

Discontinuous Percolation

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Simulations in Physics and beyond**

Moscow, September 6-10, 2015

Collaborators



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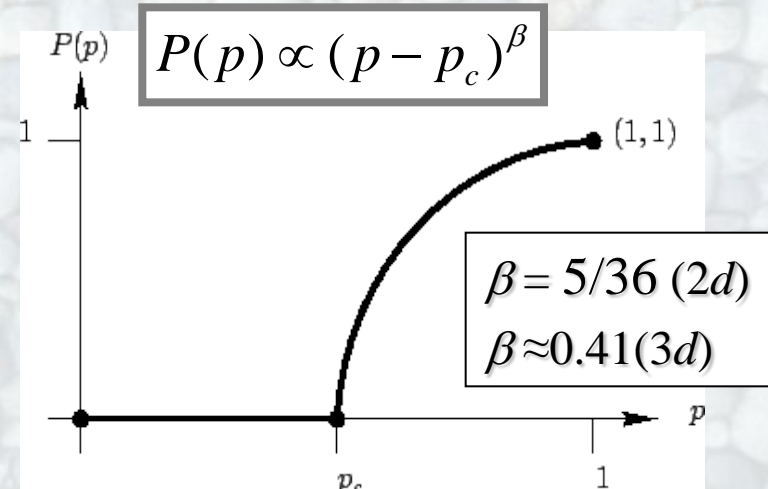
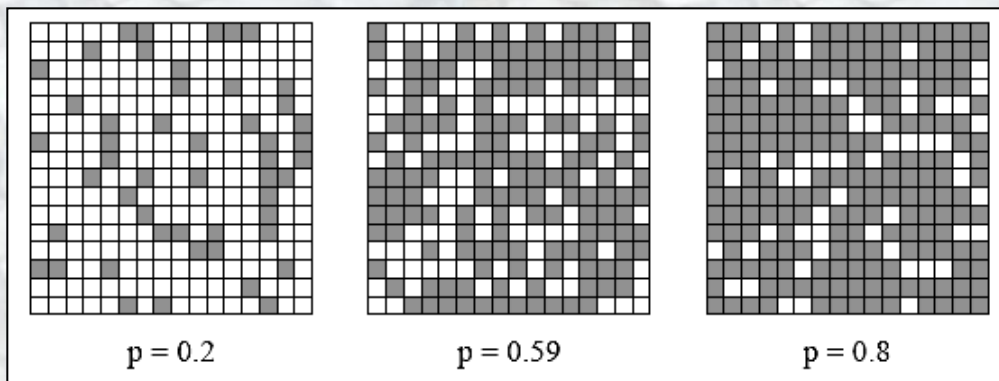


Peter Grassberger

Classical Percolation

Site percolation on the square lattice: $P(p)$ = fraction of sites in the largest cluster

Occupy randomly sites with probability p .



Neighboring occupied sites are „**connected**“ and belong to the same **cluster**.

Above a critical threshold p_c one has a **spanning cluster**.

The phase transition is continuous (of second order)
with universal critical exponents.

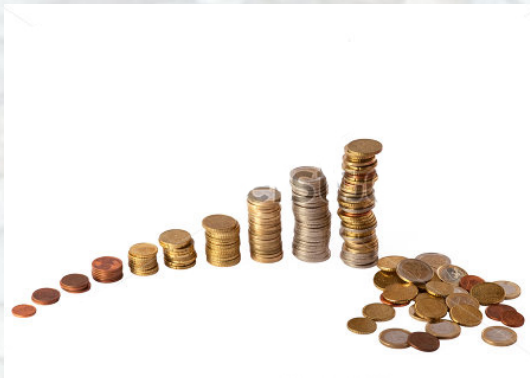
Quest for First Order Transition



Breaking of a dam

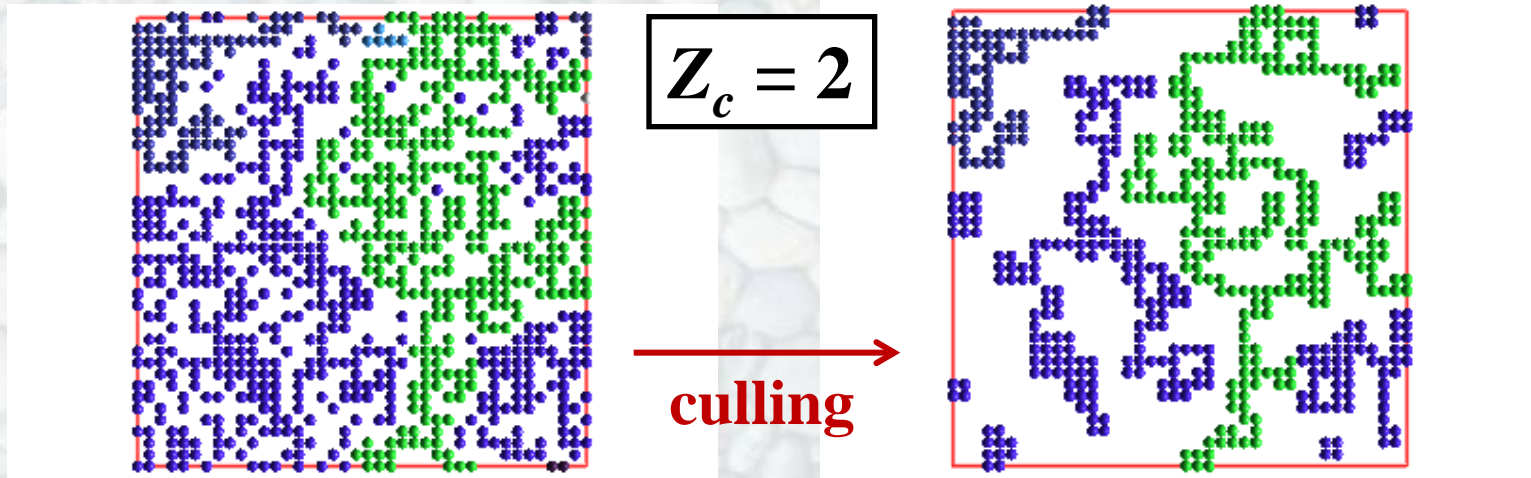


Volcano eruption



Financial bubble

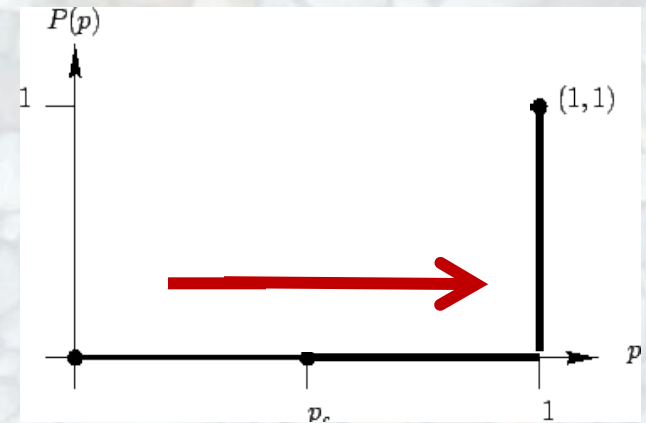
Bootstrap Percolation



The transition is first order (at $p_c = 1$)
on simple cubic and triangular lattice

when $Z_c \geq 4$

and on square lattice when $Z_c \geq 3$.



