





#### <u>Time Series in Physics and biology: listening to Nature's</u> <u>signals</u>

#### I. Morales, R. Fossion, E. Landa, A. Frank, ICN & C3, UNAM, México

















# Franco

Group Theory of IBM, IBFM, Supersymmetry, Vibron Model, Vibron-Electron Model, Symmetry Approach to Molecular Vibrations, Algebraic Scattering Theory, Eigen-potential Approach to Configuration Mixing, E(5), X(5),

Random Hamiltonians

Chaos in Nuclei, Mass Calculations by Image Reconstruction

Chaos, Criticality, Complexity, Time Series, Early Warning Signals



# Motivation: Can we find pattern behind disorder?

**Ruben Fossion** 

MC Enero 2012



## Fractal organization in human organs







n Physics 2012

# **Bronquial tree**









#### Fractal dimension $\delta \sim 3$ ... Line approaching a volume

http://www.automatedtrader.net/glossary/List\_of\_fractals\_by\_Hausdorf Beauty in Physics 2012

## Biological Function of Fractals Scaling Laws

UNCLE TOBYS

#### Shape of leaves optimize the area for photosynthesis

#### Lungs maximize surface for gas. Surface can be as lkarge as a soccer field.

ION RED





odidas





6.6

# **Blood Circulation**



Fractal dimension  $\delta = 2.7$ 



Fractals in blood vessels http://www.glimmerveen.nl/LE/Chaos.html

Korperwelten (Body Worlds) Gunther von Hagens. http://www.bodyworlds.com/en.html

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## Loss of Fractality in Ageing Nervous System



Lipsitz & Goldberger, JAMA 267 (1992) 1806

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# Why Fractals? Self-similarity as an assembly code

#### 100 000 genes





Larry S. Liebovitch "Fractals and chaos simplified for the life sciences" Beauty in Physics 2012

## **Redundancy and Health**

# **Redundancy: repetitive structures at many scales**





Goldberger et al., Sci. Am. 262 (1990) 42. http://en.wikipedia.org/wiki/ Bundle\_of\_His

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# How does this structure reflect itself in the time domain? Time Series

- Dynamic evolution of the system



- For some systems is the only available information

-Correlated with the timedependent state of the system

- Need to "listen" to the system in order to obtain information

# Fourier analysis





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## Spectral Analysis of non-periodic correlated signals



http://www.physionet.org/tutorials/fmnc/index.shtml Gisiger, Biol. Rev. 76 (2001) 161.

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# Scale Invariance

 The auto-correlation function of a 1/f signal is scale independent, or: the auto-correlation function is a fractal.

$$F(\omega) = \int_{-\infty}^{\infty} f(t) e^{-j\omega t} dt \qquad S = \text{Power Spectrum}$$
  
auto-correlation  
function  
$$R_{f}(\tau) = \langle f(t)f(t+\tau) \rangle = \frac{1}{2\pi} \int_{0}^{\infty} S_{f}(\omega) e^{j\omega t} d\omega$$
  
Special Case:  
$$S_{f}(f) = 1/f$$

$$R_{f}(\alpha \tau) = F^{-1}(1/f) = R_{f}(\tau)$$

# MAIN RESULT: 1/f implies *autocorrelation* scale invariance

# Time series analysis



#### The empirical mode decomposition and the Hilbert spectrum for nonlinear and non-stationary time series analysis

BY NORDEN E. HUANG<sup>1</sup>, ZHENG SHEN<sup>2</sup>, STEVEN R. LONG<sup>3</sup>, MANLI C. W U<sup>4</sup>, HSING H. SHIH<sup>5</sup>, QUANAN ZHENG<sup>6</sup>, NAI-CHYUAN YEN<sup>7</sup>, CHI CHAO TUNG<sup>8</sup> AND HENRY H. LIU<sup>9</sup>

Experimental data is the link between natural phenomena and the mathematical models that we use to describe such phenomena.



