



### ON TOP AND BEYOND NETWORKS

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Parmenides Foundation, Pullach/Munich and London Mathematical Laboratory Seminar talk given at IMT Lucca, December 7, 2016 Networks are everywhere – says the blurb of a recent conference.

Yes: interactions are everywhere. And they often are pairwise, and the interacting partners may live on a complex graph.

Today we tend to project networks into everything we see around us.

It is a great achievement that people (or at least some of them) in fields like e.g. economics realize that there are interactions between the agents (or that there are more agents at all, beyond the lonely representative one) and that the topology of these interactions matter a lot, but I do not think that the story ends there. Directions in which the network picture can be extended:

- Functionals over networks and the network these functionals can define
- Background fields acting on nodes and/or links
- Action of nodes' dynamics on links and their co-evolution.

#### Networks on top of networks

Real world networks have a function, they serve some purpose, they are either spontaneously evolved, or purposefully designed. The efficiency of this function usually depends not only on the local features, but the whole structure, topology, geometry, etc.: there is a *functional* defined over the network.

Furthermore, there may be a success criterion (extremal principle) associated with this functional. For simplicity, I assume that the functional is a real valued scalar and will refer to it as the energy, or free energy. Success, optimality, etc. corresponds to the minimum of the functional.

#### Examples

Transport network

Functional: # of people, volume of goods transported, GDP Information/communication networks

Functional: GDP again

Financial networks

Functional: stability and/or efficiency of financial intermediation

Interpersonal relationships, relation to institutions, norms

Functional: social happiness, low transaction costs

#### Illustration: Ising spin glass

*N* agents  $s_{i,i} = 1,2,...,N$ , facing a binary choice:  $s_i = \pm 1$  interacting via  $J_{i,i} = \pm 1$ , and possibly under a bias or external field:

$$E = -\sum_{\langle i,j \rangle} J_{i,j} s_i s_j - \sum_i h_i s_i$$

Simple model of competition and cooperation.

For simplicity, consider complete graph.

Random search for optimum (MC): Moves accepted with prob. 1 if they decrease or leave *E* unchanged, and accepted with prob. *p* if *E* is increased.

#### Small sample: red: J=+1, blue: J=-1



Frustration pushes ground state energy upwards (relative to the every J positive case), increases degeneracy.

# Energy spectrum and network of four lowest lying states



Seemingly different interaction matrix with the same energy landscape (gauge invariance)





### Slightly different interaction matrix with very different landscape





#### Spectrum and landscape



### N=16, lowest 3 energy states that can be reached from each other for small p



- There is a network of accessible states determined by the functional defined over the underlying network.
- Transitions can take place in the phase space landscape without change in the underlying network.
- Slow dynamics, quasi-equilibria, "homeostasis", punctuated equilibrium.
- Are post-referendum Britain / the US of the 2016 campaign / Orban's Hungary fundamentally different from their former self?

#### When the undelying network is changing...

"Annealed averages": the underlying network is changing on the same timescale as the agents – leads to boring equilibrium.

Between annealed and quenched: hardly studied, although the technical tools are there (A. Coolen & D. Sherrington)

Social balance theories: the agents are fixed, but their interactions change so as to reduce overall frustration (the friend of a friend is a friend, and the enemy of an enemy is a friend). Ends up in everyone in the same camp, or two antagonistic camps.

#### An illustration from history (S. Strogatz)



Entente Cordiale 1904

British-Russian Alliance 1907

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### Beyond networks

In several instances that we try to describe in terms of networks, one can discern some background field that cannot be represented as a sum of binary interactions.

Trust is a major factor of stability of social order or the economy.

Culture, shared values, ideologies, myths, the Zeitgeist, etc. act as external fields on individual agents, or their groups, *but also on the interactions* between agents.

## Example: Hungarian revolution October 23, 1956

- Neither the authorities, nor the organizers of the student demonstration could sense the amosphere of the country
- A march of a couple of hundred students evolved into armed uprising and the collapse of a totalitarian regime in one afternoon

#### Example: banking networks

In the wake of the 2007-08 crisis a large number of works have been devoted to banking networks and their systemic risk implications. The concept of networks is one of the few new ideas that has penetrated regulation (J.-C. Trichet) and some of the finance literature.

Magic of words: networks, contagion, cascades evoke the picture of serial default, forest fire, dominos falling over, etc. September 15, 2008, was not like this; Bernanke, Paulson and Geithner were desperately trying to find a buyer for Lehman, but no one wanted it, everyone was frightened and hoarded money. The credit market seized up in two days. It was a total and sudden collapse of trust.

#### The week of the crisis



#### Banking networks

Banks are connected by overlapping asset portfolios, mutual exposures, credit-debt relationships, etc.

But also: by common culture, common ideology, common business school education, common pubs, golf clubs, etc., employees subject to same toxic atmosphere and overburden, rollercoaster of panic and exuberance.

The former can be modelled by networks, the latter cannot.

How should we model such a turbulent ecology?

#### State of nodes acting on links

- What kind of model can I imagine?
- Update interactions by an amount depending on the current state of the system (say, proportional to the absolute value of the sum of spins) shifting couplings upwards (more cooperation, "socialism"), or downwards (more competition, "neoliberal policies"), let system relax, then repeat.

#### THANK YOU!