

Statistical Physics for Power Grids

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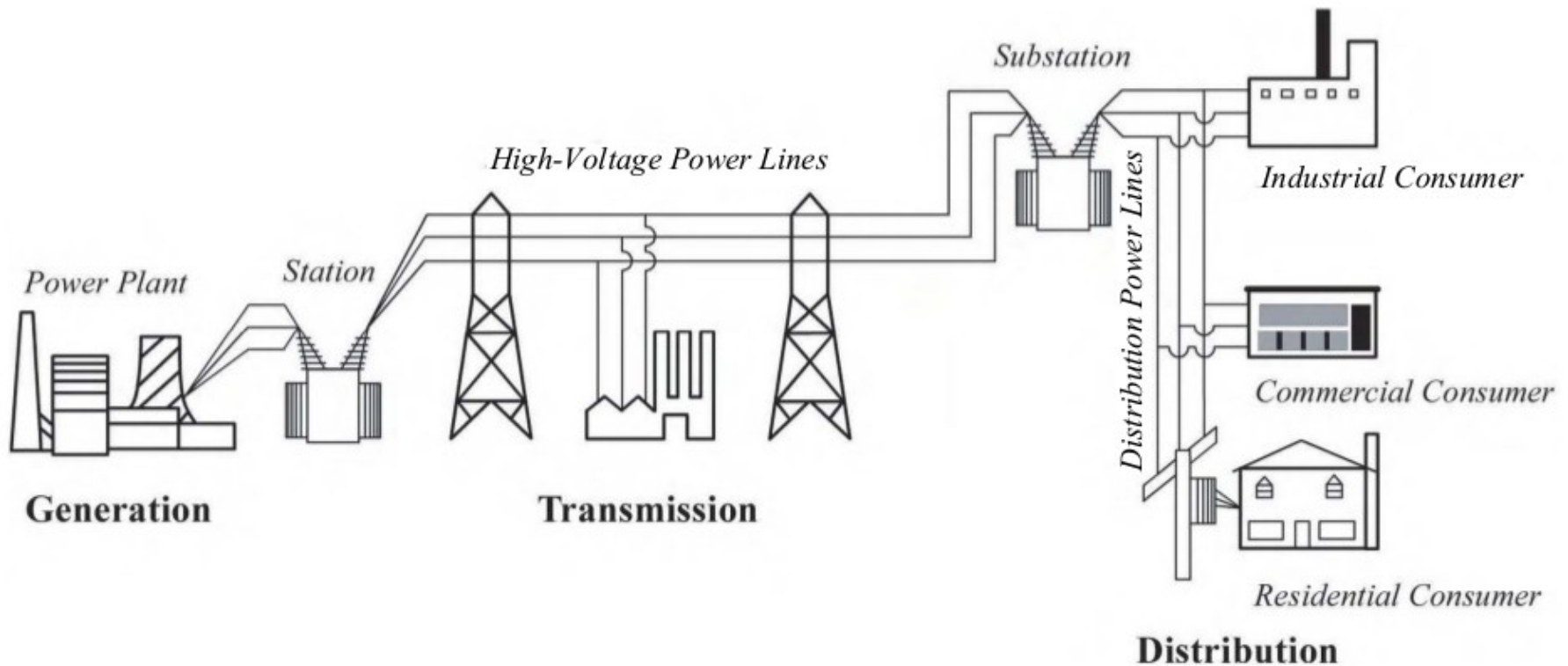
Physics Seminars, Federico II

Overview

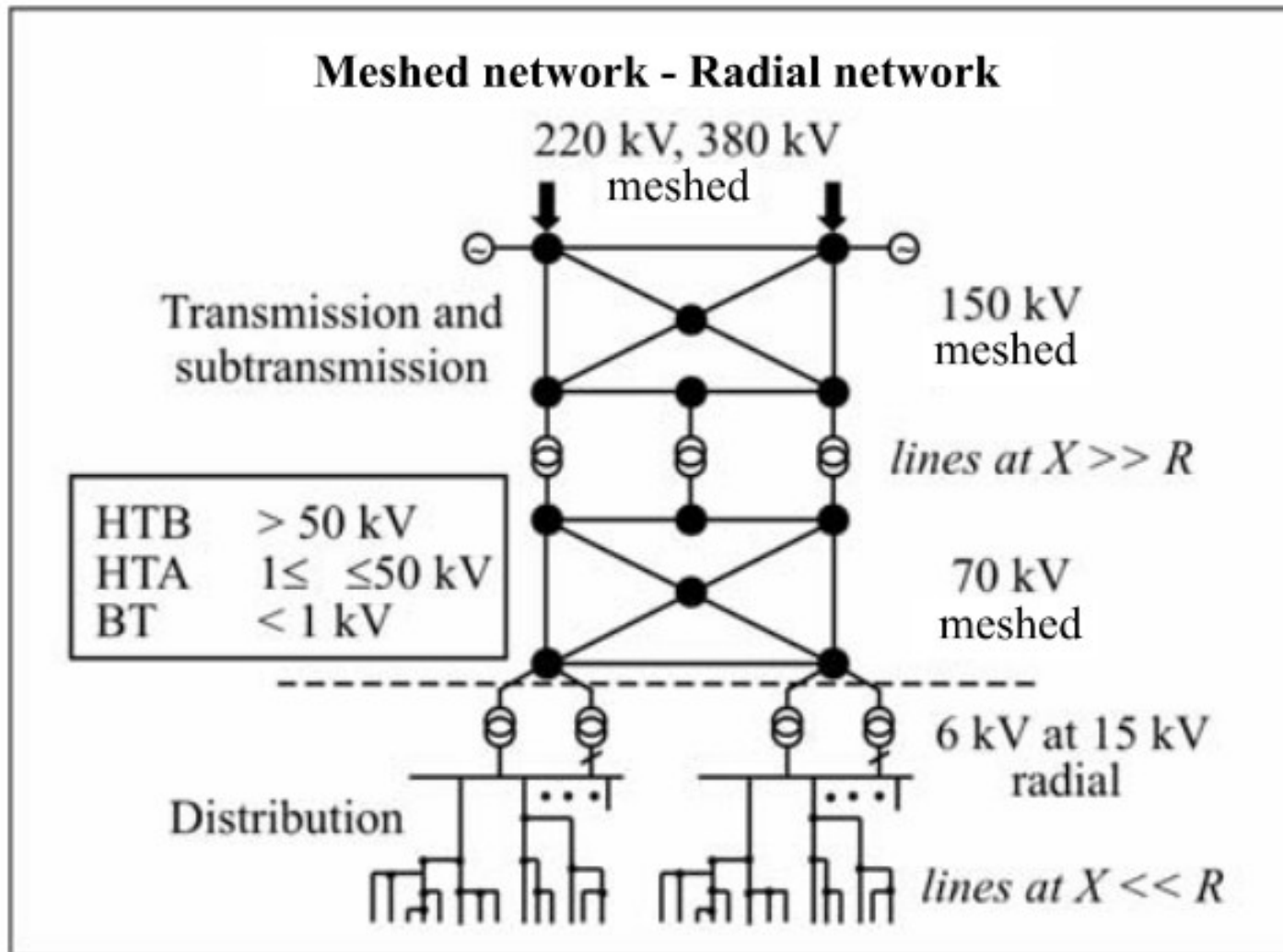
- Power System
- Blackouts
 - Stress from Increasing loads
 - Fluctuations from Renewable Sources
- Self-healing Networks
 - Simulations
 - Cavity Method
 - Self Healing Percolation

