 2]$$



N Coupled Logistic Maps with periodic boundary conditions

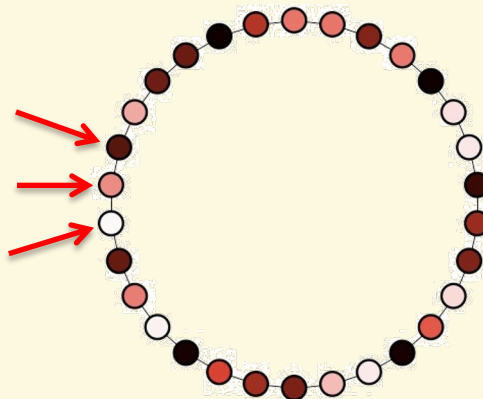
$$x_{t+1}^i = (1 - \epsilon) f(x_t^i) + \frac{\epsilon}{2} [f(x_t^{i-1}) + f(x_t^{i+1})]$$



map  $i+1$

map  $i$

map  $i-1$



Strength of the local coupling

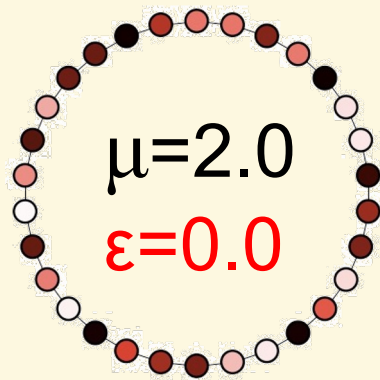
$$\epsilon \in [0, 1]$$

Different colors indicate different random initial conditions

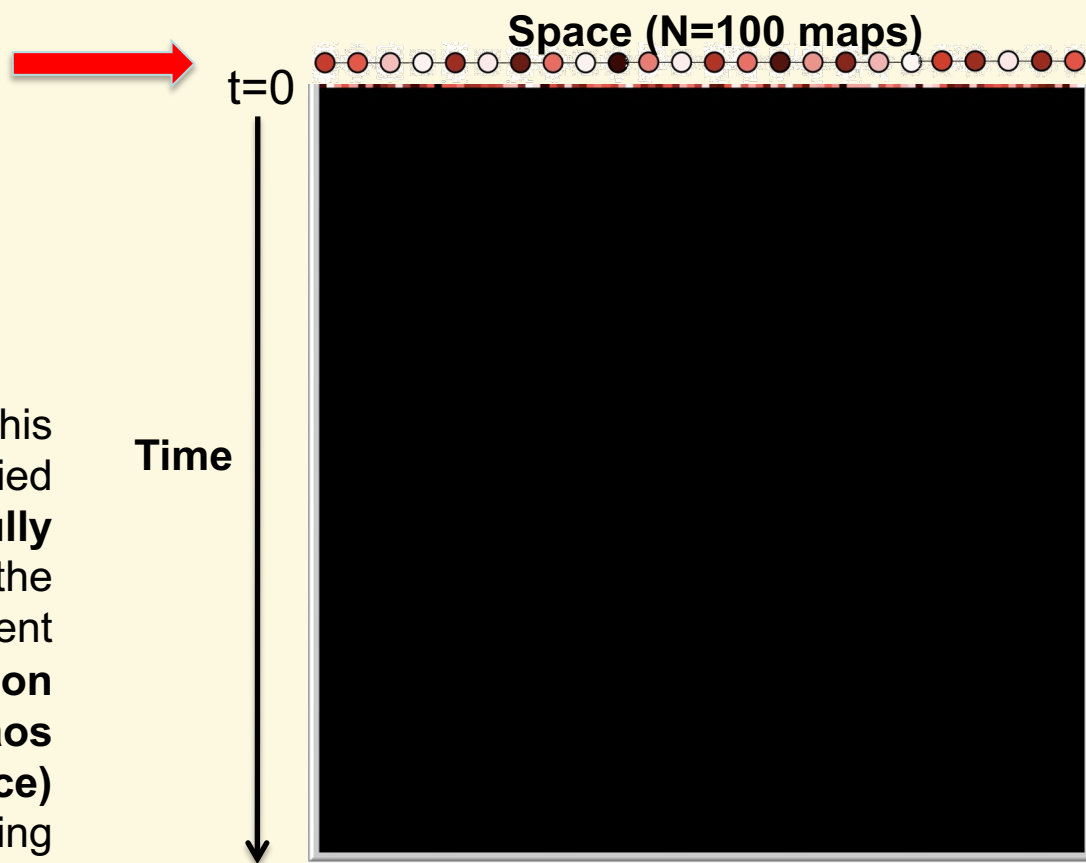
# Spatiotemporal chaos and synchronization patterns in the Coupled Map Lattice (CML) Model

K. Kaneko , "Simulating Physics with Coupled Map Lattices" (World Scientific, Singapore, 1990)

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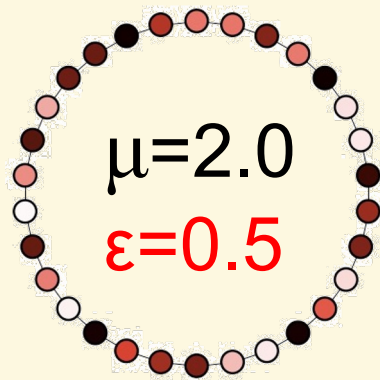
In **absence of noise**, this model was extensively studied in particular in the **fully chaotic regime**, where the coupled maps show different **patterns of synchronization and spatiotemporal chaos (fully developed turbulence)** as function of the coupling strength  $\epsilon$ .



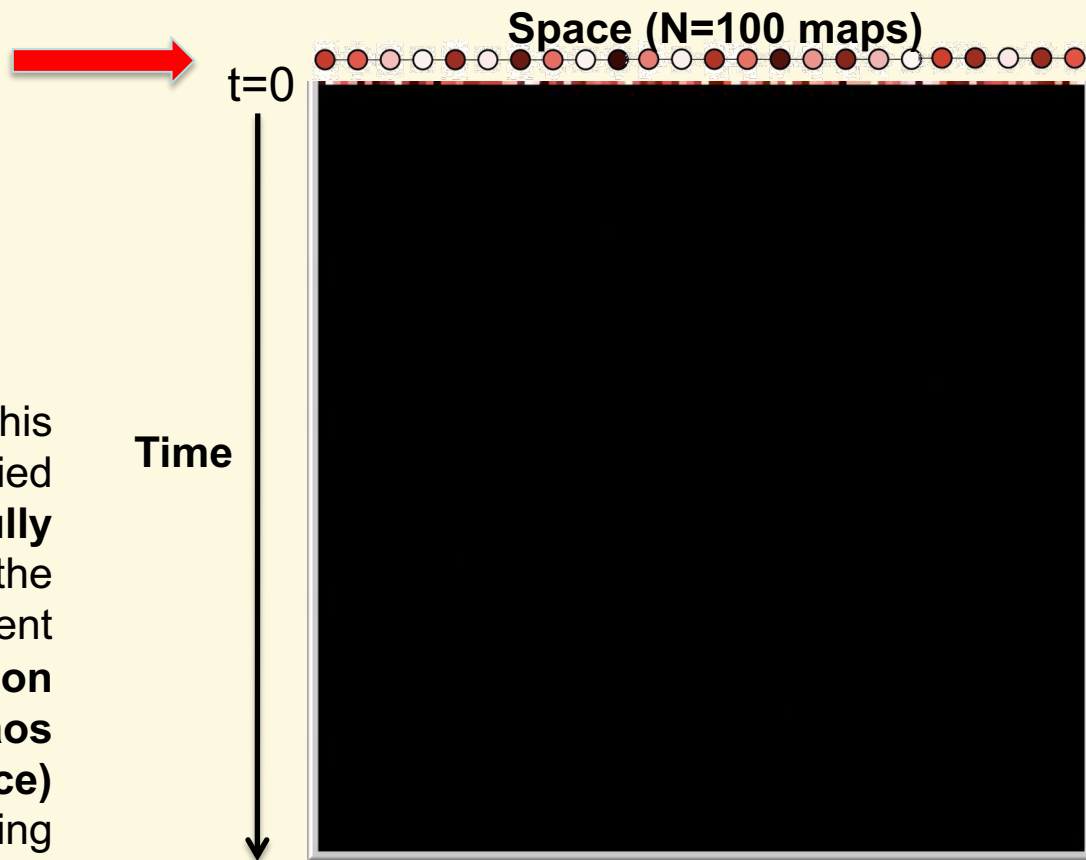
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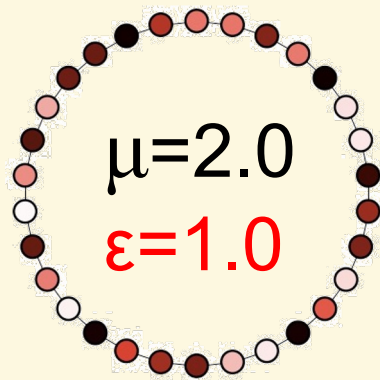




