

Sistemas Complexos e o Prêmio Nobel de Física 2021

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The Royal Swedish Academy of Sciences has decided to award the Nobel Prize in Physics 2021

“for groundbreaking contributions to our understanding of complex physical systems”

with one half jointly to

SYUKURO MANABE

Born 1931 in Shingu, Japan. Ph.D. 1957 from University of Tokyo, Japan. Senior Meteorologist at Princeton University, USA.

KLAUS HASSELMANN

Born 1931 in Hamburg, Germany. Ph.D. 1957 from University of Göttingen, Germany. Professor, Max Planck Institute for Meteorology, Hamburg, Germany.

and the other half to

GIORGIO PARISI

Born 1948 in Rome, Italy. Ph.D. 1970 from Sapienza University of Rome, Italy. Professor at Sapienza University of Rome, Italy.

“for the physical modelling of Earth’s climate, quantifying variability and reliably predicting global warming”

“for the discovery of the interplay of disorder and fluctuations in physical systems from atomic to planetary scales”



Sistemas Complexos

Ingredientes básicos e

propriedades emergentes

Complex systems is a relatively new and broadly interdisciplinary field that deals with systems composed of many interacting units, often called “agents.” The foundational elements of the field predate the current surge of interest in it, which started in the 1980s, but substantial recent advances in the area, coupled with increasing interest both in academia and industry, have created new momentum for the study and teaching of the science of complex systems.

There is no precise technical definition of a “complex system,” but most researchers in the field would probably agree that it is a system composed of many interacting parts, such that the collective behavior of those parts together is more than the sum of their individual behaviors. The collective behaviors are sometimes also called “emergent” behaviors, and a complex system can thus be said to be a system of interacting parts that displays emergent behavior.

M. Newman, Am. J. Phys. **79**, 800-810 (2011)

- Muitos “agentes”
- Relações entre agentes: interações → rede de conexões.
- Vínculos conflitantes: interações competitivas (frustração).
- Comportamento emergente: auto-organização.
- Múltiplas escalas: estrutura hierárquica.
- Complexidade: muitos equilíbrios possíveis.

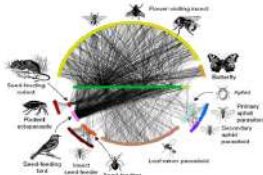
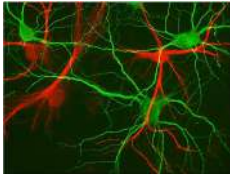
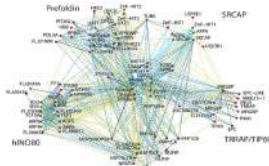
Sistemas Complexos

Como funcionam ?

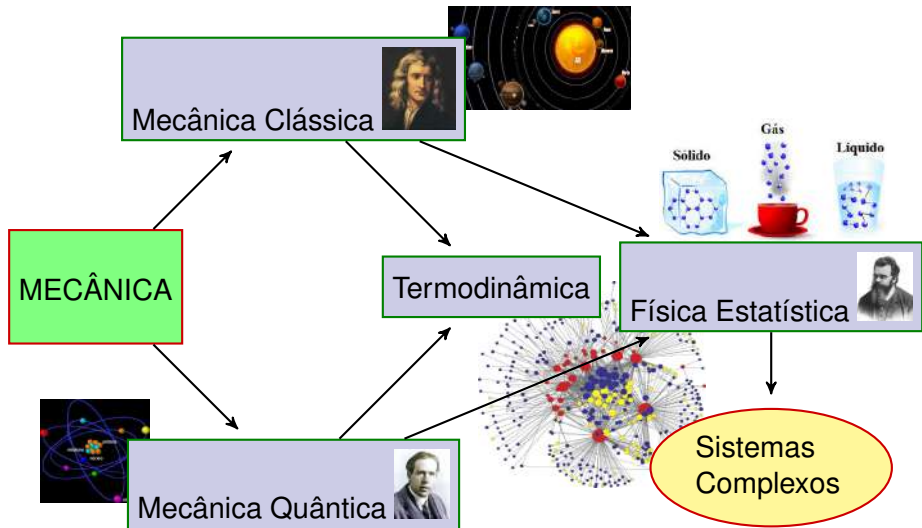
Qual a relação entre estrutura e “observáveis” ?

Como evoluem no tempo ?

Fluxos de passageiros



Os Sistemas Complexos e as áreas da Física



“for groundbreaking contributions to our understanding of complex physical systems”



vidros de spin
vidros estruturais
problemas de
otimização
combinatória
redes neuronais

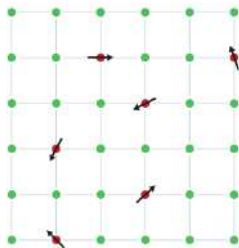
...

*“for the discovery of the
interplay of disorder and
fluctuations in physical
systems from atomic to
planetary scales”*

Vidros de spin

Ligas de dois metais, um deles magnético

Desordem:

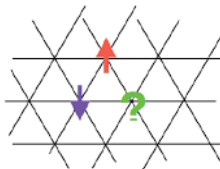
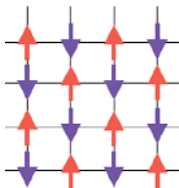


$$Energia = -\frac{1}{2} \sum_{i,j=1}^N J_{ij} S_i S_j$$

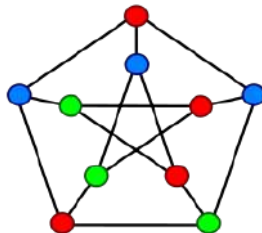
Quais os estados de menor energia ?