Power Systems

Electric System



Meshed vs Radial



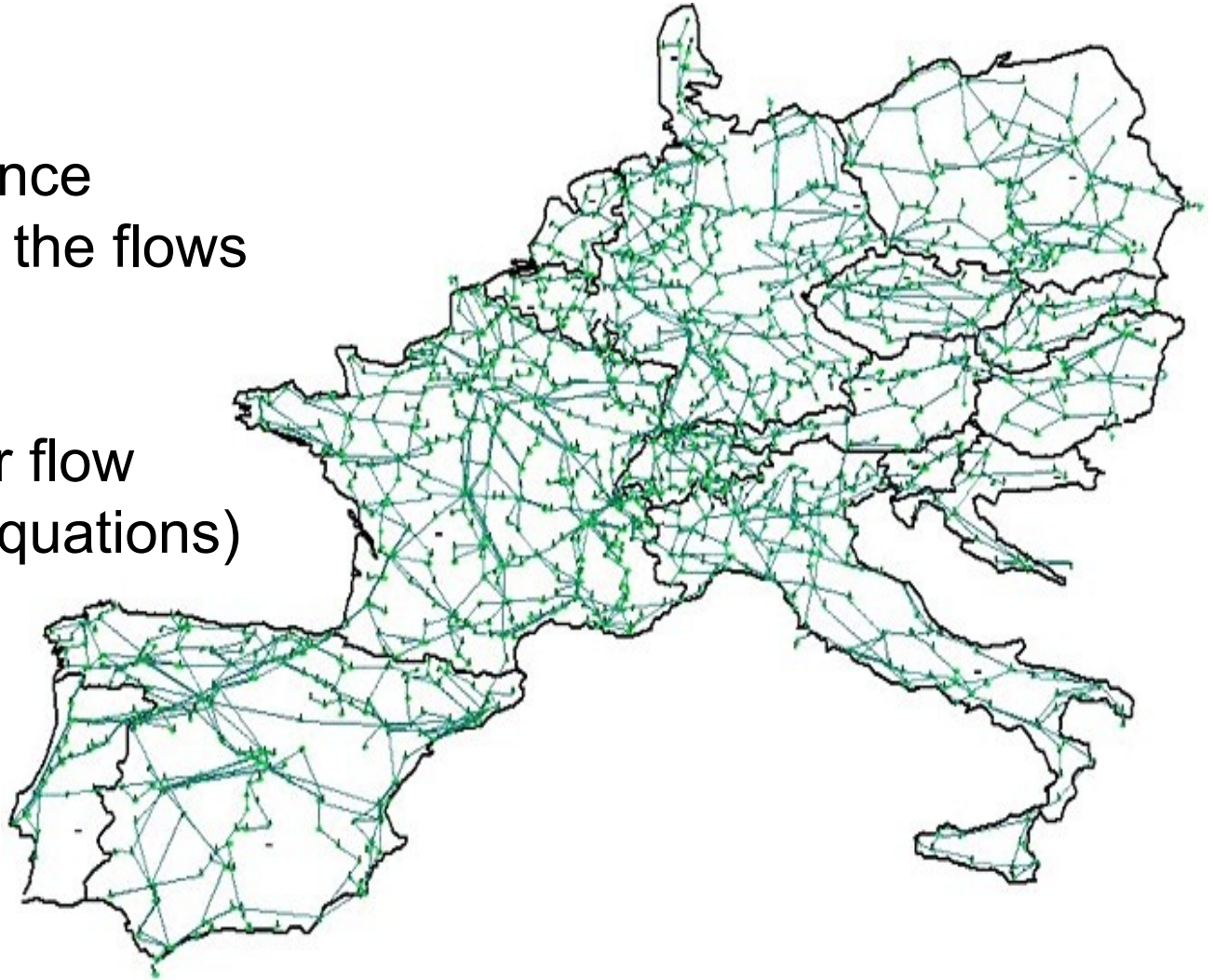
Blackouts

**Abruptness of Cascade Failures in Power Grids
Scientific Reports 4 (3694)**

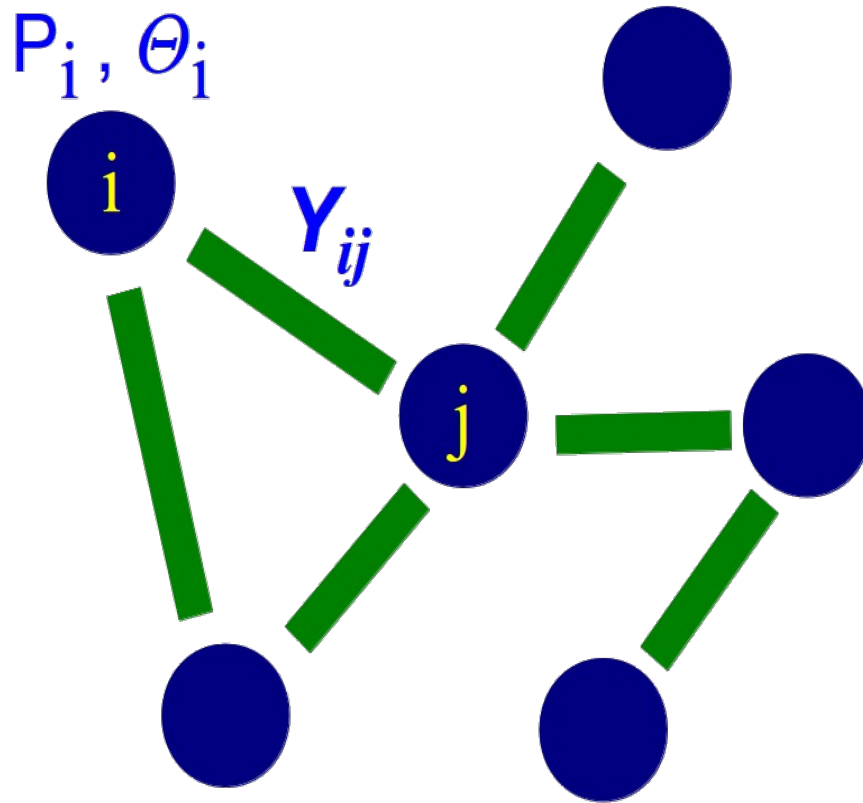
Transmission networks

- Power imbalance
- Magnitude of the flows

AC power flow
(non-linear equations)



DC Power Flow



- Linearized system:

$$\mathcal{L} \Theta = P$$

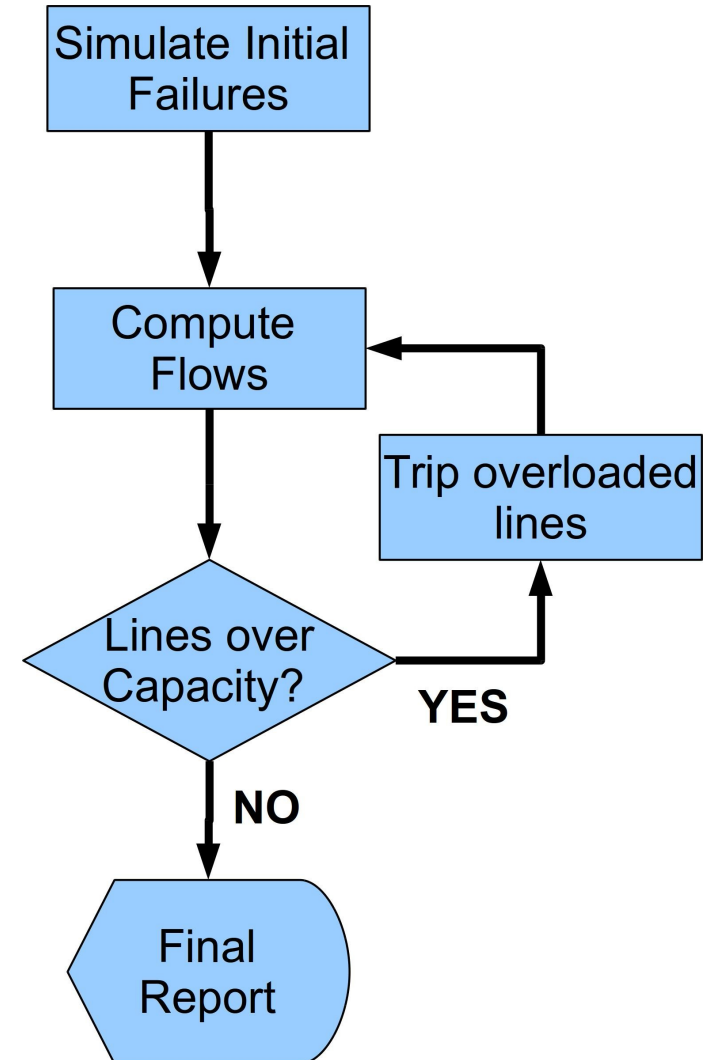
- \mathcal{L} depends on
 - the topology
 - line values

- Fluxes proportional to:

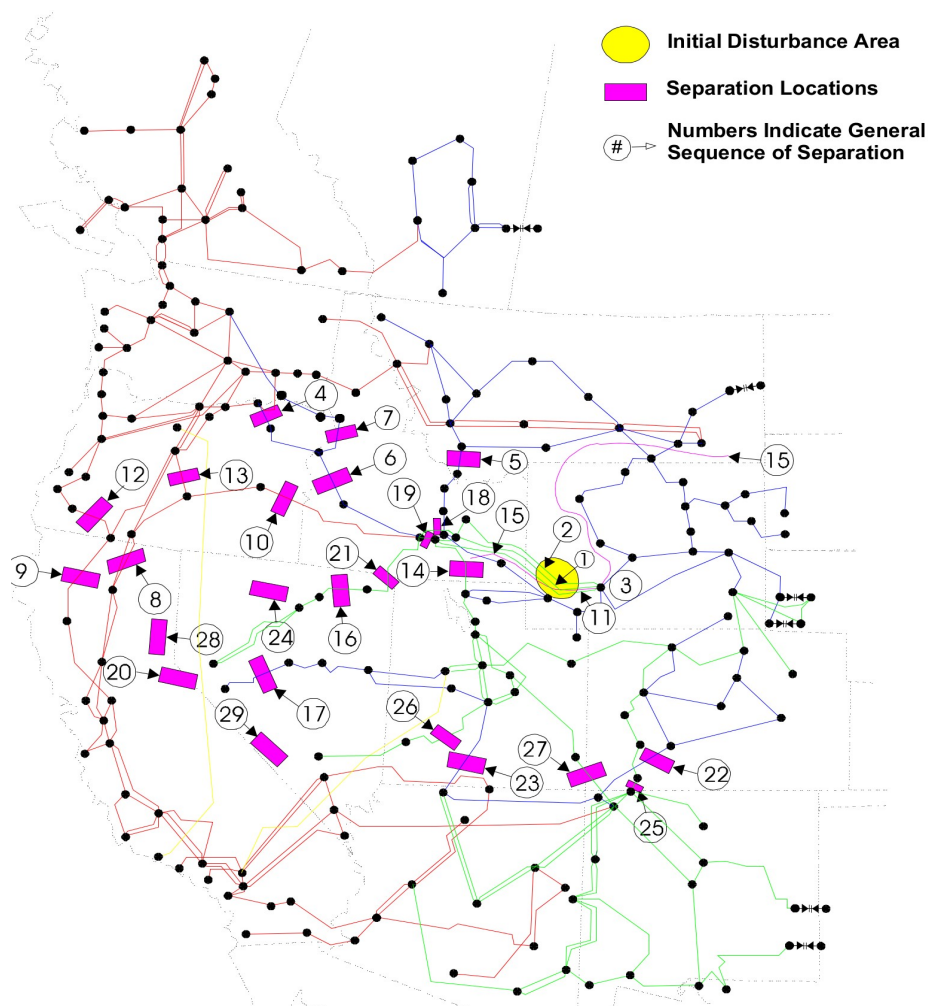
$$\Theta_{ij} = \Theta_i - \Theta_j$$

Overload Cascade Model

- Not considering transients
- Not considering voltage instabilities
- Not considering phase sync
- **Just a sequence of line trippings**