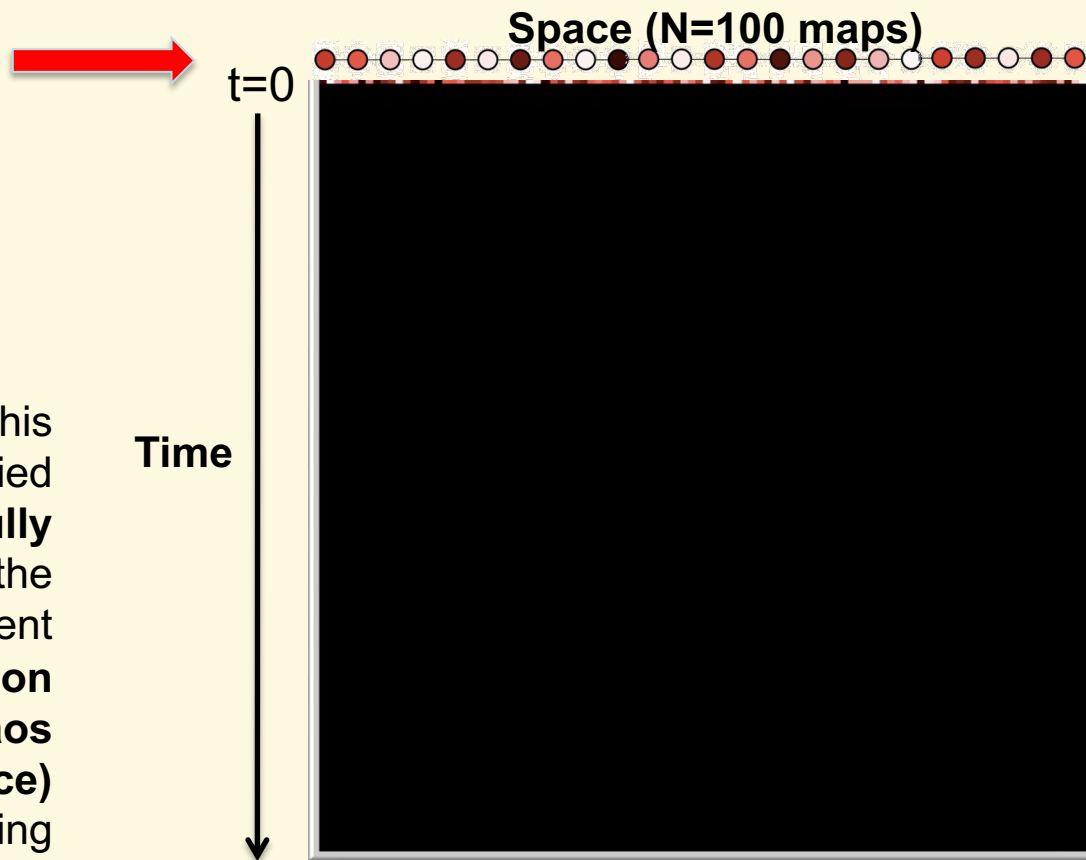
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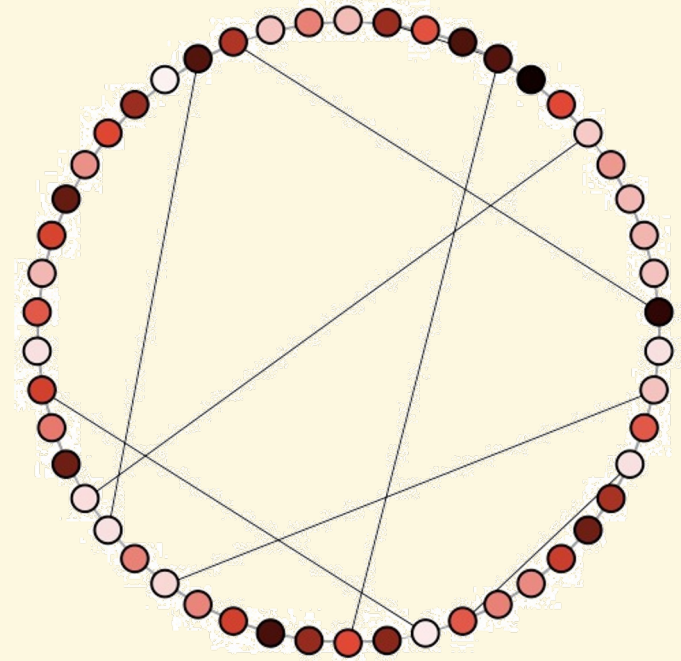
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# Inducing on-off intermittency in small-world networks of chaotic maps

C. Li and J. Fang, IEEE 0-7803-8834-8/05 (2005) 288 - 291 Vol. 1

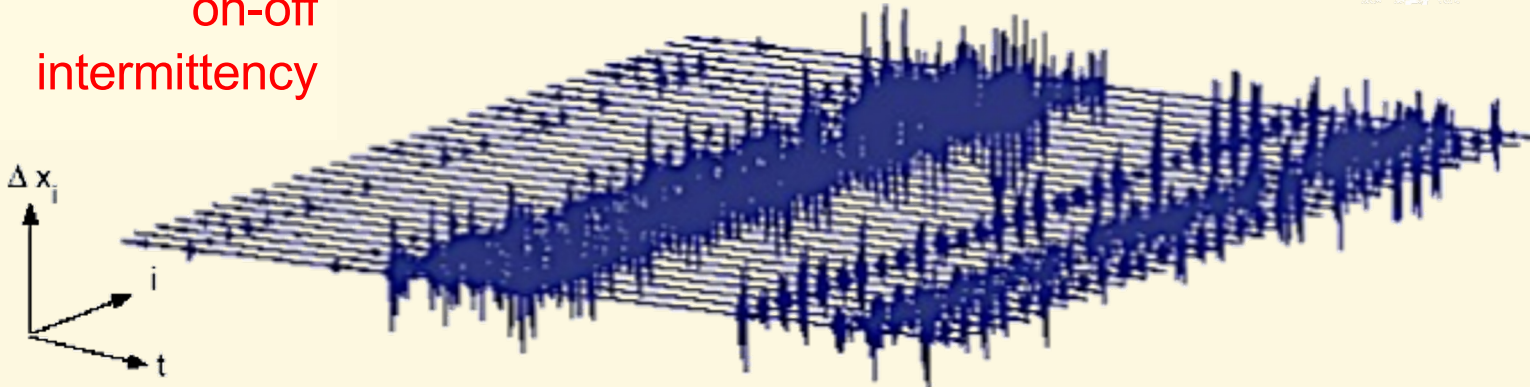
It has been shown that **small-world topology** affects the behavior of the locally coupled logistic maps in the **fully chaotic** regime by introducing **long-range correlations** among maps. For a fixed strong coupling  $\varepsilon$ , when the **rewiring probability  $p$**  is slightly **less** than a critical value (0.29), the synchronous chaotic state is no longer stable and **on-off intermittency** appears.



$$\mu = 1.9$$
$$\varepsilon = 0.6$$

$$p = 0.27$$

on-off  
intermittency



# Noise induced correlations in a lattice of logistic maps at the edge of chaos

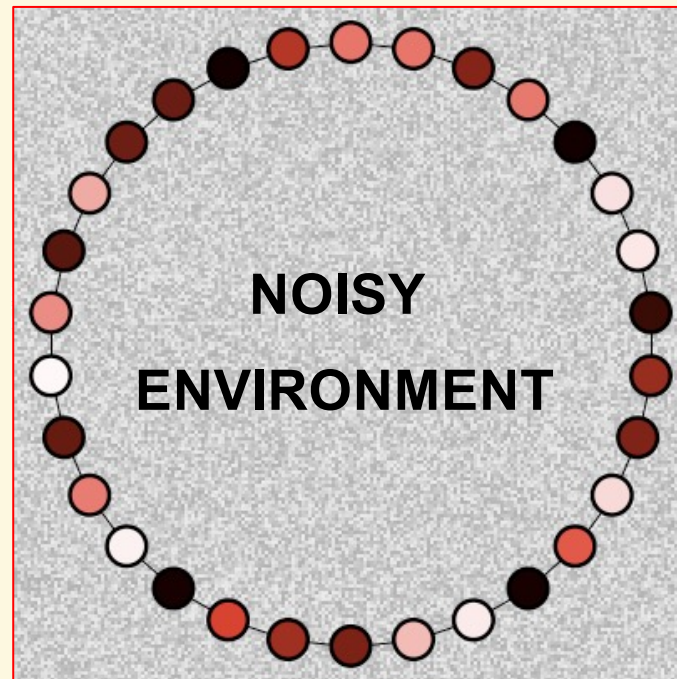
Our idea is to induce **long-range correlations** and **intermittency** in the system using local coupling only but **embedding the maps in a common noisy environment**:

$$x_{t+1}^i = (1 - \epsilon) f(x_t^i) + \frac{\epsilon}{2} [f(x_t^{i-1}) + f(x_t^{i+1})] + \sigma(t)$$

