

# Intermittent Chaotic Chimeras

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# Kuramoto at MPIPKS

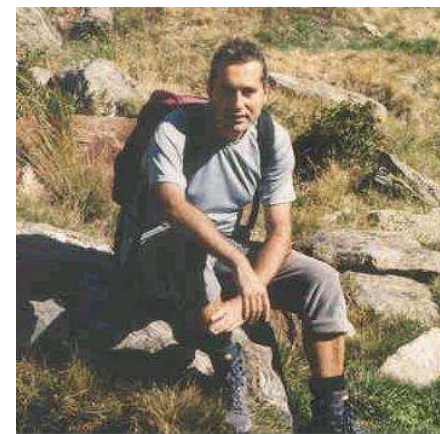
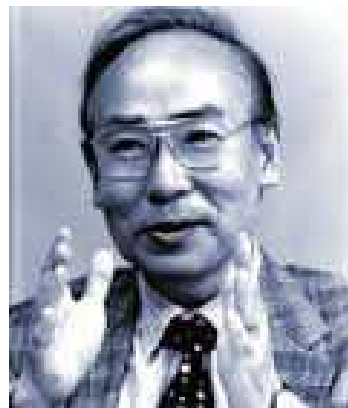


On **october, 11th 1997** I gave the following talk at MPIPKS

**Transition from phase to amplitude turbulence in the CGLE**

Seminar on Patterns and Dynamics in Complex Fluids and Biological Systems

Scientific Director: W. Zimmermann



Kuramoto was sitting in the first row and after the talk came by me . . .

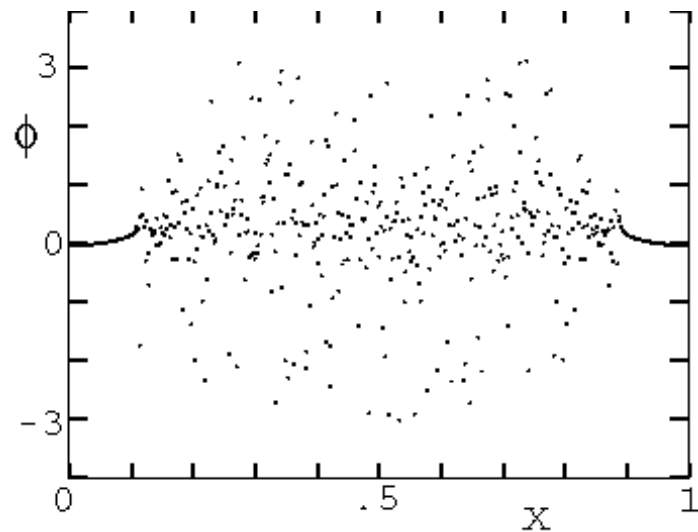
[AT, H. Frauenkron, P. Grassberger, PRE 55 \(1997\) 5073](#)

# My 15 Minutes of Fame



On **october, 12th 1997** at **8.30 AM**, we met and Kuramoto says

- I am interested in non-locally coupled CGLE
- My collaborator, Dorjsuren Battogtokh, has found this numerical result



- It seems you developed a new integration scheme for CGLE
- May you please send it to Battogtokh ?

Y Kuramoto & D Battogtokh, *Nonlinear Phenomena in Complex Systems* (2002)

# Pteroptix Malaccae



Usually, entrainment results in a constant phase angle equal to the difference between pacing frequency and free-running period as it does in *P. Cribellata*. The mechanism of attaining *synchrony* by Malaysian firefly *Pteroptix Malaccae* is *quite different*. When the pacer changes, this firefly requires several cycles to reach a steady state. Once this steady state is achieved, *the phase angle difference is near zero irrespective of the pacer period*. This can be explained only by the animal adjusting the period of its oscillator to equal that of the driving oscillator.

Experiments on Fireflies by Hanson, 1982

# Kuramoto Model with inertia



- Ermentrout developed a pulse-coupled (Winfree) model with inertia to deal with this kind of synchronization [B. Ermentrout, *Journal of Mathematical Biology* (1991)]
  - A phase model with **inertia** allows for adaptation of oscillator frequency to the forcing one
- Tanaka, Lichtenberg, Oishi [PRL, *Physica D* 1997] developed a generalization of Kuramoto model by including an inertia term

$$m\ddot{\theta}_i + \dot{\theta}_i = \Omega_i + \frac{K}{N} \sum_j \sin(\theta_j - \theta_i)$$

- Hysteretic first order synchronization transition
- Self-consistent mean field equation the macroscopic order parameter
- For sufficiently large inertia → Clusters of drifting oscillators appear
- Peculiar finite size and finite mass scaling

Acebrón et al PRE (2000); Gupta et al PRE (2014); Komarov et al PRE (2014); Olmi et al PRE (2014)

