

# Connectivity and synchronization: comparison of neural observations and experiments with toy networks

#### Ludovico Minati

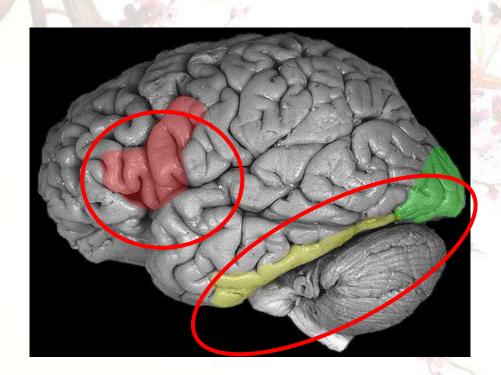
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#### Two views on brain organization

#### Functional specialisation:

What regions respond to a particular experimental input?





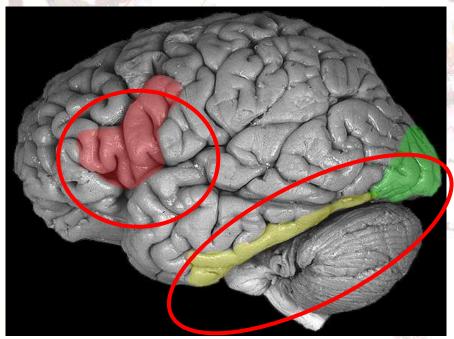
#### Two views on brain organization

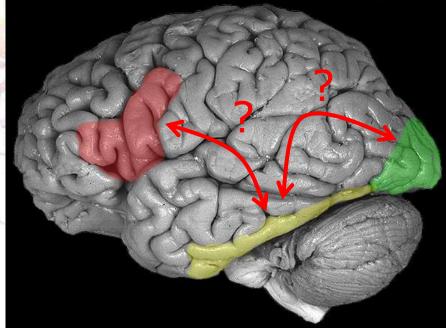
#### Functional specialisation:

What regions respond to a particular experimental input?

#### Functional integration:

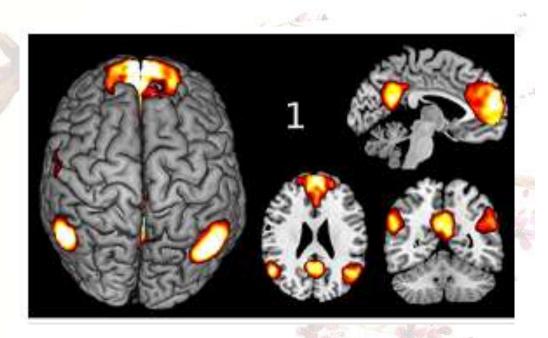
How do regions influence each other? How does cognition <u>emerge</u> from interacting regions?







#### Topography to topology



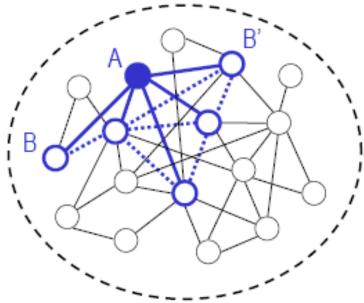




Image source: Eileen Kraemer, 2005

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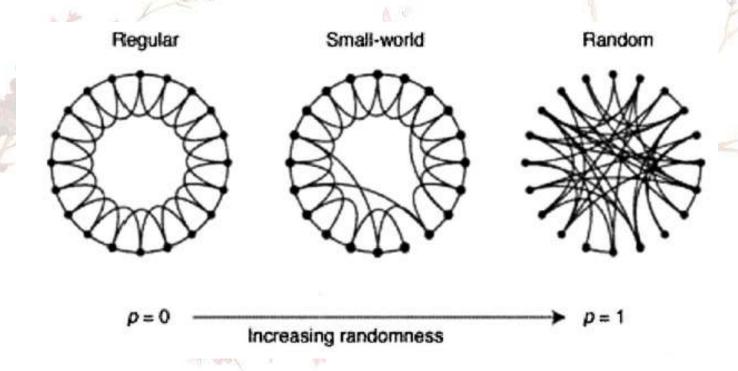
#### Networks are everywhere

| 9 | Network         | Nodes    | Edges         |
|---|-----------------|----------|---------------|
|   | Internet        | routers  | wires         |
|   | brain           | neurons  | synapses      |
|   | www             | pages    | hyperlinks    |
|   | Hollywood       | actors   | movies        |
| M | gene regulation | proteins | binding sites |
| 美 | ecology web     | species  | competition   |



