



The Institute of
Mathematical
Sciences, Chennai



Complex Systems: The Organizing Principles of Nature & Society



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What is Complex ?

Everything that the theoretician wishes weren't there!

The Grad student's prayer:

“God, please make the universe linear, stationary and Gaussian” (and we can also add “at equilibrium”)

So most complex systems are

- ❑ NON-linear
- ❑ NON-stationary
- ❑ NON-Gaussian
- ❑ FAR-FROM-equilibrium

A key aspect of complex systems is the **EMERGENCE** of qualitatively different properties at the system-level

Emergence: “More is Different”



Philip W Anderson

PW Anderson, *Science* 1972

The elementary entities of science X obey the laws of science Y.

X	Y
solid state or many-body physics	elementary particle physics
chemistry	many-body physics
molecular biology	chemistry
cell biology	molecular biology
⋮	⋮
⋮	⋮
⋮	⋮
psychology	physiology
social sciences	psychology

But this hierarchy does not imply that science X is “just applied Y.”

At each stage entirely new laws, concepts, and generalizations are necessary, requiring inspiration and creativity to just as great a degree as the previous one. Psychology is not applied biology, nor is biology applied chemistry.

Example: Why statistical mechanics ?

Classical Mechanics

$N = 1$ particle

Relevant variables:

x, p



Phenomenology: Kepler's laws



Foundation: Newton's laws

Thermodynamics

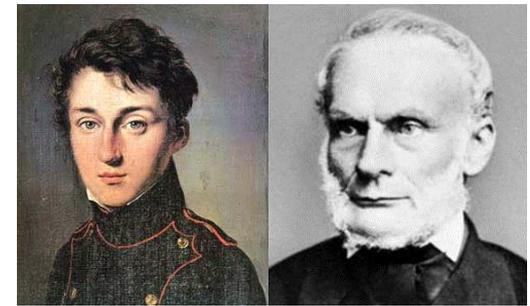
$N = 10^{23}$ particles

Relevant variables:

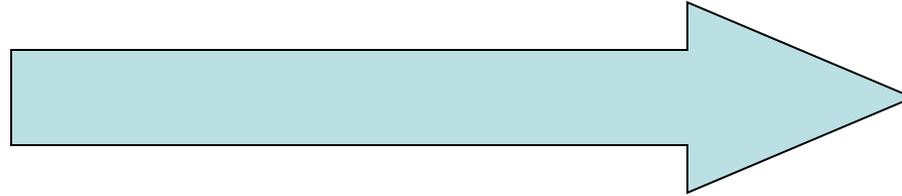
P, V, T



Phenomenology: Boyle's law etc



Foundation: The laws of thermodynamics (Carnot, Clausius)

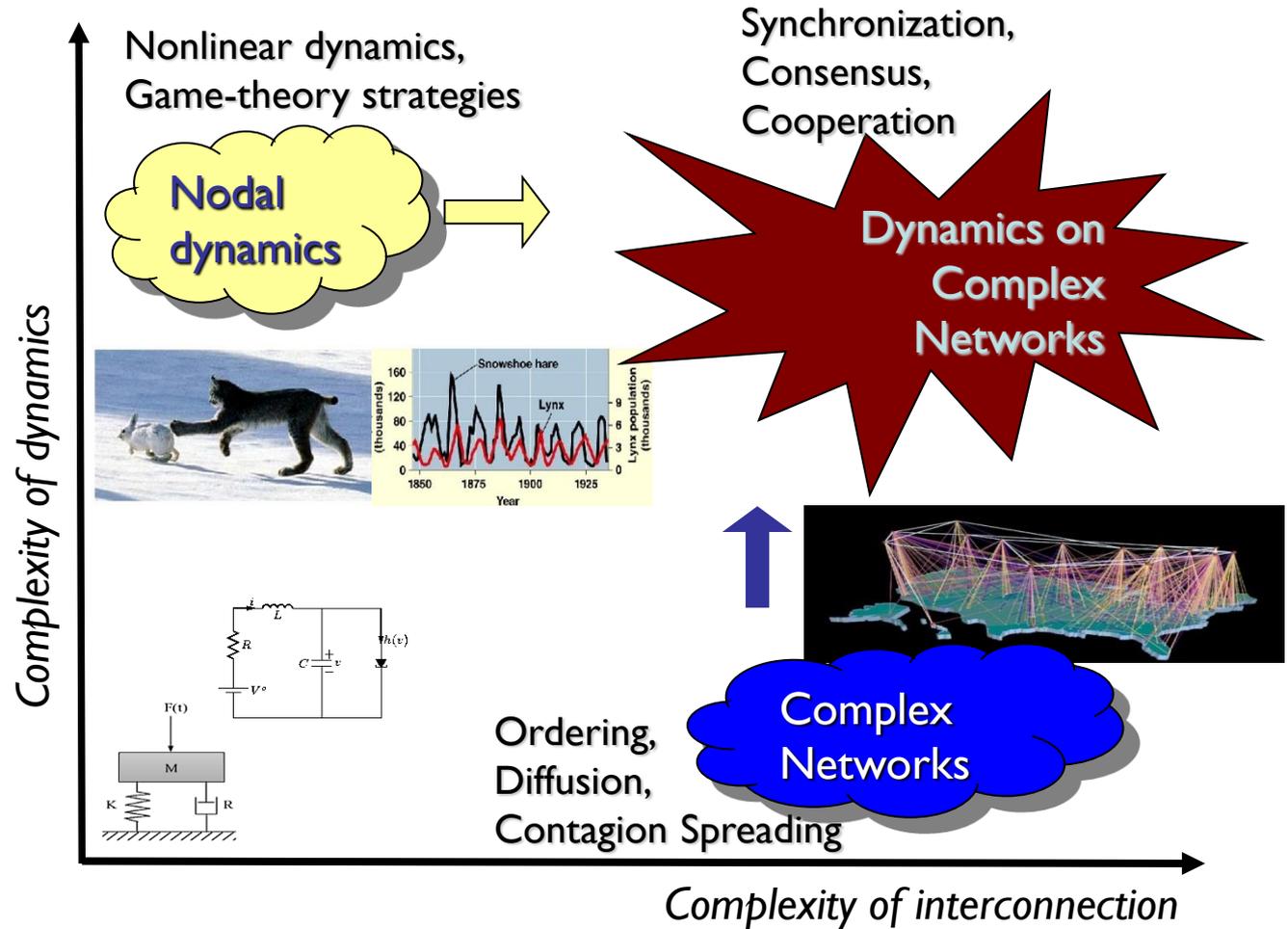


Statistical Mechanics



Ludwig Boltzmann

Problem: The components of complex systems are much more complicated than the simple particles of conventional statistical mechanics



So, do we need a new “statistical mechanics” for complex systems ?

The Quest:

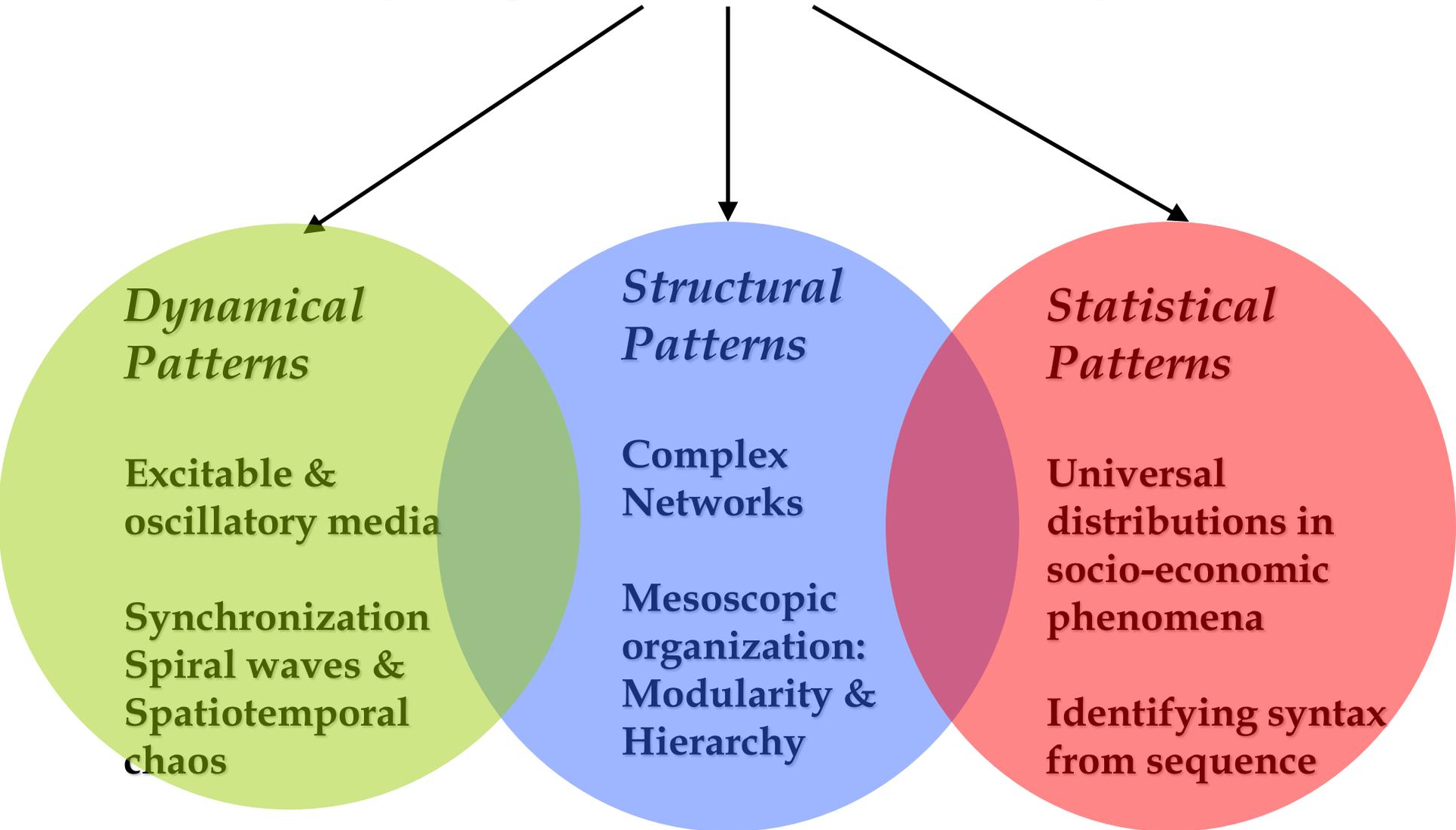
Are there universal organizing principles for complex systems arising in different domains ?