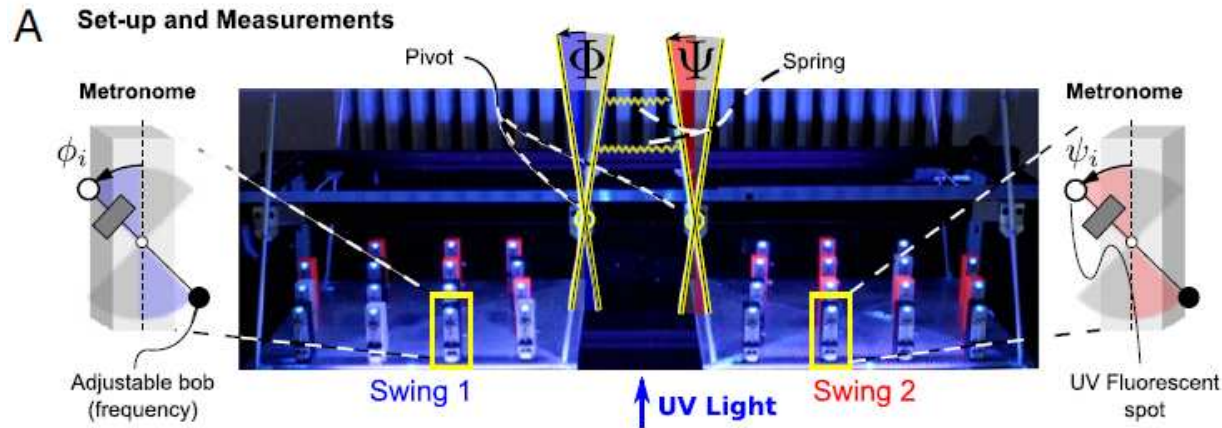
# Plan of the Talk



## Dynamics of two symmetrically coupled populations of rotators

- A brief description of the experiment
- Introduction of the 2 population model
  - Kuramoto model with inertia
- Emergence of **chaotic** broken symmetry states
  - Intermittent Chaotic Chimeras (ICC)
  - Chaotic Two Populations state (C2P)
- Linear Stability (Lyapunov) of an **Intermittent** State
  - Theoretical estimation for globally coupled systems
- ICCs are **Transient States**
- Some considerations on
  - The role of topology
  - The thermodynamic limit

# The experiment (WOW !!!)



- Two populations of metronomes (self-sustained oscillator)
- Each population:  $N = 15$  identical metronomes (same frequencies) on an aluminium swing (**strong coupling**)
- The two swings are coupled via 2 tunable springs (**weak coupling**)
- UV fluorescent spots on metronomes and swings

THE VIDEO !

# The Model



Two symmetrically coupled populations of  $N$  oscillators with inertia (rotators)

$$m\ddot{\theta}_i^{(\sigma)} + \dot{\theta}_i^{(\sigma)} = \Omega + \sum_{\sigma'=1}^2 \frac{K_{\sigma\sigma'}}{N} \sum_{j=1}^N \sin(\theta_j^{(\sigma')} - \theta_i^{(\sigma)} - \gamma)$$

- $\sigma = 1, 2$  identifies the population
- $\theta_i^{(\sigma)}$  is the phase of the  $i$ th oscillator in population  $\sigma$
- $\Omega$  is the natural frequency
- $\gamma = \pi - 0.02$  is the fixed frequency lag
- $K_{\sigma,\sigma} > K_{\sigma,\sigma'}$

The collective evolution of each population is characterized in terms of the macroscopic fields

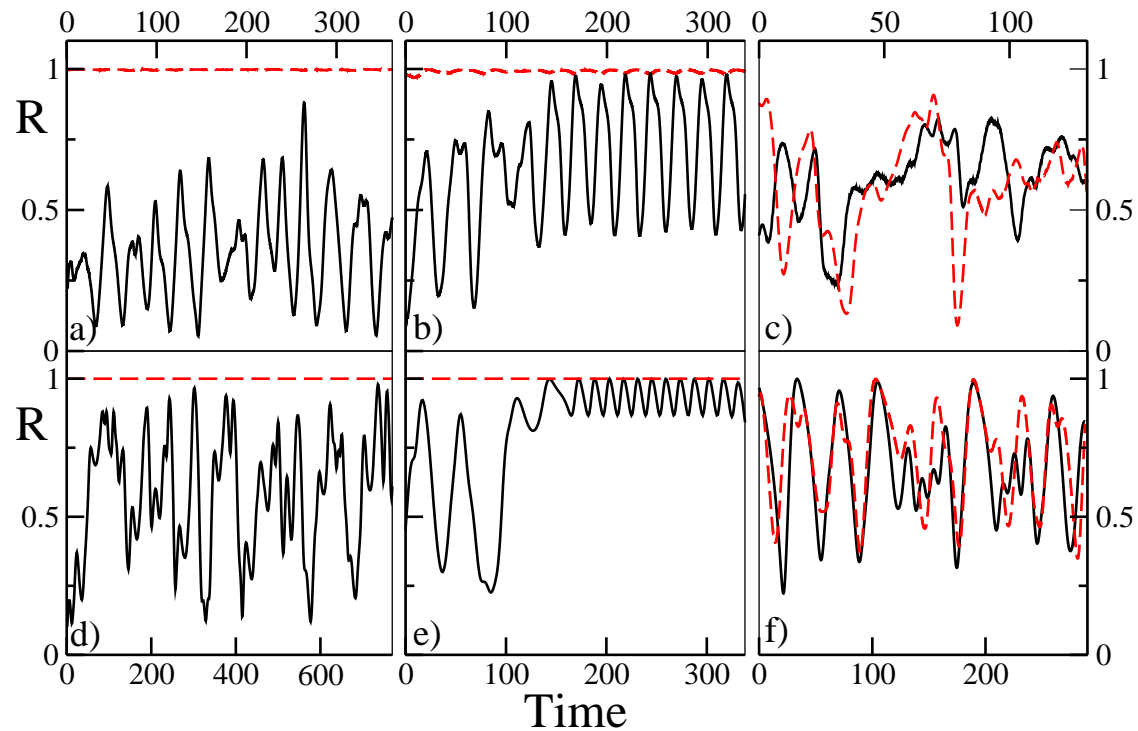
$$\rho^{(\sigma)}(t) = R^{(\sigma)}(t) \exp[i\Psi(t)] = N^{-1} \sum_{j=1}^N \exp[i\theta_j^{(\sigma)}(t)]$$

