Happy Birthday Nat !

Synchronization: What can a plasma physicist say about generic collective behavior? Thomas M. Antonsen Jr. and Edward Ott



INSTITUTE FOR RESEARCH IN ELECTRONICS & APPLIED PHYSICS



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# Synchronization in Nature

Generic behavior involving a large ensemble of nearly identical oscillators that are weakly coupled.

- Cellular clocks in the brain.
- Pacemaker cells in the heart.
- Flashing fire flies.
- Deep Brain Stimulation (DBS) treatment for Parkinson's.
- Pedestrians on a bridge
- Many more





**Strogatz** 

Physica D: Nonlinear Phenomena Volume 143, Issues 1-4, 1 September 2000, Pages 1-20

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From Kuramoto to Crawford: exploring the onset of synchronization in populations of coupled oscillators

Steven H. Strogatz



#### Activity of cells in the Suprachiasmatic Nucleus (SCN)

#### The daily pacemaker

<u>Dorsal cells don't synchronize</u> Top trace shows activity with multiple frequencies and phases

<u>Ventral cells synchronize</u> Lower trace shows locked frequencies, but various phases

Cellular clocks in the brain (day-night cycle). Yamaguchi et al., Science <u>302</u>, 1408 ('03).

## **Phase Oscillators**



Dynamics of individual elements is in higher dimensional space

Attraction to limit cycle Period  $T_i = 2\pi/\omega_i$ 

With weak coupling to others, only the evolution of the phase is important.

$$\frac{d\theta_i(t)}{dt} = \omega_i + \text{coupling to others}$$

Competition between effects of coupling and spread in distribution of natural frequencies - <u>Winfree</u>

## Kuramoto Model (1975)

$$\frac{d\theta_i(t)}{dt} = \omega_i + \frac{k}{N} \sum_{j=1}^N \sin(\theta_j - \theta_i)$$

Individual frequencies selected from a pdf  $g(\omega)$ .

k =coupling strength

Phases attract each other

Introduce order parameter A "mean" field

$$R(t) = \frac{1}{N} \sum_{j=1}^{N} \exp(i\theta_j)$$

$$\frac{d\theta_i(t)}{dt} = \omega_i + k \operatorname{Im}\left(\operatorname{Re}^{-i\theta_i}\right)$$

### **Order parameter measures the coherence**



# **Spontaneous Synchronization**

There is a transition to synchrony at a critical value of the coupling constant.



## N→∞ Limit: Shades of Vlasov

Distribution Function 
$$f(\theta, \omega, t)$$
  $g(\omega) = \int_{0}^{2\pi} f(\omega, \theta, t) d\theta$   
Evolution of DF  $\frac{\partial f}{\partial t} + \frac{\partial}{\partial \theta} \left\{ \frac{d\theta}{dt} f \right\} = 0$   
Where did the dou/dt go?  
Flow in  $\theta$   $\frac{d\theta}{dt} = \omega + K \operatorname{Im}(\operatorname{Re}^{-i\theta})$   
 $R(t) = \frac{1}{N} \sum_{j=1}^{N} \exp(i\theta_j) \rightarrow \int_{0}^{2\pi} d\theta \int_{-\infty}^{+\infty} d\omega f e^{i\theta}$ 

# **Connection to Landau Damping**

Early attempts to understand onset of synchronization led to confusion "Incoherence was neutral by one measure stable by another". .S.S

Linear theory:  
As t 
$$\rightarrow \infty$$
  $R(t) = \iint d\omega d\theta f(\omega, \theta, t = 0)e^{-i\omega t} + Ae^{st}$   
Ballistic term Collective mode

Collective Mode Dispersion Relation

$$1 = \frac{k}{2}\chi(s) = \frac{k}{2}\int d\omega \frac{g(\omega)}{s - i\omega}$$

S. Strogatz, Sync, p64.

"Paul (Matthews) gave a lecture at the University of Warwick... One of the Professors in the audience, George Rowlands, told Paul that what we were seeing was not so strange: It's called Landau damping, and plasma physicists have known about it for 45 years."