#### Properties of self-organized networks

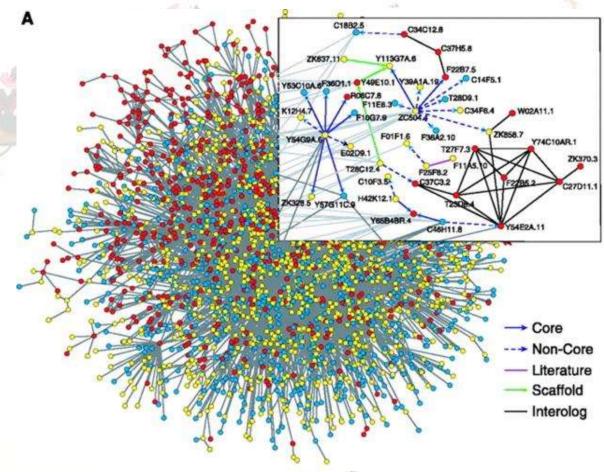
Small-world-ness:





#### Properties of self-organized networks

Scale-free-ness:



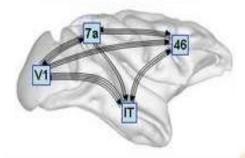
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#### Three aspects of brain connectivity

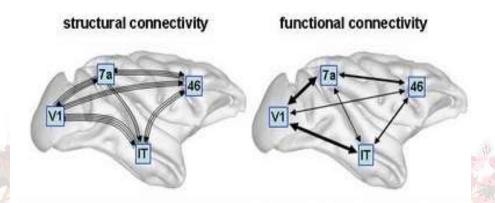
#### structural connectivity



- anatomical/structural connectivity
  - = presence of axonal connections



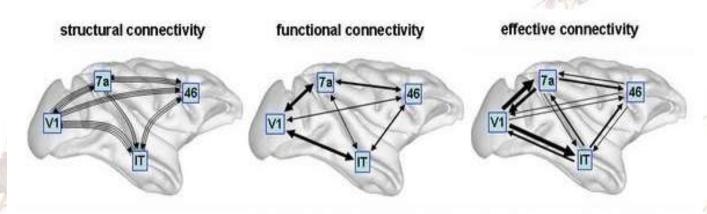
#### Three aspects of brain connectivity



- anatomical/structural connectivity
  - = presence of axonal connections
- functional connectivity
  - = statistical dependencies between regional time series



#### Three aspects of brain connectivity



- anatomical/structural connectivity
  - = presence of axonal connections
- functional connectivity
  - = statistical dependencies between regional time series
- effective connectivity
  - causal (directed) influences between neurons or neuronal populations



#### Brain connectivity and dynamics

Structural connectivity (i.e. physical links)

**Dynamics** 

Functional connectivity (i.e. synchronization)



#### Brain connectivity and dynamics

Structural connectivity (i.e. physical links)

**Dynamics** 

**Plasticity** 

Functional connectivity (i.e. synchronization)



#### Multiple scales

- Microscale (10<sup>2</sup>-10<sup>3</sup> neurons)
  - Cortical (groups of) columns/microcircuits
  - Receptive field tiling, "building blocks" for larger circuits
- Mesoscale (10<sup>5</sup>-10<sup>7</sup> neurons)
  - Gyral/sub-gyral circuits
  - Multi-sensory integration, associative functions
- Macroscale (109-10<sup>11</sup> neurons)
  - Large-scale multi-gyral/bihemispheric circuits
  - Higher cognitive functions, consciousness



#### Topological and dynamical properties



- Modularity
- Scale-free-ness
- Small-world-ness

#### Dynamics

- Non-linearity
- Possible chaoticity
- Criticality



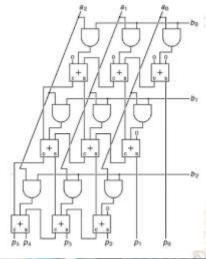
#### The brain is totally unlike a digital computer

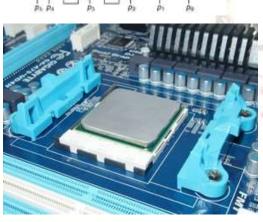
Design

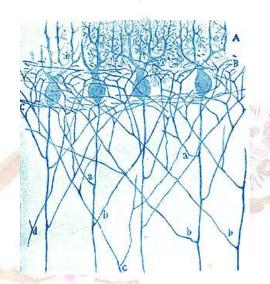
VS.

