

A heterogenitások hatásának vizsgálata energia hálózatokban



Géza Ódor and Bálint Hartmann

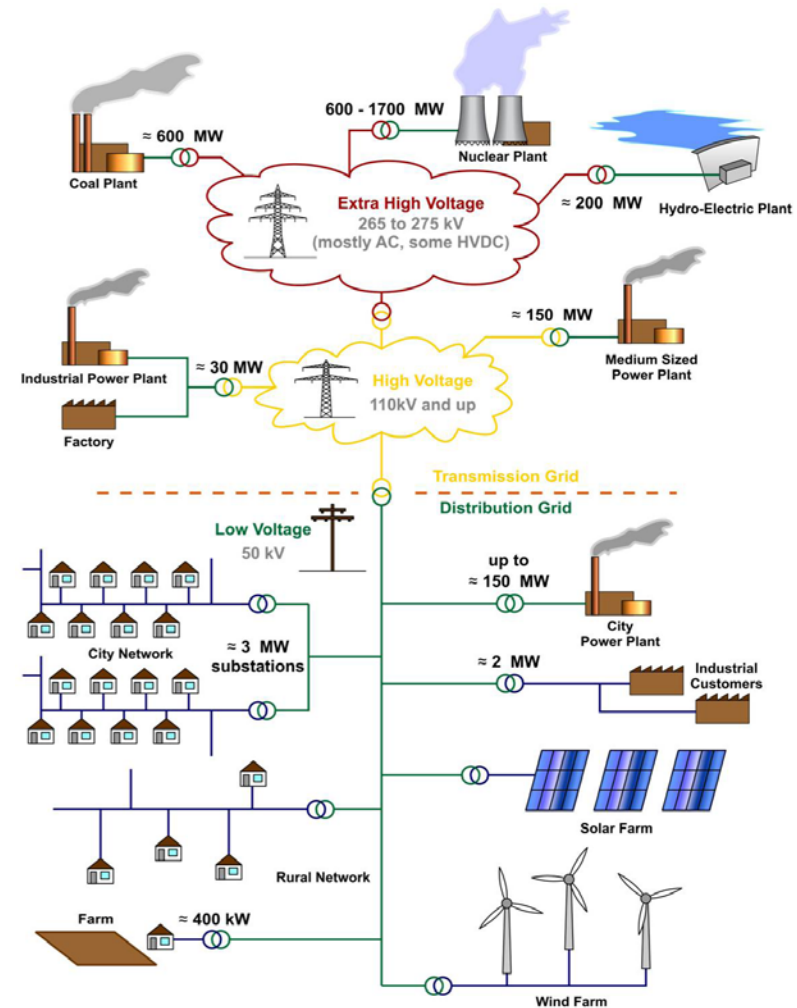
Centre for Energy Research of the Hungarian
Academy of Sciences



Electric Energy & Power Network



- Electric energy is critical for our technological civilization
- Purpose of electric power grid: generate/transmit/distribute
- Challenges: multiple scales, nonlinear, & complex system, growing number of renewables & deregulation