For example,

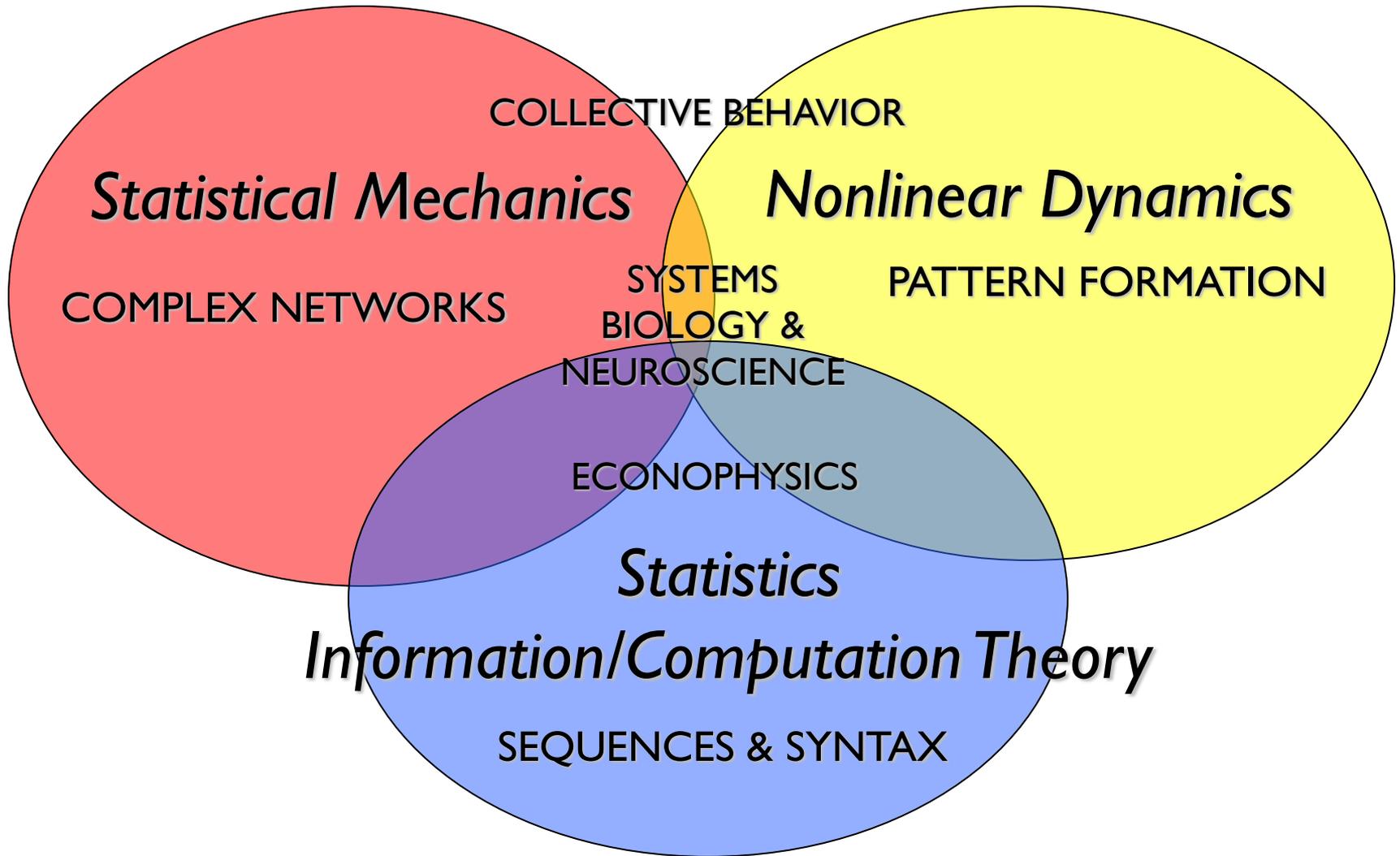
- can similar principles be at work behind the design of signaling machinery inside the cell and the design of networks of neurons in the brain ? **Why networks rather than pathways ?**
- can the process of cascading extinctions leading to ecosystem collapse be used to explain the large-scale failure of man-made systems such as electrical power grid ? **What are the conditions that increase the probability of network-wide crashes, as in the recent banking system collapse ?**

The Theme

Analyzing patterns in complex systems



The Tools



What can Complex Systems give back to Physics ?

Is there a complexity transition ? If you add together enough number of interacting elements will you always eventually end up with emergence of complexity (“BOOM”) ???!

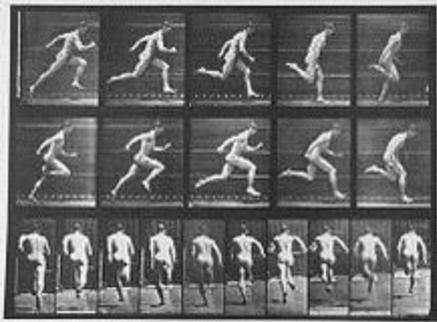
Can contribute to

- **Statistical Mechanics: Non-equilibrium Systems**
- Even kinetic theory throws up surprising results after a detour through complex systems
- **Nonlinear Dynamics: Characterization of spatiotemporal phenomena**
- While low-dimensional systems well understood, what about the bifurcations or routes to chaos of spatially extended systems ?