Blackout: “fast” & long-range

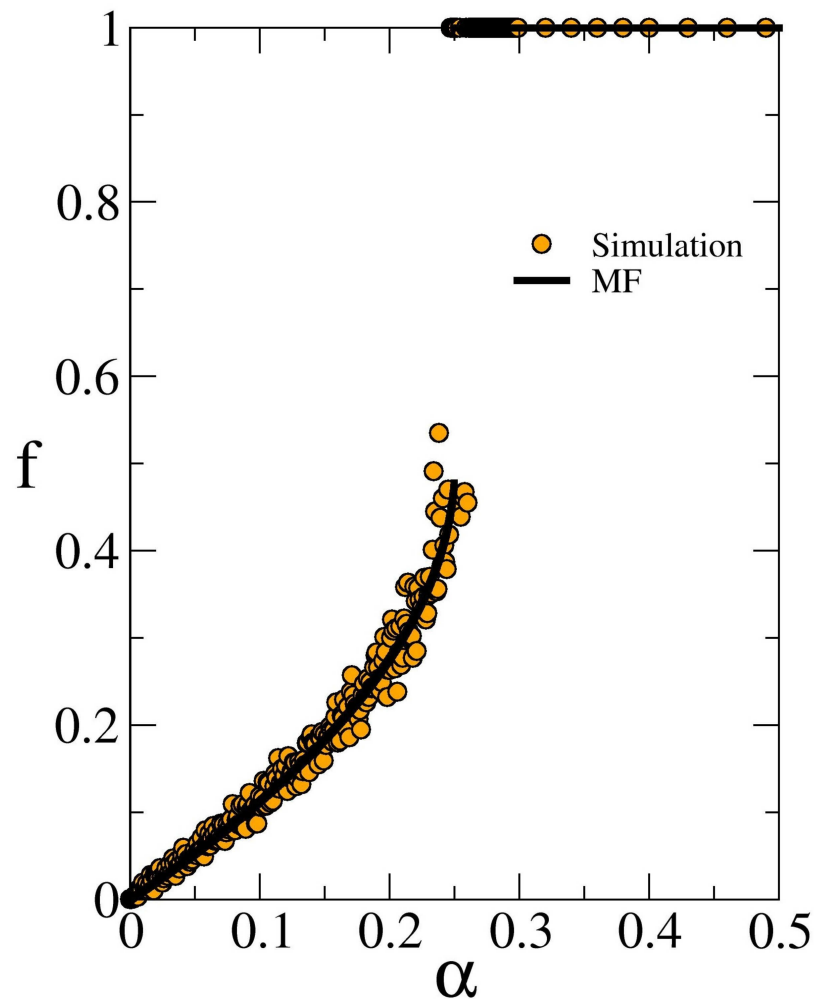


- following the fault: 5-15 min window to restore (N-1) condition (adjust generation, network reconfiguration etc)
- If another fault within 15 min window: operator intervention (time wasted!) and defence plans (e.g. load shedding, wide area monitoring and protection)
- Most blackouts happened due to multiple faults -> beyond the (N-1) reliability criterion

Janusz W. Bialek, CWPE 0407

Cambridge Working Papers in Economics

Mean Field model



Load per line I^t

Fraction of failed lines f^t

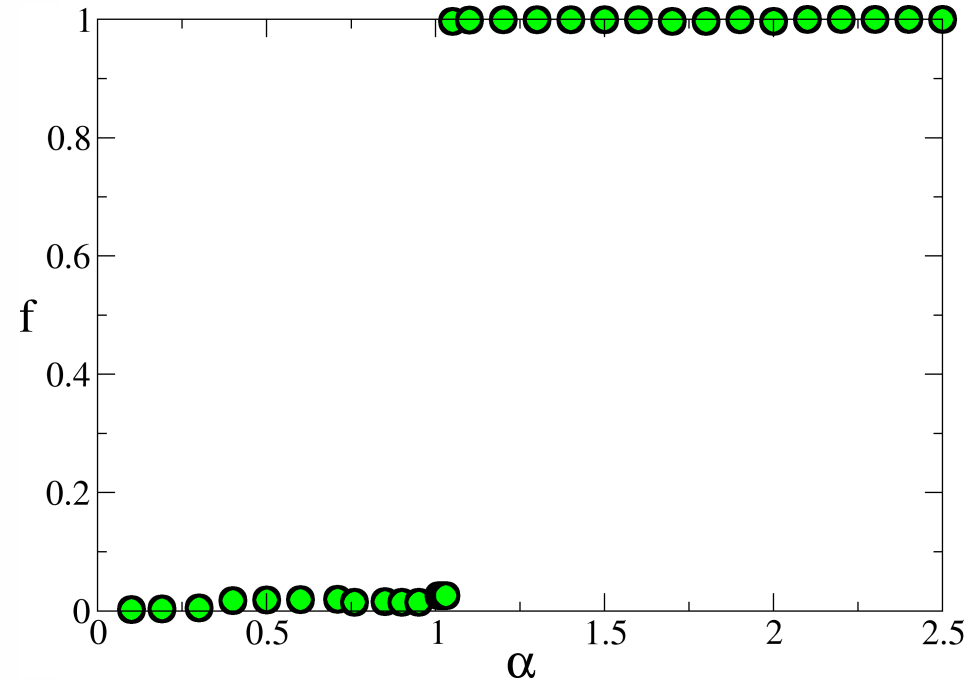
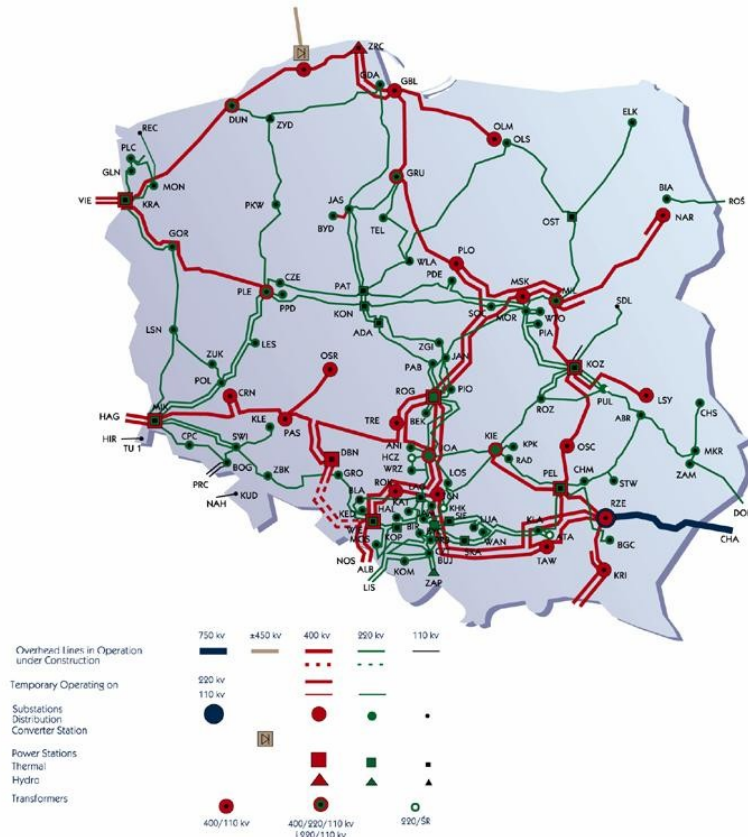
Number of survived lines M^t

Random thresholds $P(C)$

$$\begin{cases} I^{t+1} &= L/M^t \\ f^{t+1} &= P(I^{t+1}) \\ M^{t+1} &= (1 - f^{t+1}) M \end{cases}$$

$$f^{t+1} = P\left(\frac{L}{(1 - f^t) M}\right)$$

Polish Grid – Increasing Demand



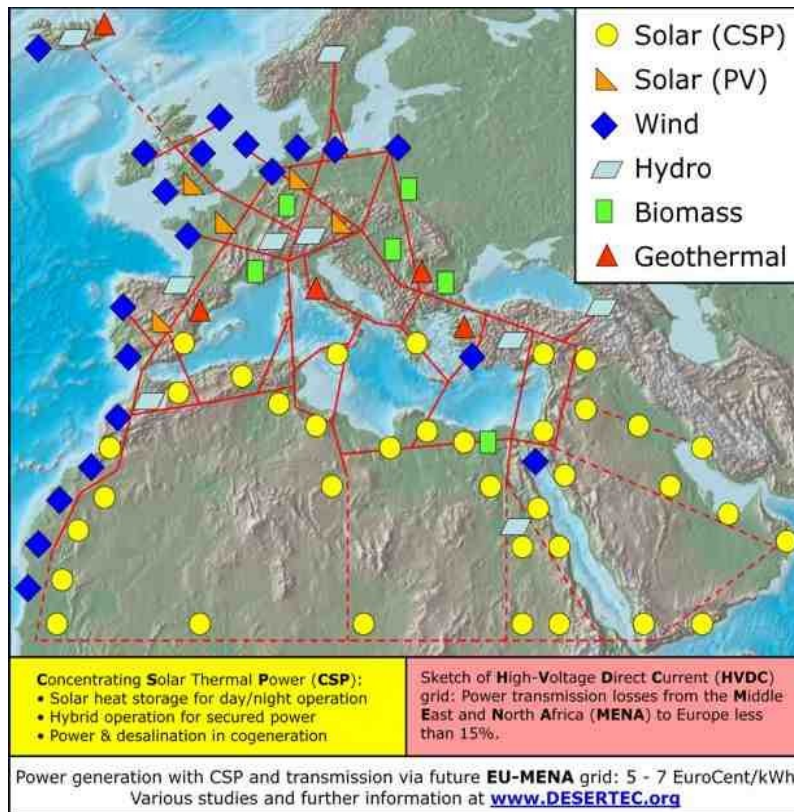
f : fraction of failed links

α : increase of demand

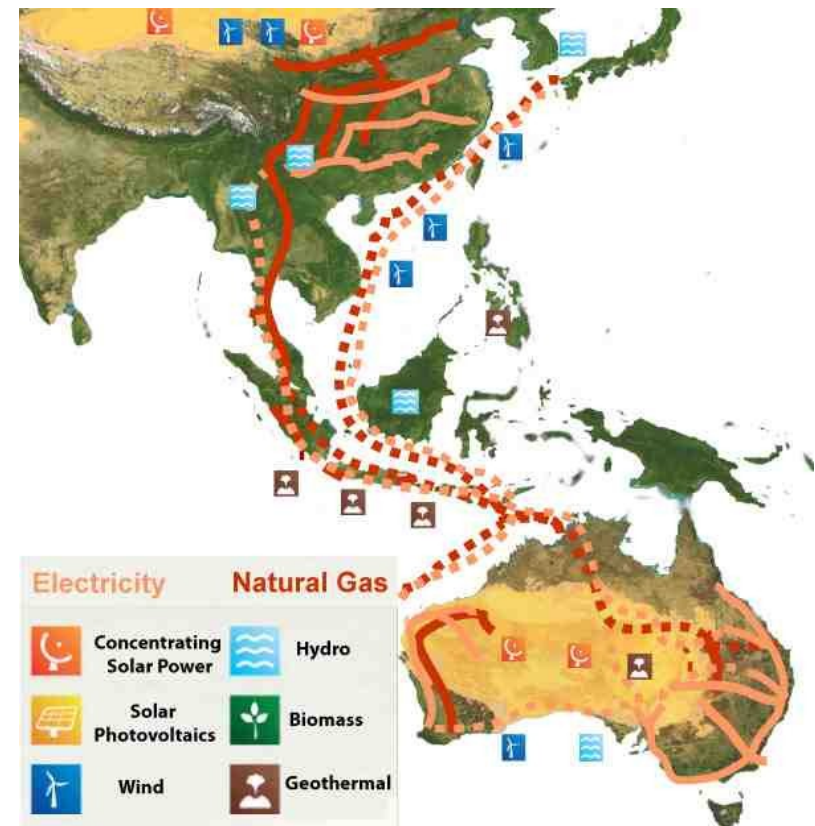
Abruptness of Cascade Failures in Power Grids
Scientific Reports 4 (3694)