where  $R^{(\sigma)}$  is the order parameter for the synchronization transition

In analogy with [Abrams, Mirollo, Strogatz and Wiley, PRL \(2008\)](#).



# Experiment vs Model



- (a)-(d) Chaotic Chimeras
- (b)-(e) Intermittency
- (c)-(f) C2P states

- $R^{(1)}$  and  $R^{(2)}$  for the two populations,  $N = 15$
- Different Initial conditions
  - Broken Symmetry Conditions in (a,b) (d,e)
  - Uniform Conditions in (c,f)

# Chaotic Chimeras



# or Regular States ?



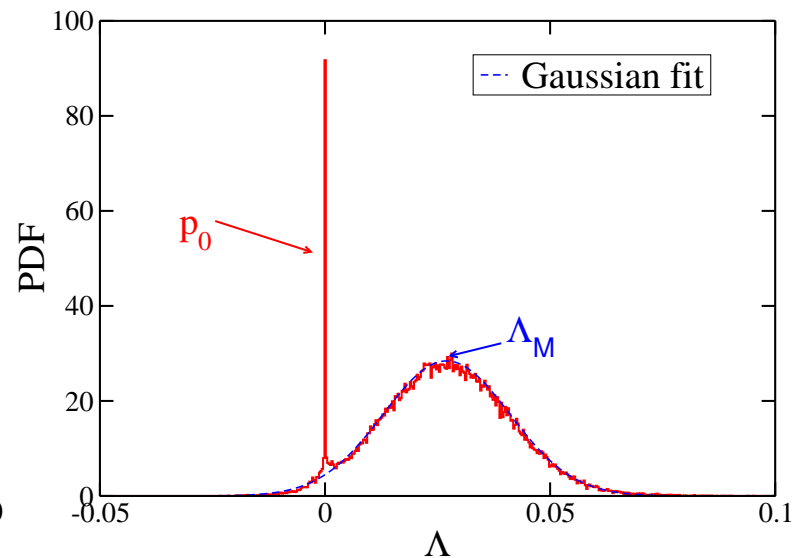
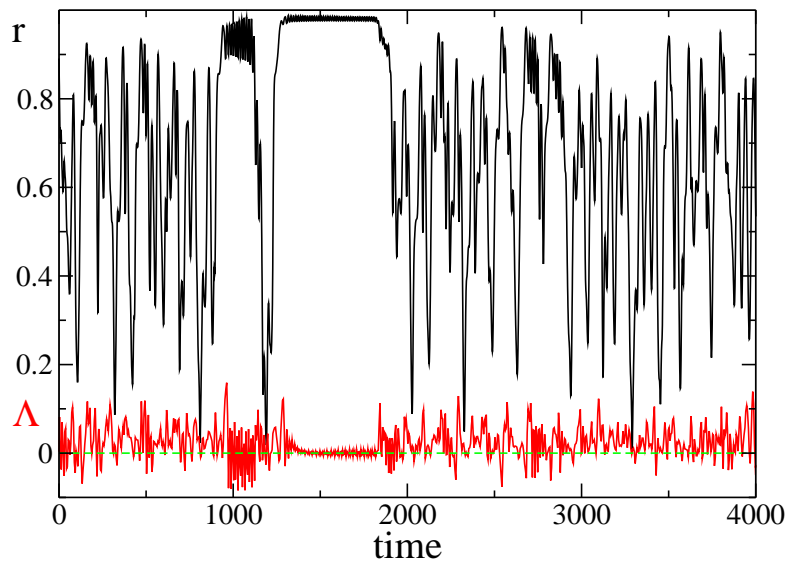
- Spatio-Temporally Chaotic Chimeras observed in ring of coupled oscillators  
[Bordyugov et al PRE \(2010\)](#); [Wolfrum and Omelchenko \(2011\)](#);  
[Sethia and Sen, PRL \(2014\)](#)
- Kuramoto model on a ring with finite-range interactions
  - Chimeras are **transient**
  - The transient time diverges **exponentially** with the size
  - Chimeras are **weakly chaotic**, with features of spatially extended systems[Wolfrum et al Chaos \(2011\)](#)
- Chaotic Chimeras (CCs) reported in two population of pulse-coupled oscillators  
[Pazó & Montbrió, PRX \(2014\)](#)
- Our aim: describe dynamical features of CCs for 2 coupled populations of Kuramoto model with inertia



# Intermittent Chaotic Chimera



The chaotic population exhibits clear **intermittent behavior**, displaying a **laminar phase** where the two populations tend to synchronize and a **turbulent phase**.