Dynamical Patterns

“Clocks” in nature: span many space & time scales

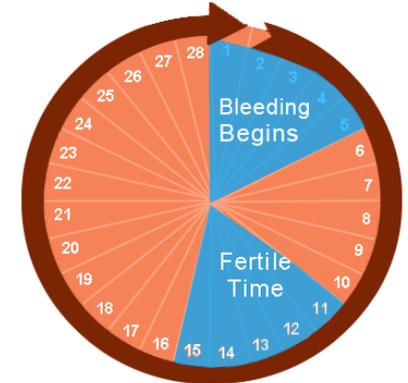
Locomotion gait patterns



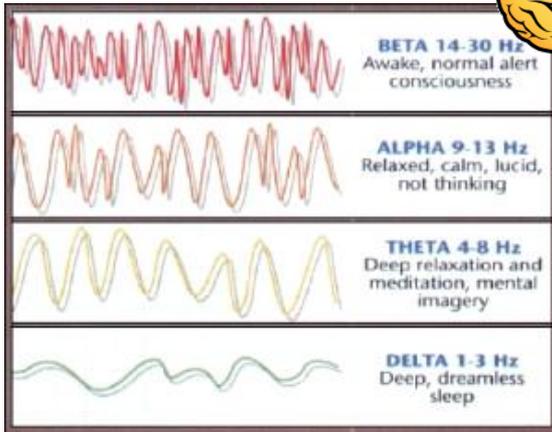
Circadian rhythm



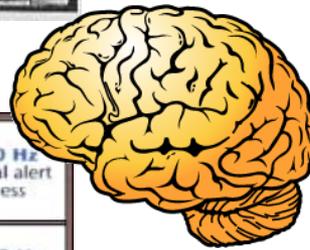
The Menstrual Cycle



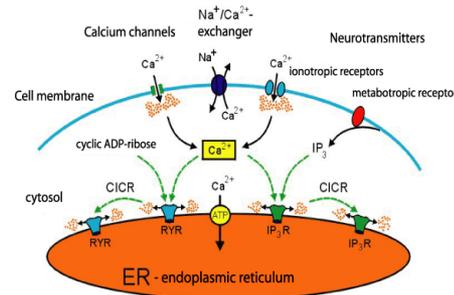
Spatial scale



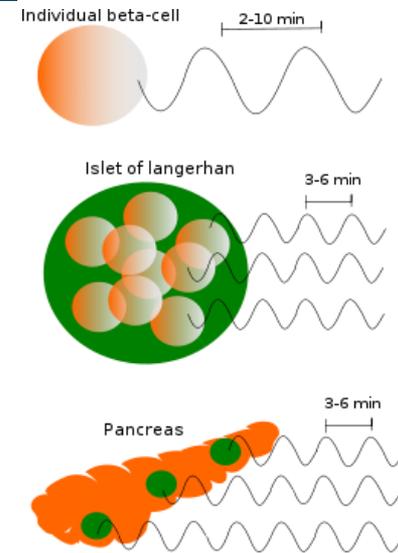
Brain activity oscillations



Intracellular oscillations



Insulin release oscillations



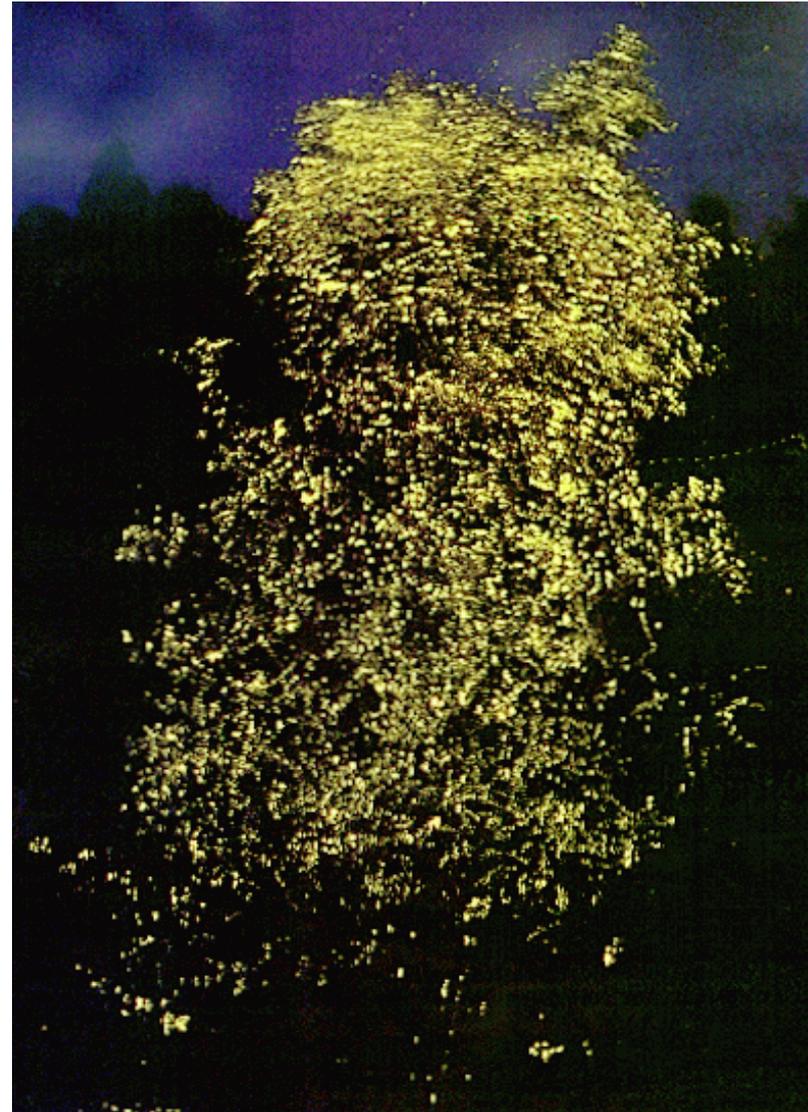
Time-scale

Synchronization of spatially distributed oscillations is ubiquitous in nature...

- Pacemaker cells in the heart
- β -cells in the pancreas
- Long-range synch across brain during perception
- Contractions in the pregnant uterus
- Menstrual cycles
- Rhythmic applause
- Pedestrians on a bridge falling in step with the swinging motion of bridge

Male Fireflies flashing in unison

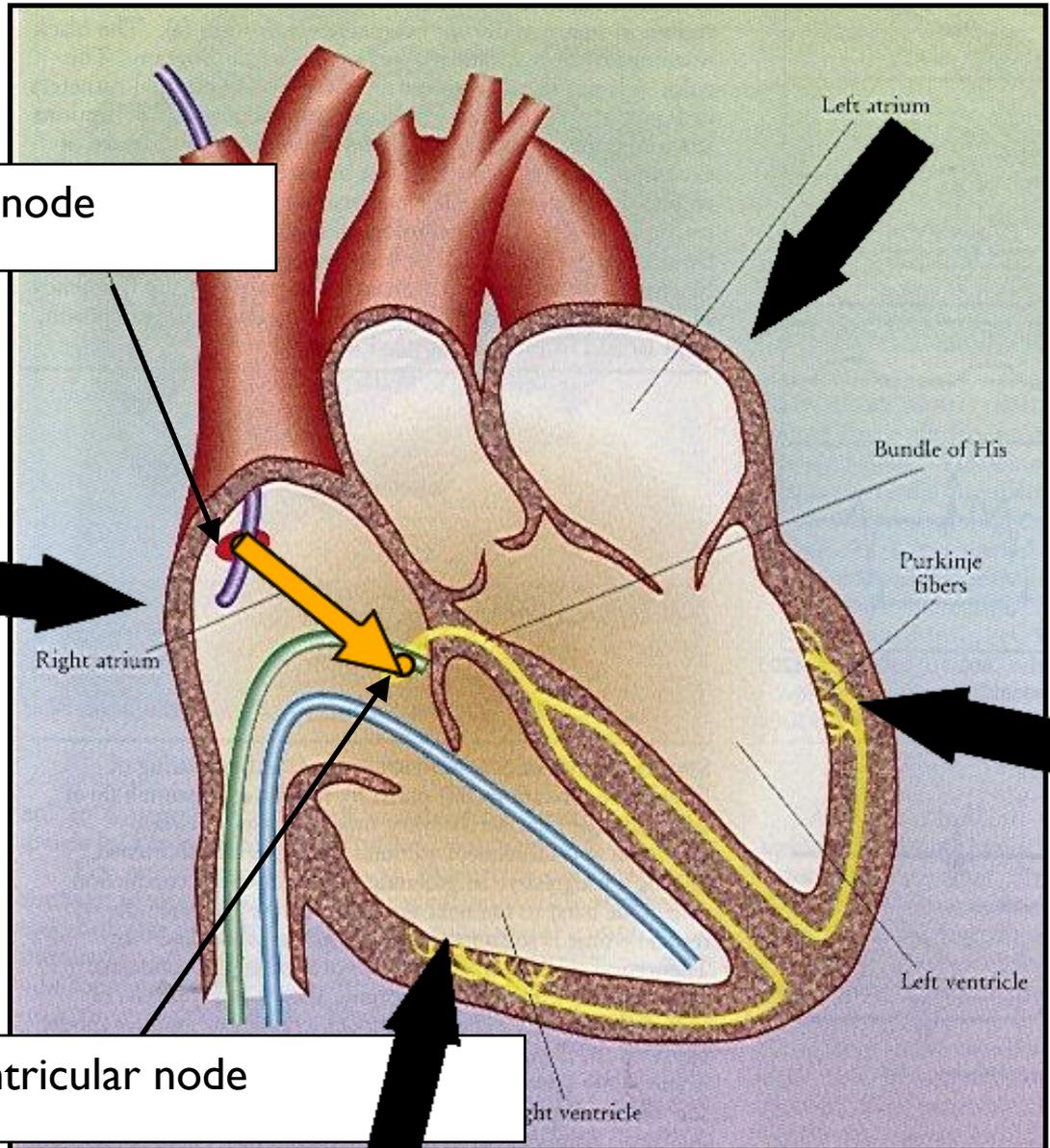
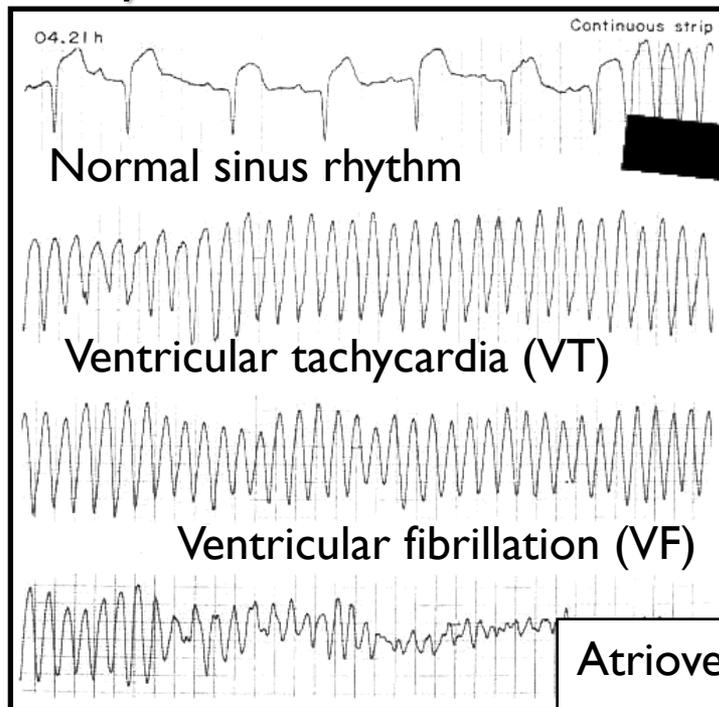
Each insect has its own rhythm – but the phase alters based on seeing its neighbors lights, bringing harmony



... and vital for the proper functioning of many biological systems

Example:

Disruption of coherent collective activity in heart can result in life-threatening arrhythmia

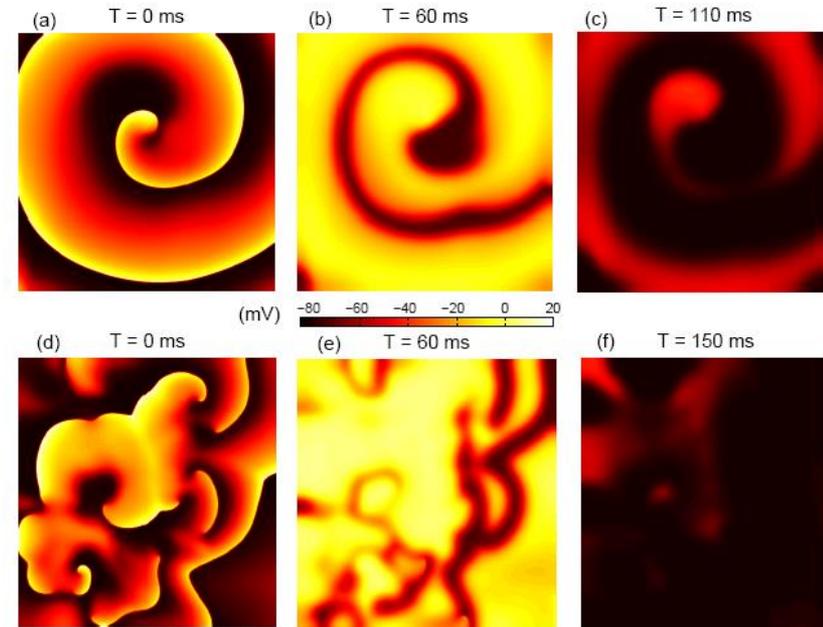
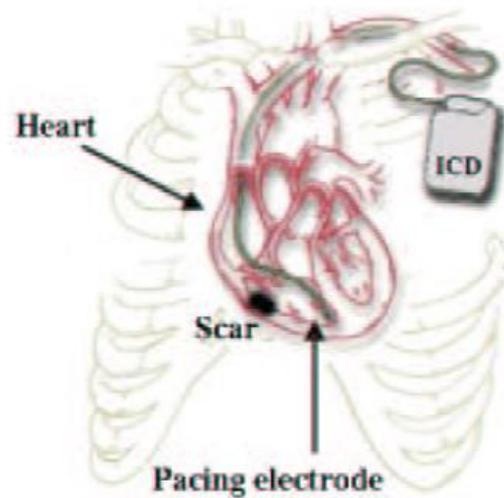
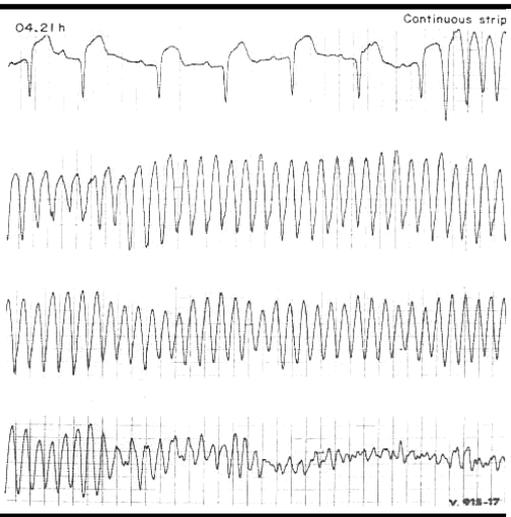