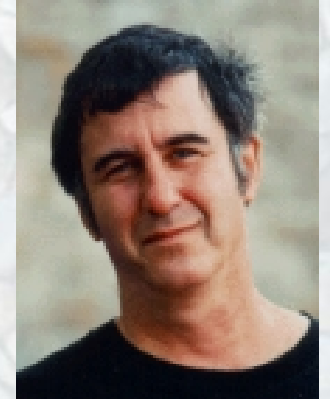
The Saga of Explosive Percolation



Dimitris Achlioptas



Raissa D'Souza



Joel Spencer

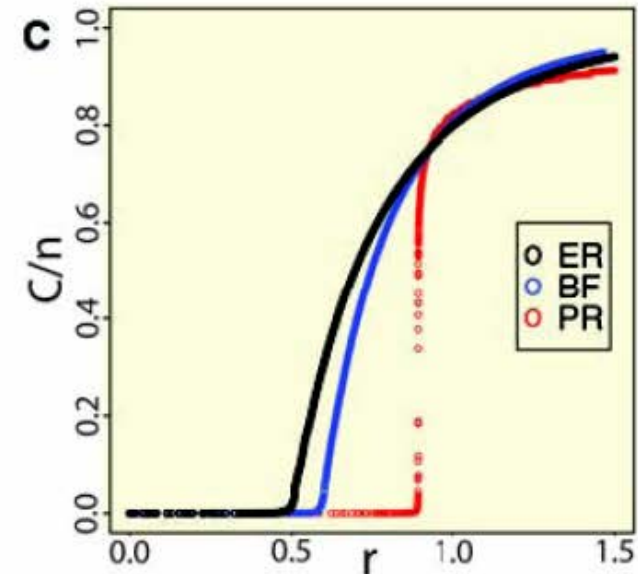
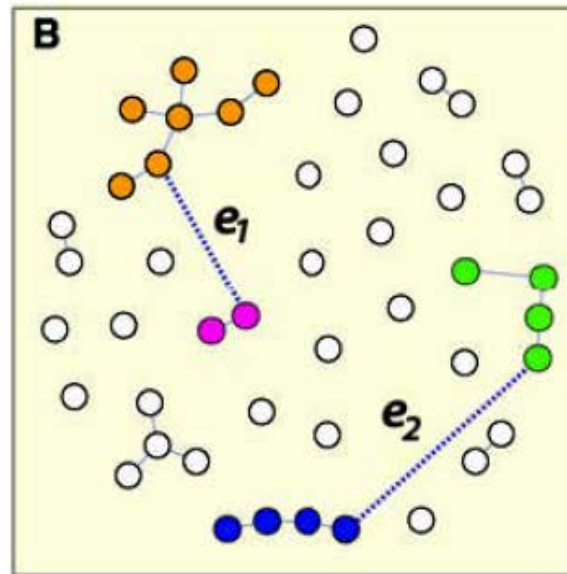
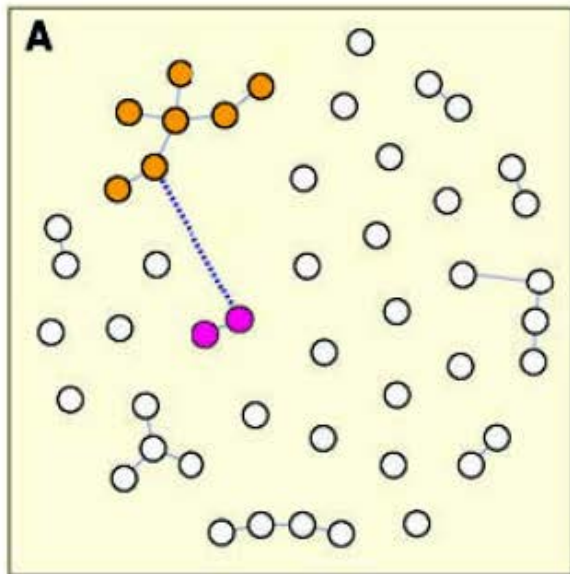
D. Achlioptas, R. M. D'Souza and J. Spencer, Science 323, 1453 (2009)

Product Rule (PR)

- Consider a fully connected graph.
- Select randomly two bonds and occupy the one which creates the smaller cluster.

classical percolation

product rule



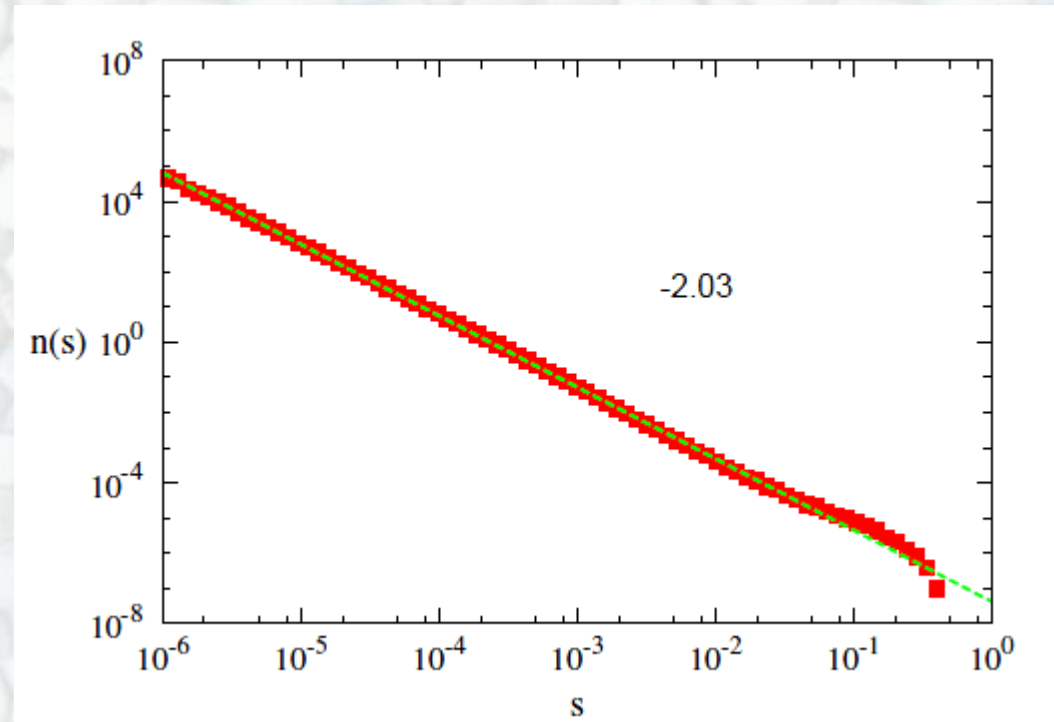
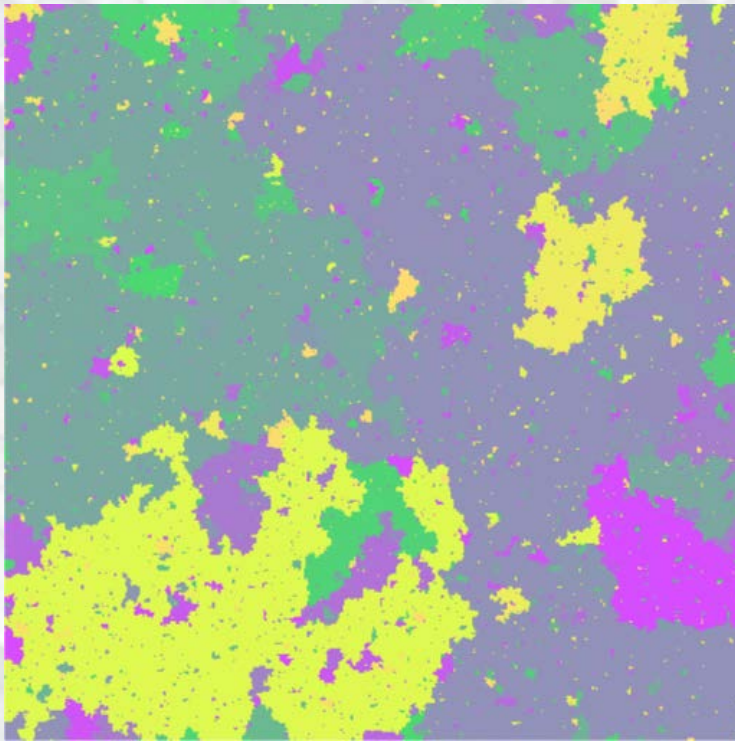
D. Achlioptas, R. M. D'Souza and J. Spencer, Science 323, 1453 (2009)

Product Rule (PR)

cluster size distribution n_s

on the square lattice:

$$n_s \propto s^{-\tau}$$



Y. S. Cho et al., Phys. Rev. E 82, 042102 (2010)

However, ...