Renewable Sources

Mega Grids



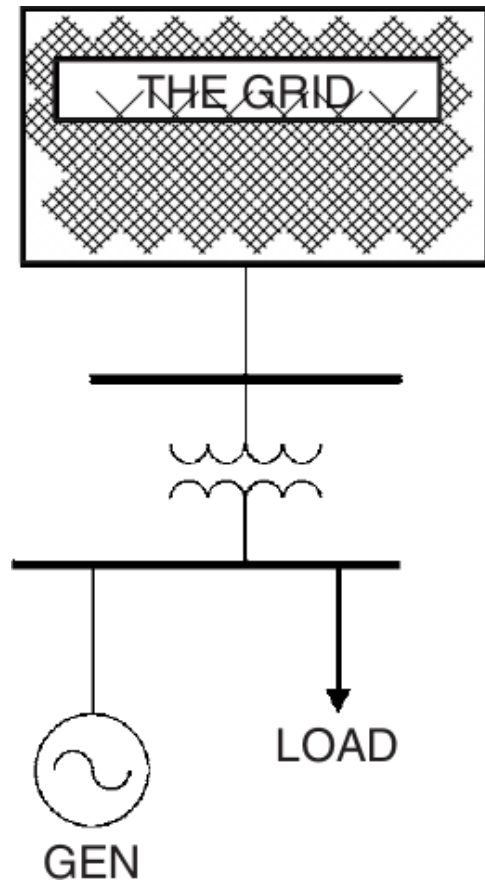
EU-MENA
(DESERTEC+AIRTRICITY)