Challenge: Scale-free blackout size distributions

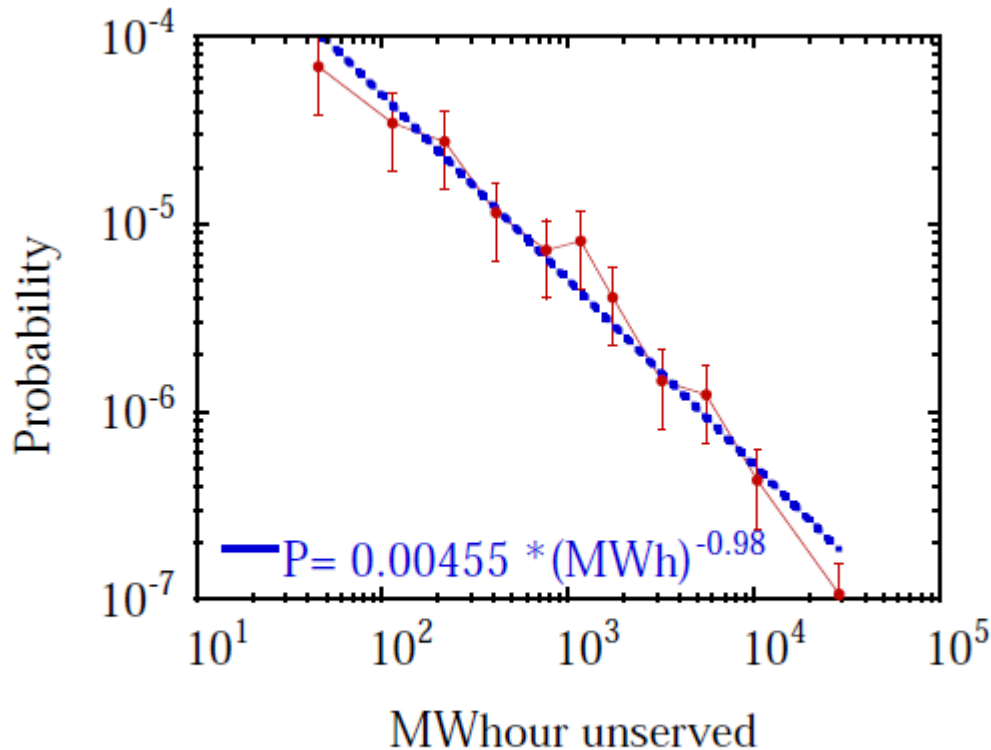


Figure 4. Probability distribution function of energy unserved for North American blackouts 1993-1998.

B. Carreras et al, Proceedings of Hawaii International Conference on System Sciences, Jan. 4-7, 2000, Maui, Hawaii. 2000 IEEE

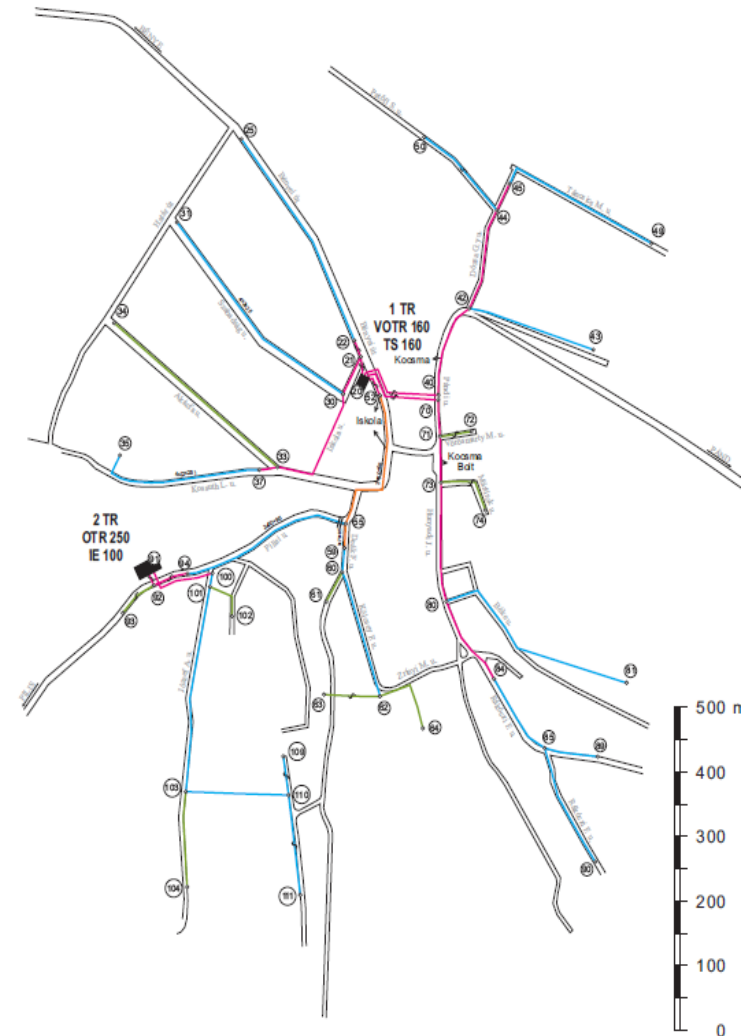
Extreme events occur more frequently than by Gaussian model prediction

US HV 4941 nodes

Self-Organized Criticality (SOC) is assumed for modeling this:

Competition of supply and demand

- Multi-level : high – medium - low voltages



Synthetic Power grid generation

We created large: HV (transmission) - MV (sub-transmission) - LV(distribution) level graphs with weights

For HV : from utilities and system operators

For MV, LV: representative or reference network models (RNM) : **NEW algorithm using iterative random MATLAB processes, using empirical electrical distributions**