Transition continuous in thermodynamic limit

J. Nagler, A. Levina and T. Timme, Nature Phys. 7, 2645 (2010)

O. Riordan and L. Warnke, Science, 333, 322 (2011)

R. A. da Costa, S. N. Dorogovtsev, A. V. Goltsev, and J. F. F. Mendes, Phys. Rev. Lett., 105, 255701 (2010)

But what happens in finite dimension ??

Best-of- m Model



José Soares Andrade Jr.

- Select randomly m bonds and occupy the one which creates the smaller cluster

**This is a straightforward generalization of the Product Rule which corresponds to $m = 2$.
 $m = 1$ is classical percolation.**

Best-of- m Model

$$\chi = \sum_i s_i^2$$

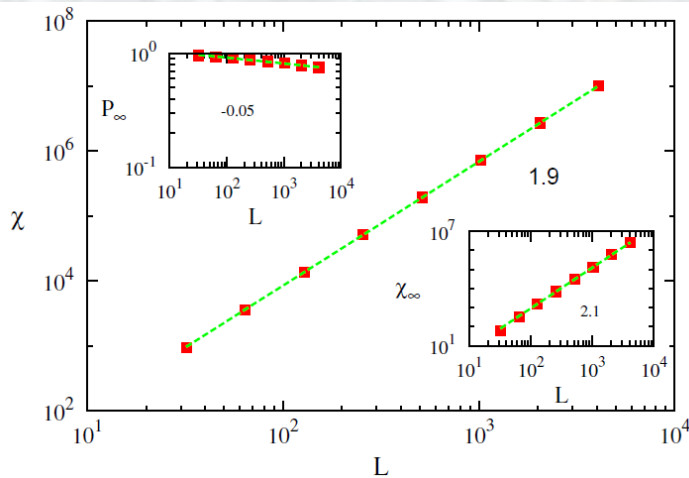
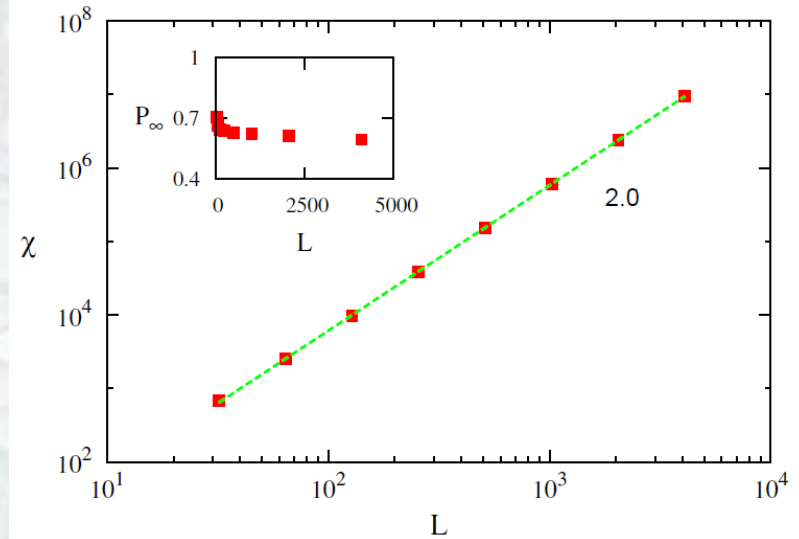
$$P_\infty = s_{\max} / N$$