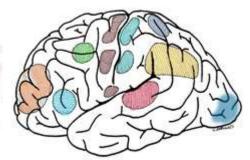
Emergence

J. Von Neumann 1903-1957











A. Turing 1912-1954





# Is there anything *physically* unique about it?

# Cartesian determinism Stochastic Quantum Decision Module Categorization Module Module Module Categorization Module Module Categorization Module Categoriz

Seemingly, everywhere one looks, there is a paradox...

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#### Centrality and universality of emergence



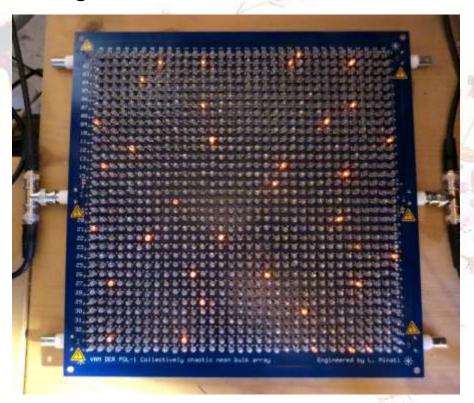
Whole (collective behavior) >> Sum of parts (elemental dynamics)

Image credit: Wikipedia, others



#### Why compare to other *physical* systems?

e.g. non-linear electronics



#### Numerical simulation





#### Why compare to other *physical* systems?

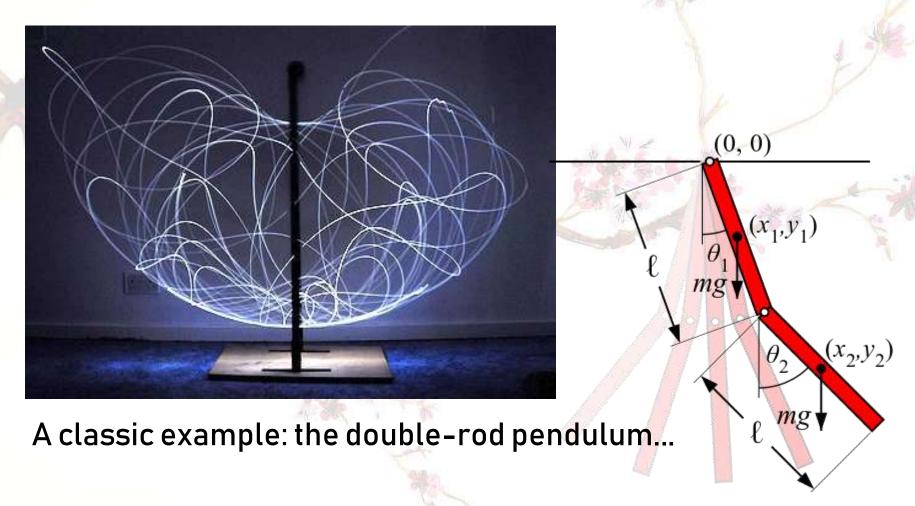
In non-linear physical systems the emergence of global properties often <u>fundamentally</u> influenced by "nuances" such as:

- Parametric mismatches between constituent elements,
- Electrothermal noise in the oscillatory variables,
- Noise in the dynamical parameters,
- Non-ideal behaviours such as presence of "parasitic" elements,
- Lack of discretization and so on.

Not at all trivial to capture numerically!