Admittance matrix:

for HV: Hungarian example

for MV,LV: synthetic grid modeling

HV: undirected loop top $L = \frac{1}{N(N-1)} \sum_{j \neq i} d(i, j)$

$$C^W = \frac{1}{N} \sum_i 2n_i / k_i (k_i - 1) \quad \text{and} \quad C^\Delta = \frac{\text{number of closed triplets}}{\text{number of connected triplets}}.$$

of nodes

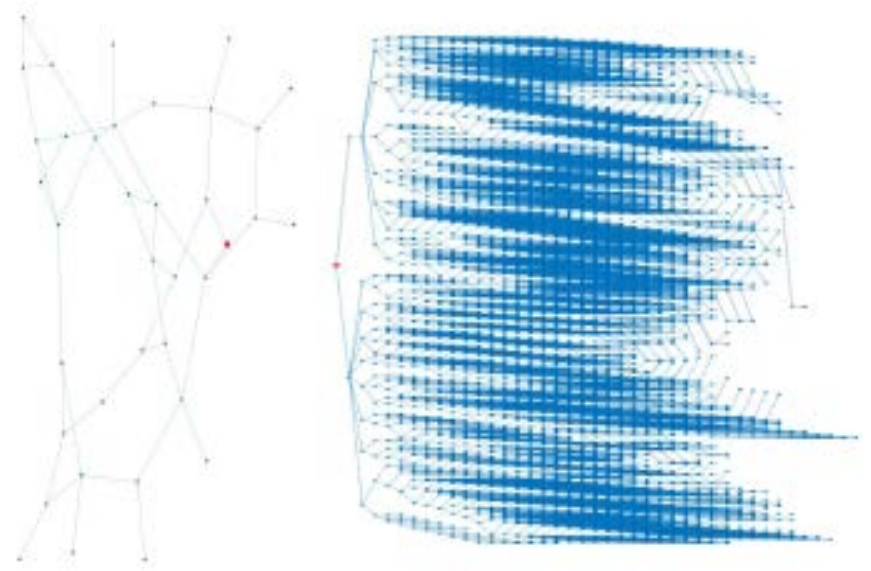


FIG. 1: Structural representation of the synthetic networks. Left side: HV, right side: a radial subnetwork. The highlighted red node connects the two layers. The network on the picture has 68850 nodes and 68849 edges.

TABLE I: Power-grids generated and studied.

Network	N	Edge no.	L	C^Δ	C^W
1M	1098583	1098601	1.7440×10^6	0	0
1.5M	1455343	1455367	1.0457×10^6	0.0594	0.0486
2.5M	2356331	2356360	1.6162×10^6	0.0851	0.0586
23M	23551140	23551254	2.1129×10^6	0.0626	0.0741

Network graph analysis

- Basic network distributions:

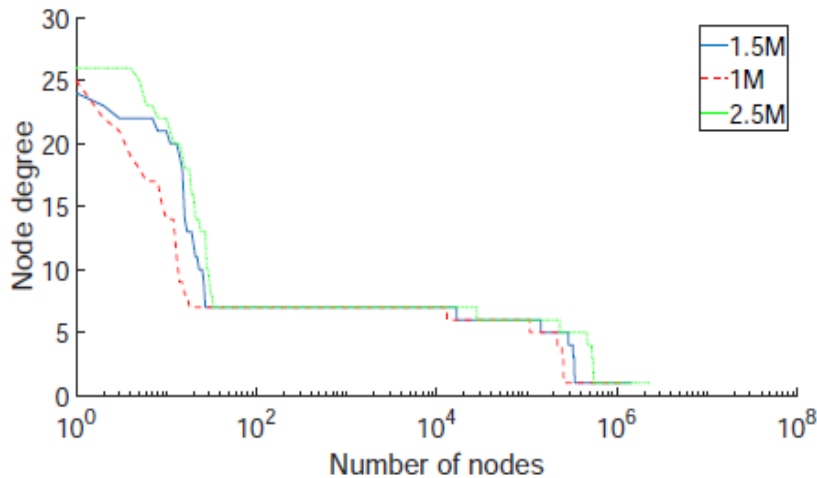


Figure 2. Node degree distribution of the synthetic power-grids generated.

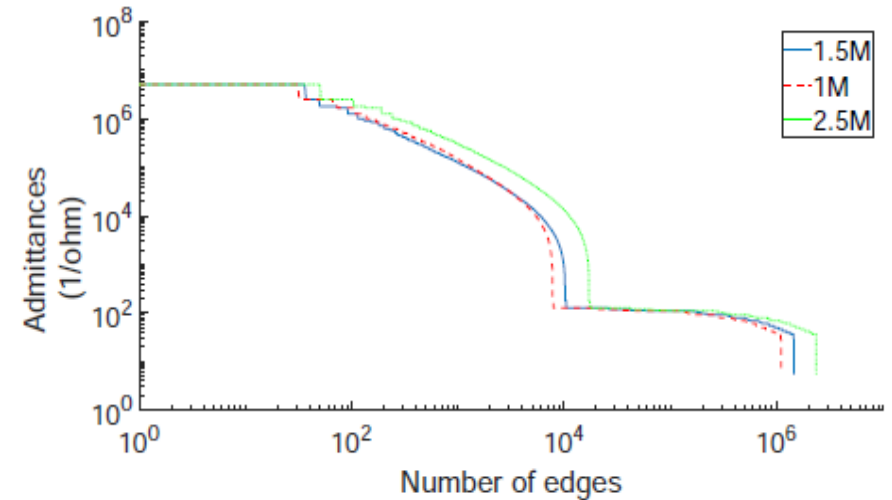


Figure 3. Admittance distribution of the power-grids generated.