$f(x_t^i)$  taken in module 1 with sign

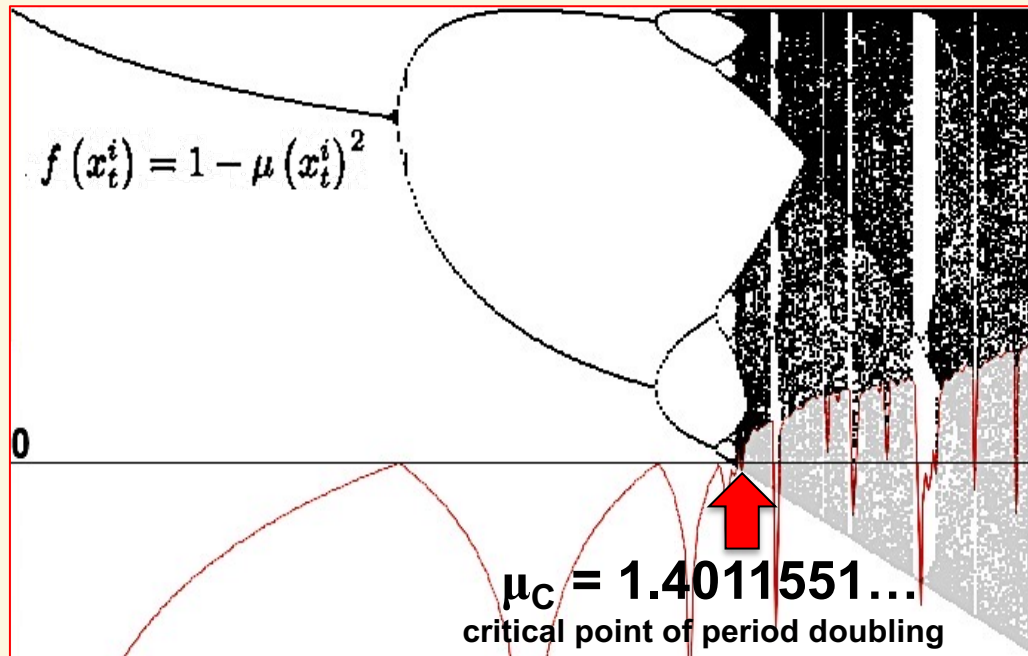
the additive noise is a random variable uniformly extracted in the interval

$$\sigma(t) \in [0, \sigma_{max}]$$



# Noise induced correlations in a lattice of logistic maps at the edge of chaos

At variance with previous studies on coupled logistic maps we also consider them not in the chaotic regime but **at the edge of chaos**, where the *Lyapunov exponent is vanishing*:



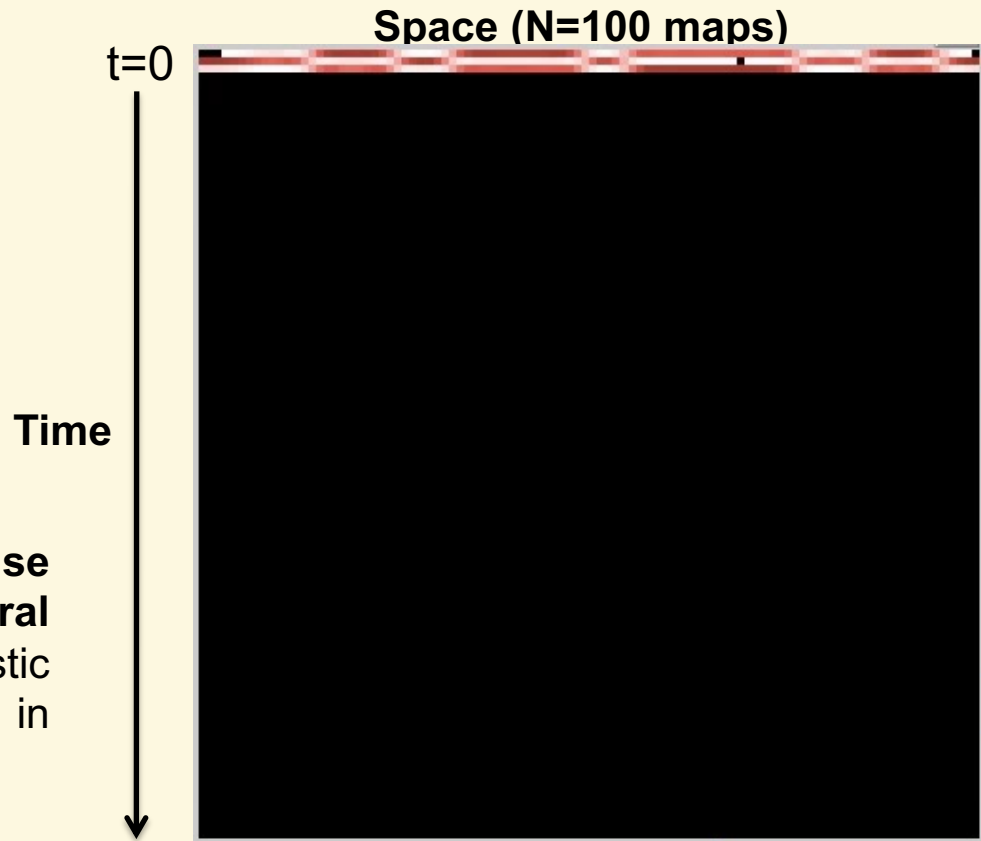
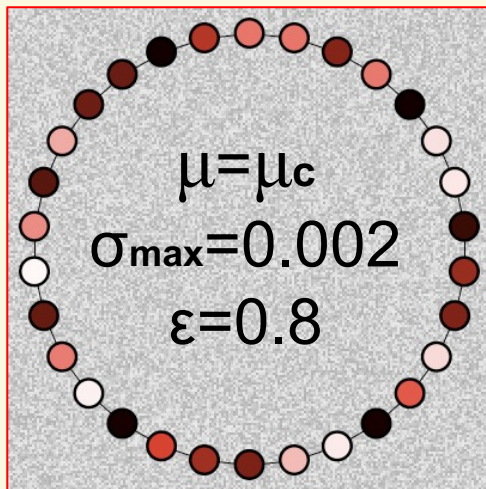
Many biological complex systems operate frequently both **at the edge of chaos** and in a **noisy environment**. Therefore studying the effect of a weak noise in this kind of coupled systems could be relevant in order to **understand the way in which interacting units behave in real complex systems**, like for example living cells.

See e.g.: - D. Stokic, R. Hanel, S. Thurner, *Phys. Rev. E*. 77, 061917 (2008)

- R. Hanel, M. Pochacker, M. Scholling, S. Thurner, *Plos One* 7, e36679 (2012)

# Noise induced correlations in a lattice of logistic maps at the edge of chaos

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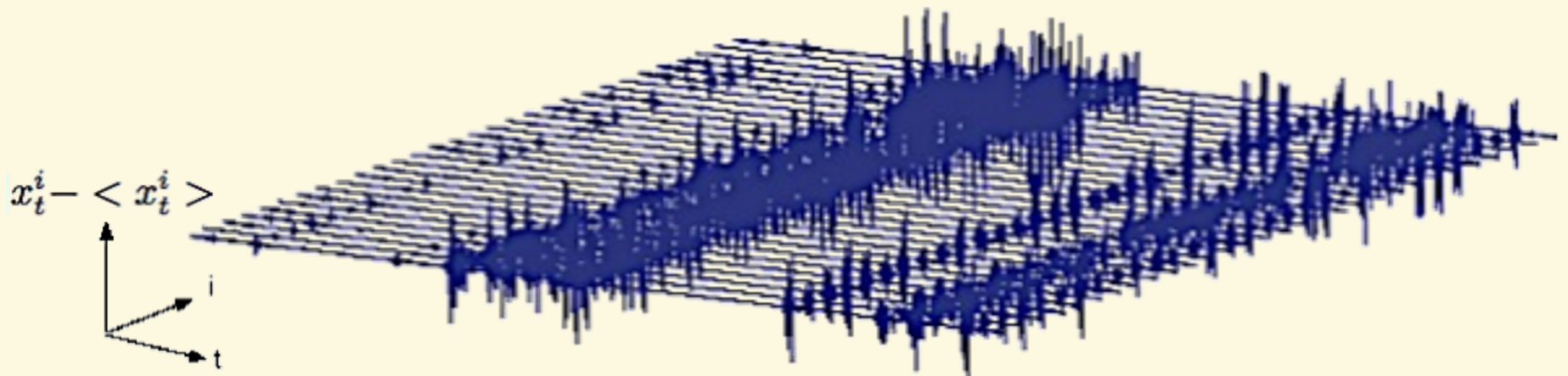
The addition of a **small level of noise** induces evident **spatiotemporal correlations** to the lattice of logistic maps at the edge of chaos, in presence of **strong coupling**.

# Noise induced correlations in a lattice of logistic maps at the edge of chaos

In order to study these **correlations** we subtract the synchronized component and **keep the desynchronized part** of each map, considering, at every time step, the difference between the average and the single map value. Then we further consider the **average of the absolute values** of these differences over the whole system in order to measure the **distance from the synchronization regime at time t** with only one variable:

$$d_t = \frac{1}{N} \sum_{i=1}^N |x_t^i - \langle x_t^i \rangle|$$

If all maps are trapped in some **synchronized pattern** then this quantity remains close to zero, otherwise **oscillations** are found.