**Empirical Mode Decomposition** 

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Motivation: Dripping Faucet and phase transition periodic – chaotic - continuous



# **Dripping Faucet**





T.J.P. Penna y P.M.C. de Oliveira, PRE52 (1995) R2168.



FIG. 4. Power spectra S(f) for the interval increments for the time series presented in Fig. 1. A straight line corresponding to the  $\beta = -1$  curve is presented for comparison.

## Physiological Dynamics: Time Series ECG: What can we find out about the heart?



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## Heart-rate fluctuation time series



http://reylab. bidmc.harvar d.edu/ people/Ary.ht ml

Goldberger et al., PNAS 99 (2002) 2466



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## **Illness and Treatment**



Pikkujämsä et al., Circulation 100 (1999) 393.

# "harmonious" mix of different time-scale frequencies

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# **Exercise and criticality**



Fig. 1. Short-term scaling exponent ( $\alpha_s$ ) at baseline (Pre1), following a 4-wk time control period (Pre2) and following 6 wk of resistance training in men with low  $\alpha_s$  and high  $\alpha_s$ . \*Significant group differences (P < 0.05). #Significant group  $\times$  time interaction (P < 0.05).

Heffernan, J. Appl. Physiol. 105 (2008) 109

# Why 1/f? Fractal time series Correlation range (memory)

- Autocorrelation function (for linear and stationary time series)

- Mutual information function (also for non-linear and non-stationary



Beauty iRph Sossion et al., AIP Conf. Proc. 1323 (2010) 7

# General Considerations: Order, Disorder and Criticality



# TimeDomain



## Can spacial fractality produce time domain fractality?



CIMAT, 11 de Mayo, 2011

## Dynamics: Phase transitions and time series. Is the heart in a critical state? Optimal response.



Early-warning signals for critical transitions Marten Scheffer, Nature Vol 461.3 September 20

## Long-range correlations: bubbles and stirling flocks

### Bénard Cells in liquids. How can large flocks of thousands of individual birds arise (long-range correlations) when birds only communicate with up to 7 of their nearest neighbours (short-ranged bird-bird



8 10 12

modulus (ms')

14 16

velocity fluctuations



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**Bénard Cells** 

# Self-organization criticality in living systems



### **Critical region**

"mean" between extremes Dynamic system



## Phase **B**

0% copying from neighbours 100% free will "Ideal gas of random bird-particles"

Phase A

100% copying from neighbours 0% free will "Flying brick (rigid object)"

# **Bird-bird Interaction**

(copy from neighbours)

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X

## A practical endeavor: Early-warning signals

"... Complex dynamical systems, ranging from ecosystems to financial markets and the climate, can have tipping points at which a sudden shift to a contrasting dynamical regime may occur.

### generic early-warning signals may

indicate for a wide class of systems if a critical threshold is approaching... "

#### NATURE CLIMATE CHANGE / REVIEW

*Early warning of climate tipping points Timothy M. Lenton Nature Climate Change 1, 201–209 (2011)1* 

#### **PLOS Computational Biology**

Early Warning Signals for Critical Transitions: A Generalized Modeling Approach Steven J. Lade<u>\*</u>,



## **Early-warning signals**

- Critical slowing down
- Increase in autocorrelation strength
- Increased variance
- Increased fluctuation
- Flickering

### •POWER LAWS: Increase in autocorrelation range (memory)







AN EXAMPLE: Obstruction of the heart arteries: Early warning.

=>Transition to a high pressure regime of the heart.

Project with National Institutes of Cardiology and Geriatrics. Fragility and Ageing: Marie Curie Project.