## **Spontaneous Synchronization**

There is a transition to synchrony at a critical value of the coupling constant.

 $g(\omega) = PDF$  of natural oscillator frequencies  $\omega$ .



# What We Found

Ott & Antonsen, Chaos <u>18</u>, 037113 ( '08); and Chaos <u>19</u>, 023119 ( '09). Also Ott, Hunt & Antonsen, Chaos 19, 023117 ('09)]

- A <u>nonlinear solution</u> for for the <u>distribution function</u> in the limit  $N \rightarrow \infty$ .
- The time evolution of the <u>order parameter</u> is that of a <u>low</u> <u>dimensional system</u>.
- **O** The nonlinear solution is a "weak" <u>attractor</u>

Special case of Lorenzian 
$$g(\omega) = \frac{\Delta}{\pi \left[ (\omega - \omega_0)^2 + \Delta^2 \right]}$$

$$\frac{dR}{dt} + \frac{k}{2}(|R|^2 - 1)R + (-i\omega_{\theta} + \Delta)R = 0$$

### Nonlinear Solution: the O-A Ansatz

A distribution function of the following form satisfies the kinetic equation.

$$f_{OA}(\theta,\omega,t) = \frac{g(\omega)}{2\pi} \left[ \frac{1}{1 - \alpha(\omega,t)e^{i\theta}} - \frac{1}{2} \right] + c.c$$

Where: 
$$\frac{\partial}{\partial t} \alpha + i\omega \alpha + \frac{k}{2} (R \alpha^2 - R^*) = 0$$
  
parametric dependence on  $\omega$ 

Order Parameter:  $R(t) = \int d\omega g(\omega) \alpha^*(\omega, t)$ 

$$\frac{d}{dt}R(t) = \int d\omega g(\omega) \ \frac{\partial}{\partial t}\alpha^*(\omega, t) = \dots$$

### Weak Attractor

In general, the distribution function is the sum of the O-A Ansatz and a remainder. O-A ansatz lies on a submanifold M in space of functions.  $f(0, w, t) = f_{-1}(0, w, t) + f_{-1}(0, w, t)$ 

$$f(\theta, \omega, t) = f_{OA}(\theta, \omega, t) + f_{rem}(\theta, \omega, t)$$

You cannot show

$$f_{rem}(\theta,\omega,t) \rightarrow 0 \quad \text{as} \quad t \rightarrow \infty$$

You can show  $\iint d\omega \, d\theta \, f_{rem}(\theta, \omega, t) \, e^{-i\theta} \to 0 \quad \text{as} \quad t \to \infty$ 

Solution for R(t) is an attractor

• M is an *invariant* submanifold.

### **Generalizations of the Kuramoto Model**



#### E.g., circadian rhythm.

<u>Ref.</u>: Sakaguchi, ProgTheorPhys( '88); Antonsen, Faghih, Girvan, & Ott, Platig, Chaos <u>18</u> ( '08); Childs, Strogatz, Chaos <u>18</u> ( '08).

#### **Communities of Oscillators:**

A = # of communities;  $\sigma$  = community ( $\sigma$  = 1,2,..., s); N<sub> $\sigma$ </sub> = # of individuals in community  $\sigma$ .

$$\frac{d\theta_i^{\sigma}}{dt} = \omega_i^{\sigma} + \sum_{\sigma'=1}^s \left(\frac{k_{\sigma\sigma'}}{N_{\sigma'}}\right) \sum_{j=1}^{N_{\sigma'}} \sin(\theta_j^{\sigma'} - \theta_i^{\sigma} + \beta^{\sigma\sigma'})$$

<u>Refs</u>, Barreto et al., PhysRevE ( '08);Martens et al., PhysRevE( '09); Abrams,et al.,PhysRevLett( '08); Laing, Chaos<u>19</u>( '09); and Pikovsky & Rosenblum, PhysRevLett <u>101</u> ( '08).