$$\chi_\infty = \sqrt{\langle s_{\max}^2 \rangle - \langle s_{\max} \rangle^2}$$

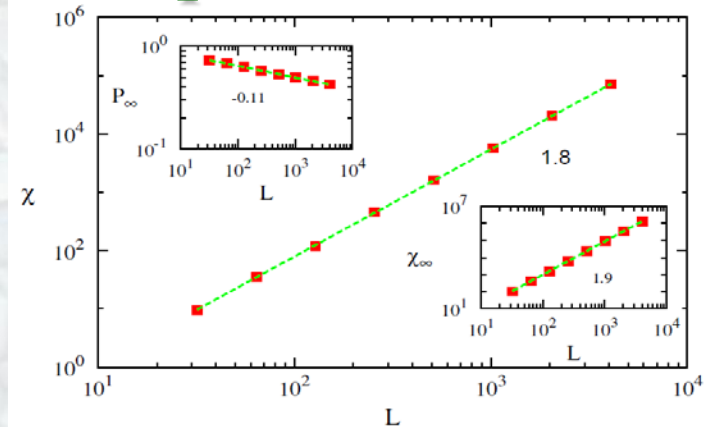
$m = 10$

at p_c on square lattice

$m = 2$



classical percolation

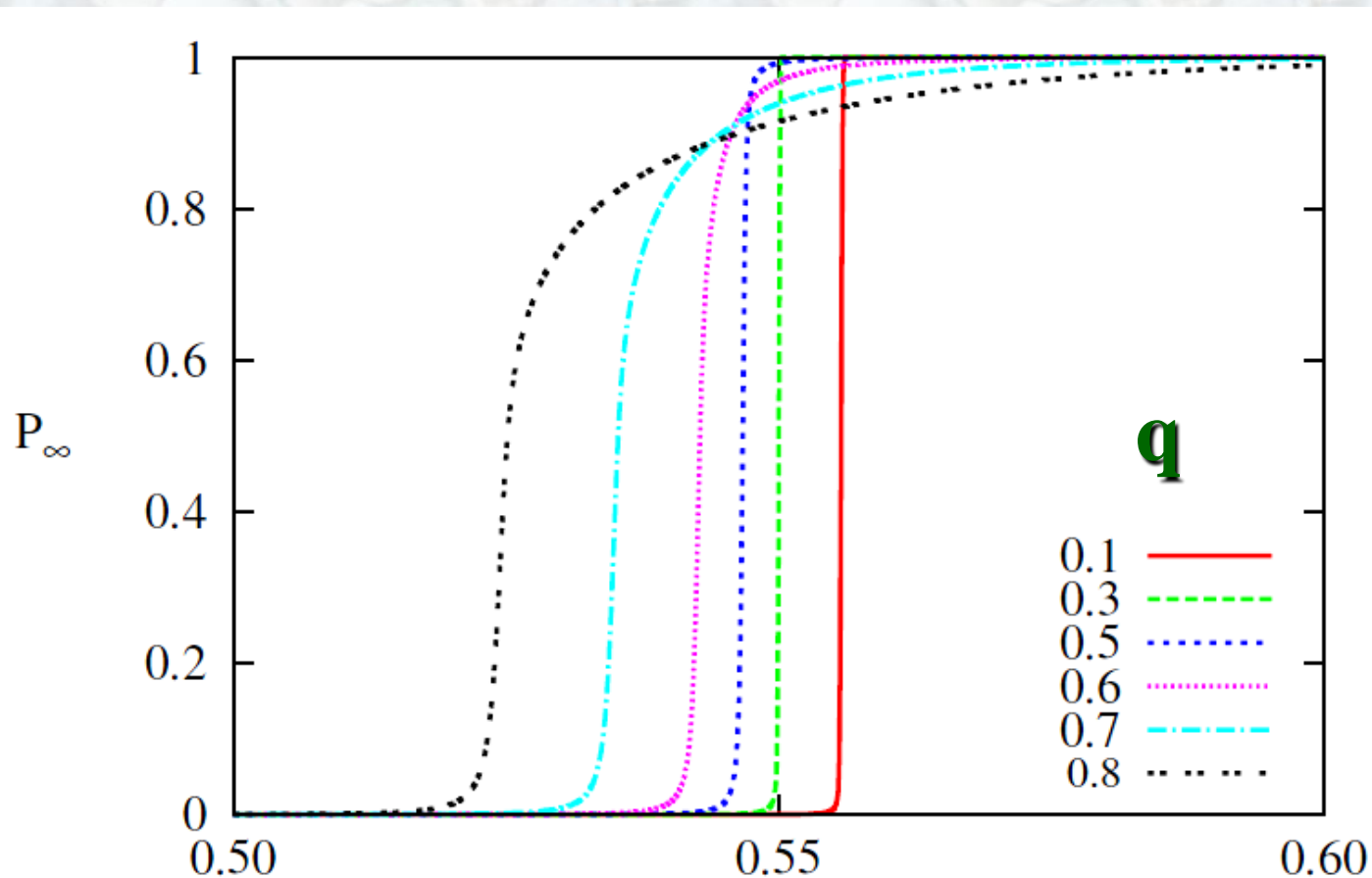


Mixing $m = 10$ with $m = 1$



Bob Ziff

q is the fraction of $m = 1$ bonds

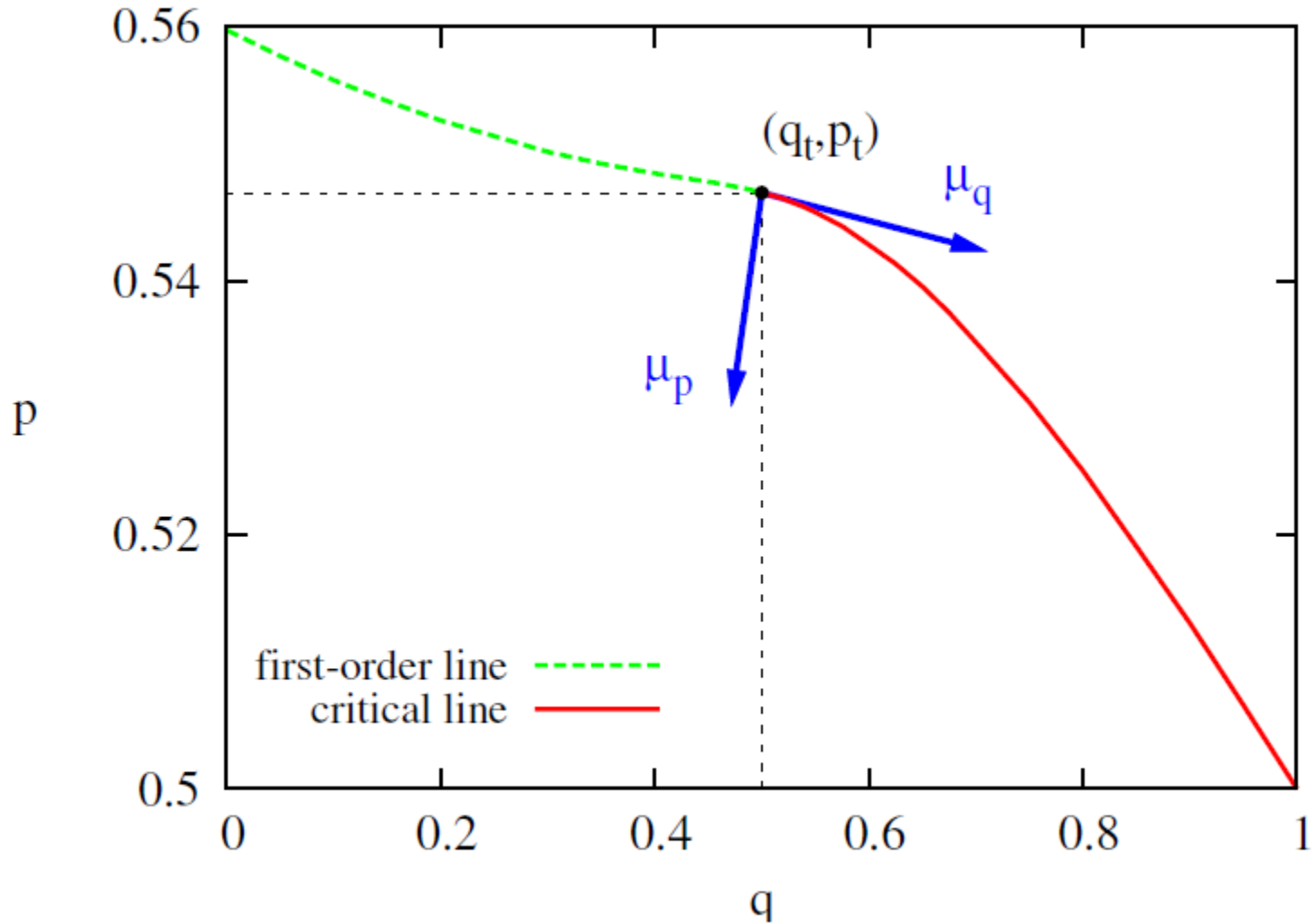


N. A. M. Araújo, J. S. Andrade Jr., R. M. Ziff, and HJH, Phys.Rev.Lett. 106, 095703 (2011)

CSP 2015, Moscow, September 6-10, 2015

Mixing $m = 10$ with $m = 1$

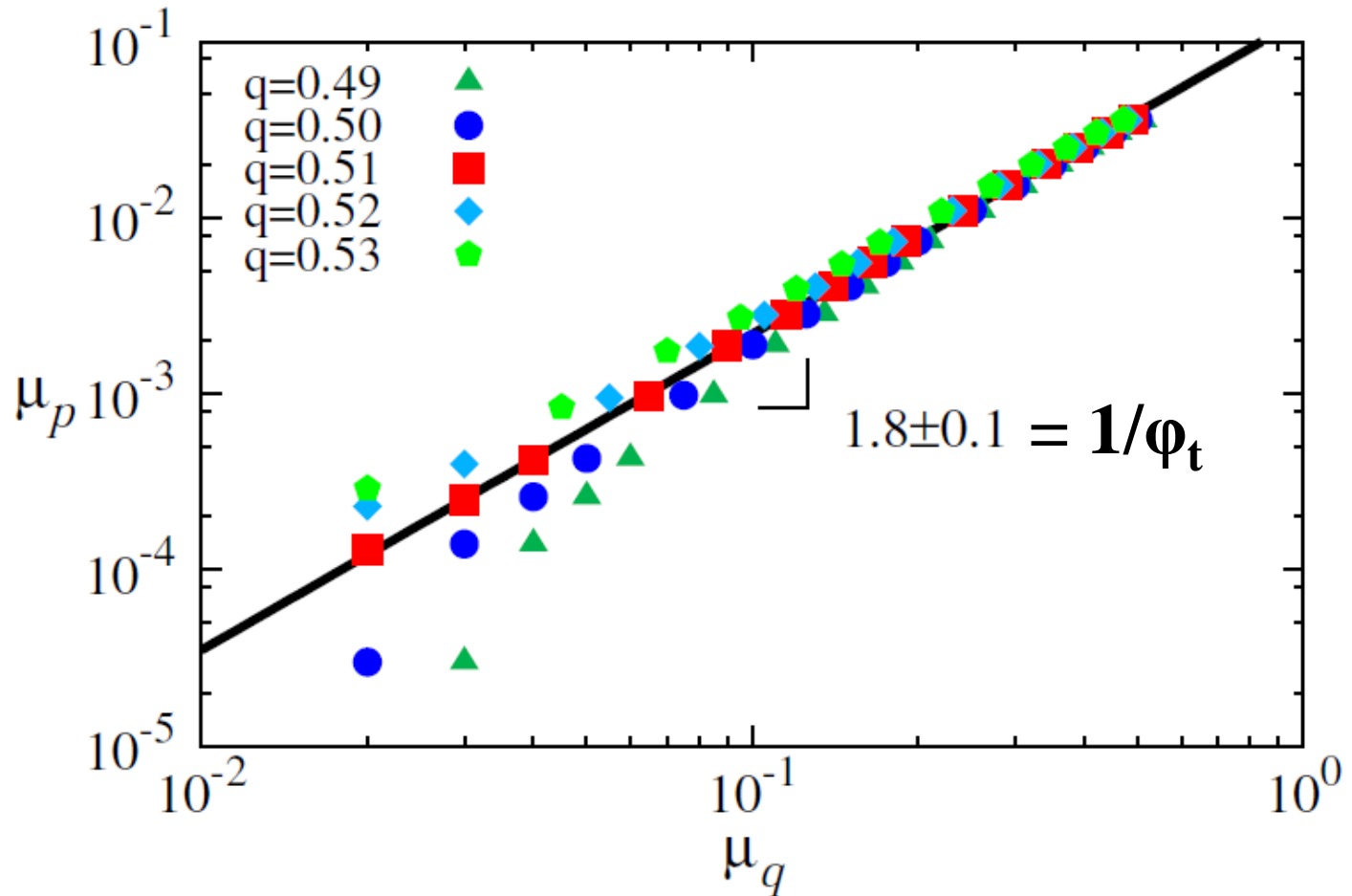
**tricritical
point**



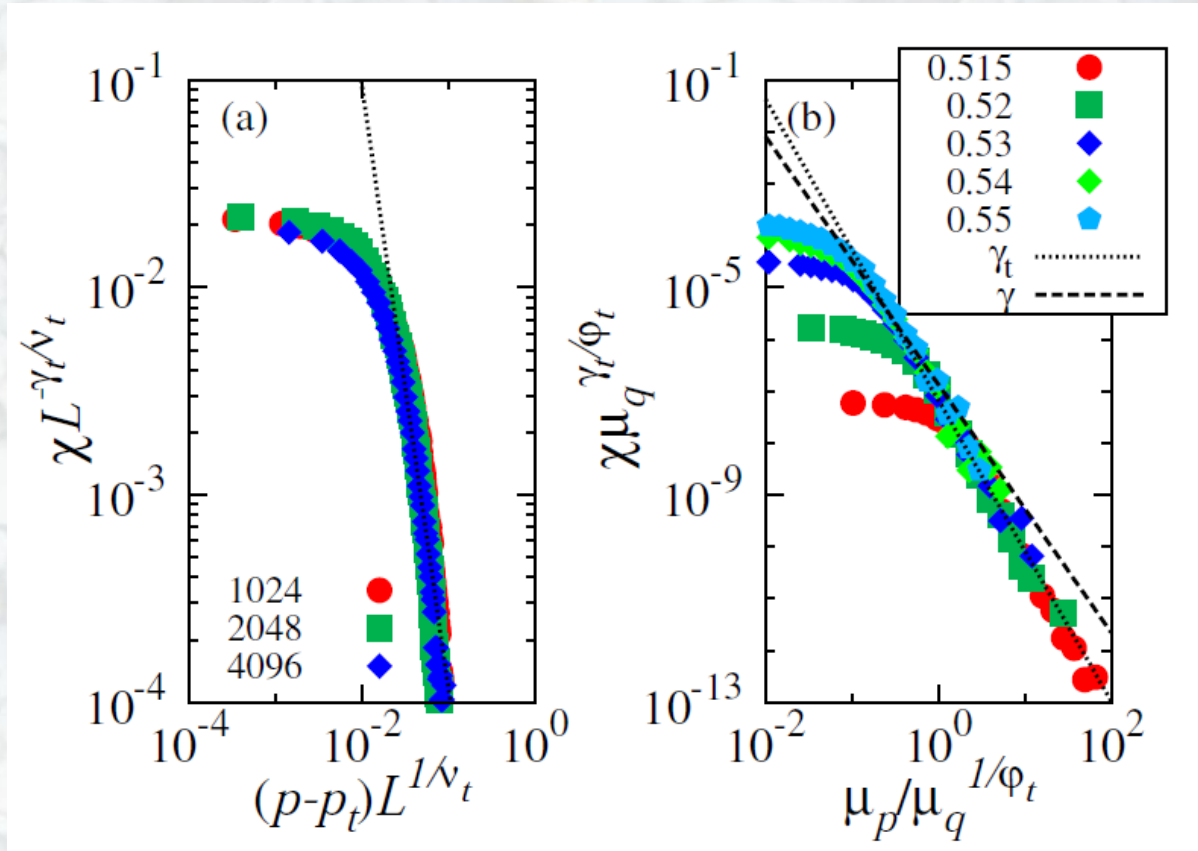