# A simpler ageing model: Fragility in C Elegans



#### http://en.wikipedia.org/wiki/Caenorhabditis





http://shirleywho.wordpress.com/2 008/09/21/departmental-retreatsacademia-with-a-twist-of-karaoke/ http://www.wormatlas.org/ver1/bandbook/anatomyintro/anatomyintro.htm

## Time series of pharinx area of C elegans: pixel analysis



Figura ¿?. Método para la segmentación de las imágenes. A) imagen original. B) afilar la imagen. C) filtro de mediana . D) filtro pasobanda. E) afilar la imagen. F) realzar el contraste. G) modificar brillo y contraste. H) calibrar el umbral de las imágenes. I) segmentar la imagen.

#### Ixchel Garduño Alvarado, Beasty idePligeigeratiliza

## Time Series Correations in three different scales



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# **Slope of pharinx fluctuations**



## Criticality: phase transitions The Boiling Song

#### Can we verify whether 1/f behavior really signals criticality?



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# **Bubbles that "sing"**



How water flows over a conical pit

J. Walker, *The amateur scientist: what happens when water boils is a lot more complicated than you might think*, Sci. Am. 247(6) (1982) 162-171.



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Stages in the growth of a bubble

#### Water cooling immediately after boiling (1/f noise)



# **Other Rithms: Gait**



Goldberger et al., *Physionet*, http://physionet.org/tutorials/fmnc/node11.html



Correlations change with age and fragility

## Other Examples: Electro-encefalogram (EEG)







#### **Quantum Transitions: "Time Series" of excited** nuclear states Quantum biology on the edge of quantum chaos

Gabor Vattay and Stuart Kauffman University of Vermont, Vermont Complex Systems Center 210 Colchester Ave, Farrell Hall, Burlington, VT 05405



## **RMT gives 1/f behavior. Relaño et al.**

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#### Critical quantum chaos

S.N. Evangelou\*

Department of Physics University of Ioannina, Ioannina-451 10, Greece

# The different "phases" of light

coherent light (lasers)

#### **Propriedades:**

-Intervalos interfotónicos aleatorios

-- Pero fotones viajan en fase.





# **Different Phases of Light**



sol





#### Epigenetic Sequences: Early Warning for Cancer?



#### Prime Number Distribution

# What is the distribution of primes around its logarithmic trend?

- Quantum-like Chaos in Prime Number Distribution and in Turbulent Fluid Flows
- A. M. Selvam
- Indian Institute of Tropical Meteorology Pune 411 008, India email: selvam@ip.eth.net website: <u>http://www.geocities.com/amselvam</u>
- 1/f or Benford Distribution
- $P_n = Log_{(10)} (1 + 1/n)$

# Fourier: some problems

•Usually used to analyze energy-frequency distribution (very simple, very powerful)

•Physical systems can be approximated by linear systems, however most systems are NON-linear and NON-stationary (also data are finite, system always interact with detector devices)

•Many extra components are needed in order to simulate non-linear effects. The energy spreads to the neighboring frequencies.

•The Fourier decomposition has mathematical sense, but the physical sense is not clear

## A new technique: Empirical Mode Decomposition (EMD): "normal" modes



### •x(t) is composed of oscillations Emplification (EMD)

different time scales which are defined by the distance between local extrema.

•These oscillations may directly represent physical coupled phenomena producing the dynamics of the whole system. 30 20 10 0 -10 -20 -30 0 50 100 100 150 200 250 200250

•E.g.

Breathing mode in heart signals
Seasonal, el niño, etc. in climate analysis

#### Sunspots

#### Kobe earthquake

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# Detecting the Breathing Mode by EMD



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Application to Climate Change

## Conclusions

- We can "listen" to physical and biological systems using mathematical methods, beyond Fourier analysis. These signals contain information about the system's workings, fragility or robustness. It may be possible to detect early warning signals: "phase transitions", or critical behavior
- There are generic traits for critical behavior in a large number of systems, including physical, biological and physiological, which may be treated within a single theoretical framework. Modelling can be implemented in a second stage. Multidisciplinary work.
- Involuntary biological systems are on a "critical" regime, which often can be characterized by 1/f type signals. Deviations may be predictive of fragility and illness.
- Work in progress in several directions, in collaboration with experts in other fields.