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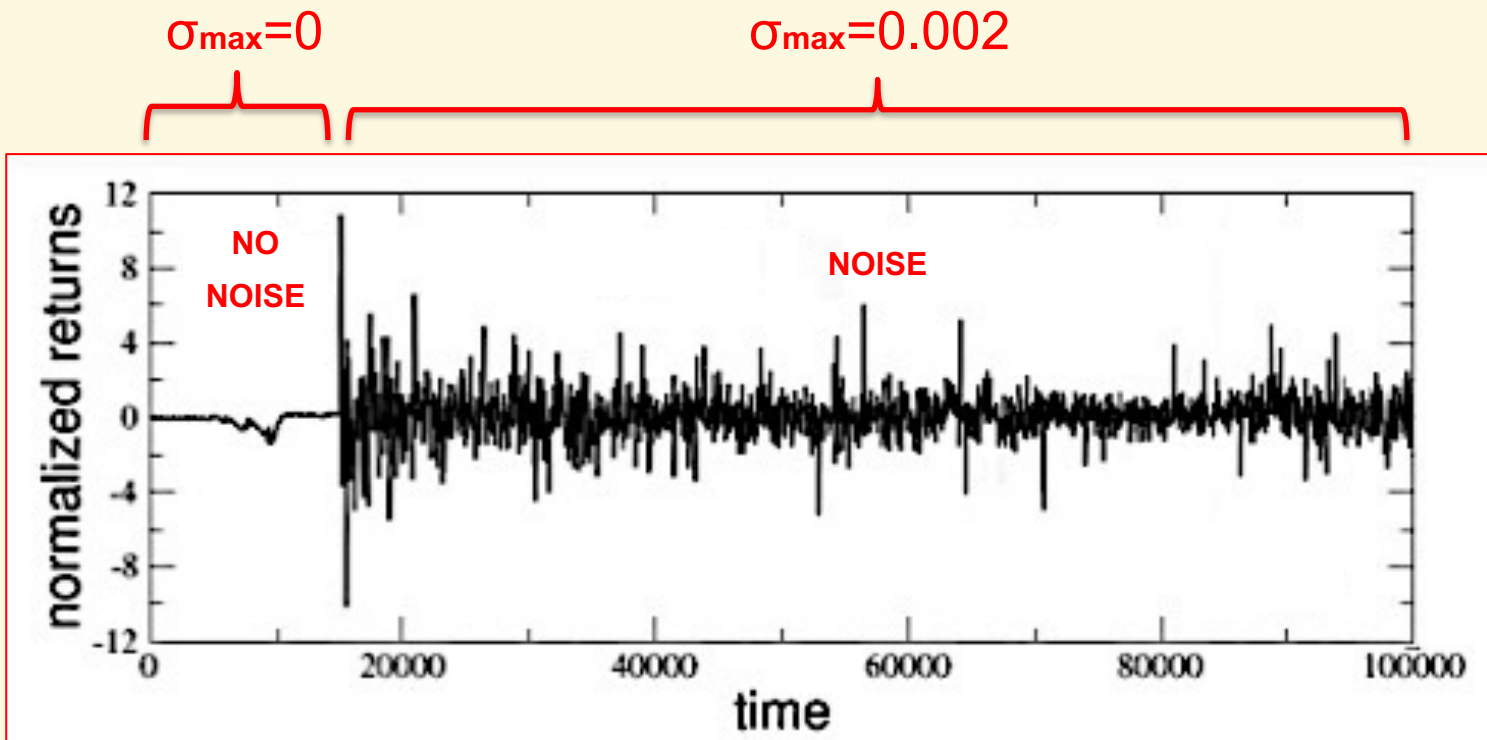
As commonly used in turbulence or in finance, we analyze these oscillations by considering the **two-time returns**  $\Delta d_t$  with an **interval of  $\tau$  time steps**, defined as:

$$\Delta d_t = d_{t+\tau} - d_t$$

- S.Rizzo, A.Rapisarda, "*Application of superstatistics to atmospheric turbulence*" in *Complexity, Metastability and Nonextensivity*, World Scientific, Singapore (2005) 39
- J. Ludescher, C. Tsallis and A. Bunde, *Europhys. Letters* 95, 68002 (2011)

# Time evolution of the two-time returns in presence of weak noise

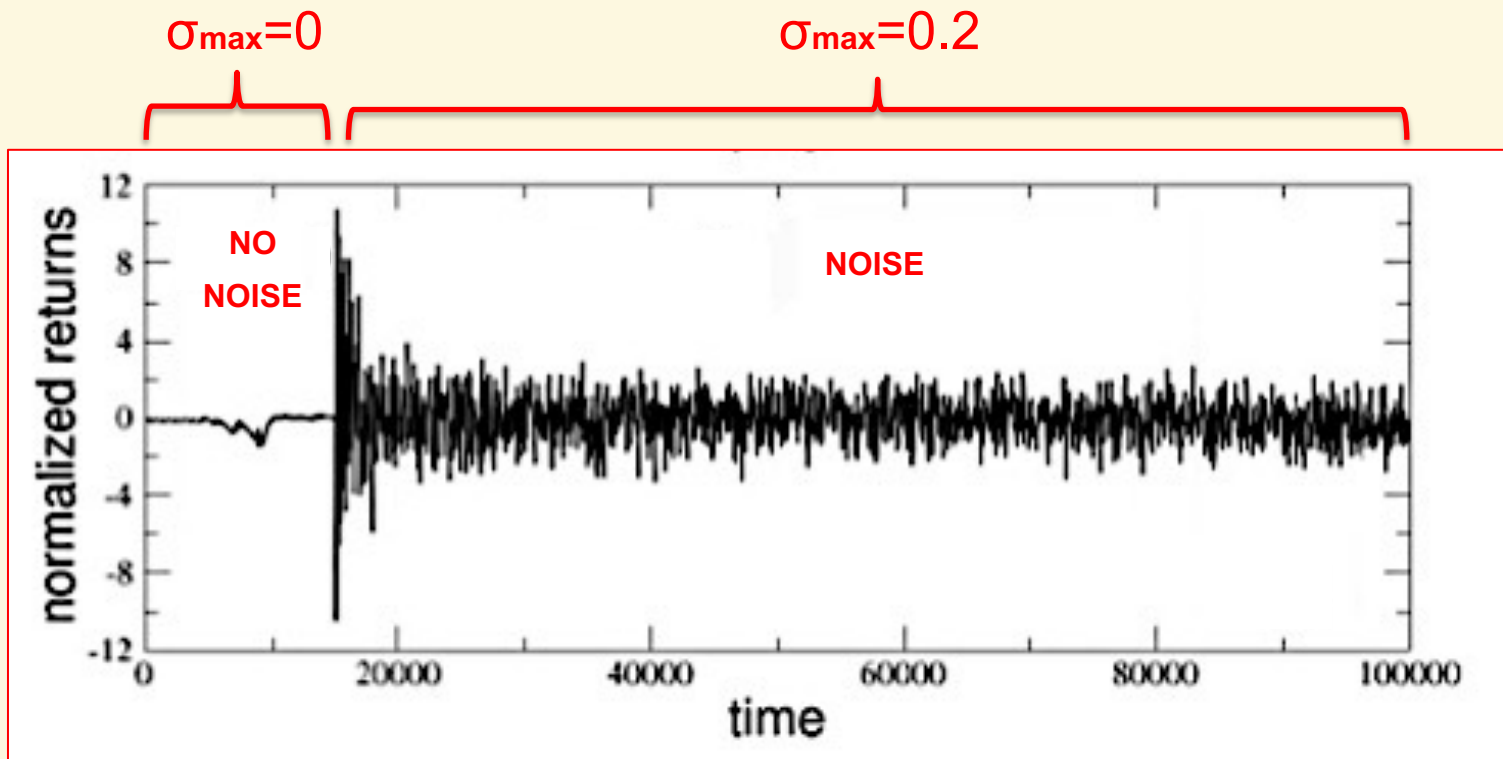
**Effect of noise** in the time evolution of returns (normalized to the standard deviation of the overall sequence) for the case  $N = 100$ ,  $\mu = \mu_c = 1.4011551\dots$ ,  $\varepsilon = 0.8$  and  $\tau = 32$  time steps. During the first 15.000 time steps at **zero noise** ( $\sigma_{\max} = 0$ ) the maps remain synchronized due to the strong coupling. At time  $t = 15000$  we **switch on the noise**, with  $\sigma_{\max} = 0.002$  (**weak noise**): a clear **intermittent behavior** appears.





# Time evolution of the two-time returns in presence of weak noise

The intermittent behavior **disappears** if we repeat the same simulation but with  $\sigma_{\max} = 0.2$ , i.e. in presence of **strong noise**. In this case only **Gaussian fluctuations** are observed.