Sinus node

Atrioventricular node

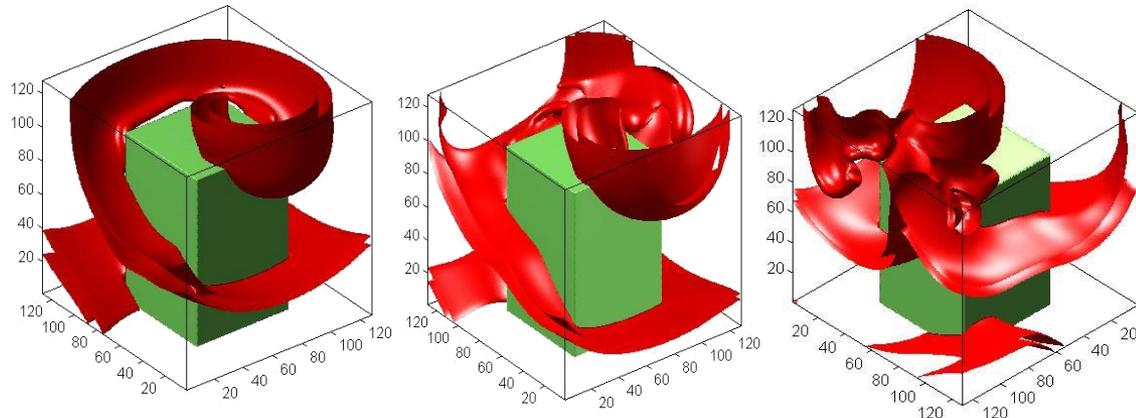
Understanding the genesis of Cardiac Arrhythmias

Arrhythmia: Life-threatening disruption in natural rhythmic functioning of the heart



Can only be treated through application of large electrical shocks to the heart – but how much is enough ?

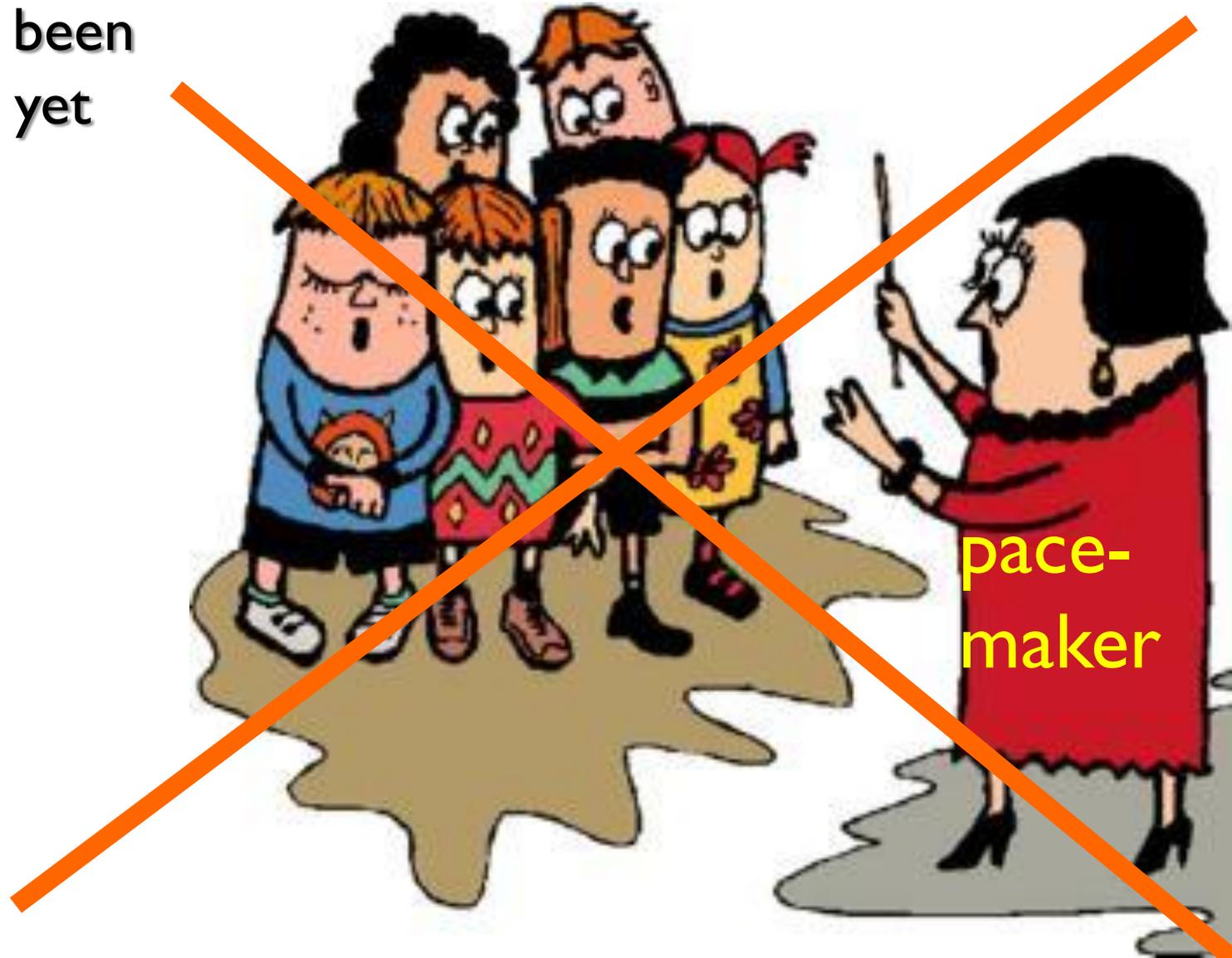
Are scar tissues and other inexcitable regions in the heart pro-arrhythmic or prevent the initiation of life-threatening fibrillation ?



For many processes

No centralized coordination

agency have been
identified as yet



Ordering without centralized coordination

Local interactions can lead to order without an organizing center in complex systems



Wikipedia

Examples:
flocking and swarming

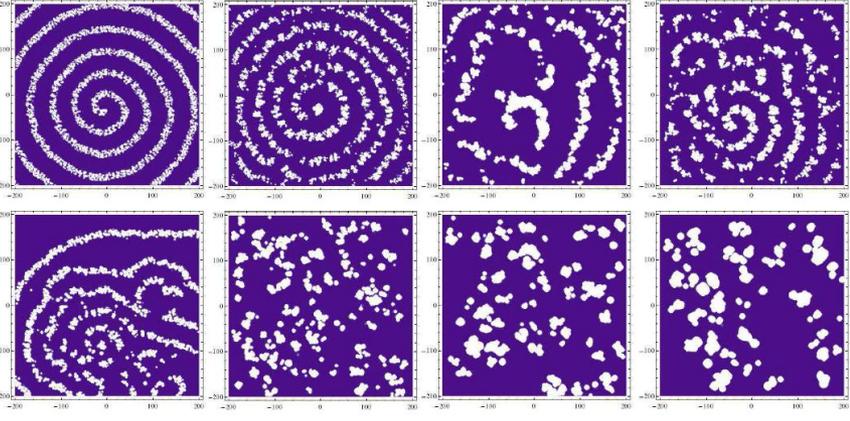
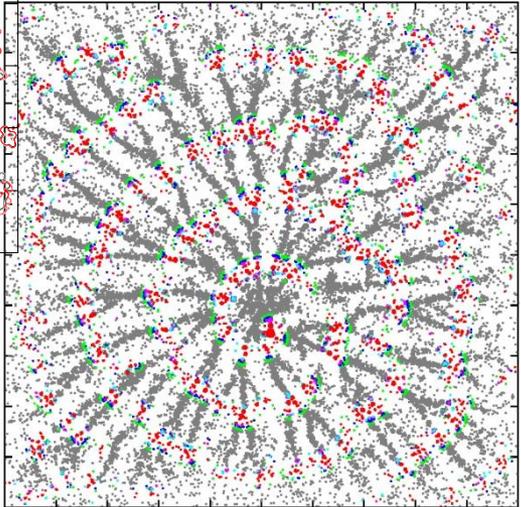
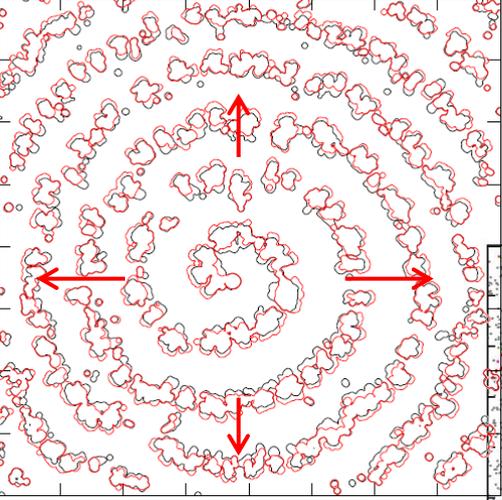
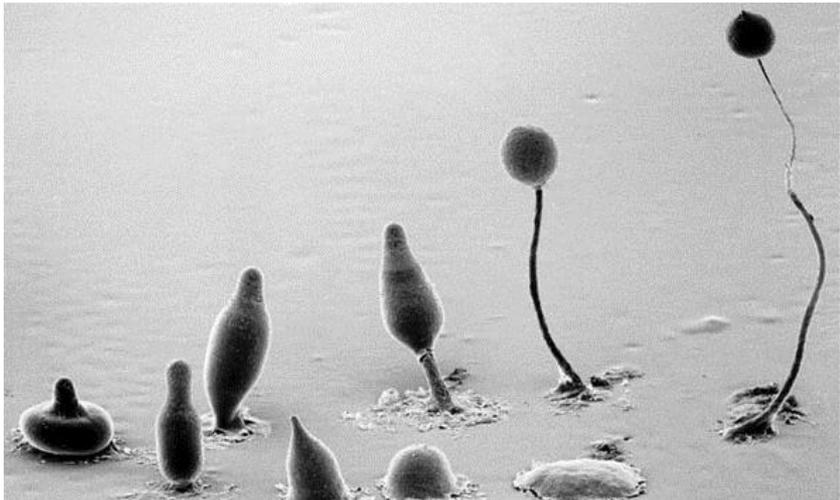
Wikipedia