- Topological dimension: $\langle N(R) \rangle \sim R^D$ by Breadth first search from each node

$$D_{\text{eff}}(D + 1/2) = \frac{\ln \langle N_R \rangle - \ln \langle N_{R+1} \rangle}{\ln(R) - \ln(R + 1)}$$

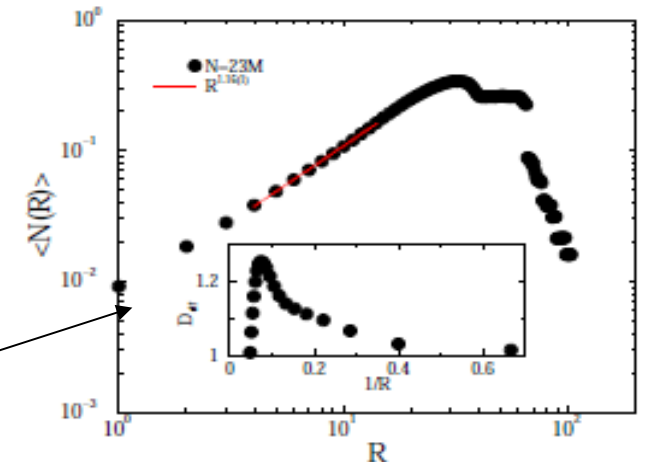
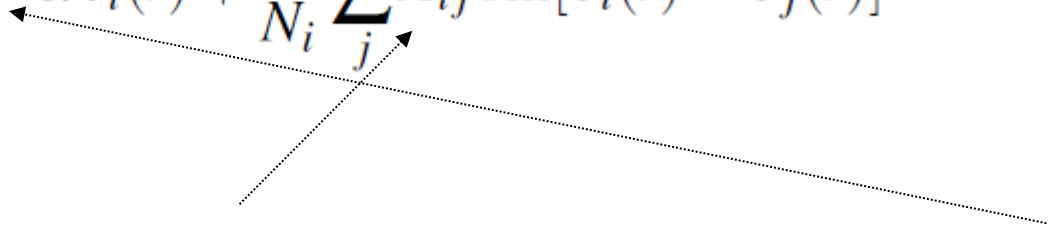


FIG. 4: Average number of nodes within chemical distance R in the 23 graph. Dashed line shows a power-law fit for $4 < R < 20$. Inset: local slopes defined in Eq. 6.

The synchronization model

- Network failures, blackouts can be described by de-synchronization of AC power

Simplest model : second order Kuramoto equations for phases θ_i of oscillators

$$\begin{aligned}\dot{\theta}_i(t) &= \omega_i(t) \\ \dot{\omega}_i(t) &= \omega_{i,0} - \alpha \dot{\theta}_i(t) + \frac{K}{N_i} \sum_j A_{ij} \sin[\theta_i(t) - \theta_j(t)]\end{aligned}$$


coupled by control parameter: K , admittance matrix: A_{ij} and α : dissipation

Quenched disorder in the topology, admittances and in the intrinsic frequencies $\omega_{i,0}$ of the nodes

The synchronization transition

- Synchronization is measured by the order parameter

$$z(t_k) = r(t_k) \exp i\theta(t_k) = 1/N \sum_j \exp [i\theta_j(t_k)] , \quad R(t_k) = \langle r(t_k) \rangle$$

- Numerical integration results in a first order phase transition for a fully coupled (mean-field) network