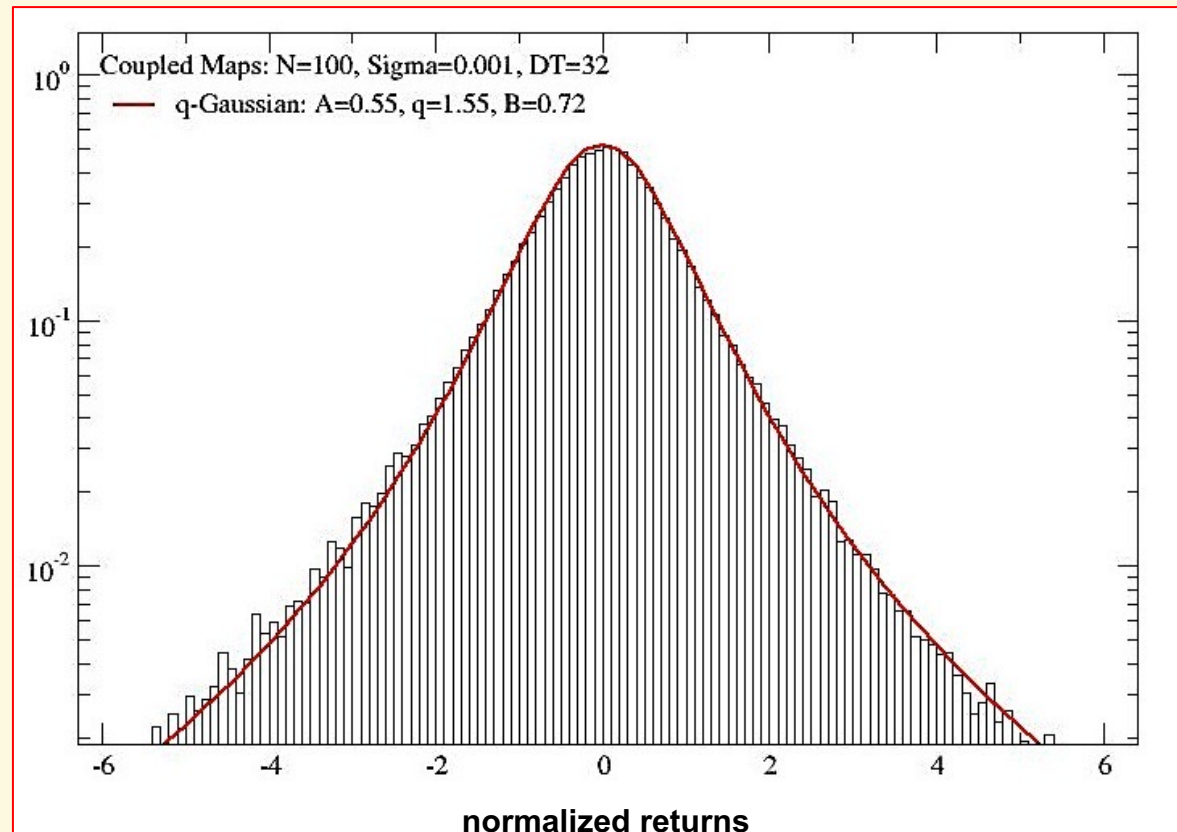


# PDFs of normalized returns for increasing values of noise

To better appreciate the transition from the intermittent to the Gaussian behavior, we plot the **probability density function (Pdf) of the normalized returns** for several **increasing values of noise**. Fat tails in the Pdfs are clearly visible only when  $\sigma_{\max} < 0.05$  and can be nicely reproduced by  **$q$ -Gaussian curves** with decreasing values of the entropic index:

$$\sigma_{\max} = 0.001$$

$$q = 1.55$$

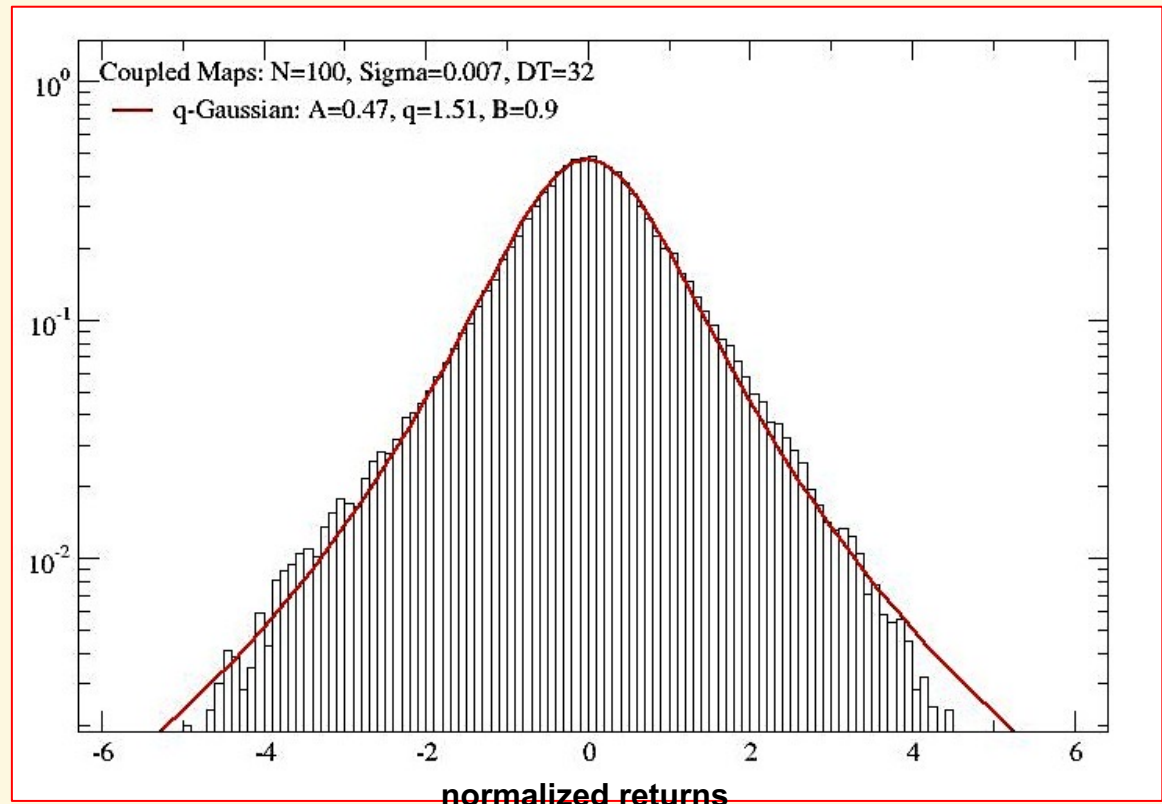


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$$\sigma_{\max} = 0.007$$

$$q = 1.51$$

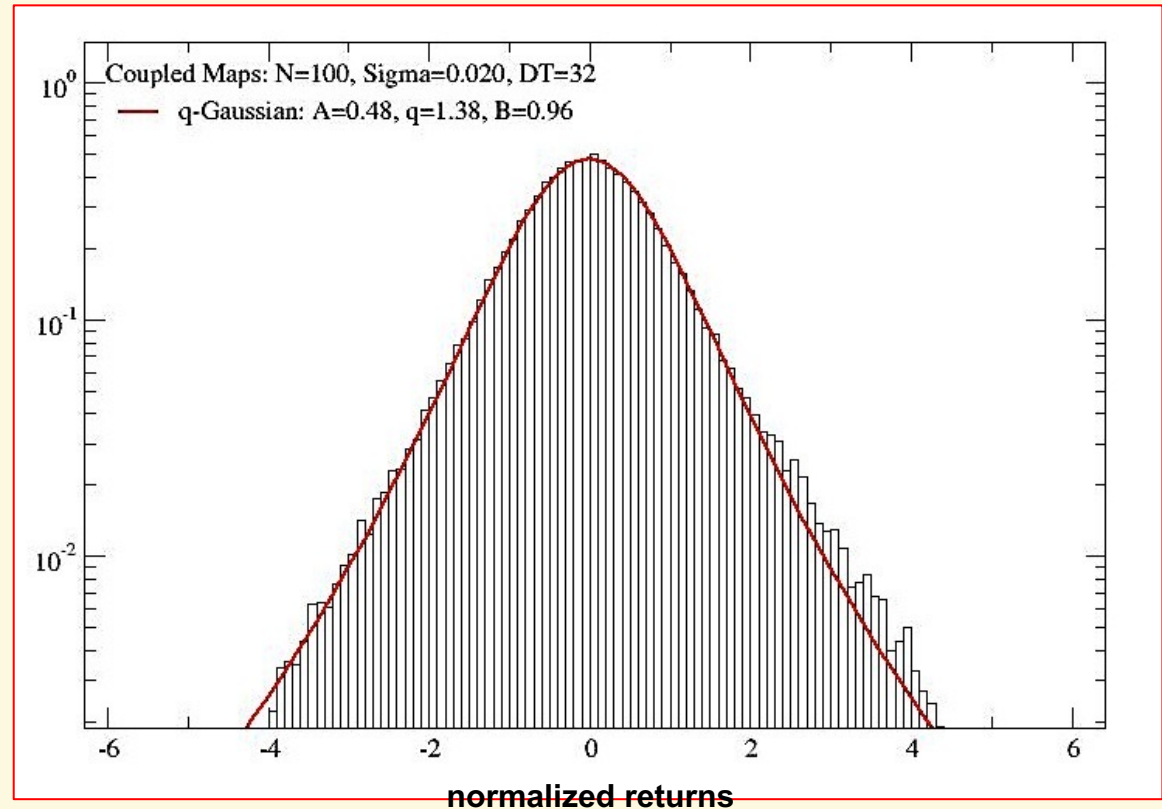


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$$\sigma_{\max} = 0.02$$

$$q = 1.38$$

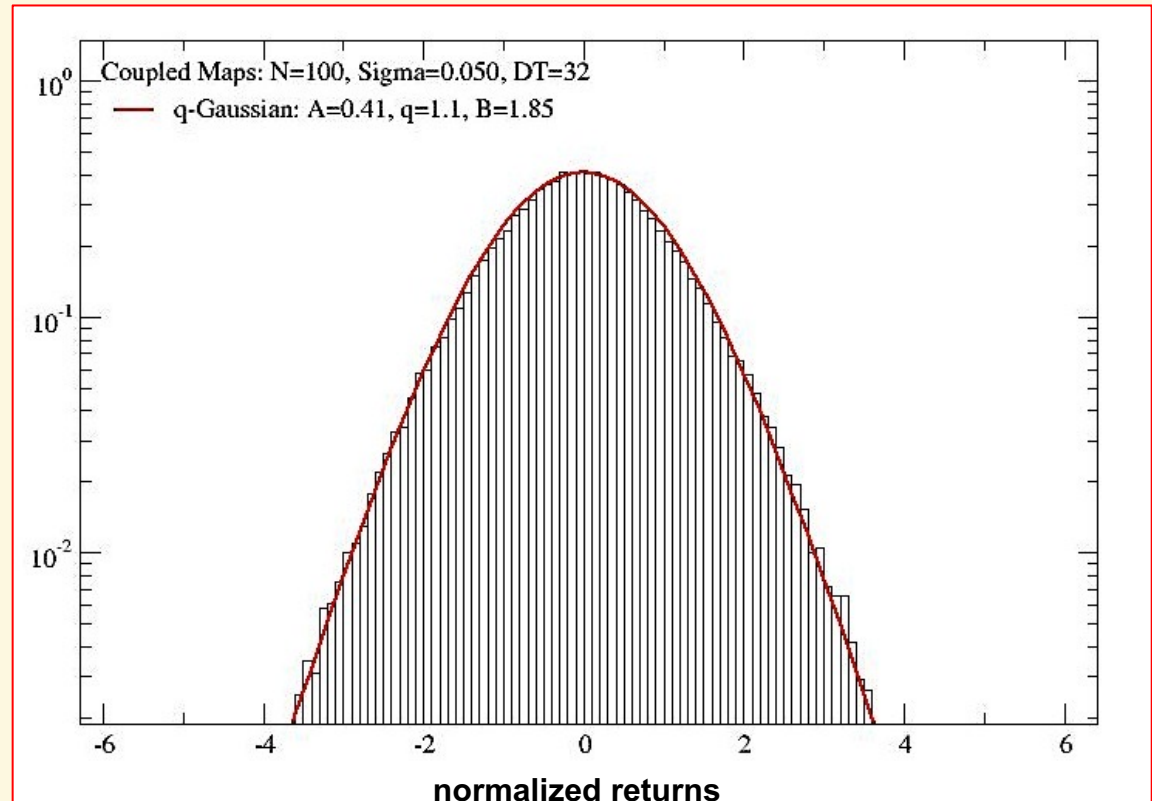


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$$\sigma_{\max} = 0.05$$

$$q = 1.10$$

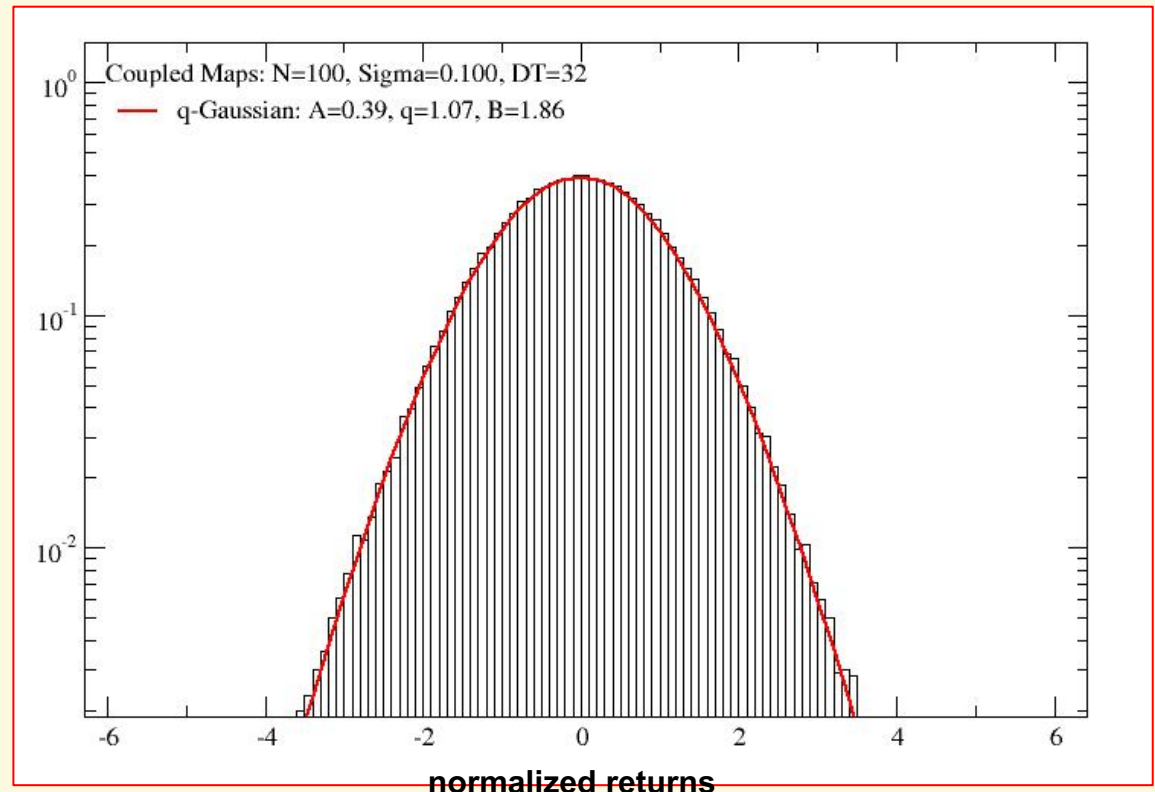


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$$\sigma_{\max} = 0.10$$

$$q = 1.07$$

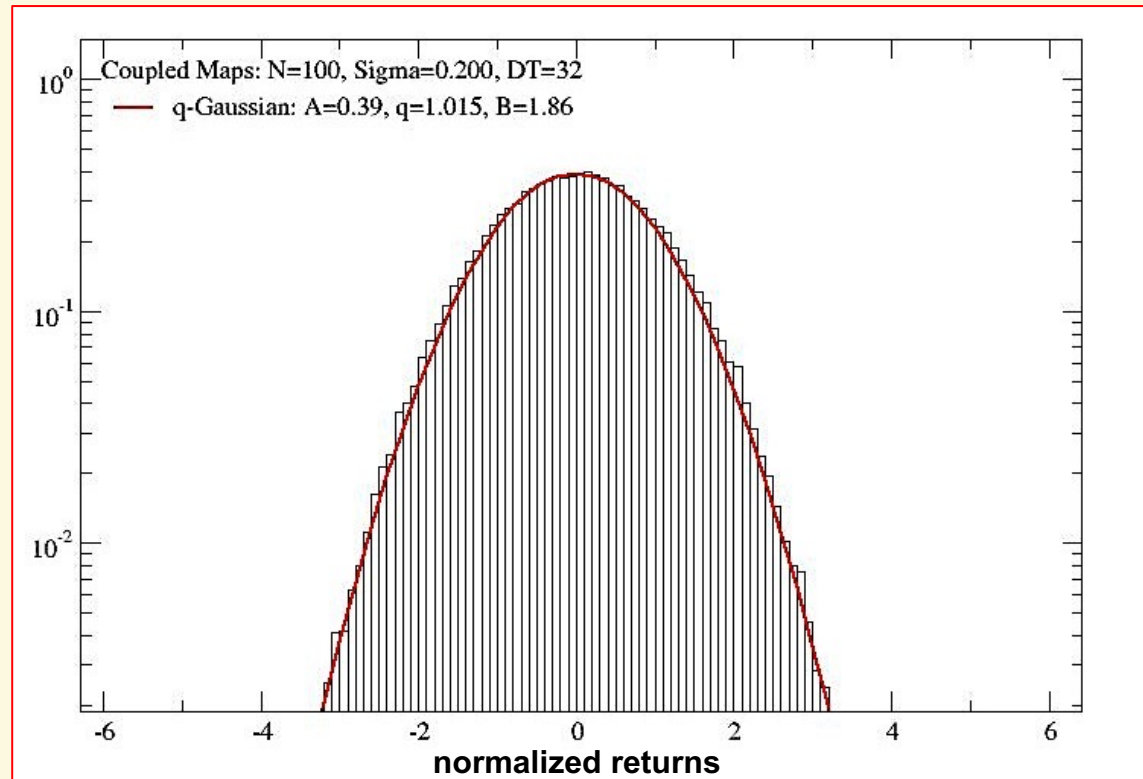


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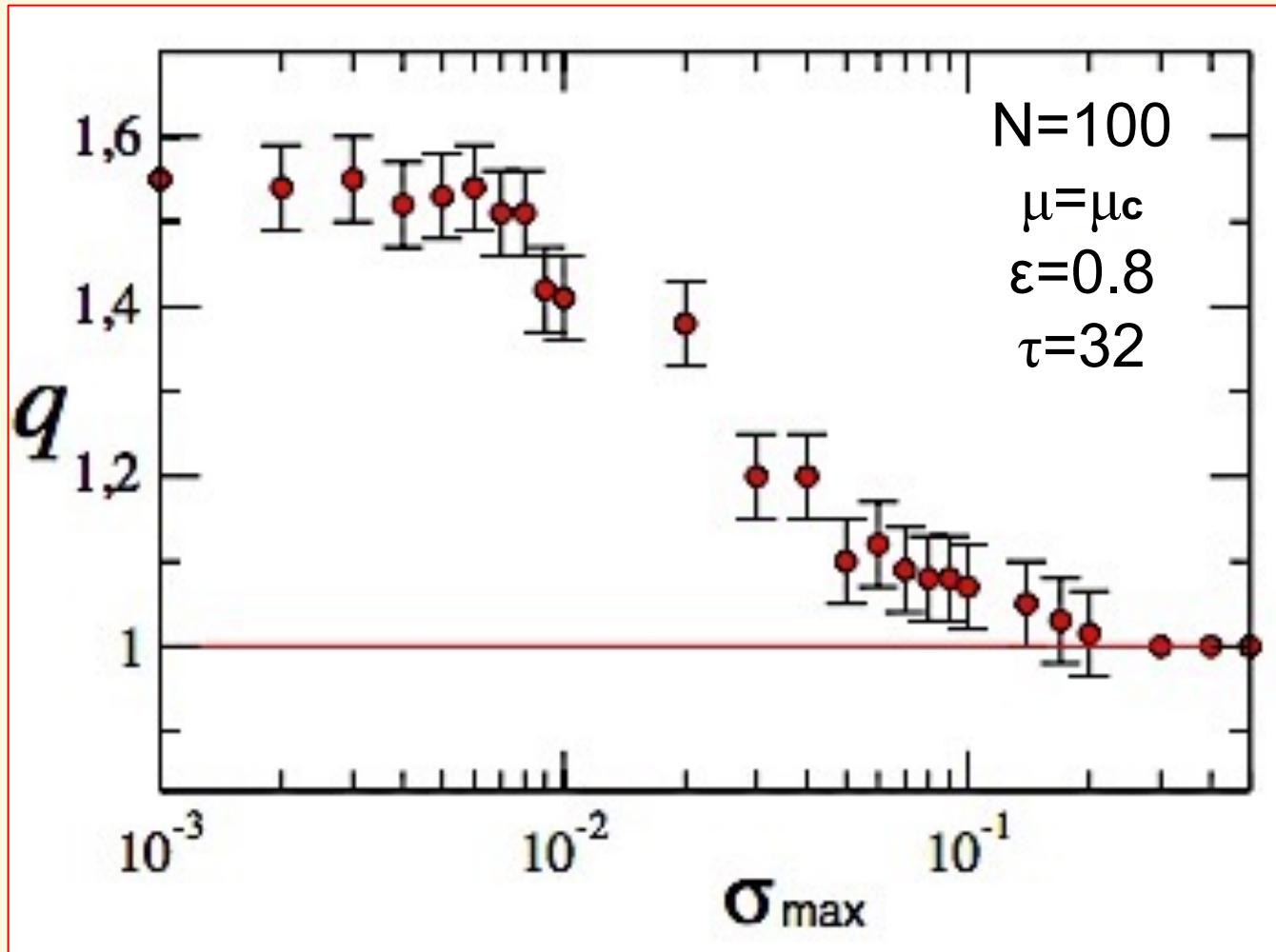
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$$\sigma_{\max} = 0.20$$

$$q = 1.01$$



# Diagram of $q$ versus $\sigma$

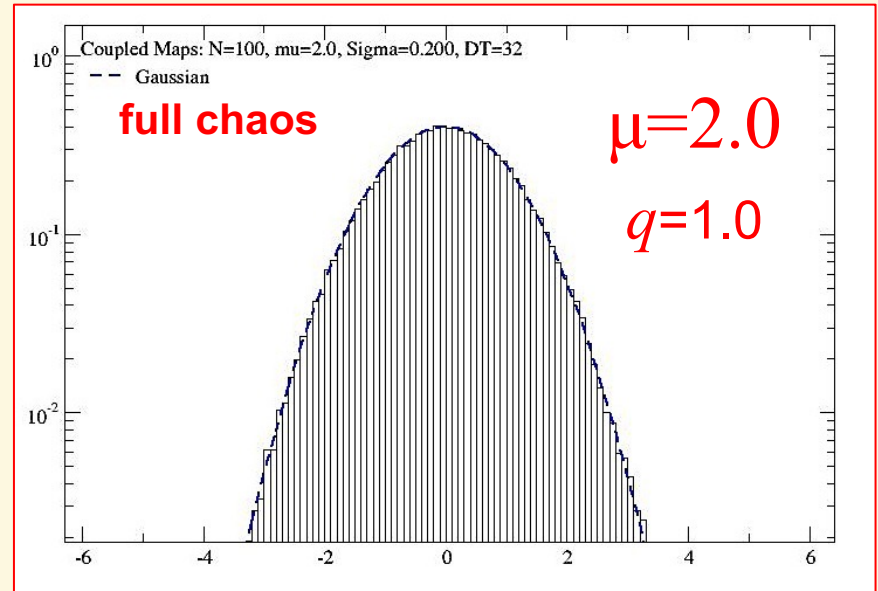
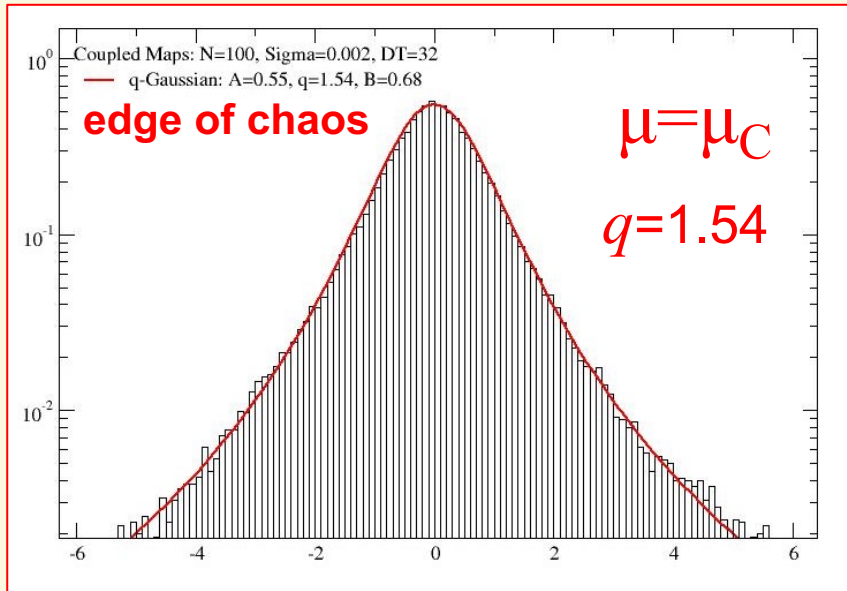