Patterns in cellular assemblies

Populations of uni-cellular organisms communicate and coordinate their activities resulting in appearance of spectacular patterns

Example: Social amoebae (e.g., Dictyostelium) send out cAMP waves during starvation conditions to aggregate – resulting in spiral waves and streaming patterns

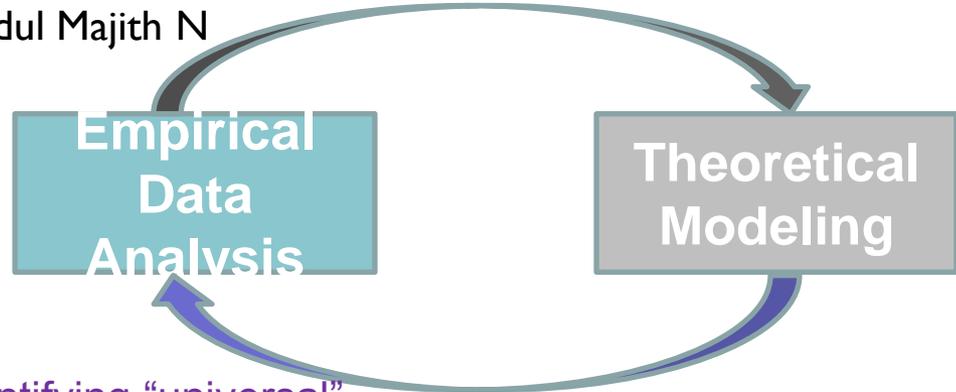
betatest.dictybase.org



Can be understood in terms of simple excitable media models with mobile agents

Example: Modeling the dynamics of Indian urban traffic

Abdul Majith N

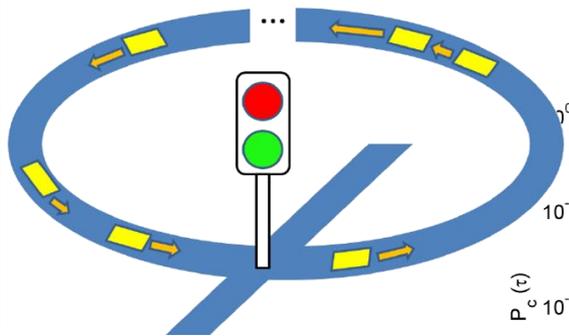


Identifying “universal” collective patterns that are independent of specific local conditions

Explaining collective patterns using “robust” models not sensitively dependent on specific details

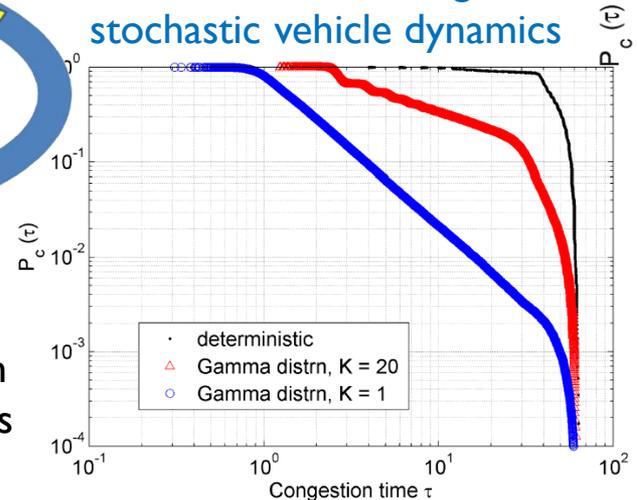
Micro-Model:

Traffic dynamics at an intersection controlled by signal



For simplicity consider a single-lane road that has an intersection where traffic is controlled by a signal

A novel kinetic Monte Carlo method for simulating stochastic vehicle dynamics

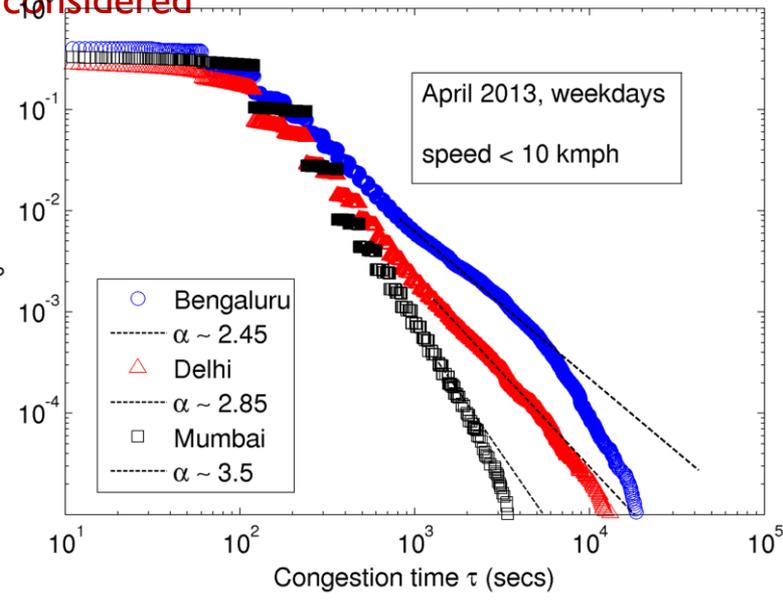


Macro-Patterns:

City wide traffic statistics inferred from “probe” vehicles

Data: GPS traces of ~1000 taxis from Bengaluru, Delhi and Mumbai for several months in 2013-14

Universality: Congestion time distributions of different cities exhibit a power law – albeit with different exponents, almost invariant over period considered



Model reproduces the power law behavior of congestion time distributions

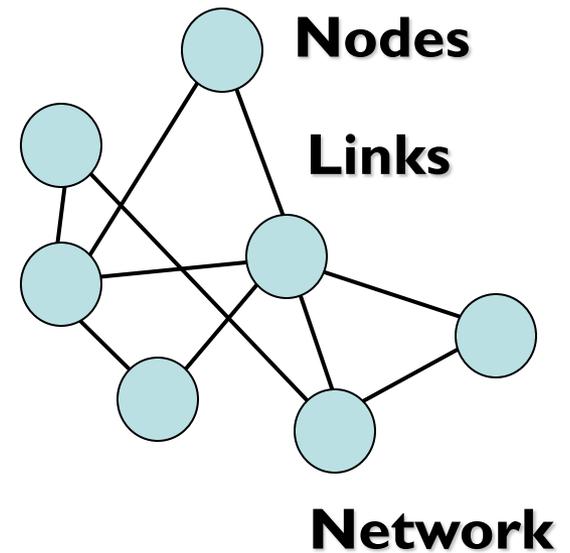
Structural Patterns

Complex Networks

Components = Nodes

Interactions = Links

System = Network



Ubiquity of Networks

Networks appear at all scales

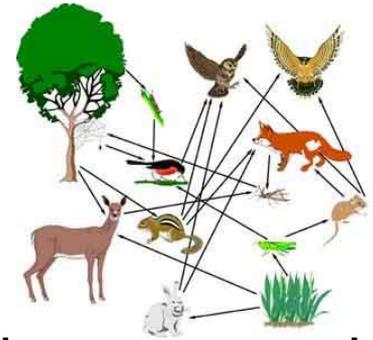
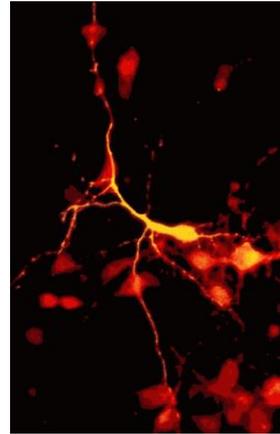
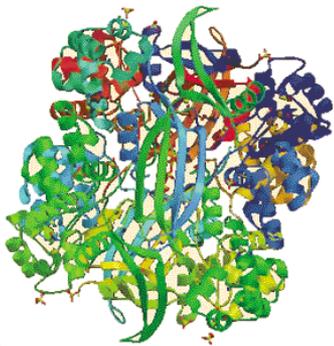
Proteins

Intra-cellular
signalling

Neuronal
communication

Epidemics

Food webs



10^{-9} m

10^{-6} m

10^{-3} m

1 m

10^3 m

10^6 m

Molecules

Cells

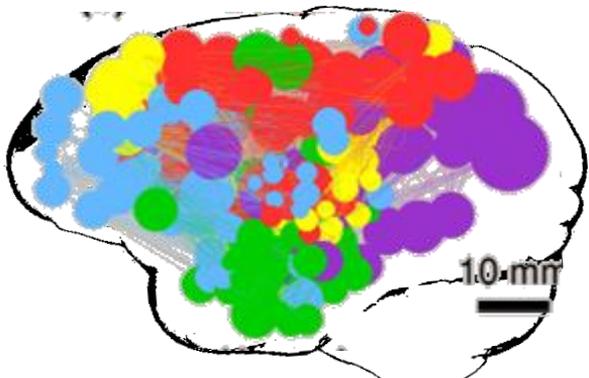
Organisms

Populations

Ecologies

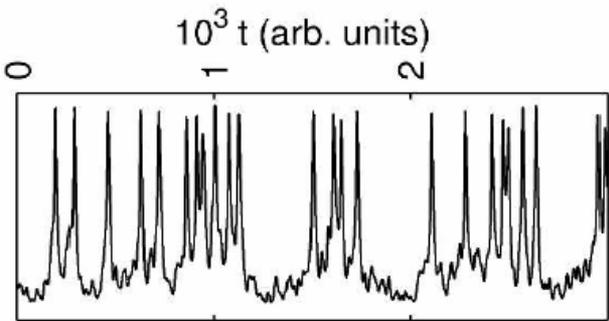
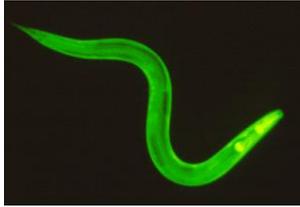
Simulating the collective activity of the Brain