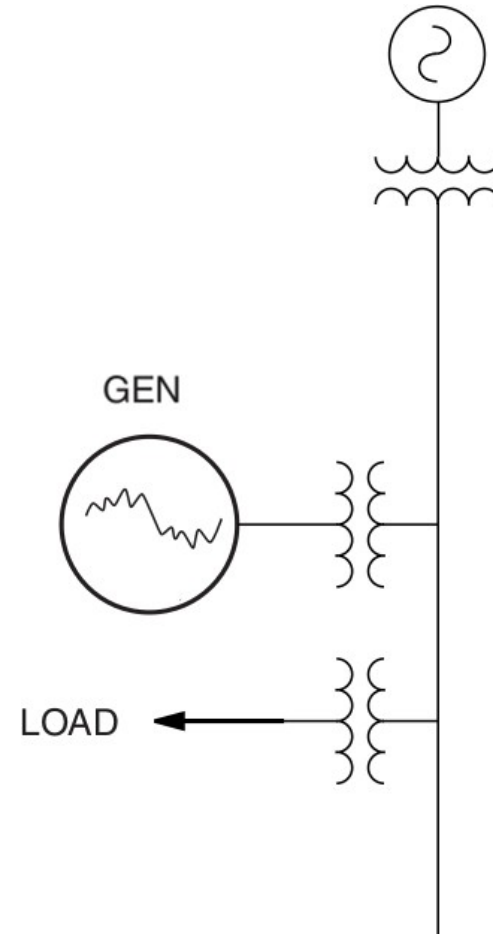
PAN ASIA
ENERGY INFRASTRUCTURES

Different perspectives

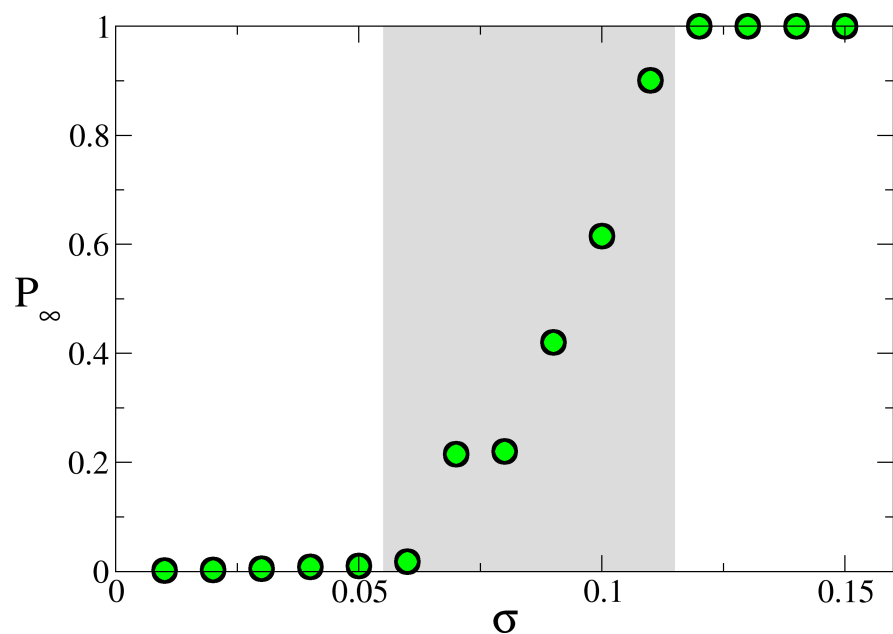
End User:
grid as an opportunity



Grid owner:
harmful perturbations

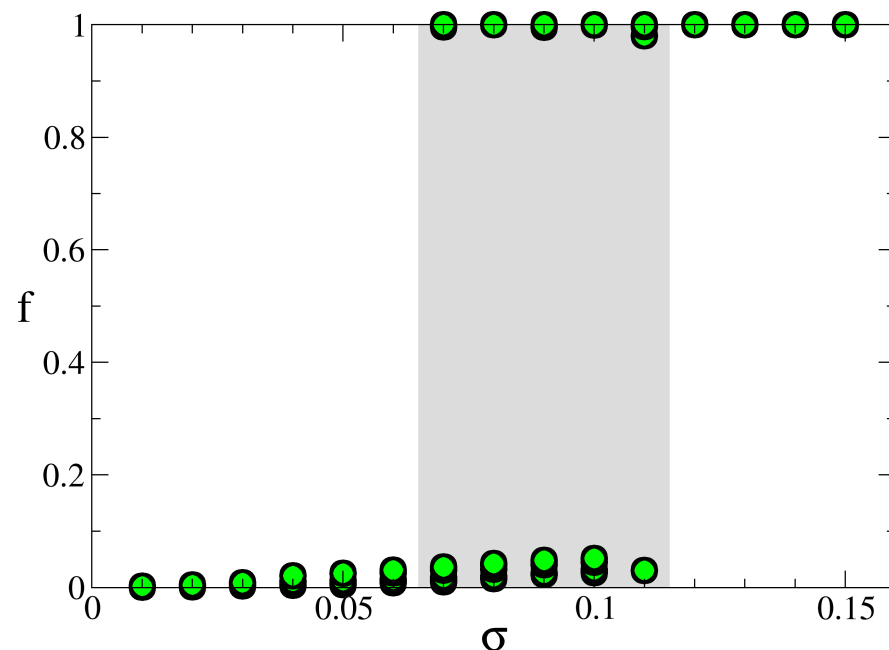


Polish Grid – with Renewables



P : probability of blackout

σ : magnitude of fluctuations



f : fraction of failed links

σ : magnitude of fluctuations

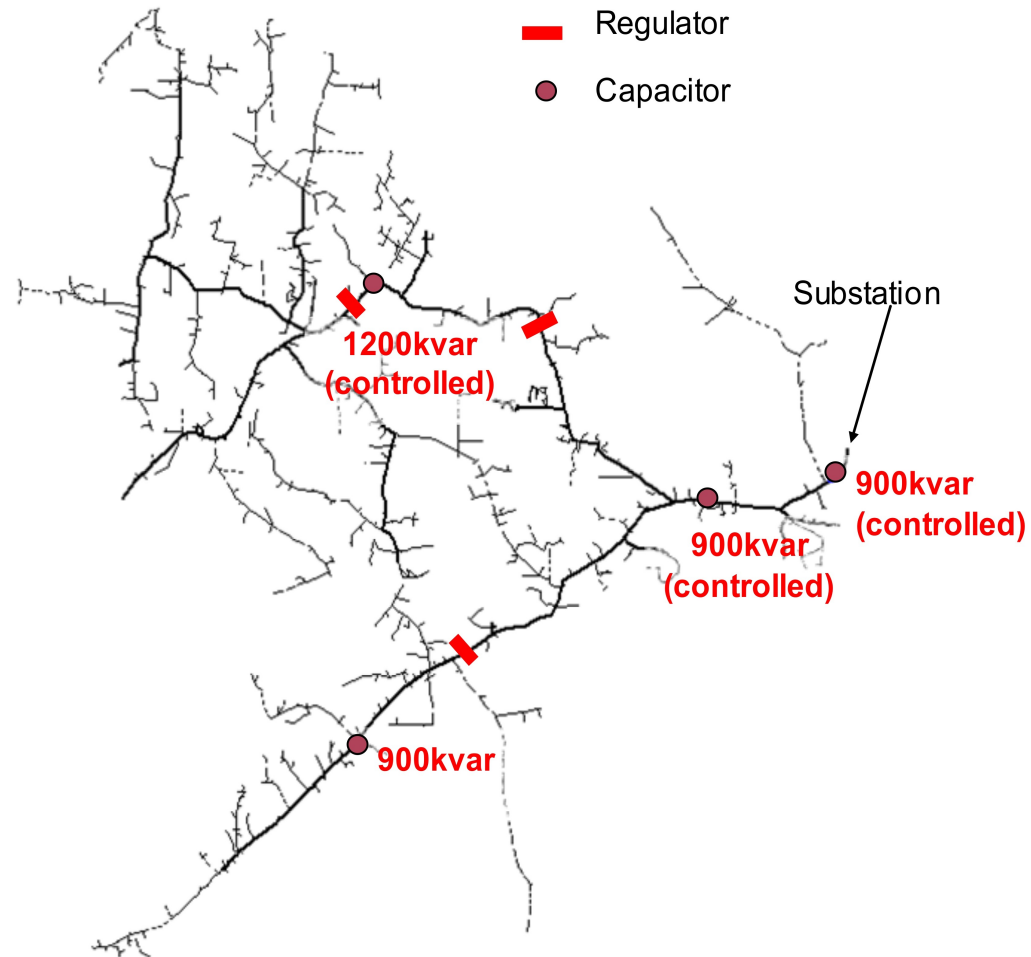
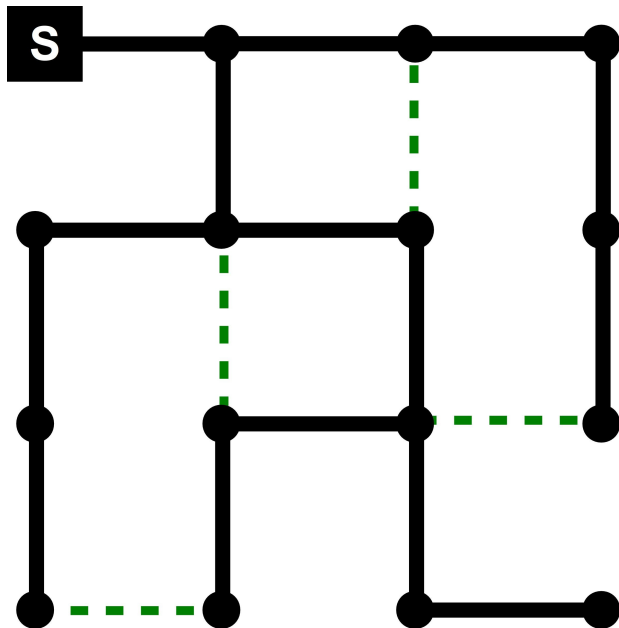
Blackout probability increases, yet single blackouts are abrupt!

Abruptness of Cascade Failures in Power Grids
Scientific Reports 4 (3694)

Smart Networks

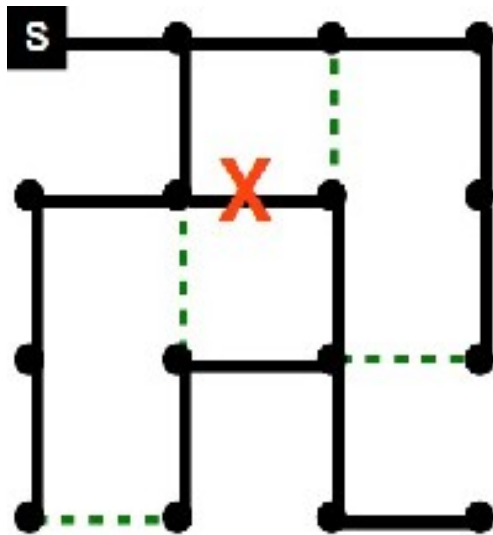
Self-Healing Networks: Redundancy and Structure
PLoS ONE 9 (2), e87986

Distribution networks

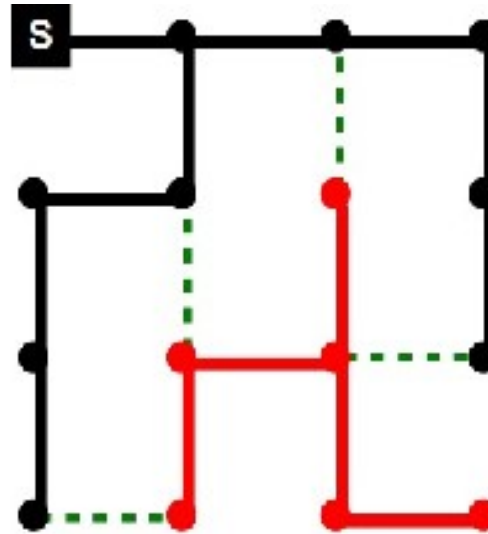


IEEE 9500 bus test feeder
(US, medium voltage)

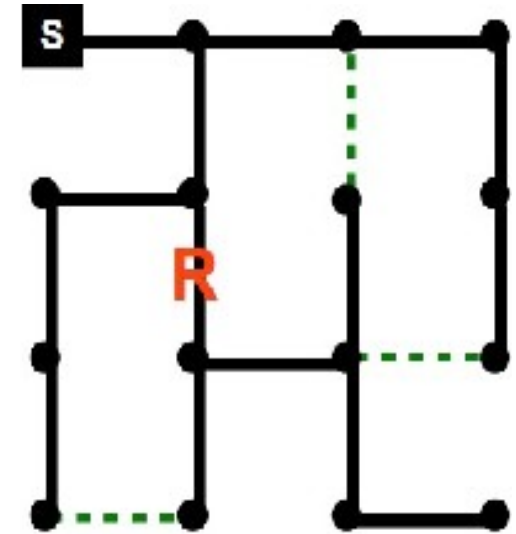
Self-healing Networks



(a) Initial configuration



(b) Link failure



(c) Recovered Network

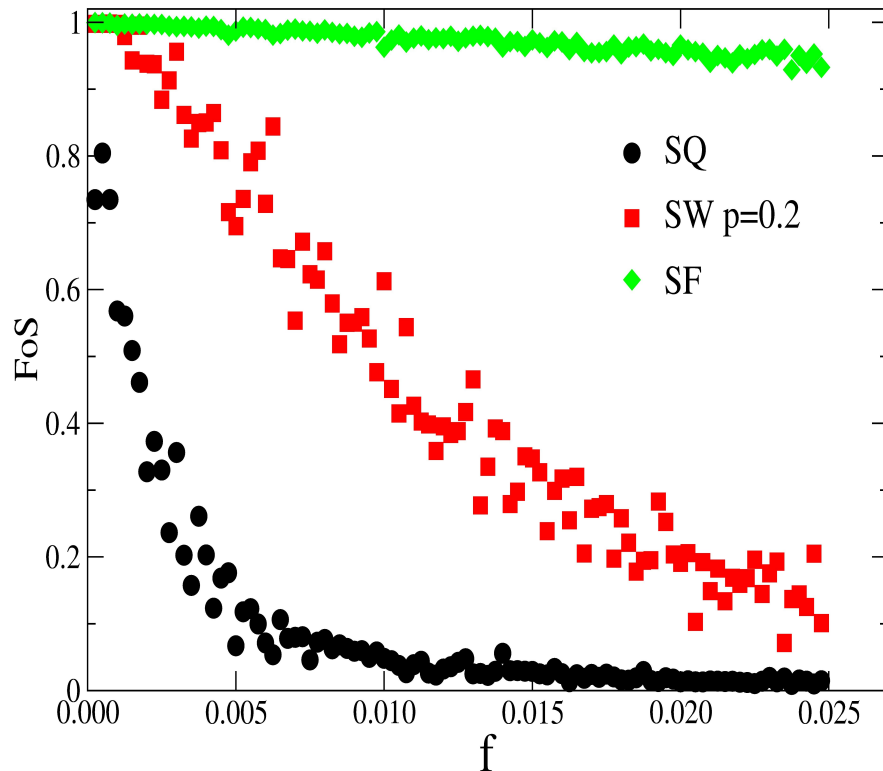
- Inspired by real distribution networks
- Routing Algorithms for Smart Networks

Self-Healing Networks: Redundancy and Structure
PLoS ONE 9 (2), e87986

Simulations

1. Generate a **host network** topology
2. Generate a **tree topology** on such network
3. Add a fraction **r** of recovery links
4. Delete a fraction **f** of active links
5. **Reconnect** the nodes using recovery links
6. Calculate the fraction **FoS** of connected nodes