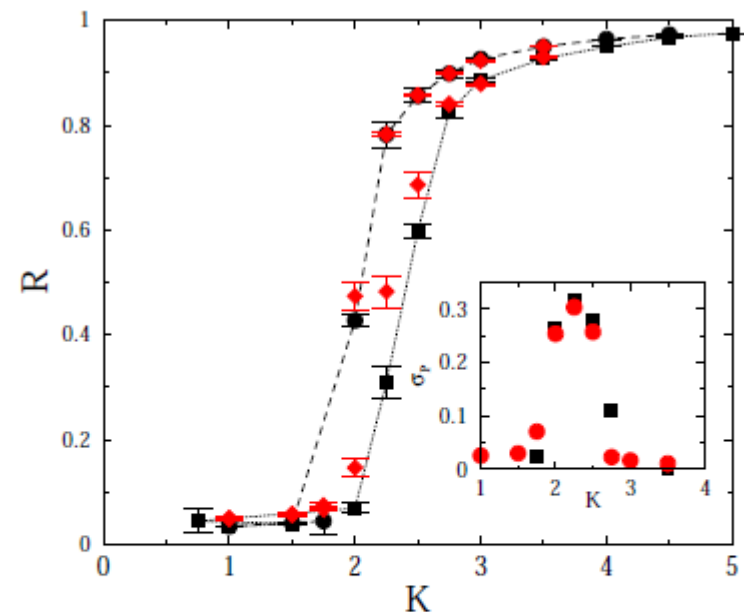


FIG. 2: Hysteresis in the steady state order parameter in fully coupled networks of sizes $N = 1000$ (boxes) and $N = 500$ (diamonds). Inset: $\sigma_R(K)$ peaks for the two different network sizes investigated.

Two-dimensional lattice grid

- Synchronization transition on homogeneous, 2D lattices:
- Numerical integration results in a **crossover** to synchronization at large K values
- “Fast” relaxation to the steady state (no power-law)
- Hysteresis
- **What is the consequence of heterogeneities ?**

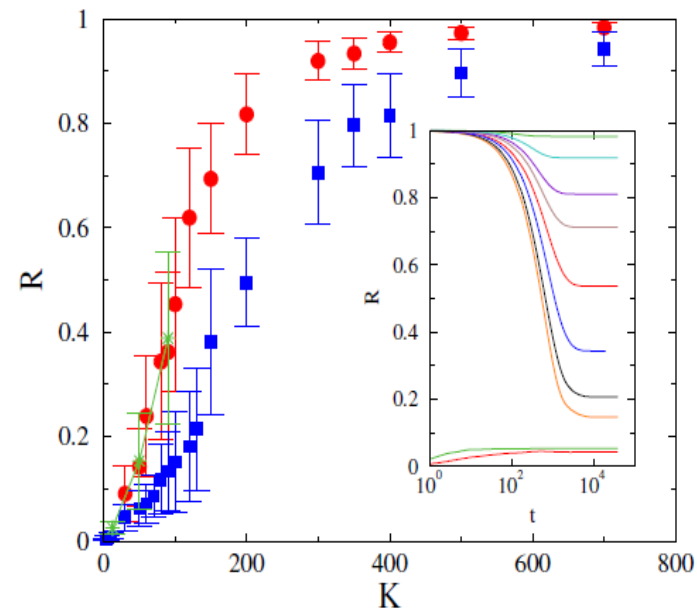
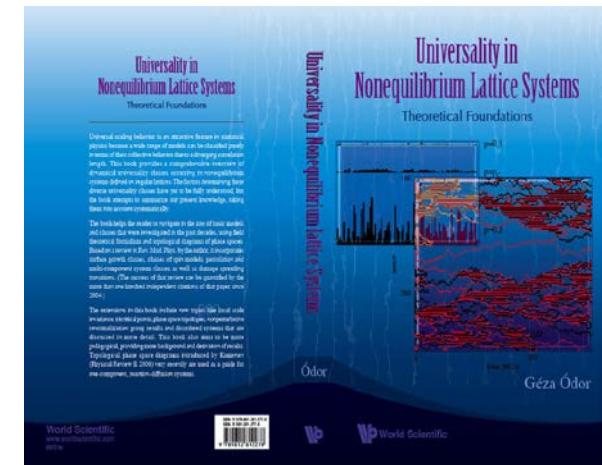
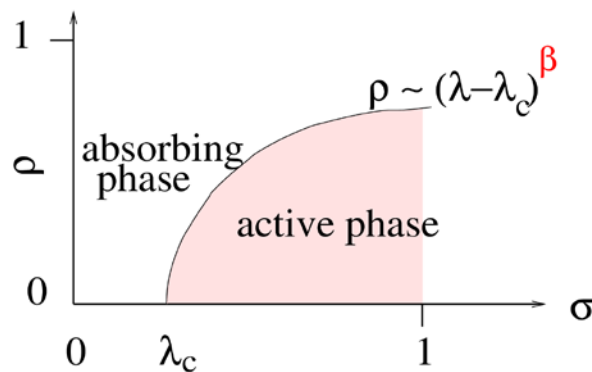