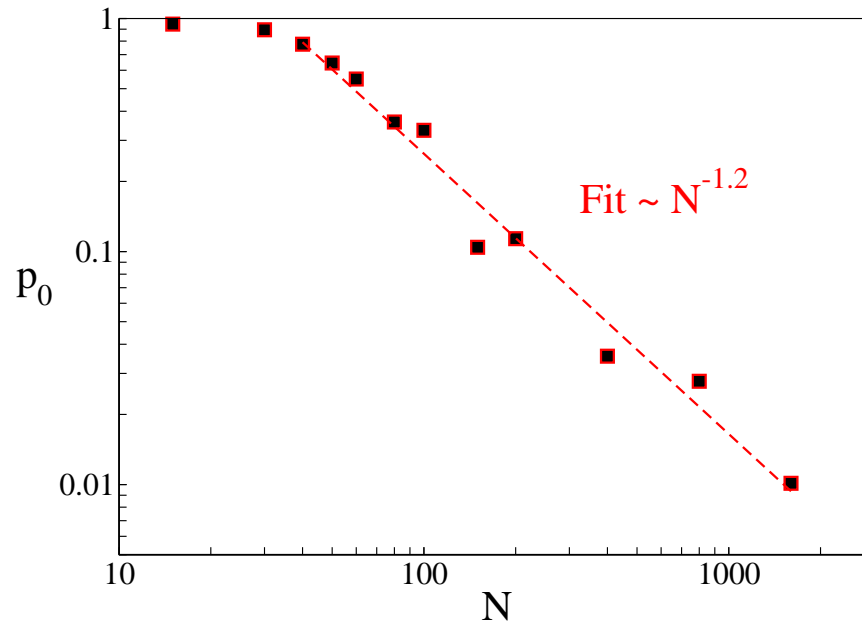
The **finite time Lyapunov exponent** (FTLE)

$$\Lambda(t) = \frac{1}{\Delta t} \ln \left[ \sqrt{\sum_{i=0}^{4N} \mathcal{T}_i(\Delta t) \mathcal{T}_i(\Delta t)} \right]$$

is calculated by performing a short time average of the magnitude of the tangent vector

$$\mathcal{T} = (\delta\dot{\theta}_1^{(1)}, \dots, \delta\dot{\theta}_N^{(1)}, \delta\dot{\theta}_1^{(2)}, \dots, \delta\dot{\theta}_N^{(2)}, \delta\theta_1^{(1)}, \dots, \delta\theta_N^{(1)}, \delta\theta_1^{(2)}, \dots, \delta\theta_N^{(2)})$$

# Laminar Phase



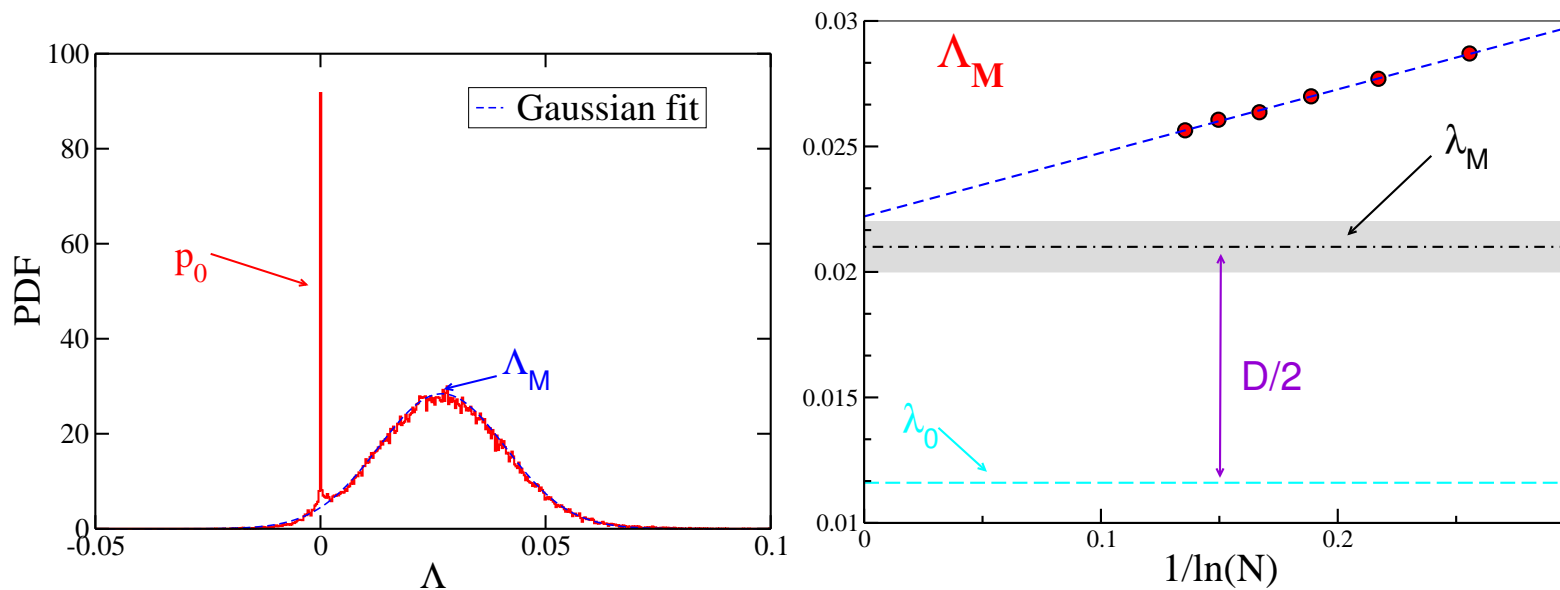
- The **laminar phase**, whose probability of occurrence is measured by  $p_0$  vanishes in the thermodynamic limit;
- In the limit  $N \rightarrow \infty$  only the **turbulent regime** is present,