Modeling the Macaque brain as a network of brain regions

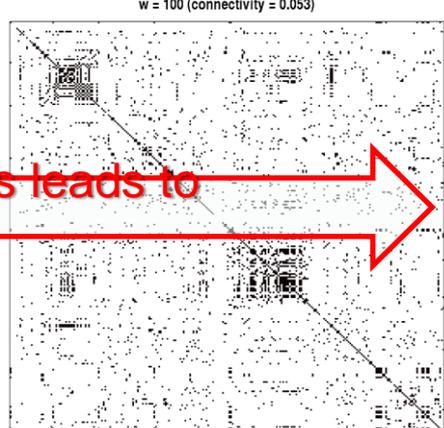
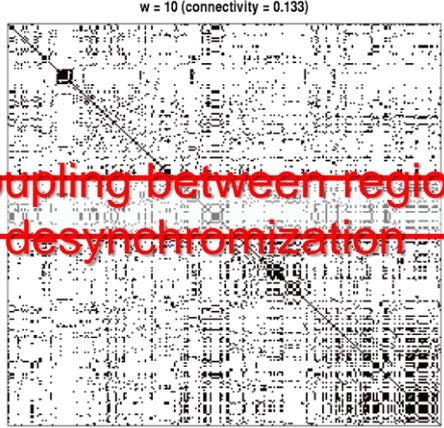
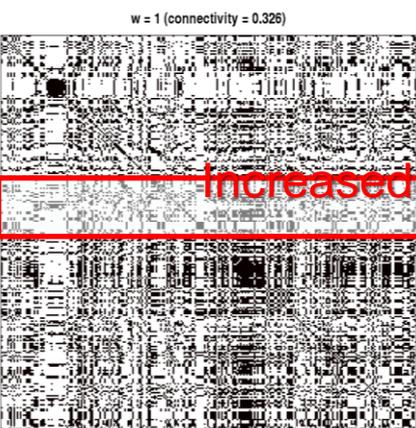
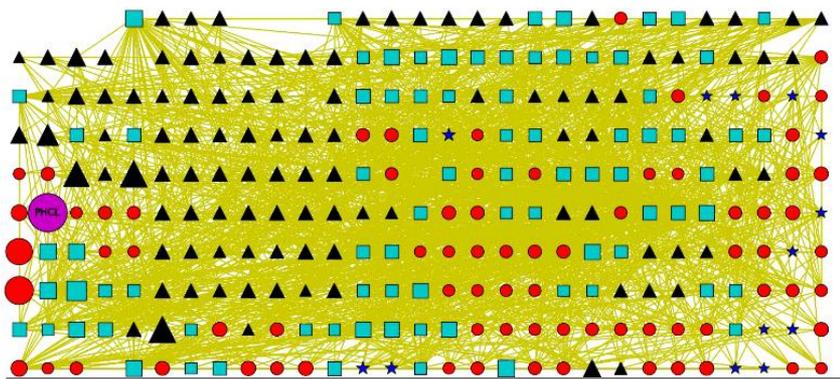


Collaborators: Anand Pathak, Shakti N Menon, Raj K Pan and Sitabhra Sinha (IMSc); Nivedita Chatterjee (SN Chennai)

A biologically realistic neural network simulator for the entire somatic nervous system of the nematode *Caenorhabditis elegans*



Collective dynamics yields realistic EEG-like traces

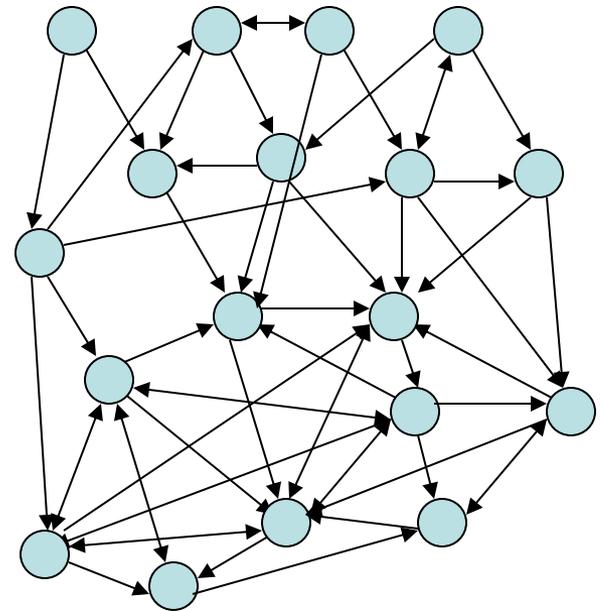
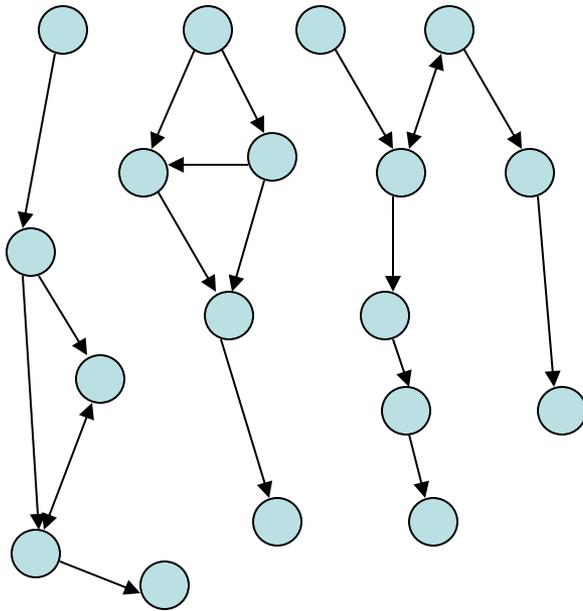


Increased coupling between regions leads to desynchronization

Can explain higher connectivity in functional networks reconstructed from EEG recordings of fatigued subjects

Pathways vs Networks

Why did Nature opt for Networks ?

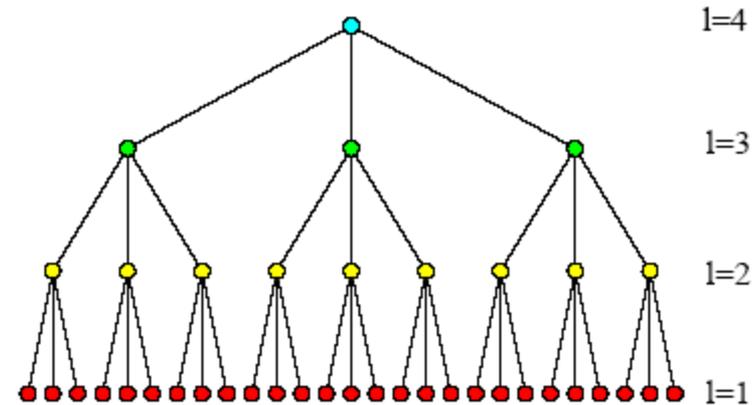
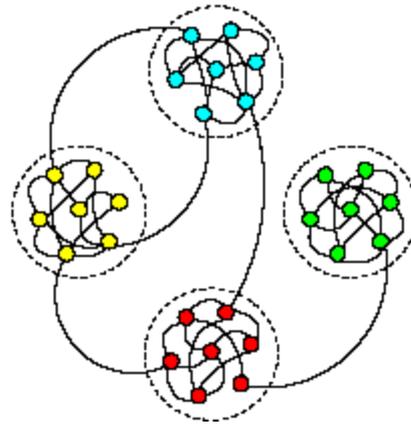


- Why did a central nervous system (brain) evolve at all instead of a nervous system equivalent to a collection of reflex arcs ? Also relevant for cell-signalling