Mixing $m = 10$ with $m = 1$

tricritical scaling

$$\mu_p \propto \mu_q^{\frac{1}{\varphi_t}}$$



Mixing $m = 10$ with $m = 1$



**tricritical
scaling**

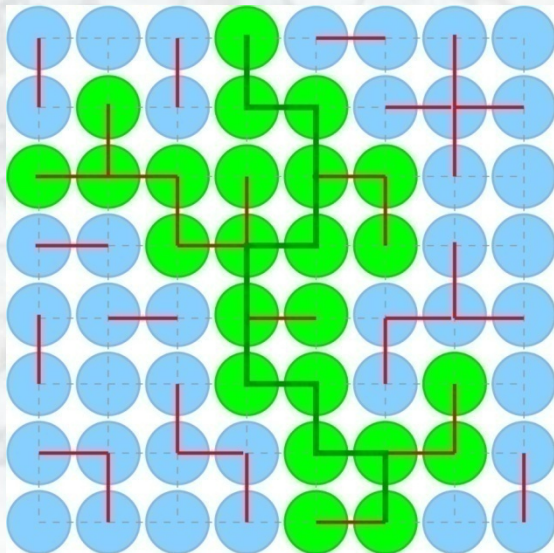
$$\chi = L^{\frac{\gamma_t}{\nu_t}} \mathcal{F} \left[(p - p_c) L^{\frac{1}{\nu_t}} \right]$$

$$\chi(\mu_p, \mu_q) = \mu_q^{-\frac{\gamma_t}{\phi_t}} \mathcal{F}_{cross} \left[\mu_p \mu_q^{\frac{1}{\phi_t}} \right]$$

Largest Cluster Model



Nuno Araújo



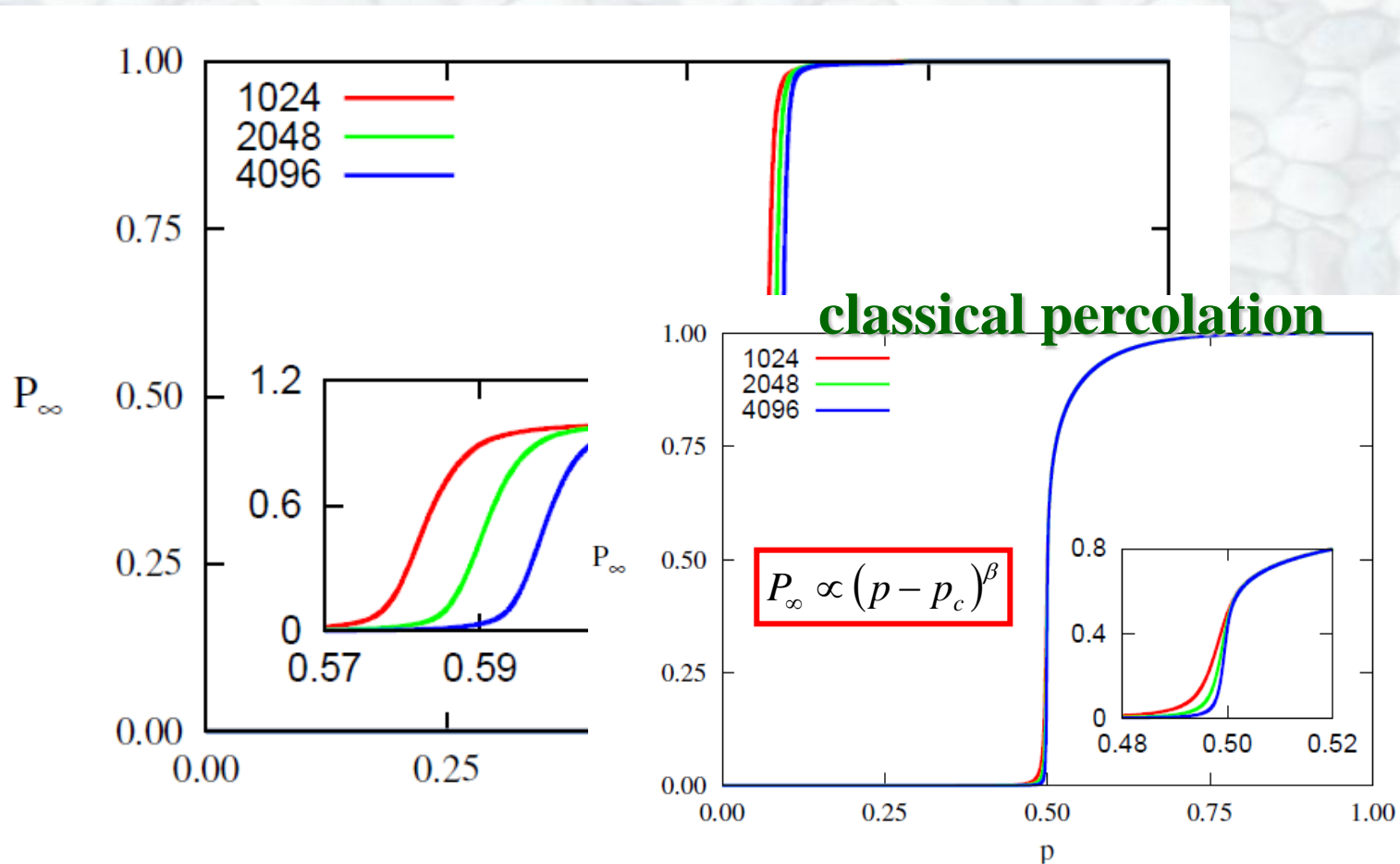
- select randomly a bond
- if not related with the largest cluster occupy it
- else, occupy it with probability