#### Why would chaotic networks be interesting?





# Why would chaotic networks be interesting?

Rapid divergence... but it is not the main point...

$$x(t) = f^t(x_0)$$

$$x(t) + \delta x(t) = f^t(x_0 + \delta x_0)$$

$$\|\delta x(t)\| \approx e^{\lambda t} \|\delta x_0\|$$

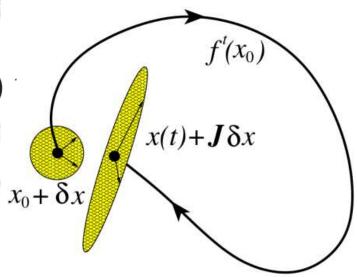
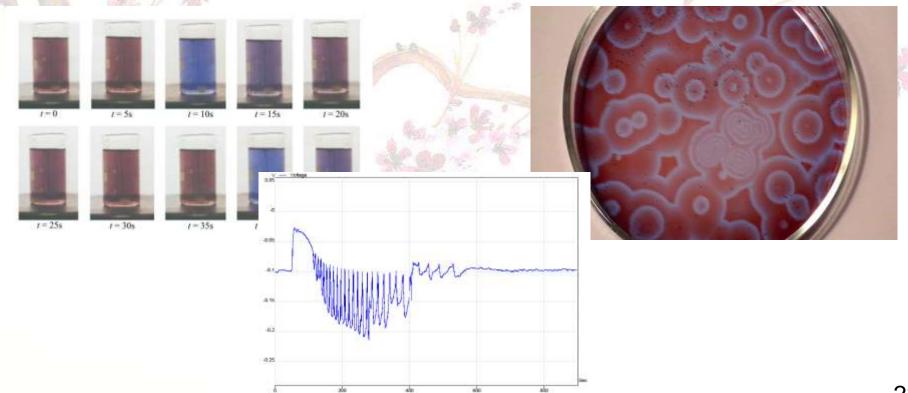


Image credit: Wikipedia, others

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# Why would chaotic networks be interesting?

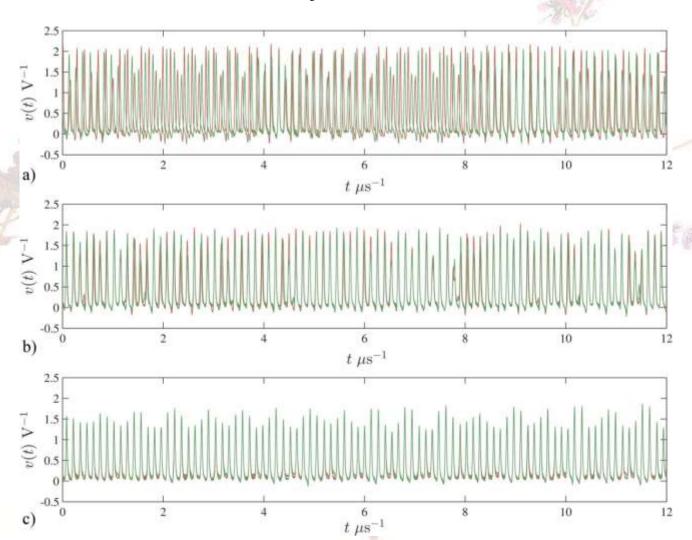
Self-organization: paradigmatic case of the Belousov-Zhabotinsky reaction