# Maximal Lyapunov exponent



The maximal Lyapunov exponent  $\Lambda_M$  restricted to the turbulent phase

- $\Lambda_M$  remains positive in the limit  $N \rightarrow \infty$
- $\Lambda_M$  scales as  $1/\ln N$  with the system size



$$\Lambda_M(N \rightarrow \infty) > \lambda_0 > 0$$

$\lambda_0$  is the mean field LE for the chaotic population

# Mean Field Result



The mean field evolution of a single rotator forced by the complex fields  $\rho^{(\sigma')} = R^{(\sigma')}(t)e^{i\Psi(t)}$  is

$$m\ddot{\phi}^{(\sigma)} + \dot{\phi}^{(\sigma)} = \Omega + \sum_{\sigma'=1}^2 K_{\sigma\sigma'} \left[ \Im \rho^{(\sigma')} \cos(\phi^{(\sigma)} + \gamma) - \Re \rho^{(\sigma')} \sin(\phi^{(\sigma)} + \gamma) \right] .$$

the growth rate of the infinitesimal perturbation  $d(t) = \sqrt{|\delta\dot{\phi}^{(1)}(t)|^2 + |\delta\phi^{(1)}(t)|^2}$  is the mean field Lyapunov exponent (LE)  $\lambda_0$  for the **chaotic population**.

- The evolution of  $\ln d(t)$  in the tangent space can be seen as a **drifting Brownian particle** with average velocity  $\lambda_0$  and a diffusion coefficient  $D$  .

$$\ln d(t) \simeq \lambda_0 t \quad [\ln d(t) - \lambda_0 t]^2 = Dt$$

- From the mean field analysis one gets  $\lambda_M = \lambda_0$ , this is correct for the bulk part of the spectrum, but **wrong** for the maximal LE
- The **interaction** with the other rotators should be taken in account

$$\dot{d}_j(t) = e^{\lambda_0 t} \left[ d_j(t) + \frac{1}{N} \sum_k \mathcal{A}_{jk}(t) d_k(t) \right]$$

Same analysis as in the talk by Edward Ott



# Beyond mean field



The **particles**  $\ln |d_j(t)|$  are indeed **interacting** Brownian particles

$$\dot{d}_j(t) = e^{\lambda_0 t} [d_j(t) + \frac{1}{N} \sum_k \mathcal{A}_{jk}(t) d_k(t)]$$

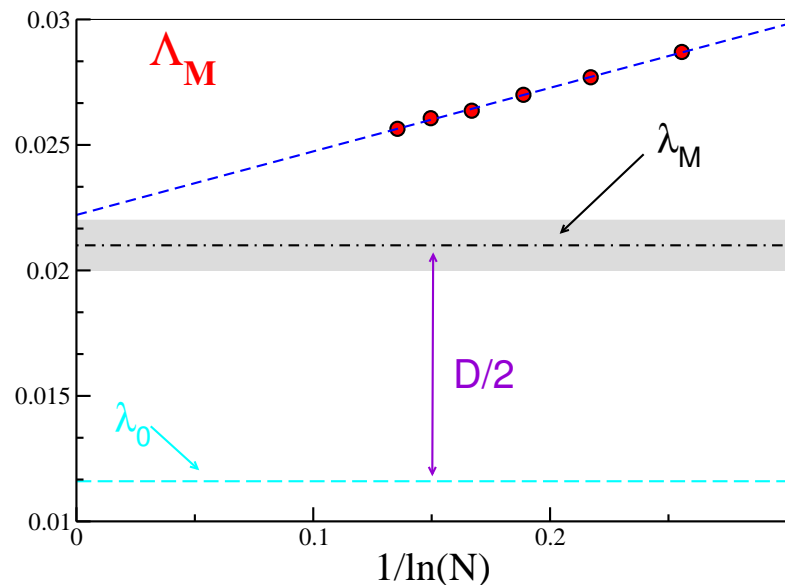
Assuming a **localized** Lyapunov vector the modulus is dominated by the largest component  $d_M(t)$  therefore