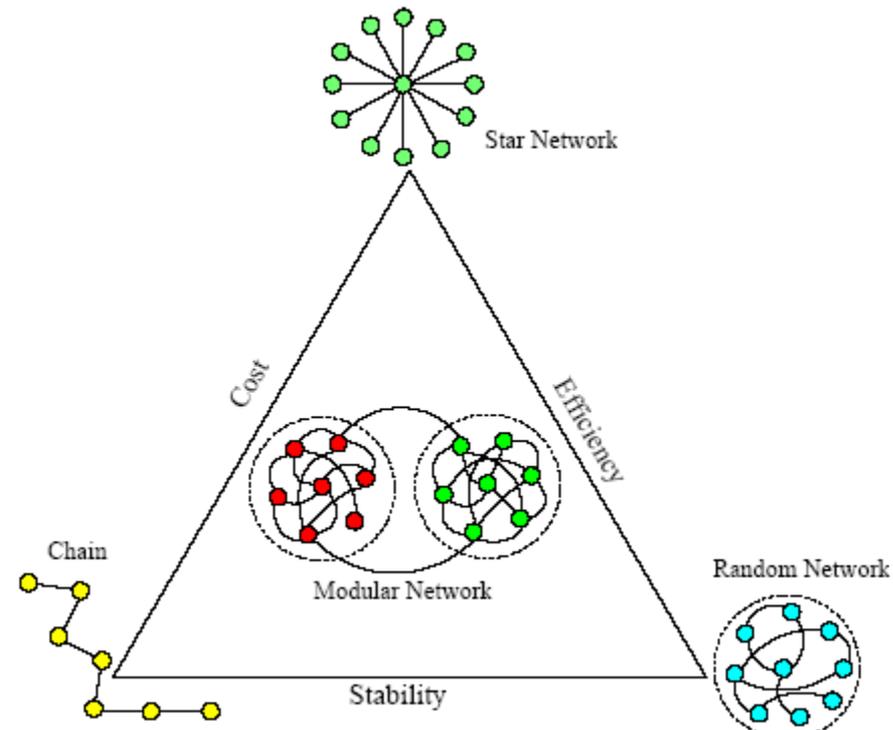
Evolution of Complex Networks

The mesoscopic organizational features of networks

- modular structure
- hierarchical levels
- core-periphery organization

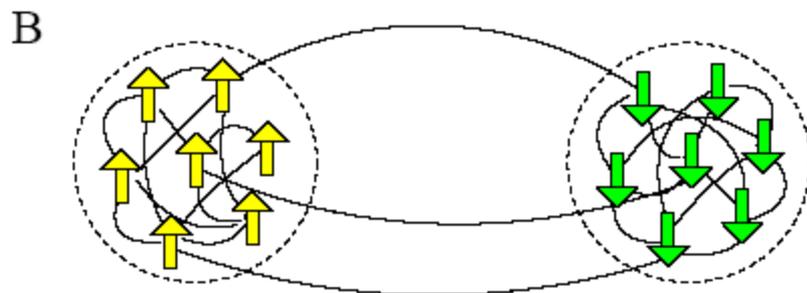
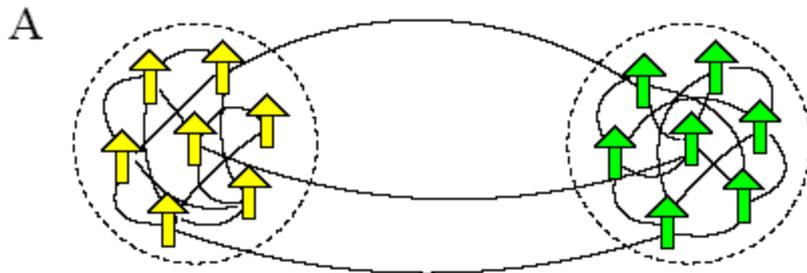


Can we explain their emergence as a result of optimizing between different structural & dynamical constraints ?



Co-ordination in complex networks

How can co-operation and modular structure coevolve ?
Game theoretic strategies by agents interacting on networks



Prisoners' dilemma

		prisoner B	
		confess	remain silent
prisoner A	confess	 5 years 5 years	 0 year 20 years
	remain silent	 20 years 0 year	 1 year 1 year

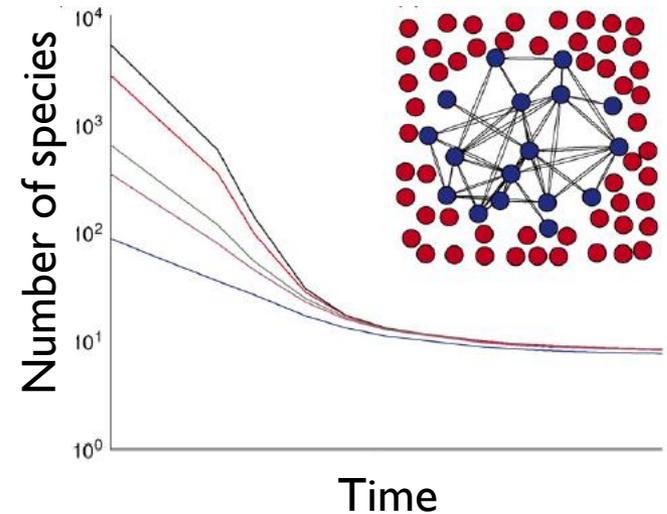
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Collective behavior and
Communities:
Spin dynamics on modular structures

Robustness of Complex Systems

How do complex systems “rebound” from major perturbations ?

Networks with nonlinear dynamics are *non-extensive* systems: evolve to configurations that are independent of initial values



Mt St Helens Eruption



Statistical Patterns

Theories for the organizing principles of complex systems do not only apply to biological systems but also...

e.g., in economic systems

PHYSICS TEXTBOOK

Sitabhra Sinha, Arnab Chatterjee,
Anirban Chakraborti, Bikas K. Chakrabarti

WILEY-VCH

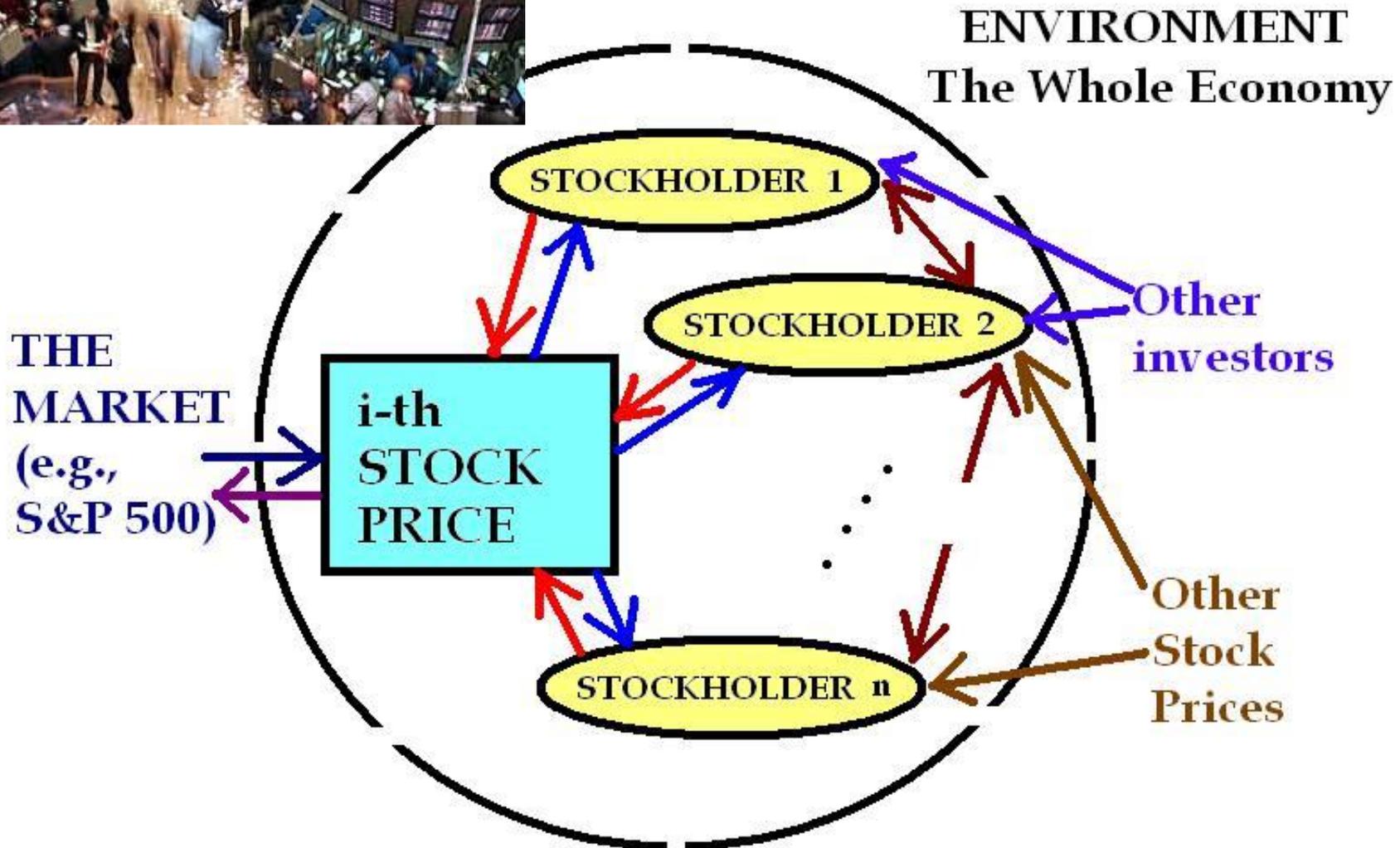
Econophysics

An Introduction



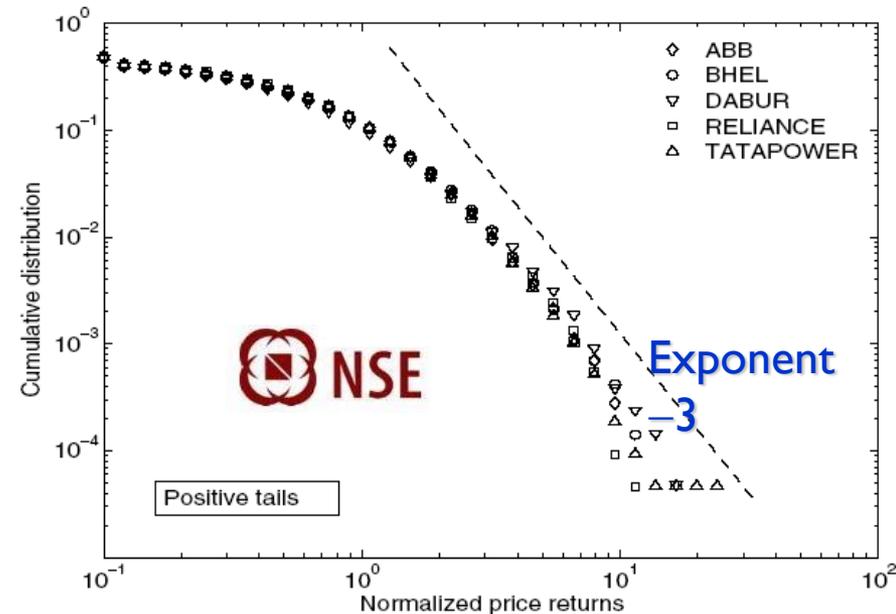


The Market according to Physics



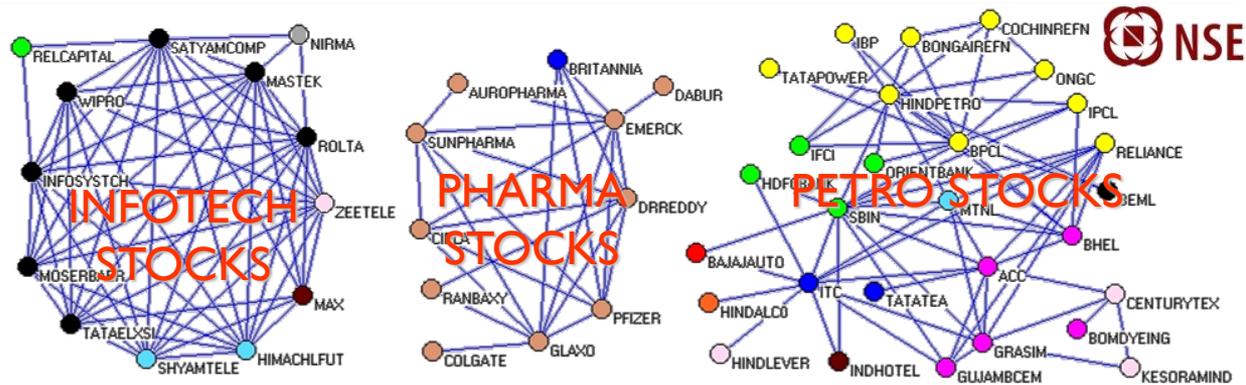
Financial Markets \equiv Complex system of interacting stocks

