#### Dégustation de quatre sujets

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### Topics

- Space-time phases
- Derivation of Langevin equation
- Poincaré's second species orbits
- Gamma ray bursts

# Space-time phases for spatially extended nonlinear dynamics

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### Happy Birthday, Tassos!





# Complexity Science: my view

- The study of systems with many interdependent components
- e.g. laser, condensed matter, cell, brain, ecosystem, climate system, transport network, internet, health service, finance, economy
- Hope for unifying principles: mathematics



## Is it new? No!

- Complexity Science builds on much preceding science, e.g. statistical mechanics, nonlinear dynamics, stochastic processes, ecology/ epidemiology, game theory, evolutionary theory, many-body quantum theory...
- "The main themes in complexity theory have been studied by physicists for over a hundred years, and these scientists have evolved a toolkit of concepts and techniques to which complexity studies have added barely a handful of new items." (P Ball, 2004)



## New? continued

- "A new branch of mathematics the theory of systems with a large number of locally interacting random components – has developed in recent years. This theory is a natural instrument for the mathematical modeling of ... systems of various natures, such as complex biological, chemical, physical, and cybernetical systems and socio-economic structures." (Dobrushin, Kryukov &Toom, 1978).
- The current wave can be considered to have started with the Santa Fe Institute in 1984.
- But the surface has only been scratched.



## What are the questions?

- 1. Emergence
- 2. Robustness
- 3. Control and Design
- 4. More



# 1. Emergence

- Wikipedia: "Emergence is the way complex systems and patterns arise out of a multiplicity of relatively simple interactions"
- "The whole is more than the sum of its parts" (Aristotle, c330BC)
- "the whole becomes not merely more, but very different from the sum of its parts" (Anderson, 1972)



A "cathedral" mound produced by a termite colony: a classic example of emergence in nature.



## Philosophers

- JS Mill, 1843
- Weak v Strong emergence,

e.g. Chalmers, 2006: A high-level phenomenon is weakly / strongly emergent with respect to a low-level domain when it arises from the latter but truths concerning it are

unexpected given the principles governing /

not deducible even in principle from truths in

the low-level domain.



## My view: space-time phases

- (a) What emerges from a spatially extended dynamical system is "space-time phases": probability distributions over realisations of state as function of space-time that arise from typical initial probabilities in the distant past.
- (b) Amount of emergence is the "distance" of a space-time phase from the set of products for independent units.
- (c) Strong emergence means non-unique spacetime phase (but not due to decomposability).



# (a) Examples of phases

 "Climate" is a probability distribution for temperature, precipitation etc over space-time, compatible with the laws of weather.



Thessaloniki



## Equilibrium statistical mechanics

- The allowed probability distributions are the "Gibbs phases" for βH where H represents the sum of contributions h to the energy and β is coolness (1/temperature).
- i.e. probability density

$$\frac{1}{Z}e^{-\Sigma\beta h}$$

wrt reference measure, where *Z* is a normalisation constant, or better those whose conditionals for all finite subsystems and external states satisfy this (Dobrushin,Lanford,Ruelle).



Dihydrofolate reductase in water (Dmitry Nerukh)



## Stochastic dynamics

 For Markov chains the phases are the Gibbs phases (over time) for - log p(i,j): probability of sequence i<sub>0</sub>, i<sub>1</sub>, ..., i<sub>n</sub> =

$$\prod_{t} p(i_t, i_{t+1}) = e^{-\sum_{t} -\log p(i_t, i_{t+1})}$$

- Probabilistic cellular automata (PCA): update state  $\sigma_s^t$  at spatial site *s* and time *t* by independent probabilities conditional on current state  $\sigma^t$
- <u>Demonstration</u>: Toom's NEC majority voter PCA with error rate *p* = 0.15, by Marina Diakonova.
- The phases of a PCA are the space-time Gibbs phases for  $-\log p(\sigma_s^{t+1}|\sigma^t)$ .





## **Deterministic dynamics**

- Sensitive dependence on initial conditions makes individual trajectories unpredictable but often leads to a unique probability distribution on an attractor for random initial conditions in its basin.
- e.g. trajectories on a topologically mixing uniformly hyperbolic attractor for a map f can be coded by symbol strings σ, and random initial conditions in distant past in the basin give trajectories distributed according to unique Gibbs phase for

 $\beta H = \sum_{t} \log |\det Df_{E^{-}}(x^{t}(\sigma))|$ on time [Sinai, 1967/72]

• Analogous results for continuous-time.



Markov partition for Cerbelli-Giona map



#### A physical uniformly hyperbolic system



Show video



Minimal geodesics on configuration space from which to make a 40 element Markov partition



# Spatially extended deterministic dynamics

- Trajectories of uniformly hyperbolic spatially extended discrete-time system *f* (coupled map lattice) can be coded by space-time symbol tables  $\sigma = (\sigma_s^t)$ .
- Random initial conditions in distant past lead to distribution of trajectories given by Gibbs phases of  $\beta H = \sum_{s,t} tr(\log Df_{E^-}(x_s^{t}(\sigma)))_{ss}$

(M,1995; Bricmont & Kupiainen, 1996).



#### (b) Distance between multivariate probabilities

- Most metrics on spaces of probabilities do not behave well for large number of variables.
- e.g. product of N independent Bernoulli B(p,1-p) variables on {0,1}<sup>N</sup> in total variation metric:

 $D_{TV}(\rho,\sigma) = \sup(\rho(A) - \sigma(A)) \text{ over measurable subsets A,}$ moves with speed ~  $\sqrt{\frac{N}{2\pi p(1-p)}}$  wrt *p*.