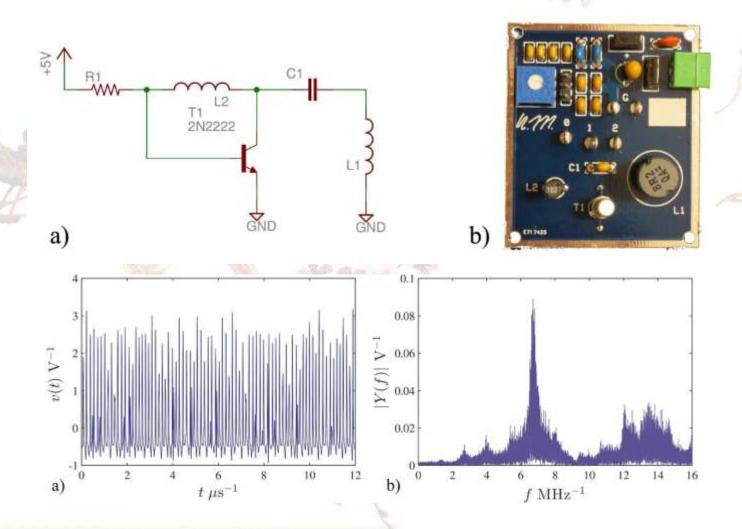
Coupling strength

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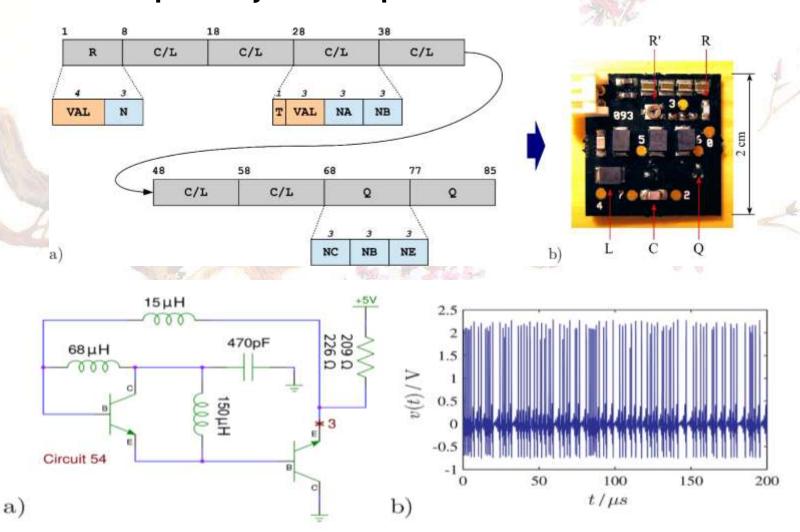
#### Chaos synchronization