- $\ln |d_j(t)|$  diffuses freely if  $|d_j(t)| \gg |d_M(t)|/N$
- otherwise the coupling term enters in the game and the growth is dominated by  $|d_M(t)|/N$ 
  - the particles can move only within a box of size  $\simeq \ln(N)$ : the **slowest particles** are pulled and the **fastest particle** pushes the box;
  - The maximal LE  $\lambda_M$  is **the average velocity of the box**.

# Finite Size Scaling



One can write a Fokker-Planck equation for the evolution of these pseudo-particles within the box and from the stationary solution one gets the correct scaling for the maximal LE



$$\lambda_M(N) = \lambda_0 + \frac{D}{2} + \frac{a}{\ln(N)} + \mathcal{O}\left(\frac{1}{\ln^2(N)}\right)$$

- $\lambda_0$  is the mean field LE value
- $D$  is the diffusion coefficient associated to the fluctuations of  $\lambda_0$

First quantitative verification for a continuous time system of the [Takeuchi et al](#) theory, with the extra difficulties to have intermittent dynamics and two interacting populations

[Takeuchi, Chaté, Ginelli, Politi, AT, PRL \(2011\)](#)

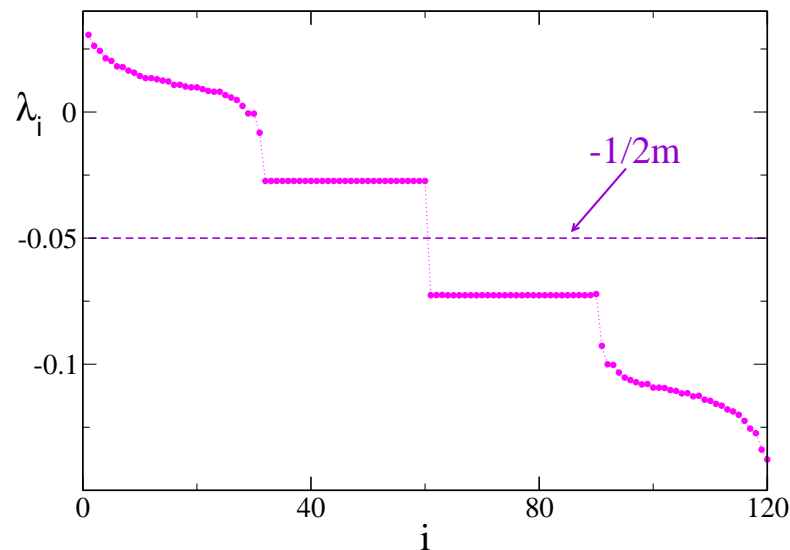
# Lyapunov Spectrum



- The **Lyapunov spectrum** is made of  $4N$  exponents, but it exhibits a pairing rule

$$\lambda_i + \lambda_{4N-i+1} = -\frac{1}{m} \quad i = 1, \dots, 2N \quad \text{U Dressler PRA (1988)}$$

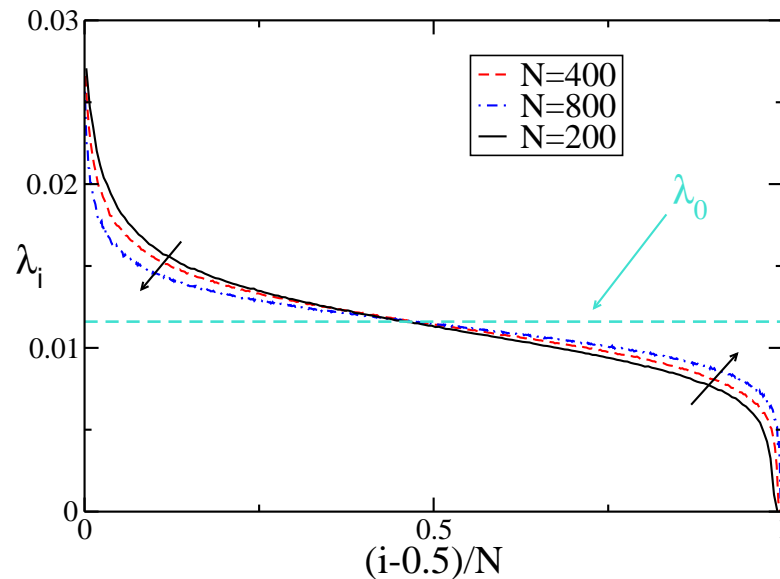
- The **spectrum** is composed of a **positive** part and a **constant negative** part.
- The **negative part** is associated to the **synchronized population** and coincides with the mean field value for this population
- The **positive part** is associated to the **chaotic population**