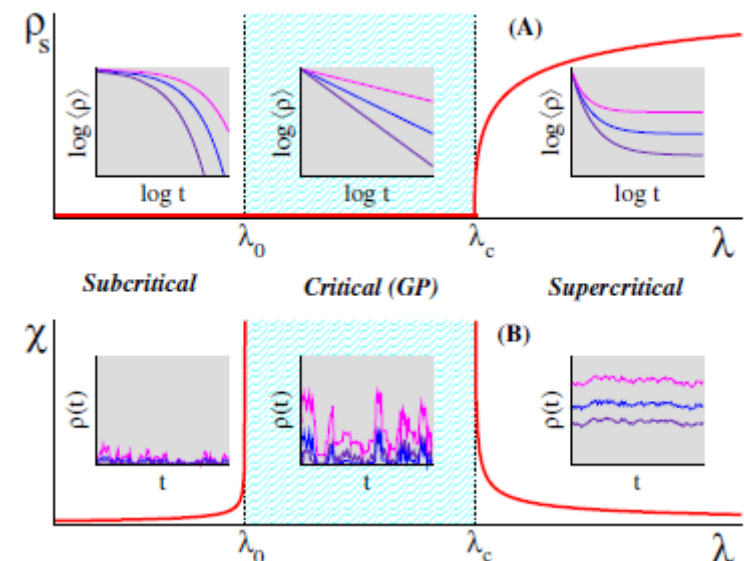
Figure 6. Phase synchronization transition in the steady state in 2D networks of sizes $N = 500 \times 500$ (red bullets), $N = 1000 \times 1000$ (blue boxes) using $a = 3$ and $N = 500 \times 500$ (green stars) using $a = 1$. Inset: time dependence of $R(t)$, in case of the $N = 500 \times 500$ lattice, for control parameters: $K = 700, 350, 200, 150, 100, 80, 60, 50$ in case of synchronized initial condition (top to bottom curves) and $K = 700, 100$ de-synchronized initial condition (top to bottom curves).

Heterogeneities in other network models

On lower dimensional regular, Euclidean lattices: critical point between ordered and disordered phases *due to the fluctuations*



Quenched disorder : Slowly decaying rare regions



Rounds phase transition, *Griffiths phase*:

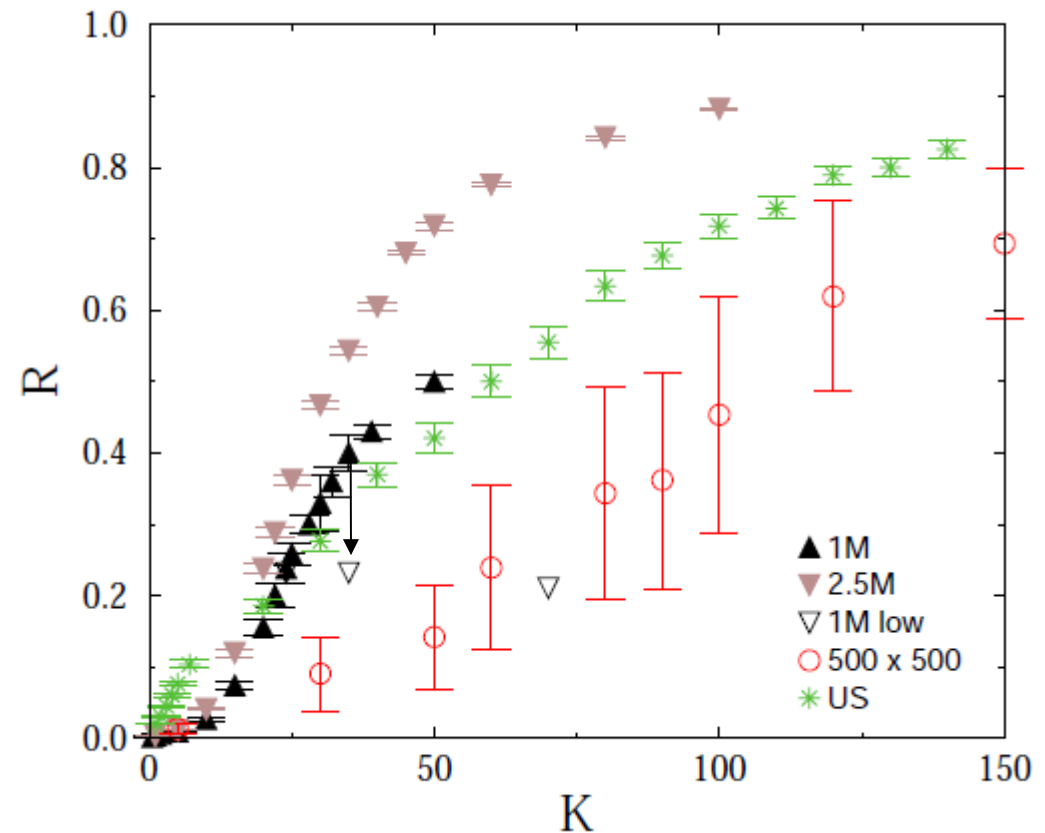
Synchronization in power-grids

Synthetic and real power grids
considered **without noise**

Bigger synchronization R values
than in $2D$ at a given K
but the stability is weak