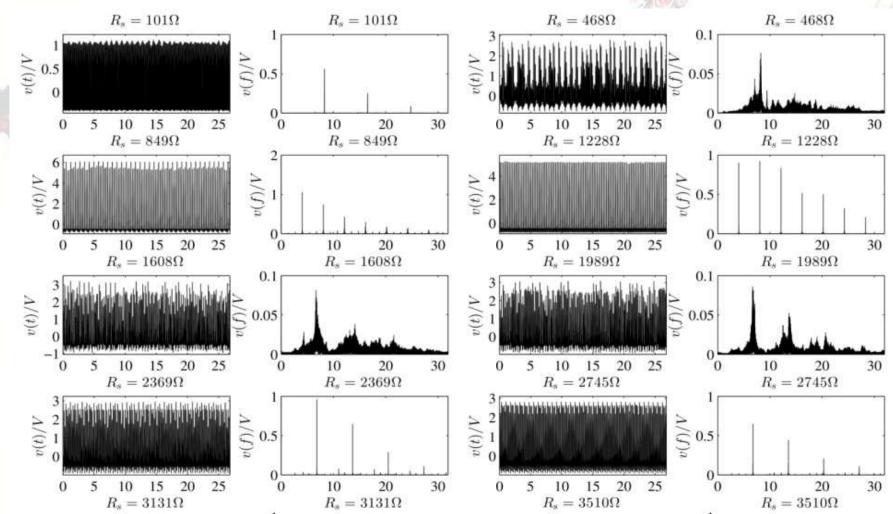








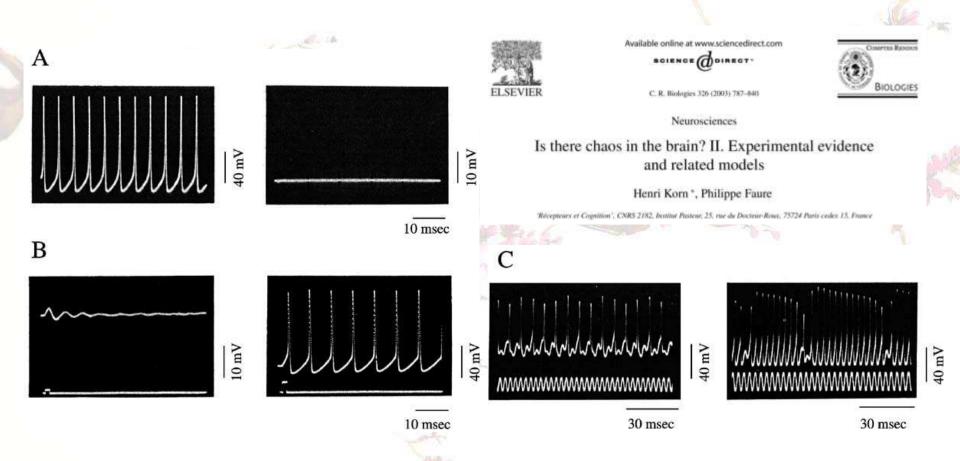






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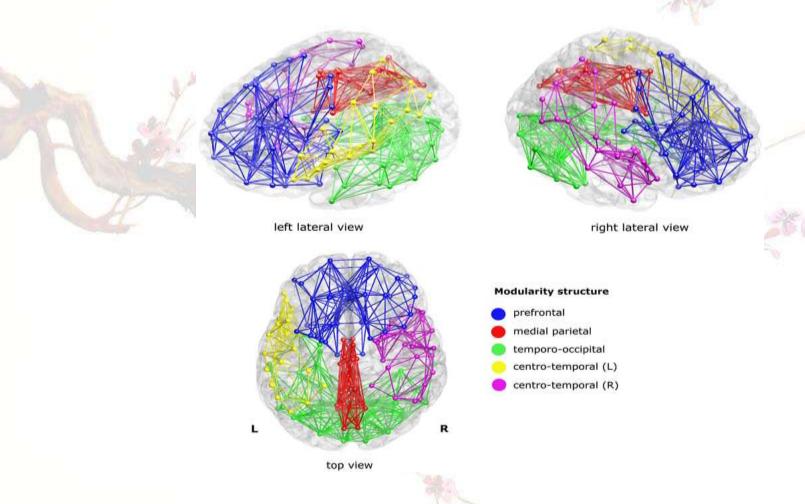
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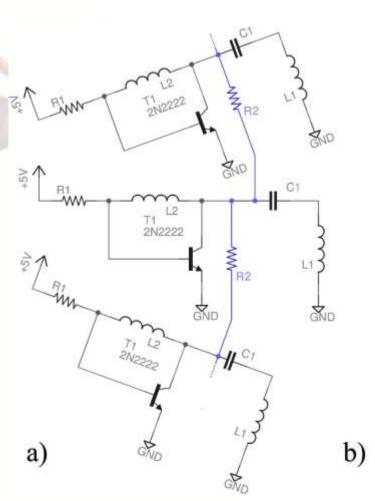
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#### Emergence of community structure





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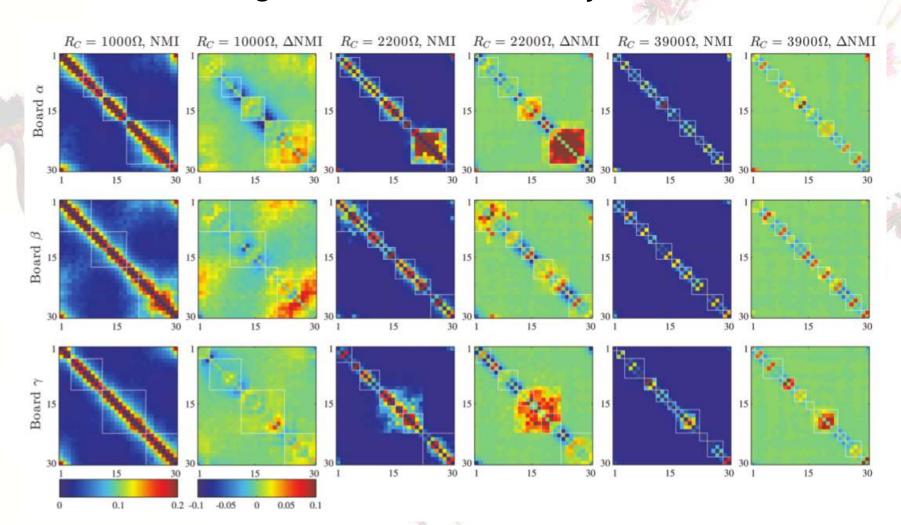