# Positive Lyapunov Spectrum



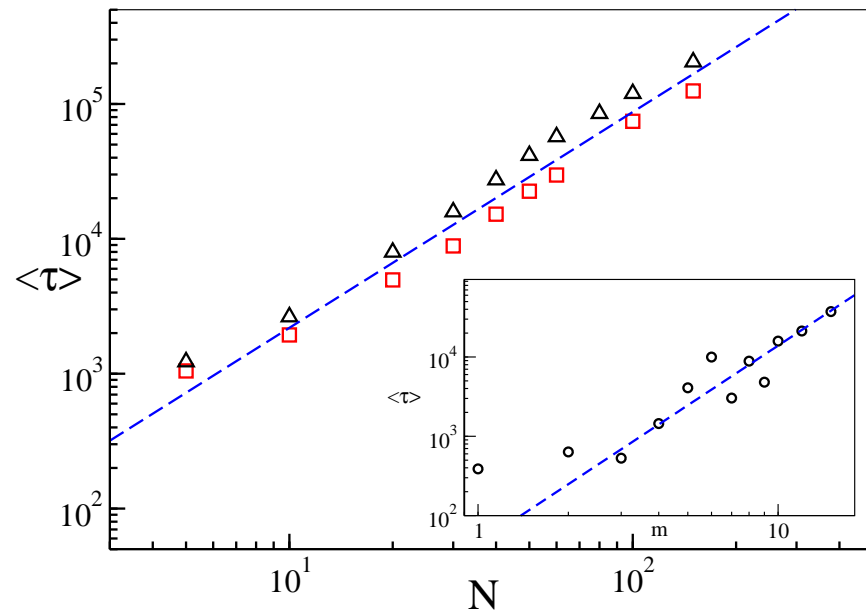
- The chaos is high dimensional  $N - 2$  positive Lyapunov exponents
- The most part of the positive spectrum tends to flatten to the mean field LE value  $\lambda_0$ , trivially extensive
- the Lyapunov in two sub-extensive bands  $\mathcal{O}(\ln N)$  take different values with respect to  $\lambda_0$ , similarly to what shown for  $\lambda_M$



Same behavior demonstrated for one population of globally coupled dissipative units

Takeuchi, Chaté, Ginelli, Politi, AT, PRL (2011)

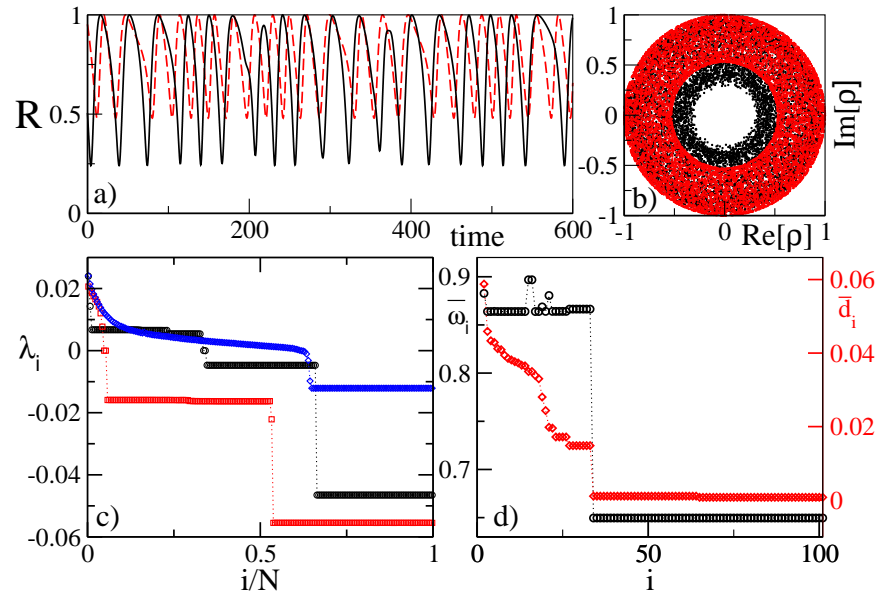
# Life Times of the ICCs



- The chaotic chimeras converge to a regular non chaotic state after a transient time  $\tau$  for all investigated masses ( $m = 6, 8$  and  $10$ )
- The final, stable, state can be either the **fully synchronized** solutions or even a broken symmetry state, corresponding to a **breathing chimera**.

- Chaotic transients diverge with  $N$  as a **power law** with an exponent  $\alpha \approx 1.60$ .
  - This result is in contrast with the observed exponential growth of the transient time found by **Wolfrum and Omel'chenko** in **PRE (R) (2011)**, typical of spatially extended systems (with **Kuramoto-Sakaguchi** oscillators).