# Gaussian behavior of returns in the fully chaotic regime

The **edge of chaos condition** is strictly necessary for the emergence of intermittency and strong correlations in presence of a small level of noise. In fact, if we consider the maps in the **fully chaotic regime**, i.e. with  $\mu = 2$  instead of  $\mu = \mu_c$ , and leaving all the other parameters unchanged, we obtain a **Gaussian Pdf** of returns.

$$N=100, \sigma_{\max}=0.002, \varepsilon=0.8, \tau=32$$

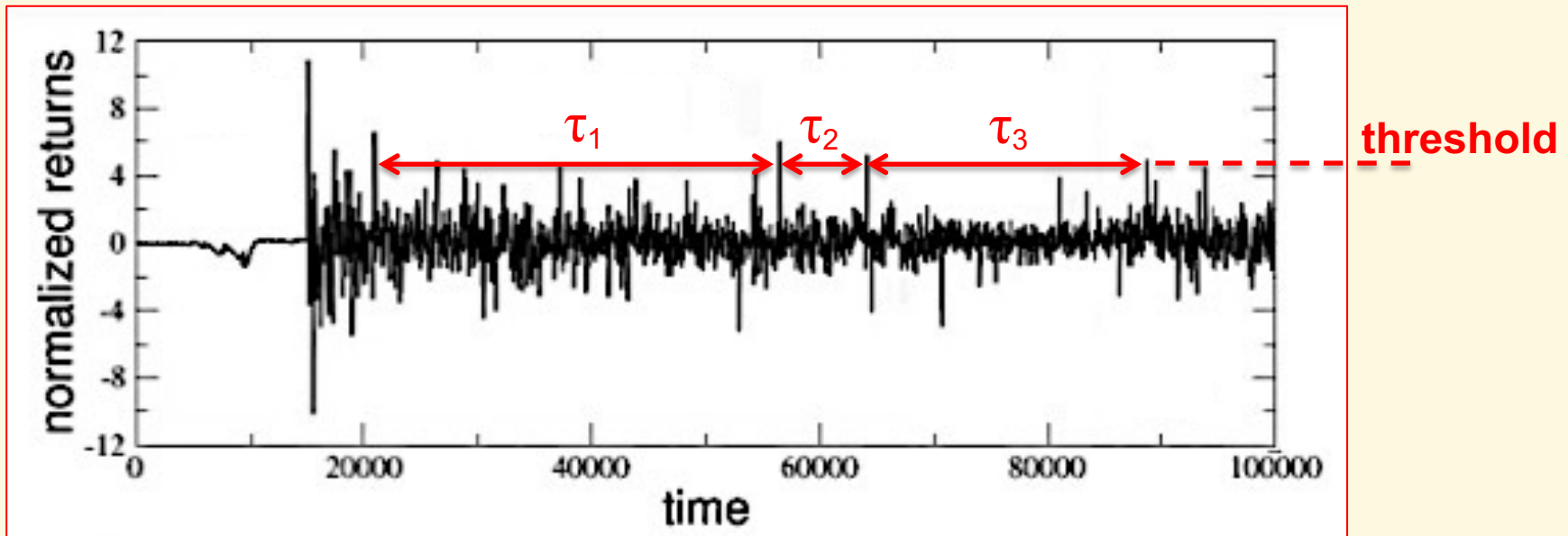


# Analysis of the interoccurrence times

**Long-term correlations** in a system typically yield powerlaw asymptotic behaviors in various physically relevant properties. In studies of **financial markets\***, it was recently observed **power-law decays** in the so-called 'interoccurrence times' between sub sequential peaks in the fluctuating time series of returns. If we fix a given **threshold**, the sequence of the interoccurrence times ( $\tau_i$ ) results to be well defined and it is then possible to study its Pdf for our system of coupled maps at the edge of chaos.