$$q = \exp \left[- \left(\frac{s - \bar{s}}{\bar{s}} \right)^2 \right]$$

Nuno Araújo and HJH, *Phys. Rev. Lett.* 105, 035701 (2010)

Largest Cluster Model

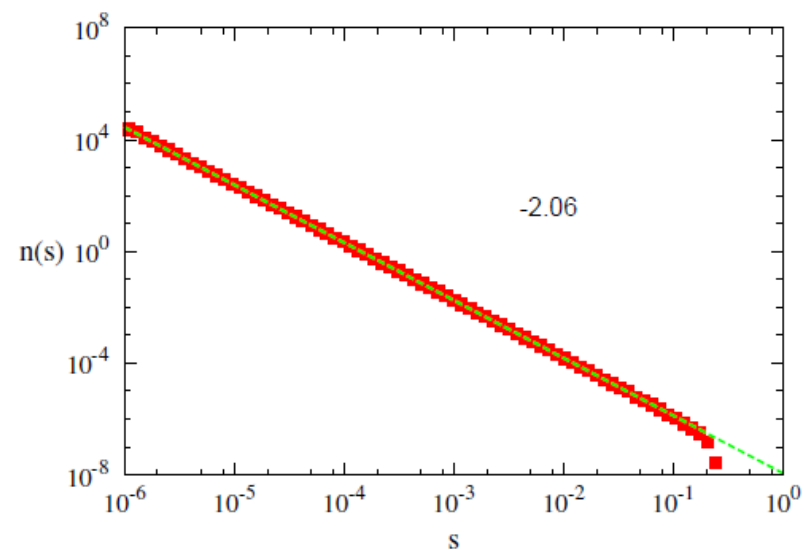
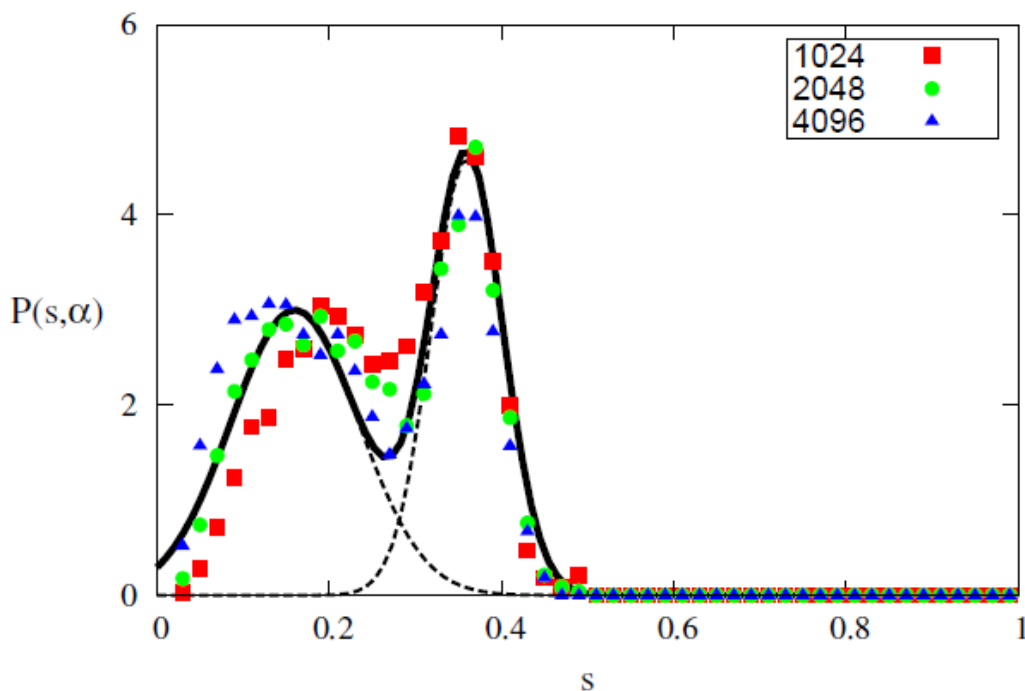
order parameter: $P_\infty \equiv$ fraction of sites in largest cluster