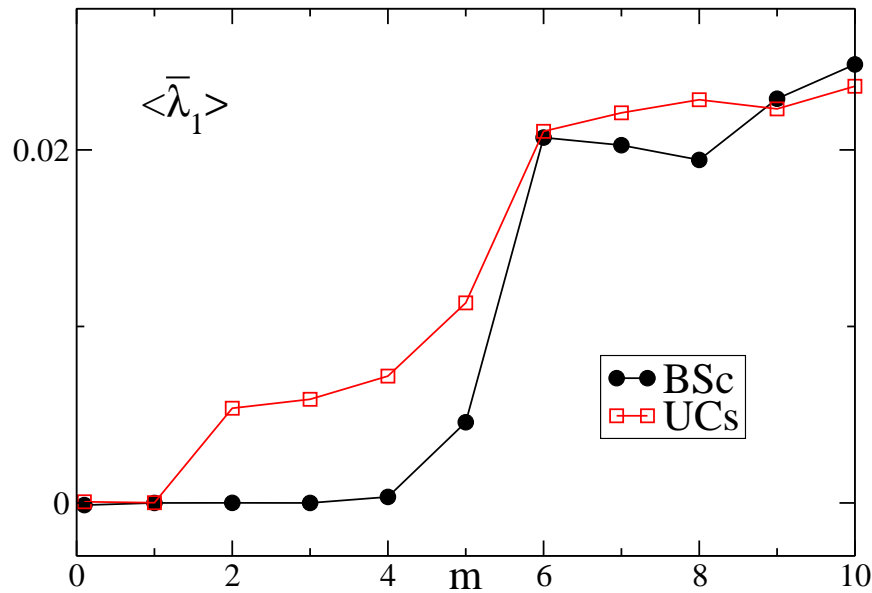
# Chaotic Two Population States



- $\bar{\omega}_i = \frac{d\bar{\theta}_i}{dt}$  average velocities
- $\bar{d}_i$  average contribution of the  $i$ -th oscillator to the maximal LE

- C2P are states with **broken symmetry**
- C2P are **not transient** states
- C2P are Multistable
- Most of the oscillators of the two populations form a **common cluster**
- Only the **isolated oscillators** contribute to chaos

# Mass Dependence



- At **small**  $m$  coexisting breathing chimeras and quasi-periodic chimeras, no chaos
- At sufficiently **large**  $m$  chaotic states emerge
- We never observed a **stationary chimera state**

Wolfrum et al. (CHAOS 2011), analyzing a ring of identical Kuramoto oscillators with a finite range interaction, have shown that

- Chimera states are chaotic transients diverging exponentially with  $N$ ;
- Chaos is weak
- Lyapunov spectra scales as in spatially extended systems.

We considered a network of two fully coupled populations; in this case

- The life-times of the ICCs diverge as a power-law with  $N$  and  $m$
- The maximal Lyapunov exponent remains positive in the infinite size limit and tends to split from the rest of the spectrum.
- The spectrum becomes asymptotically flat (thus trivially extensive), but this part is sandwiched between subextensive bands (as for fully coupled systems)

[Takeuchi et al. PRL 2011]

S. Olmi, E. Martens, S. Thutupalli, AT, arXiv:1507.07685



# Conclusions and Outlook



- **Topology** matters for the **stability properties of chaotic chimera states**;
- Furthermore, the presence of **inertia** is responsible of the fact that ICCs become a stationary chaotic state in the **thermodynamic limit**

These systems are akin to Hamiltonian models , namely Hamiltonian Mean Field (HMF) Model (Antoni & Ruffo, 1995) -- 20 years of the HMF Model

- The Lyapunov spectrum satisfies the following a pairing rule

$$\lambda_i + \lambda_{4N-i+1} = -\frac{1}{m} \quad i = 1, \dots, 2N \quad [\text{U Dressler, PRA, 1988}]$$

- Transient times diverging as  $N^{1.7}$  have been reported for the metastable states observed in the HMF model [ YY Yamaguchi, PRE, 2003]

Can the properties of ICCs be related to Hamiltonian features ?

# Fokker-Planck Equation



The distribution of the particles  $u = \ln |d|$  in the box  $u \in [0; u_{max}]$  in the reference frame moving with velocity  $\lambda_M(N)$  is ruled by the following Fokker-Planck equation

$$\frac{\partial P(u, t)}{\partial u} = -\frac{\partial}{\partial u} [\Delta\lambda] P + \frac{D}{2} \frac{\partial^2 P(u, t)}{\partial u^2}$$

where  $\Delta\lambda = \lambda_0 - \lambda_M(N)$

For sufficiently large  $N$ , since  $u_{max} \propto \ln N$ , the stationary solution is given by

$$P_s(u) = \frac{2\Delta\lambda}{D} e^{-\frac{2\Delta\lambda u}{D}}$$

Furthermore, the following normalization condition should hold

$$\int_{u_{max}}^{\infty} du P_s(u) = \frac{\mathcal{O}(1)}{N}$$

since only 1 particle should be nearby  $u_{max}$ , this leads to the finite size scaling

$$\lambda_M(N) = \lambda_0 + \frac{D}{2} + \frac{a}{\ln(N)} + \mathcal{O}\left(\frac{1}{\ln^2(N)}\right)$$

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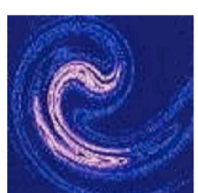
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