### **Generalizations of the Kuramoto Model**



**Millennium Bridge Problem:** 

$$\frac{d\theta_i}{dt} = \omega_i - b\left(\frac{d^2y}{dt^2}\right)\cos(\theta_i + \beta) \qquad \text{(Walker phase)}$$

$$\left(\begin{array}{c} \text{(Bridge mode)} \\ \left(\frac{d^2y}{dt^2}\right) + v \frac{dy}{dt} + \Omega^2 y = \frac{1}{M}\sum_i f_i \qquad \text{(Walker force on bridge)} \end{array}\right)$$

<u>Ref.:</u> Eckhardt, Ott, Strogatz, Abrams, & McRobie, PhysRevE <u>75</u>, 021110( '07); Abdulrehem and Ott, Chaos <u>19</u>, 013129 ( '09).

### Extensions: heterogeneous time delays

W.S.Lee, E.Ott, T.M.Antonsen, Phys. Rev. Lett. ( '09).



### Local spatial coupling

W.S.Lee, J.G.Restrepo, E.Ott, & T.M. Antonsen, Chaos 21, 023122 (2011)

$$R(t, \mathbf{x}) = \int d^n x' q(\mathbf{x} - \mathbf{x}') \int_0^\infty d\tau h(\tau) \int_0^{2\pi} d\theta \int_{-\infty}^{+\infty} d\omega f(t - \tau, \mathbf{x}') e^{i\theta}$$



(s) |r|, t = 225

### Unsolved Problem: Large but finite N

TMA, E. Ott, Paul So, and Ernie Barreto

#### Plasma approach: dressed test particles

**Correlations, fluctuations, and stability of a finite-size network of coupled oscillators** Michael A. Buice and Carson C. Chow\*, PHYSICAL REVIEW E 76, 031118 (2007)

Applies to the incoherent state  $k < k_c$ 

#### What's the problem?

- So far no settled theory applies to the transition
  - (Hong et al. PRE 2015, Daido PRE 2015 scaling theory)
- To complicate matters: Time averaging and ensemble averaging are not the same !
- What is important? Time average of a single realization or ensemble average?

\* Nat's academic brother

### Fluctuations at the Transition



### The tale of three different realizations: Manny, Mo, and Jack



Temporal variations are only part of the story

# Changes is fluctuation levels



Different realizations transition at different *k*-values.

As k is increased past  $k_c$  distribution of  $R^2$  values evolves



## Conclusion

Plasma Physics has had, and will have a big influence on the understanding and mathematical description of synchronization.

The Kuramoto model has an exact nonlinear solution in the N- infinite limit that is a weak attractor.

The correct description of the finite N with noise limit is still unresolved.

Oh yes, and Happy Birthday Nat.

# Generalizations (continued)

- <u>Time varying link coupling strengths: P.</u>So, B.Cotton, & E.Barreto, *Chaos <u>18 (</u> '08)*.
- <u>Distribution of heterogeneous link time delays:</u> W.S.Lee, E.Ott, T.M.Antonsen, *Phys.Rev.Lett.* ( '09).
- Josephson junction circuits: S.Marvel, S.Strogatz, *Chaos( '09)*.
- Oscillators distributed in space with local coupling: This situation displays hysteresis, traveling fronts, spiral waves, target patterns, stationary spots, chimera, etc.
   C.Laing, *Chaos <u>18</u> ( '09)*; and W.S.Lee, J.G.Restrepo, E.Ott, & T.M.Antonsen, Chaos 21, 023122 (2011).
- <u>Birdsong model compared with experimental data on</u> <u>canaries:</u>L.M.Alonso, J.A.Alliende, & G.B.Mindlin, *Europhys. Lett. ( '10).*
- And others.