Frustração: impossível satisfazer todos os vínculos simultaneamente !

Muitos arranjos possíveis, com energias parecidas ...



Problemas de otimização



Otimização: problema do Caixeiro Viajante (TSP)

Problema: Dada uma lista de cidades (*agentes*) e as distâncias entre elas (*relações*), *achar o caminho mais curto* que passe por todas as cidades apenas uma vez (*vínculo*).



$i = 1, 2, \dots, N$ cidades

d_{ij} : distância entre as cidades “i” e “j”

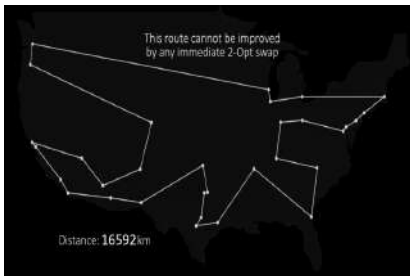
D : extensão de um dado caminho

$c_i = 0, 1$

Um caminho: $D = d_{12}c_1c_2 + d_{23}c_2c_3 + \dots + d_{N-1N}c_{N-1}c_N$

Em geral: $D = \sum_{i,j=1}^N d_{ij}c_ic_j + \text{vínculo}$

Desordem, frustração e dinâmica no TSP

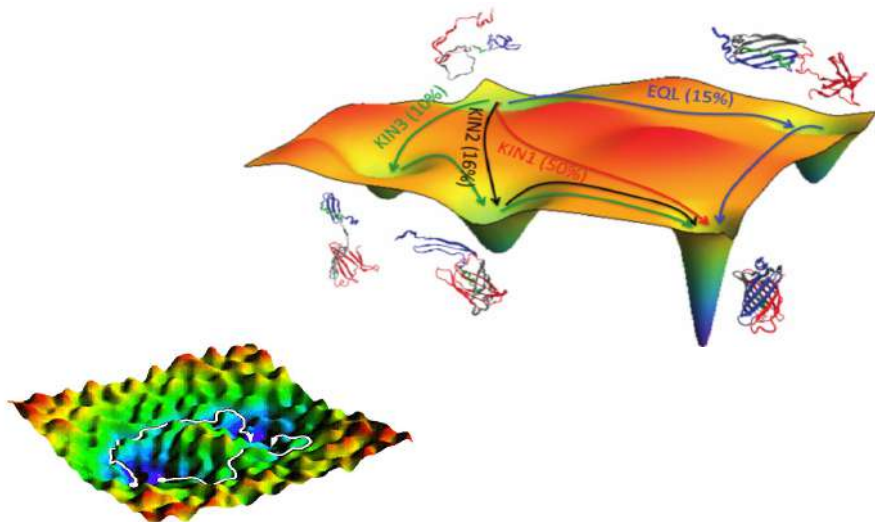


Desordem: nos interessa o comportamento de um conjunto de mapas definidos pelas distâncias $\{d_{ij}\} \rightarrow$ **propriedades estatísticas**.

Frustração: minimizar as distâncias de uma cidade até as vizinhas não sempre ajuda a minimizar o caminho total (**propriedade local versus global**).

Propriedades emergentes: a paisagem de energia

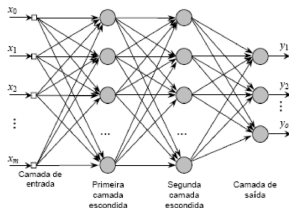
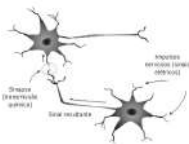
Complexidade: muitos estados estáveis possíveis



Redes Neurais



Neurônio Biológico



O modelo de Hopfield

É possível fixar as conexões (W_{ij}) para armazenar um conjunto dado de memórias ? (problema inverso)

$$E = -\frac{1}{2} \sum_{j=1}^N x_j \left(\sum_{k=1}^N w_{jk} x_k \right)$$

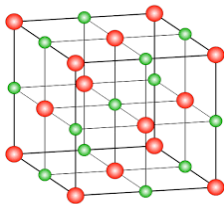
Regra de Hebb: $w_{ij} = \sum_{\mu=1}^p \xi_i^{\mu} \xi_j^{\mu}$

$$p = \alpha N$$

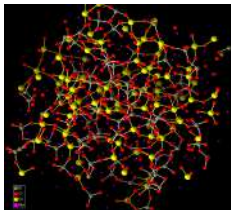


Muito obrigado pela
atenção !

Vidros de janela



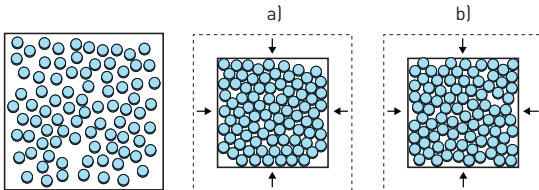
Crystal



Vidro

Mathematics for complex disordered systems

Every time many identical discs are squeezed together, a new irregular pattern is formed despite them being squeezed in exactly the same way. What governs the result? Giorgio Parisi discovered a hidden structure in such complex disordered systems, which these discs represent, and found a way of describing them mathematically.



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