Exponential relaxation remains

Adding noisy oscillators:
small effects. Even for
a Gaussian with $\sigma = 3$:
few percent drop,
Maximum -20% of R at the transition



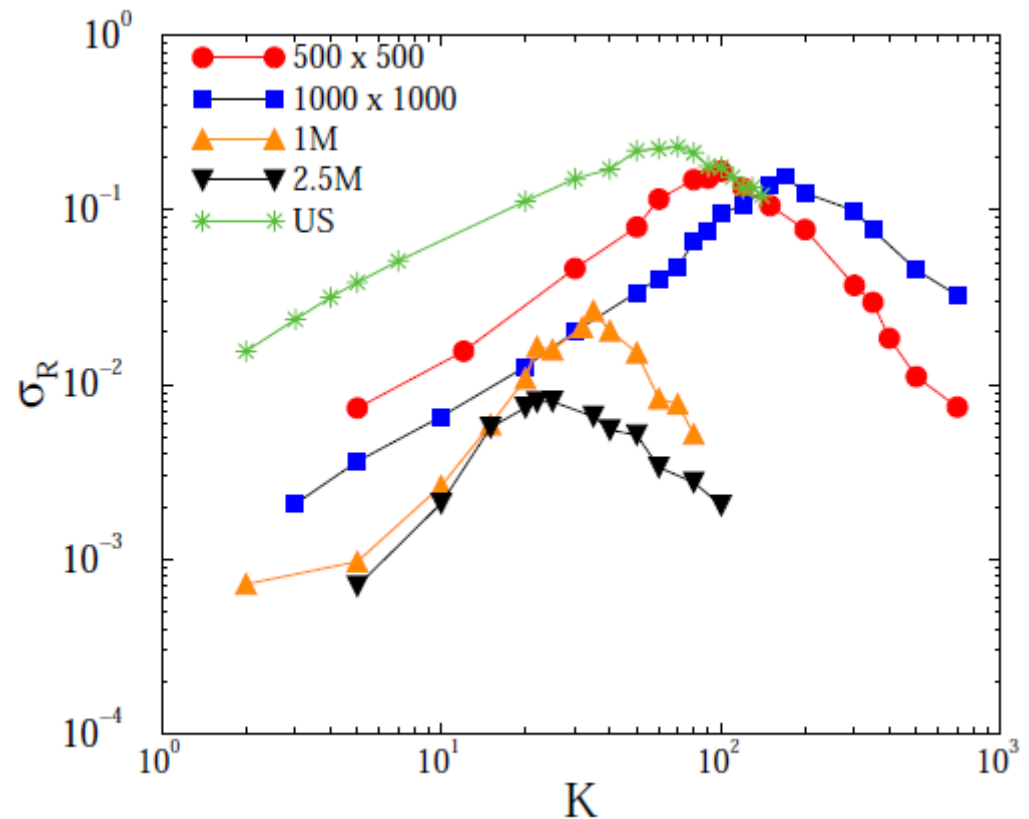
Synchronization in power-grids

Standard deviation σ_R over
50 samples and fixed time
windows in the steady state

Fluctuations peaks disappear
as $N \rightarrow \infty$

No real phase transition,
but a crossover,
like in the Kuramoto model

Crossover peaks are at
lower K -s (~ 30)
than in $2D$ ($\sim 100-200$)