Can't save it by dividing by  $\sqrt{N}$  because diameter in TV = 1.

"Total variation convergence essentially never occurs for particle systems" (Liggett, 1985).



## Dobrushin metric

- If *X* is a product of (complete separable, bounded diameter) metric spaces  $(X_s, d_s)$  over *s* in a countable set *S*, define Dobrushin's functions  $f: X \rightarrow R$ , continuous wrt product topology and "summably component-wise Lipschitz":  $||f|| = \sum_s \Lambda_s(f) < \infty$ , where  $\Lambda_s(f)$  is the Lipschitz constant for *f* wrt  $x_s$ .
- For (Borel wrt product topology) probabilities  $\rho,\sigma$  on X, define

$$D(\rho, \sigma) = \sup \frac{\rho(f) - \sigma(f)}{\|f\|}$$

over non-constant Dobrushin *f*, where  $\rho(f)$  is the mean of *f* wrt  $\rho$ .

- + Gives speed of product of N Bernoulli *B*(*p*, *1*-*p*) variables = 1.
- + Streamlines Dobrushin's proof of unique phase for "weakly dependent" PCA (e.g. Toom NEC for *p* in (1/3,2/3).
- + Proves uniformly smooth change of phase wrt parameters for PCA with spectral gap (I-P invertible on space of neutral measures).
- Not easy to compute (yet)

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## Amount of emergence

- is the distance of a space-time phase from the set of product probabilities for independent units.
- measures how far the behaviour is from mean-field approximations
- does not capture what some people want to mean by "emergence", e.g. law of averages, selection of Maxwellian velocity distribution
- but does capture a likely consequence of having interdependent components
- More interesting would be to determine correlation structure of the phase



# (c) Strong emergence

- More than one possible phase ("phase transition")
- Example: 2D Ising model (Peierls)
- Example: Toom's majority voter PCA with error rate 0.05
- Say amount of strong emergence is the diameter of the set of phases. An alternative is the persistent mutual information between well separated parts of space-time (Ball, Diakonova, M)
- Non-unique phase can arise for topological reasons, e.g. more than one attractor, or 2-piece attractor; more generally, because system is "decomposable". Don't count as strong emergence.
- A system with a space-time symbolic description is "indecomposable" if any allowable configurations on two sufficiently separated space-time patches can be joined into an allowable configuration ("specification property").
- Non-trivial strong emergence requires infinite system, but is reflected in long-range correlations for finite versions.



#### Proved examples of strong emergence

- Ferromagnetic phases of 2D Ising model
- Ferromagnetic phases of Toom's NEC voter PCA
- Period-2 phases of <u>Toom's</u> NEC voter (error rate 0.95)
- Examples with (at least) 2<sup>n</sup> extremal phases [demo], and also non-monotonic examples, e.g. 3 phases [demo]
- Endemic infection v disease-free phases of contact processes (Stavskaya...)
- Coupled map lattices based on these (Sakaguchi, Gielis&MacKay, Bardet&Keller)





## 2. Robustness

- (i) How does a phase respond to a shock?
- Exponential decaying response to shocks in case of PCA with spectral gap, but more generally?
- (ii) How does the phase or set of phases (closed, convex) vary with parameters?
- For PCA with a spectral gap, under small changes the unique phase stays unique and varies smoothly (cf. Ruelle for SRB measure of a uniformly hyperbolic dynamical system)
- For systems whose phases are Gibbsian, the set of phases varies upper hemi-continuously.
- But not always lower, e.g. 2D Ising as magnetic field crosses 0.



# Bifurcations

- In equilibrium statistical mechanics, co-existence of N (extremal) phases is of codimension N-1 (Gibbs phase rule).
- But for space-time phases, non-unique phase can be robust, e.g. Toom PCA.
- Does the set of phases generically vary smoothly? Perhaps there is a spectral projection that contains all the dynamics of domains?
- Proved examples of bifurcation: kinetic 2D Ising, Keller's globally coupled maps
- Universality classes? Renormalisation (=aggregation + rescaling)?



# 3. Control and Design

- What changes to a phase can be achieved with local control? A zealot can have huge effect in opinion-copying models [Mobilia, 2003]
- Boundary control can have a large effect when phase is non-unique.
- What changes to the set of phases can be obtained with infinitesimal (but high gain) control? (cf. "control of chaos")
- How to design a complex system so that its phases optimise some objective function or partial order?



# 4. More questions

- More realistic systems, e.g. general network instead of a lattice, interaction of mobile units via proximity in space (swarms)
- Special classes, e.g. multi-agent games, number-conserving systems, many-body quantum systems, quantum gravity?
- Systems that never settle down (evolution?)?
- Aggregation procedures
- Reduction to macroscopic models
- Fitting to data



## Conclusion

- Complexity Science offers a lot of serious and worthwhile challenges to Mathematics.
- Complexity Science needs serious input from Mathematics.



## Advertisements

- Warwick EPSRC Mathematics Research Centre Symposium Year on "The Mathematics of Complexity Science and Systems Biology", Sept 09 - Sep 10. Remaining workshop: 14-16 September 2010: Ecology, epidemiology and evolution
- UK Complex Systems Dynamics LMS network (CoSyDy).
- Warwick EPSRC Doctoral Training Centre in Complexity Science.
- ERASMUS MUNDUS 2-year MSc in Complexity Science, joint with Ecole Polytechnique, Chalmers University and University of Goteborg.