Largest Cluster Model

at p_c

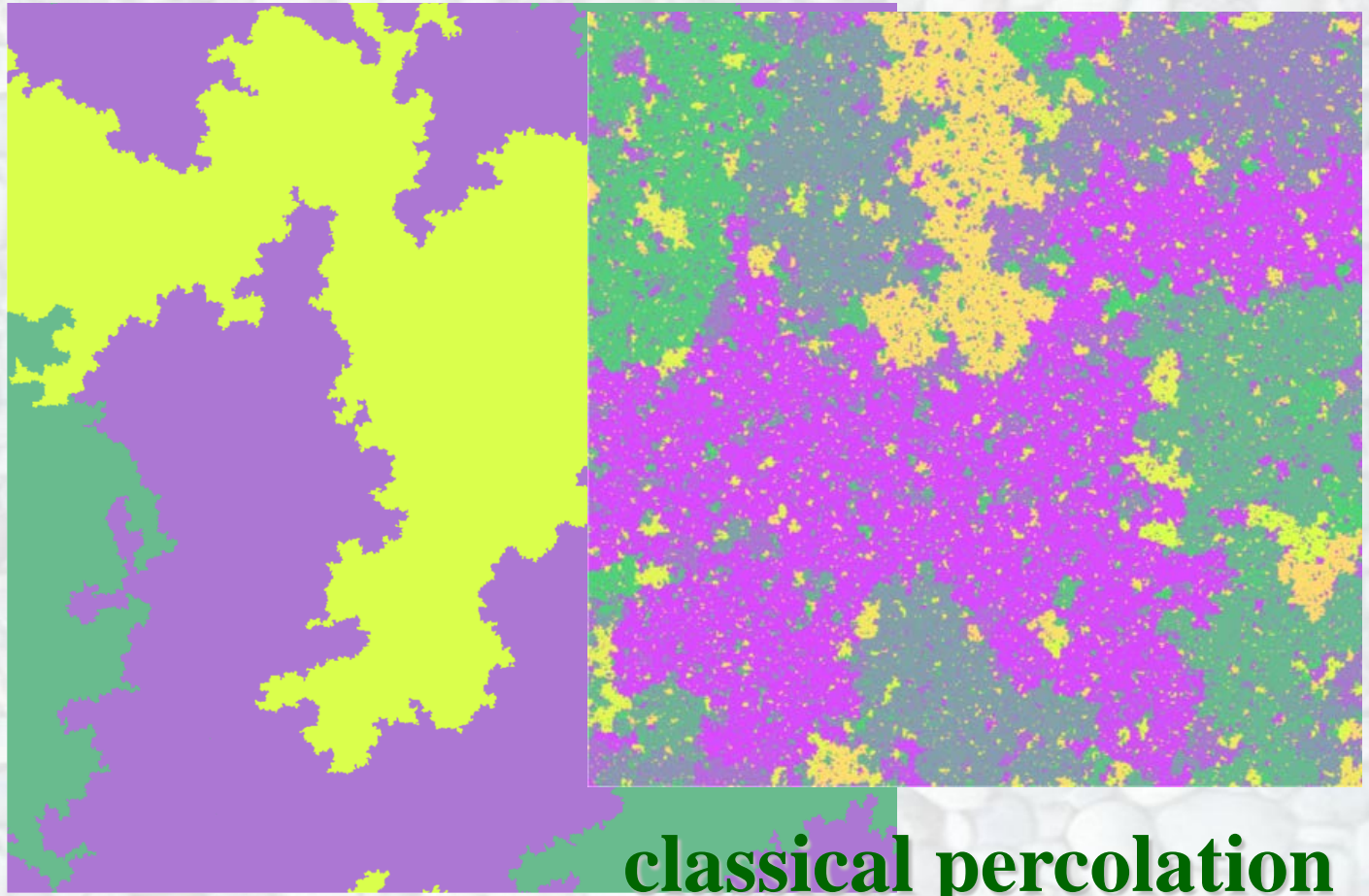
cluster size distribution



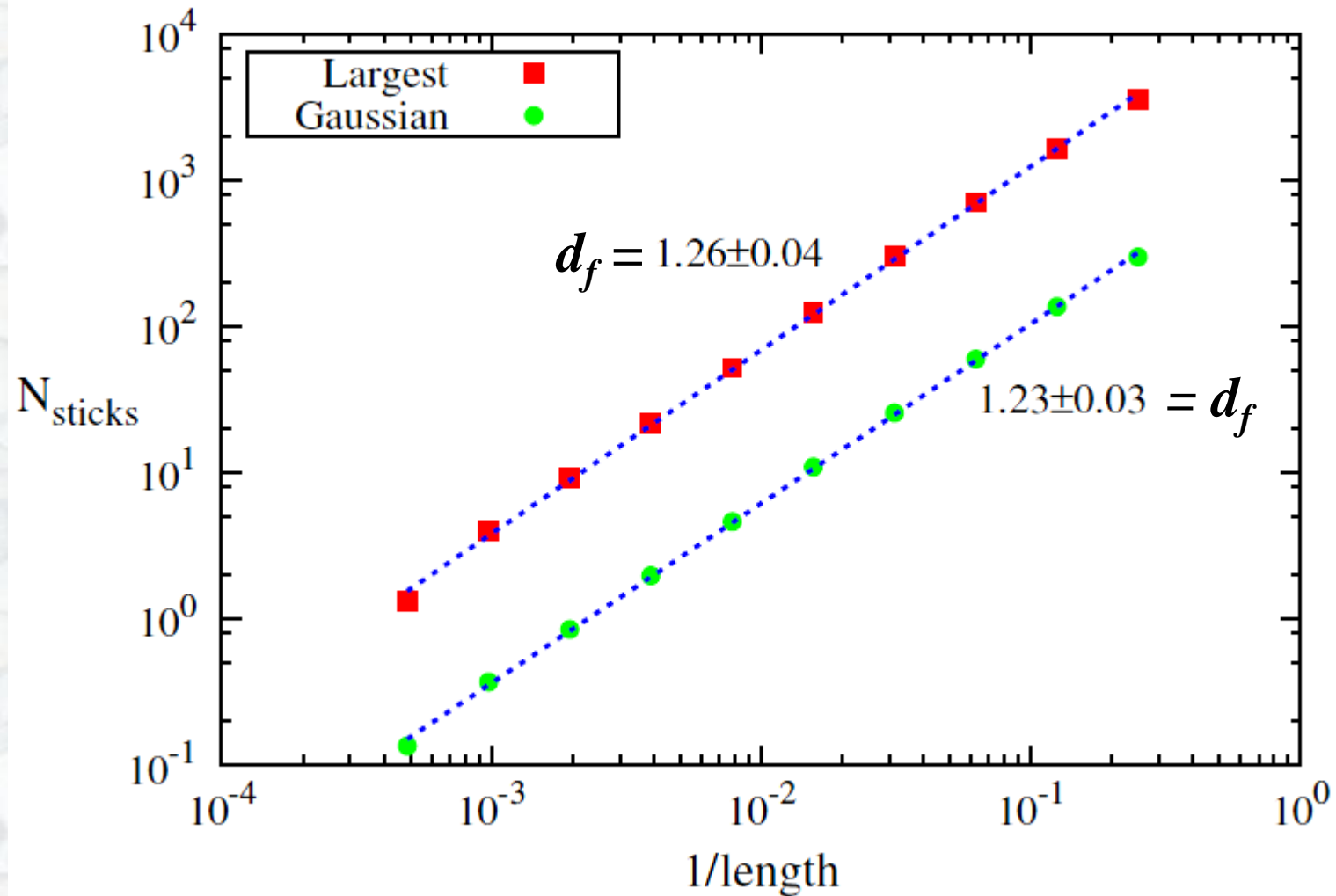
classical percolation

Largest Cluster Model

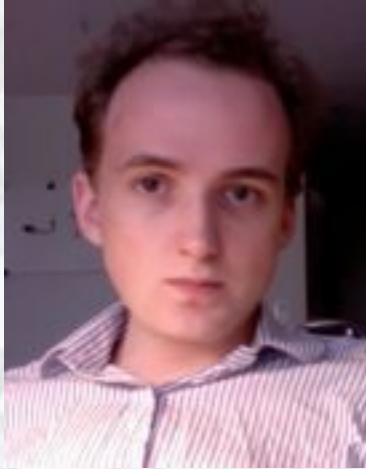
at p_c



Surface of the clusters

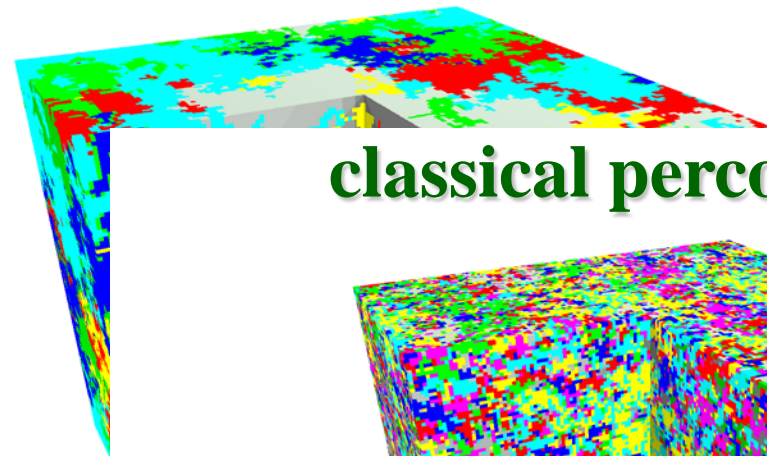