De-synchronization avalanches in power grids

The duration distribution of de-synchronization events:

$$R = 1 \rightarrow R = 1/N^{0.5}$$

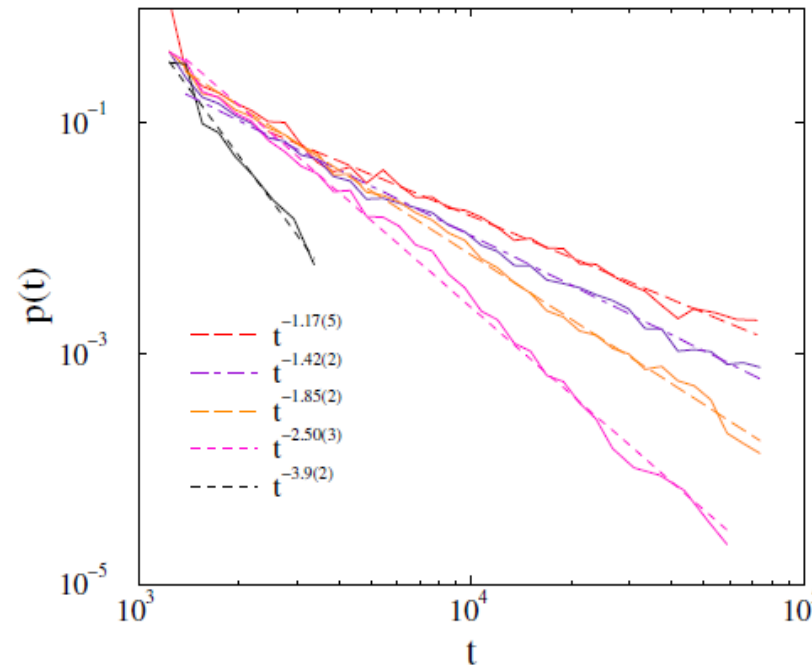


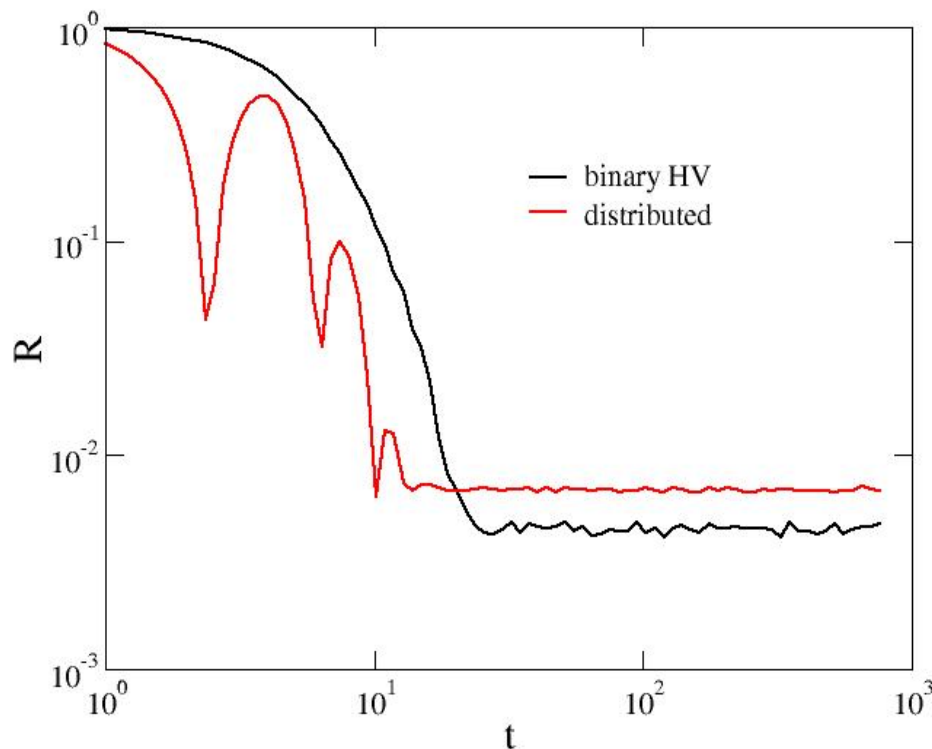
Figure 10. Avalanche duration distribution in the 1M power grid for $a = 3$ and different coupling values $K = 0.7, 0.6, 0.5, 0.4, 0.2$ (top to bottom solid curves). Dashed lines: PL fits for the tails.

K -dependent power-law tails: scale-free distributions like in GP

Centralized vs distributed sources

Renewable energy sources $\rightarrow$ distributed across the whole network $\rightarrow$ Instability ?

We compared HV sources $\leftrightarrow$ distributed



Conclusions

The topological heterogeneity smears the transition that remains for large couplings only : no real phase transition but a crossover

With respect to 2D topological+weight disorder **enhances** the synchronization but **decreases** the fluctuations

Scale-free desynchronization duration avalanches → Rare large events occur more frequently than in case of a Gaussian mathematical model

Frustrated synchronization ?

K -dependent **power-law tails** : heterogeneity effects (no SOC assumption)

Fault tolerance study : many stochastic elements have **low influence**

Distributed energy sources: After initial instability higher synchronization than in HV

Supported by MTA-EK special project grant 2017 and OTKA