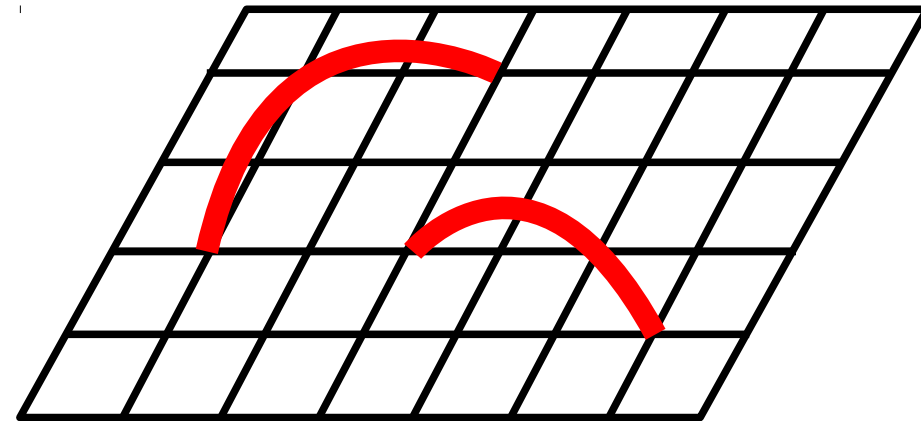
FoS = Fraction of Served nodes



SQ = Planar square lattice

SW = Small World

SF = Scale free



p = fraction of random
(long range) links added to
a regular lattice

Self-Healing Networks: Redundancy and Structure
PLoS ONE 9 (2), e87986

Cavity Method

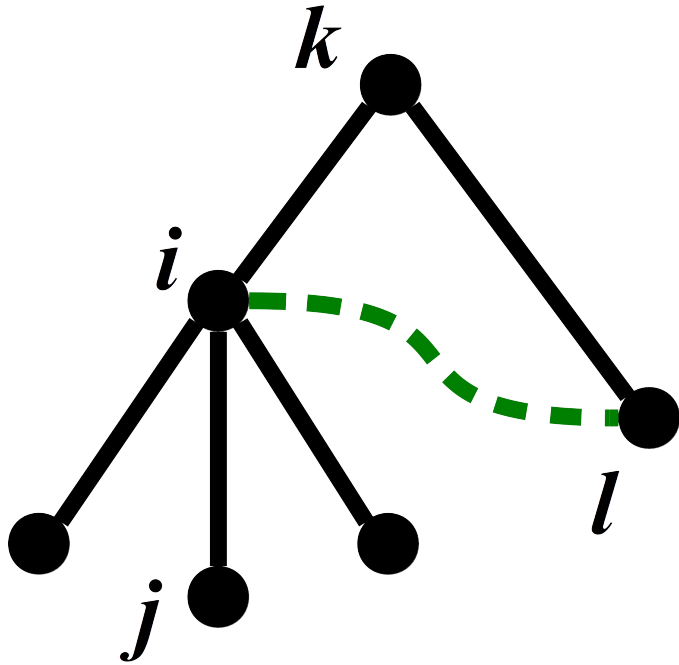
in preparation – **soon on arXiv:**

Cavity approach to Self-Healing

F Morone, H Makse, G Caldarelli and A Scala

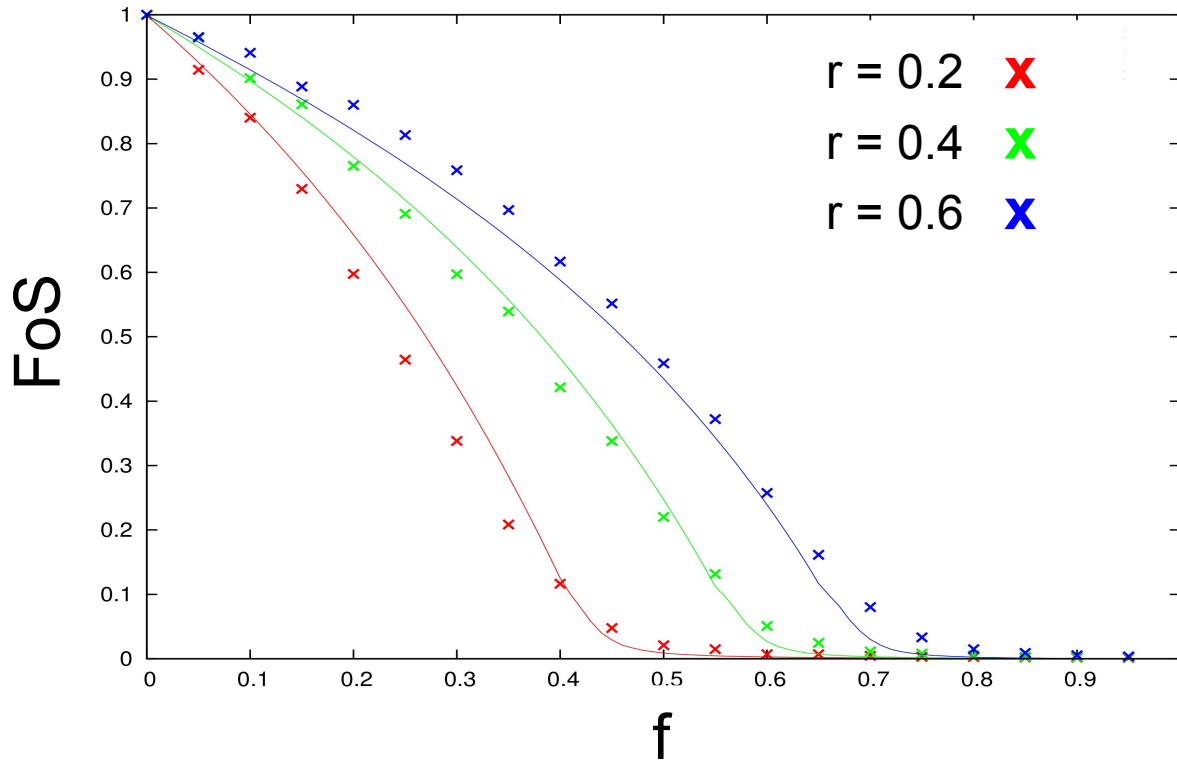
Message Passing & Cavity Equations

Self consistent equation set for:



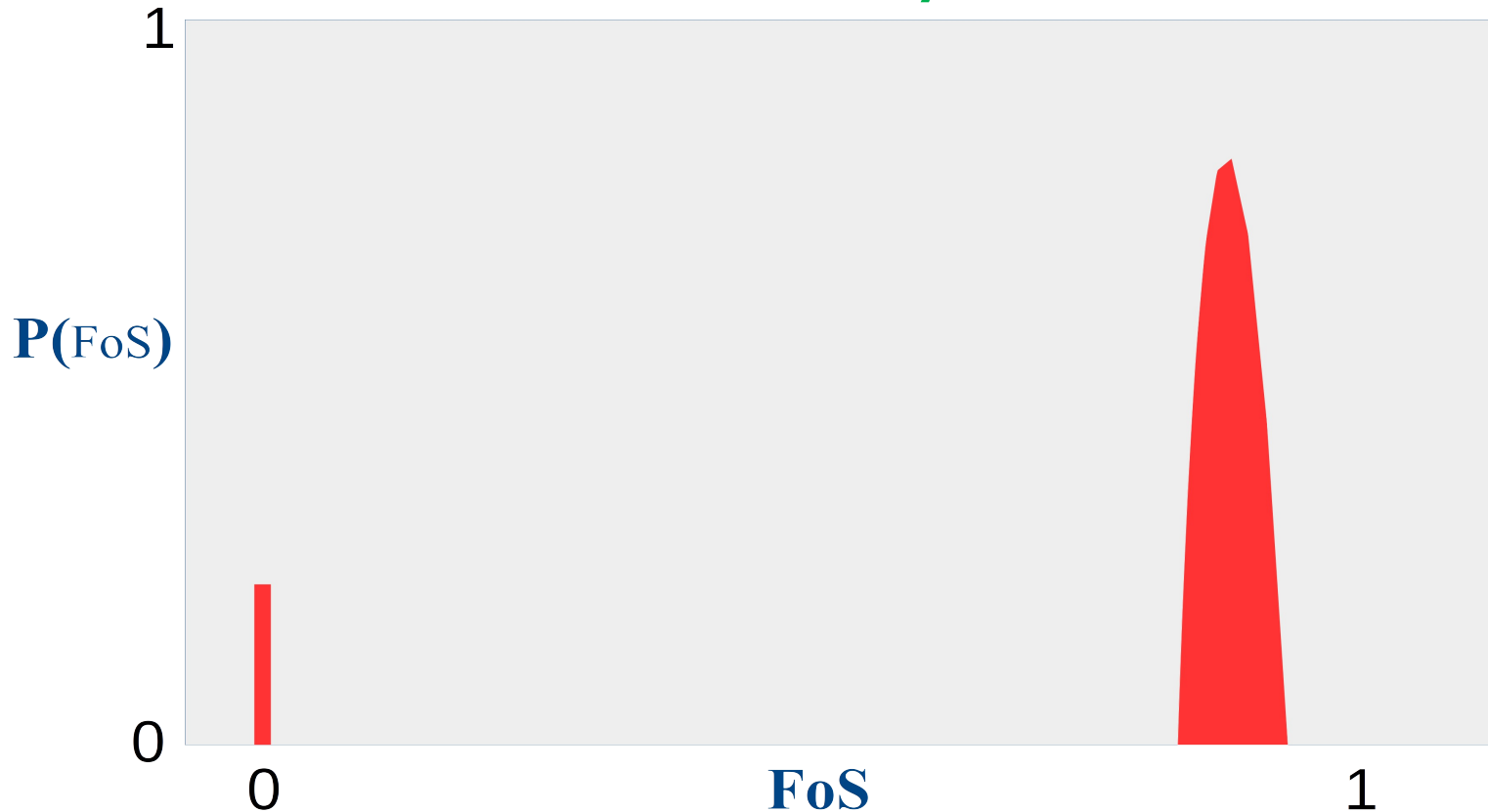
- $down_{ij}$ probability of being connected when son j fails
- up_{ik} probability of being connected when father k fails
- $redund_{il}$ probability of being connected when neighbour l fails

Simulations & theory



Self-consistent equations for messages running on the edges of the tree and on redundant edges

Corrections to the Cavity Method



Two kinds of events:

- Blackouts
- Percolation

Self-Healing Percolation

in preparation – soon on arXiv:

Self-Healing percolation

P Ballister, B Bollobas, G Caldarelli, W Quattrociocchi and A Scala

Self-Healing percolation

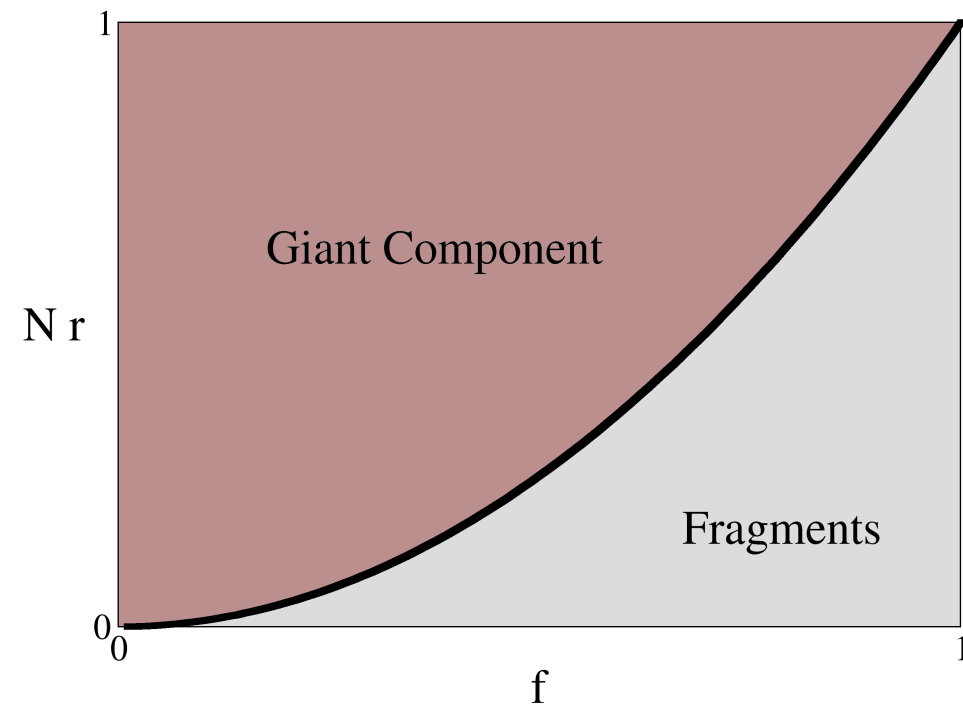
Given a network topology (distribution network)