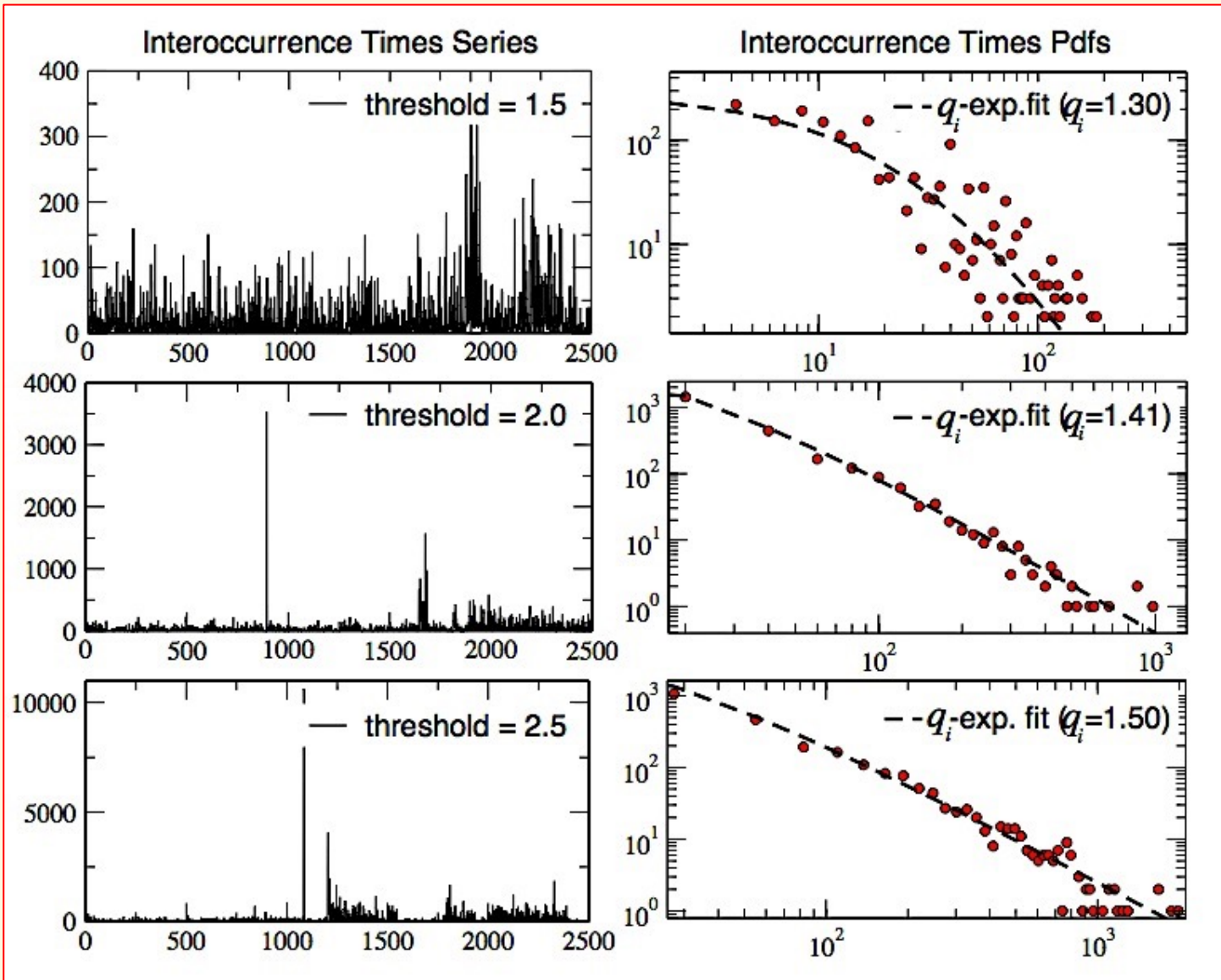
\* M.I. Bogachev and A. Bunde, Phys. Rev. E 78, 036114 (2008)

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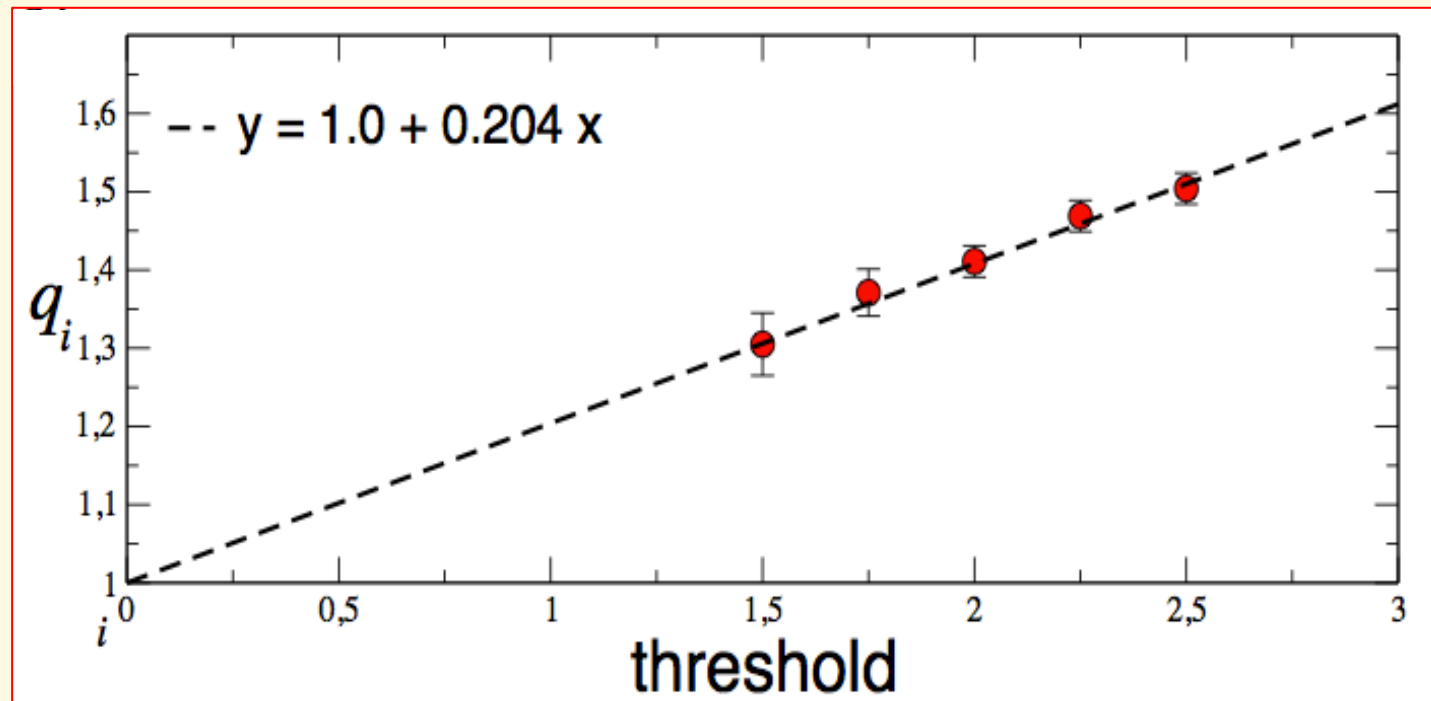
$N=100$ ,  $\sigma_{\max}=0.002$ ,  $\mu=\mu_c$ ,  $\varepsilon=0.8$ ,  $\tau=32$



# Analysis of the interoccurrence times

This can be considered as a **further footprint of the complex emergent behavior** induced on the system by the small level of noise considered. Interestingly enough, in the limit of **vanishing threshold**,  $q_i$  approaches unity, i.e., the **behavior becomes exponential**, which is precisely what was systematically observed in financial data\*.

\*J. Ludescher, C. Tsallis and A. Bunde, Europhys. Letters 95, 68002 (2011)



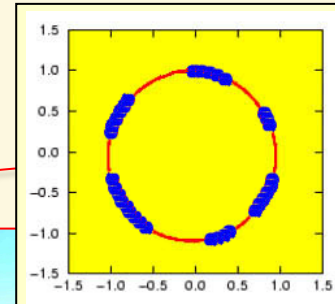


2002

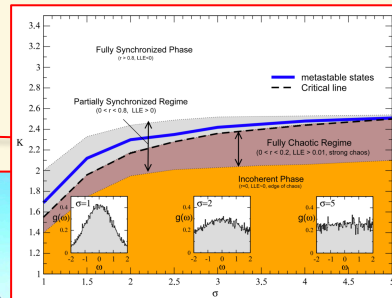
work-time-line



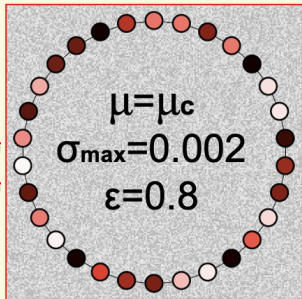
2004-2006



2009



2013



2023



# Other steps of more pleasant work...;-)

Verifying the stability of chaotic trajectories with a Non-Sinai Billiard in Mexico



Studying the effects of acoustic emissions on the walls of the Ettore Majorana Center in Erice (Italy)





HAPPY  
BIRTHDAY  
*Constantino*