# Ring structural connectivity as elementary substrate



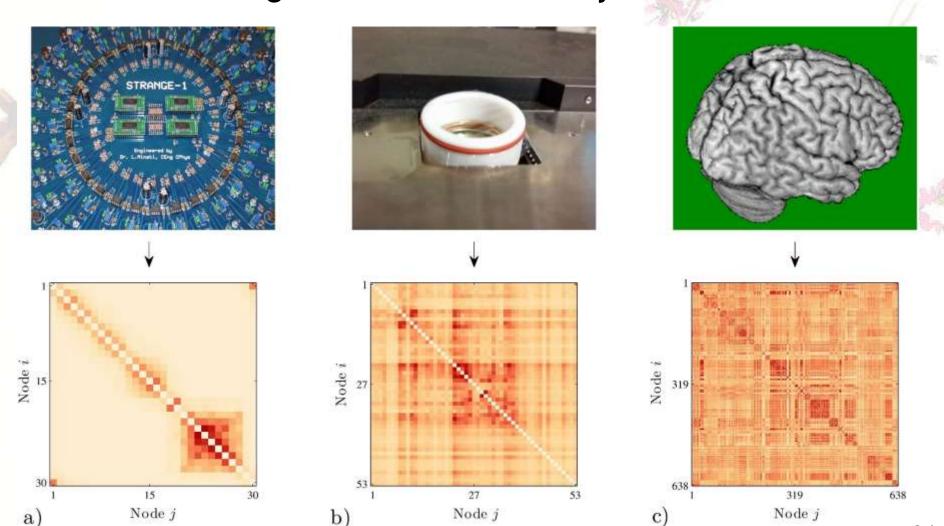


#### Emergence of community structure





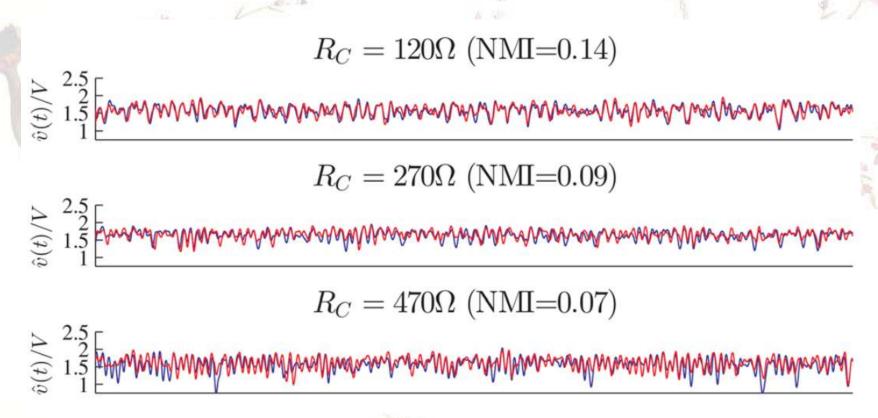
#### Emergence of community structure





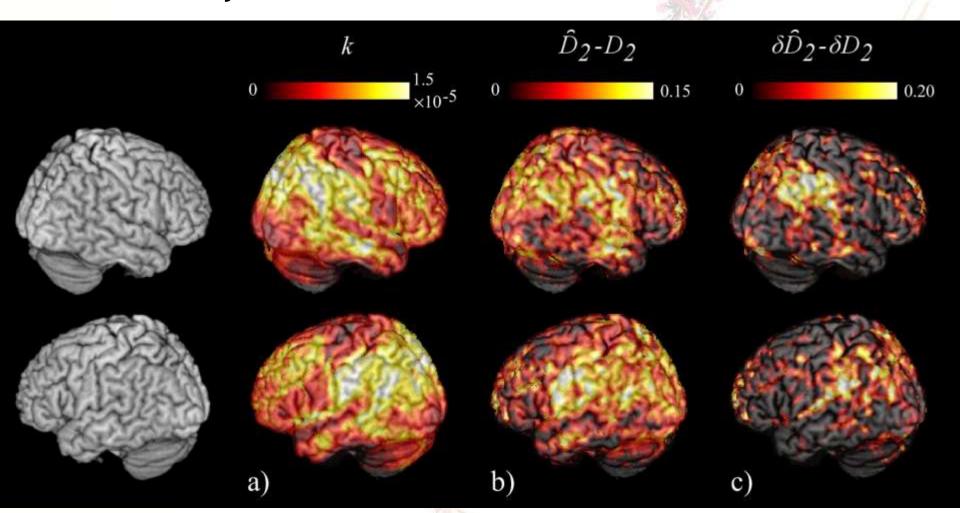
#### Emergence of community structure

Amplitude fluctuations loosely resemble EEG...