- Fix a fraction **f** of failures
- Find the fraction **r** of recovery links at which appears a ***giant component***

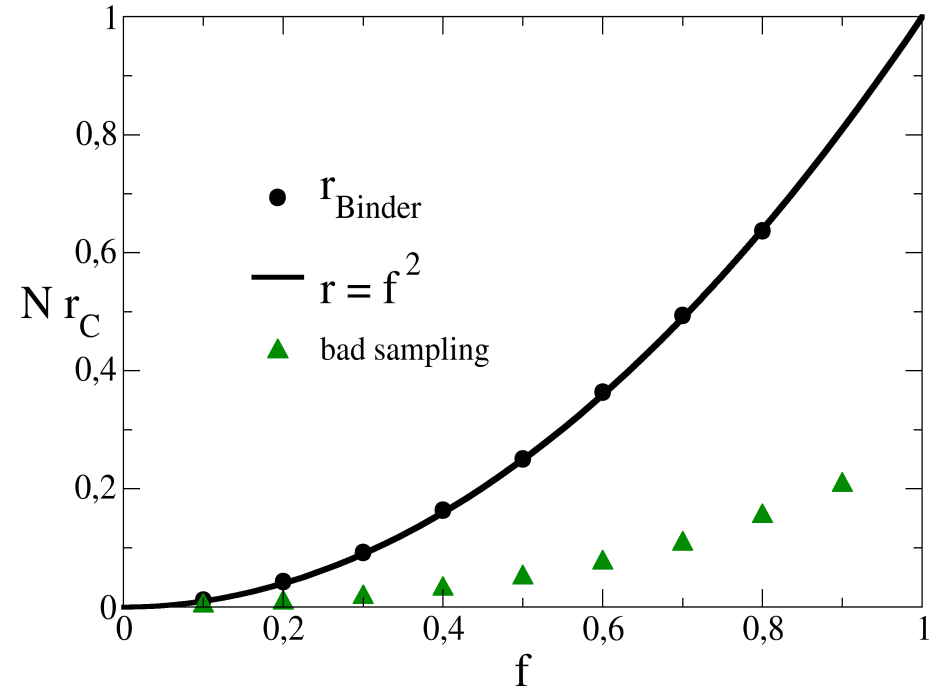
NOTICE: distribution network does not need to be a tree

Random Graph

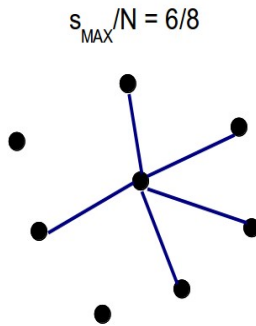
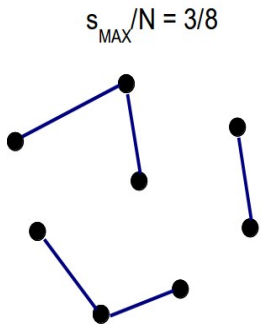
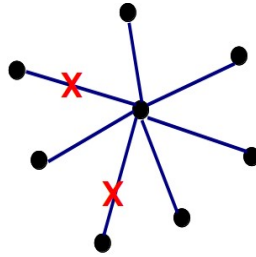
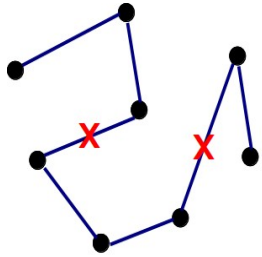
Random Graph (theory)



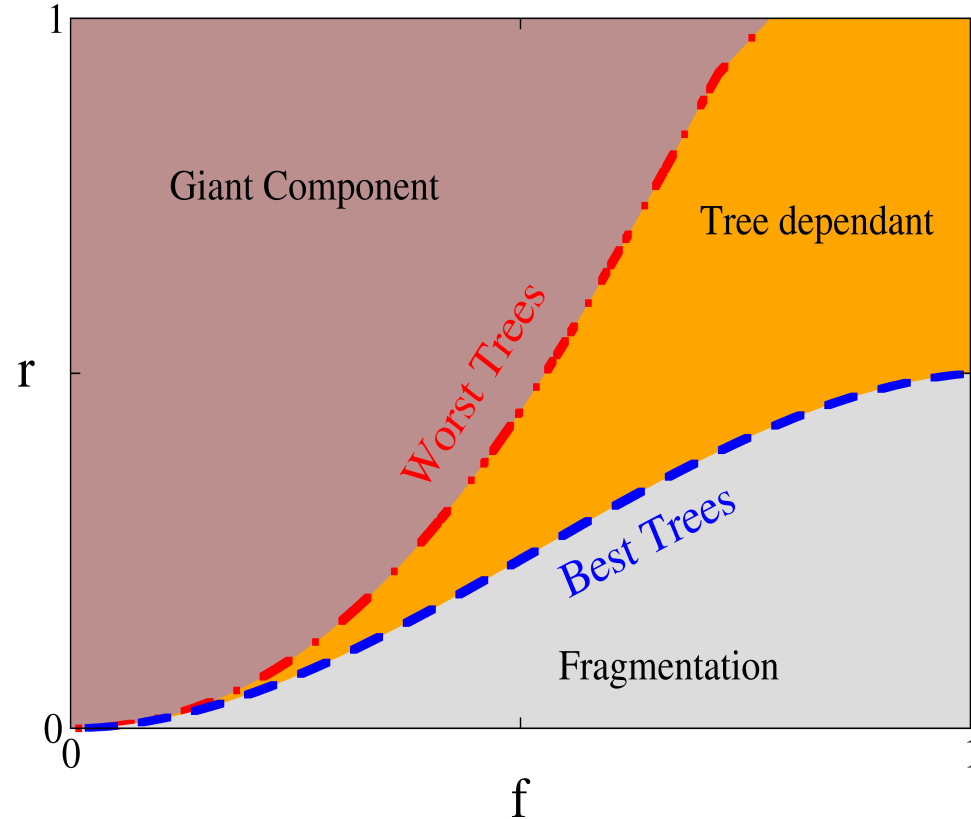
Random Graph (numerical)