Universality (?) of the distributions of market variables :
“Inverse cubic” power law tail of fluctuations distribution



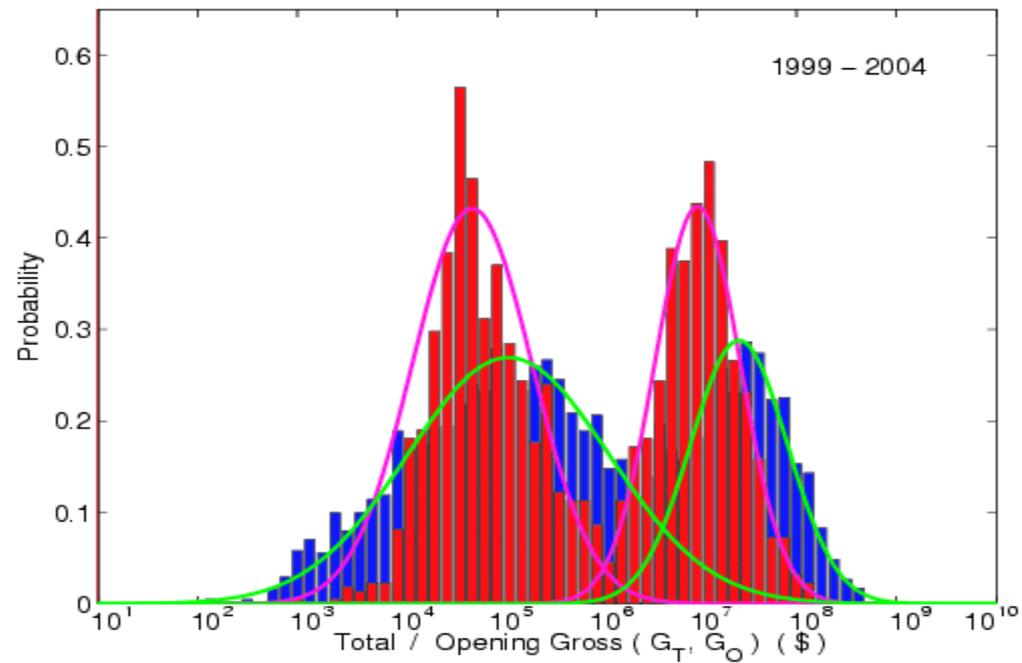
Cross-correlation of stock movements:

First picture of how network of stock interactions develop

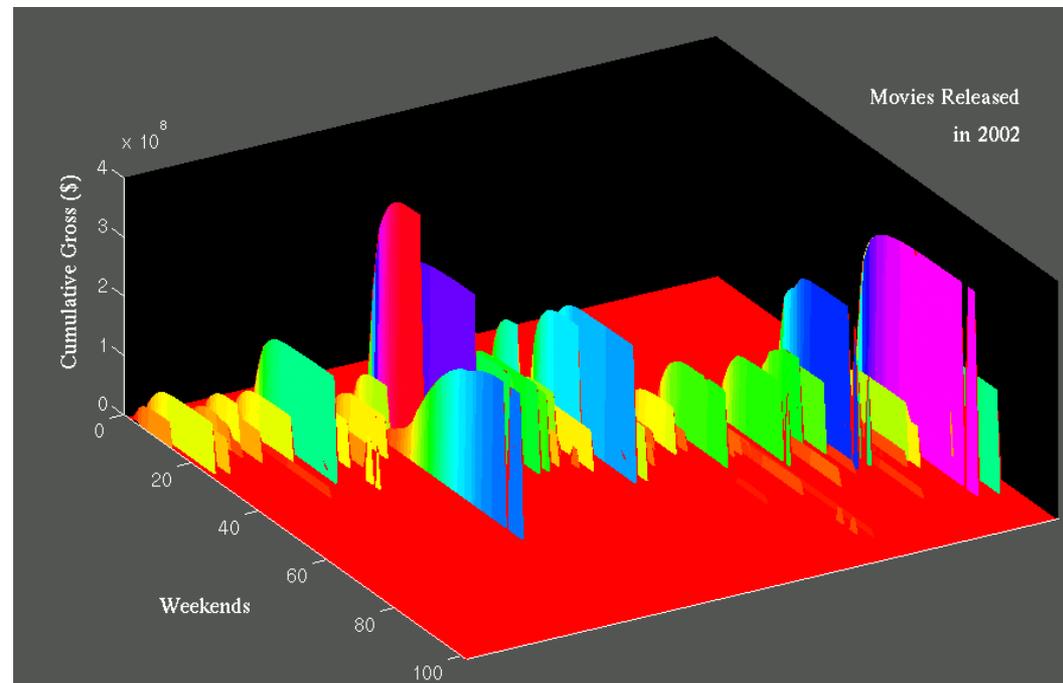


Sociophysics

Emergence of a popular product / idea \equiv self-organization of collective behavior among interacting agents



Universal features of popularity dynamics: popularity for several product types (including movies) have bimodal, log-normal distributions and power-law decay with time



Patterns in Symbolic sequences

How to identify linguistic writing ?

What is language ? A system of syntactic communication capable of encoding ideas of arbitrary complexity

Syntax = Compositionality + Recursion
(“words/letters”) (embedding)

Test for a sign system as writing:

Look for syntactic structure in a symbolic string

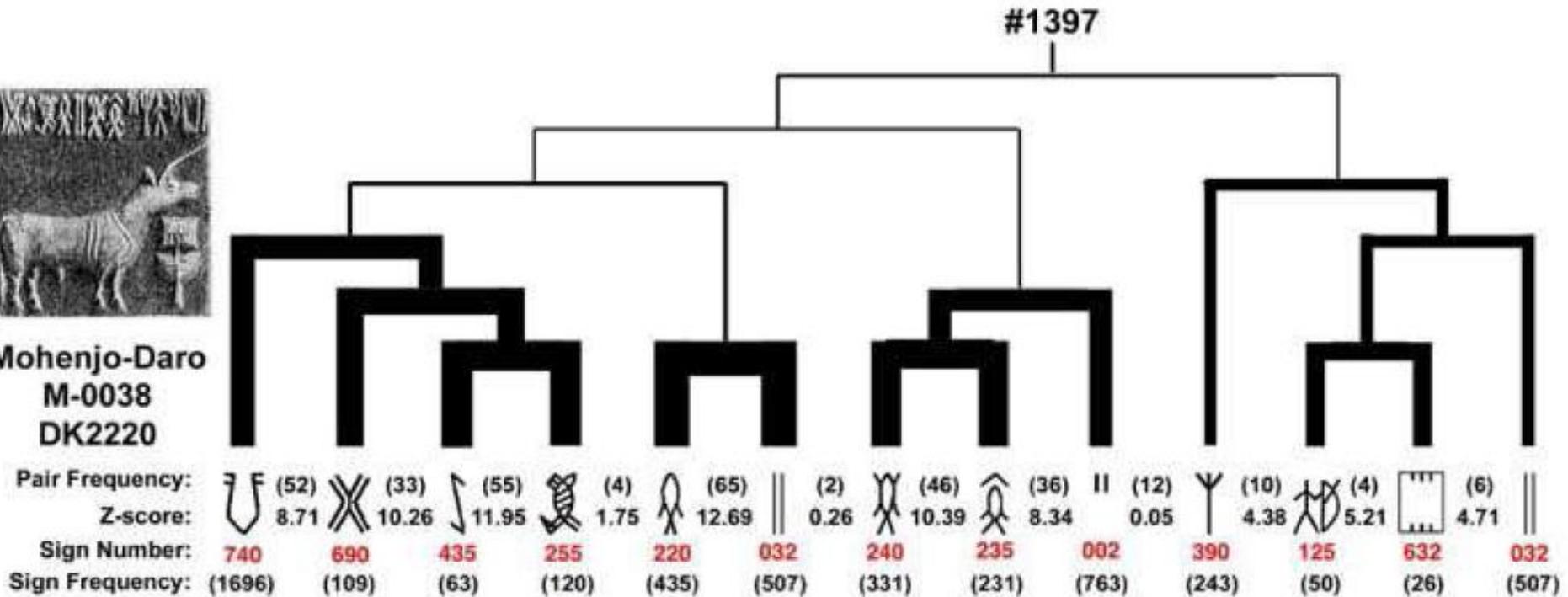
Segmentation of sign sequences: Does it reveal frequently used sign clusters ? Are they placed in specific arrangements ?

Segmentation using significant pairs

Successively merge pairs according to decreasing z-score



Mohenjo-Daro
M-0038
DK2220



Towards an Indus “grammar”

The alignment can help in identifying syntactic rules

Example of a grammar:

$$S \rightarrow S1 + S2$$

$$S1 \rightarrow S1 + S3, \{a, b\}$$

$$S2 \rightarrow \phi, S2 + S4, \{c, d, e\}$$

$$S3 \rightarrow \{f, g\}$$

$$S4 \rightarrow \{j, k\}$$

THANKS

Complex Systems Group Homepage
www.imsc.res.in/~shakti/complex_home.html