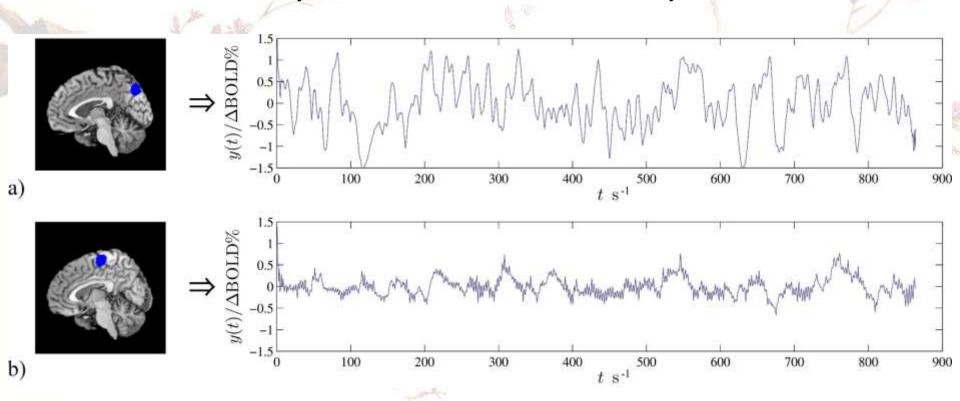
# Dynamics within and outside hubs





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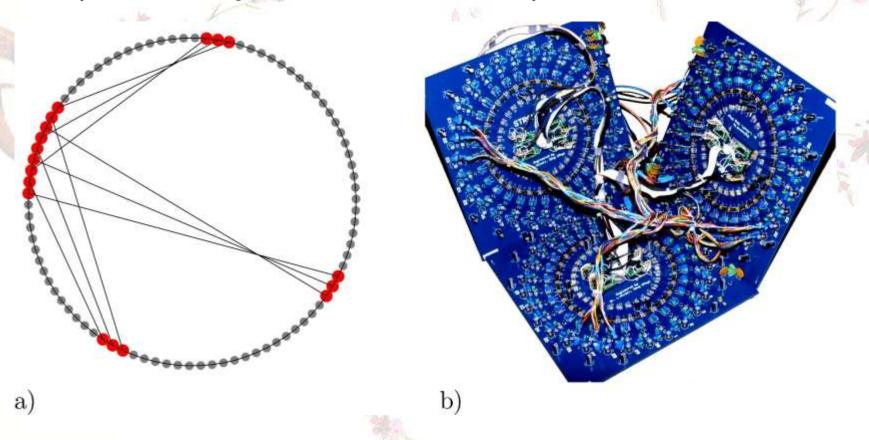
Cortical hubs seem to yield deterministic, non-linear dynamics





# Dynamics within and outside hubs

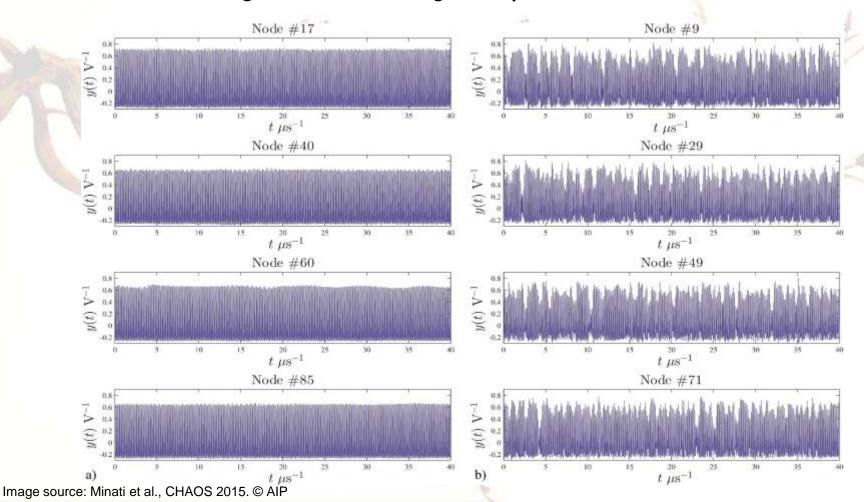
A "toy model" of high-level brain connectivity





# Dynamics within and outside hubs

Selective emergence of slow, high-amplitude fluctuations in hubs





#### Conclusions

- 1) Relationship between brain connectivity and dynamics
- Parallels between emergence in the brain and other physical systems
- 3) Phase transitions in neurons and chaotic oscillators
- 4) Brain modularity and cluster synchronization
- 5) Hubs and dynamics



#### Thank you for your attention

#### References:

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