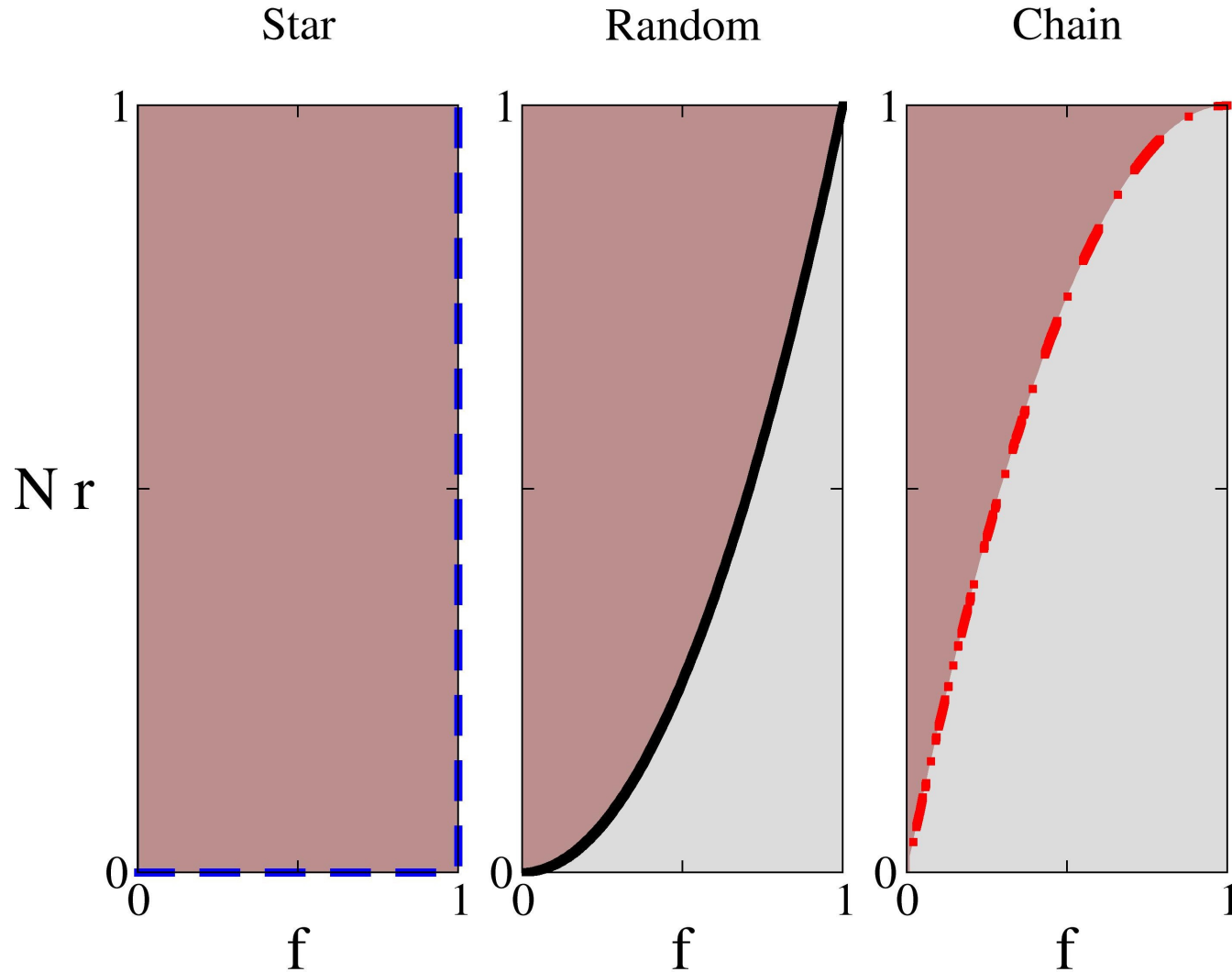
Topology of the distribution tree



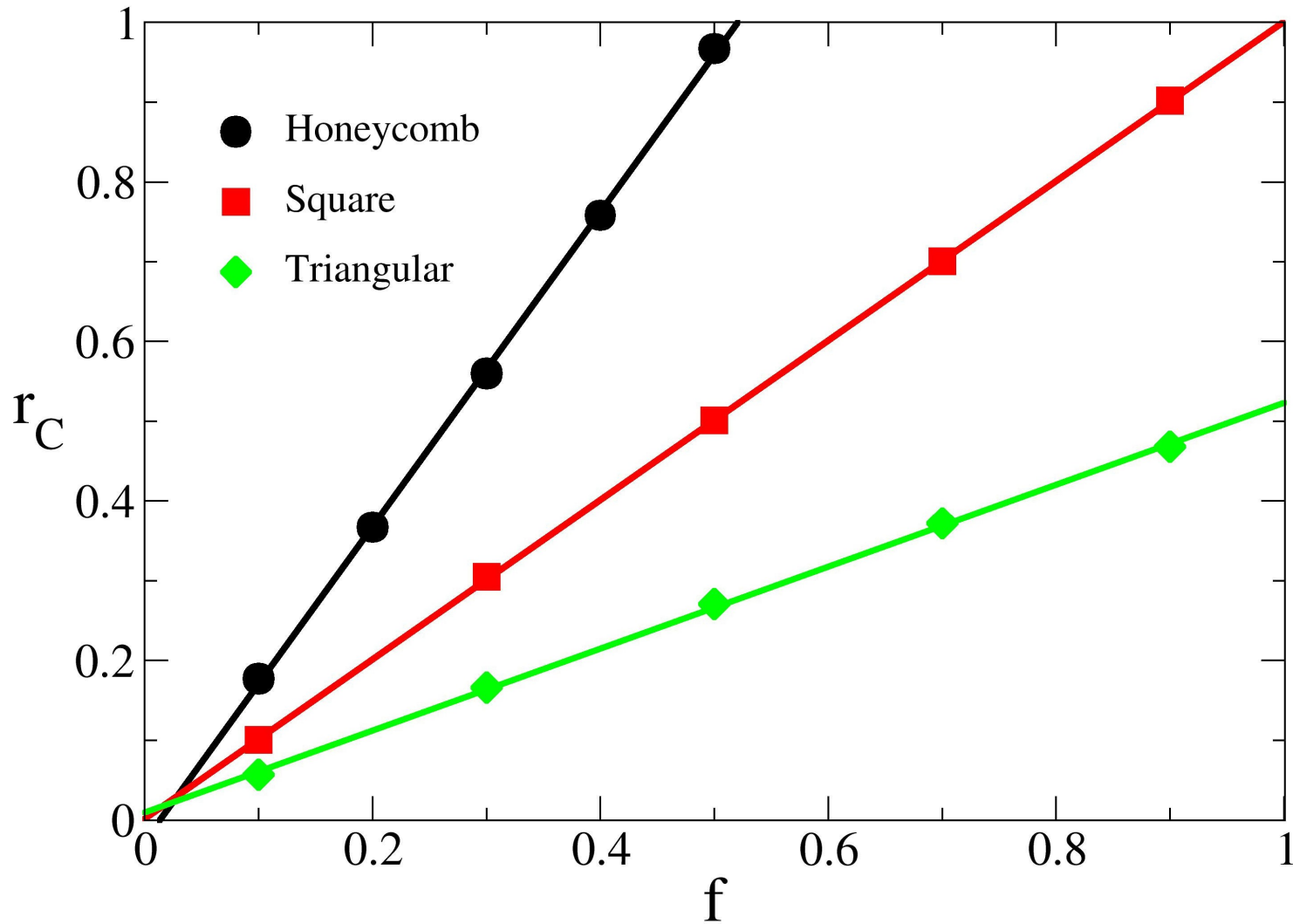
- Chain is the most fragile
- Star is the most robust



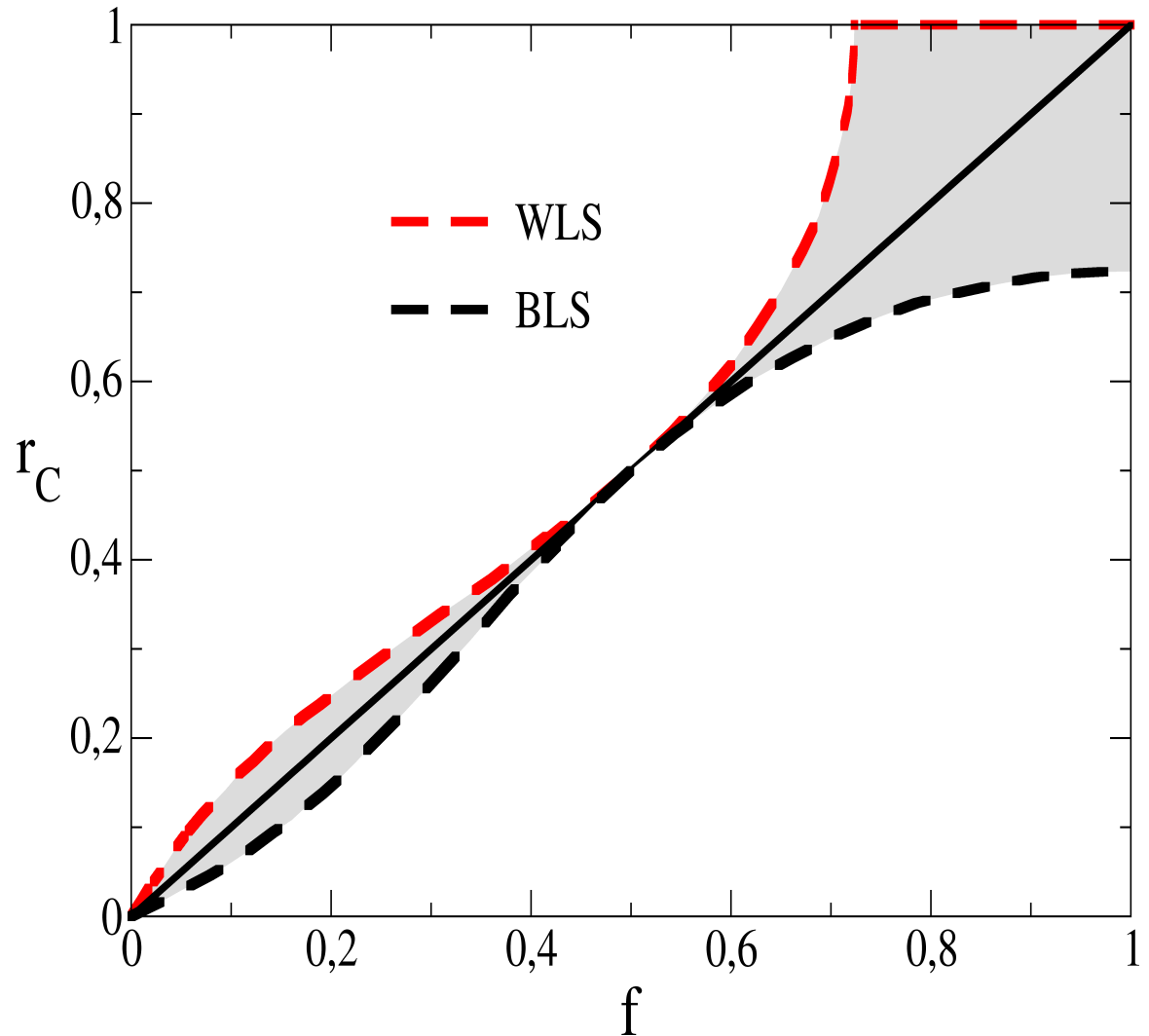
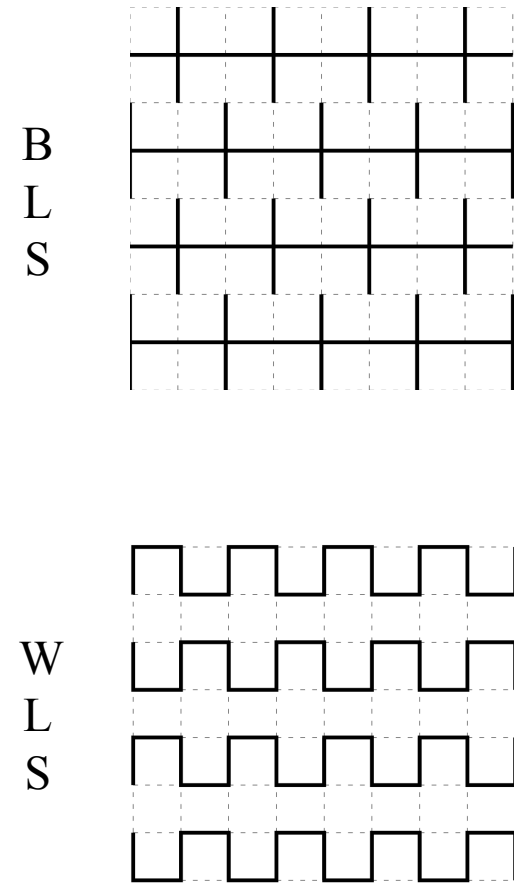
Best/Worst trees for ER graphs



Planar lattices



Optimal trees on SQ lattice



Conclusions

- Statistical Mechanics can spot possible sources of systemic risks in large power grids
- “Smartness” could be accomplished customizing “on the market” routing protocols

THANKS TO:

- CNR-PNR National Project Crisis-Lab
- FP7 project MULTIPLEX - Foundational Research on MULTIllevel comPLEX networks and systems
- H2020 project DOLFINS - Distributed Global Financial Systems for Society
- EU HOME/CIPS project CI2C “Critical Infrastructures and Cloud Computing: understanding cross-sectorial criticalities and security practices”