Largest cluster Model in 3D

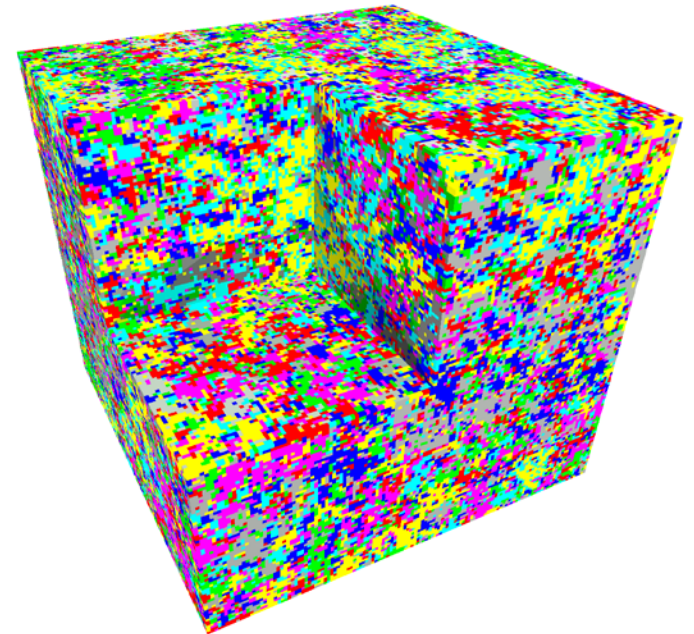


Julian Schrenk

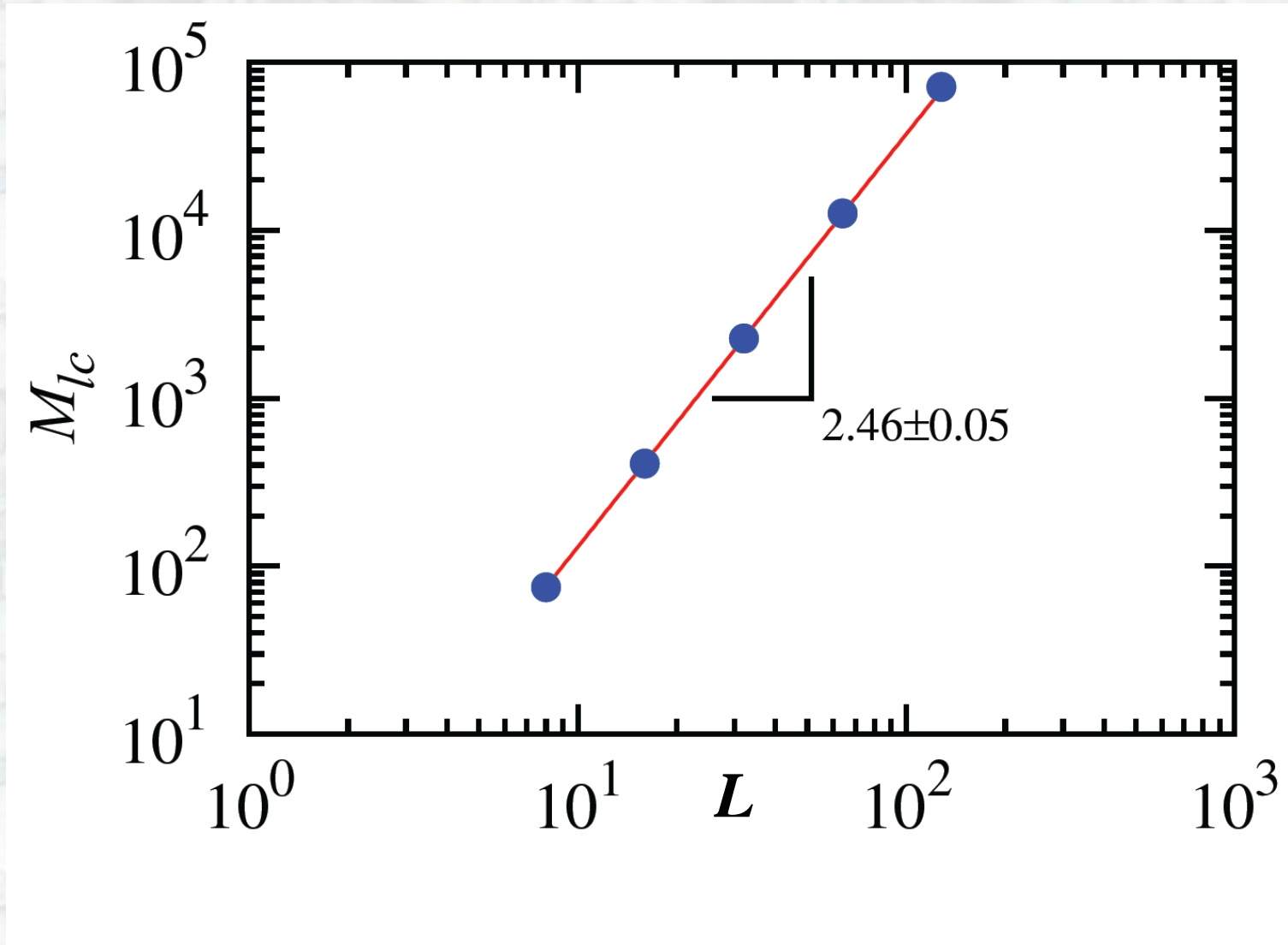
**K.J. Schrenk, N.A.M. Araújo, and H.J.H.,
Phys. Rev. E, 84, 041136 (2011)**



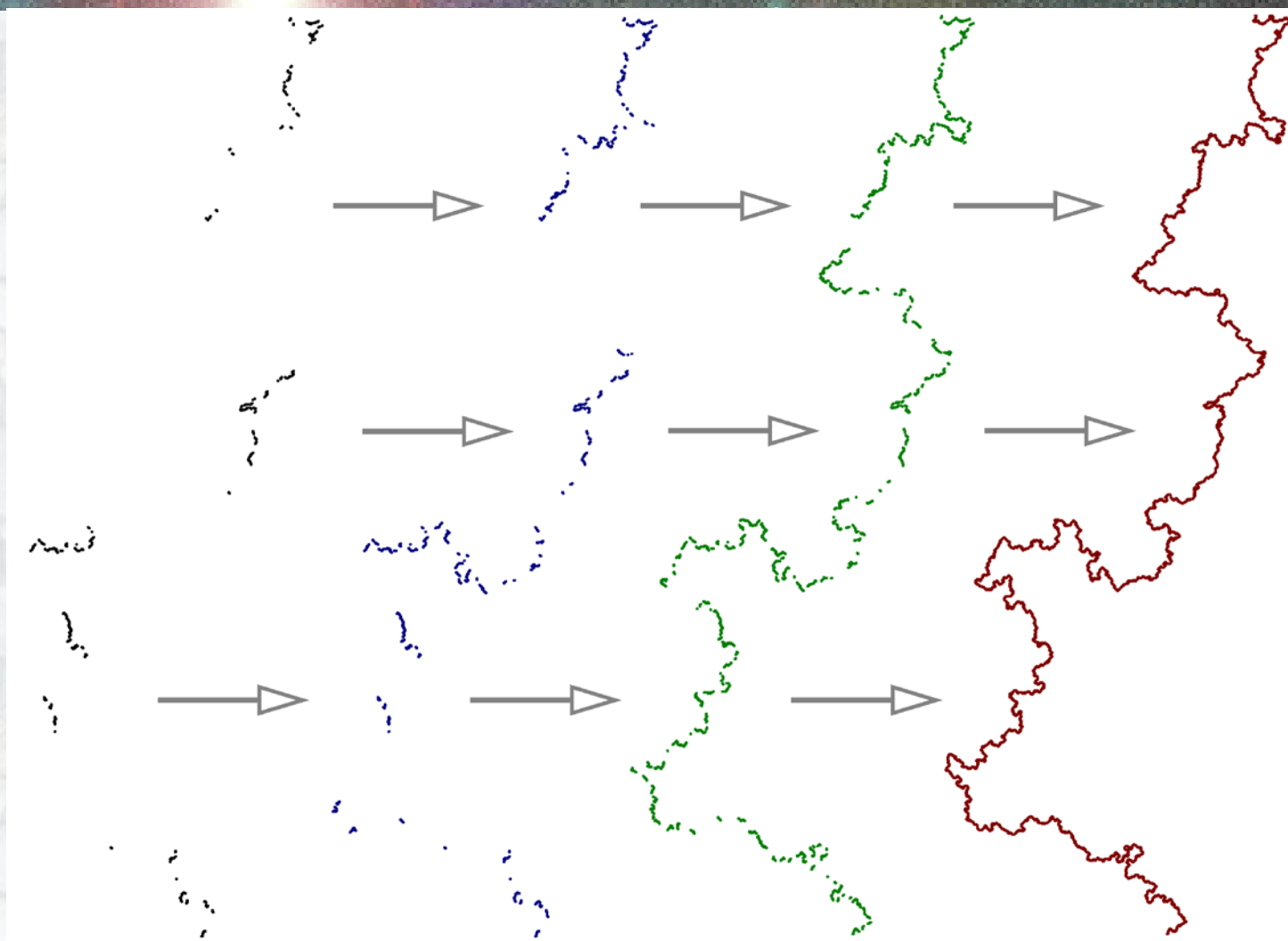
classical percolation



Largest cluster model in 3D



Bridge Percolation



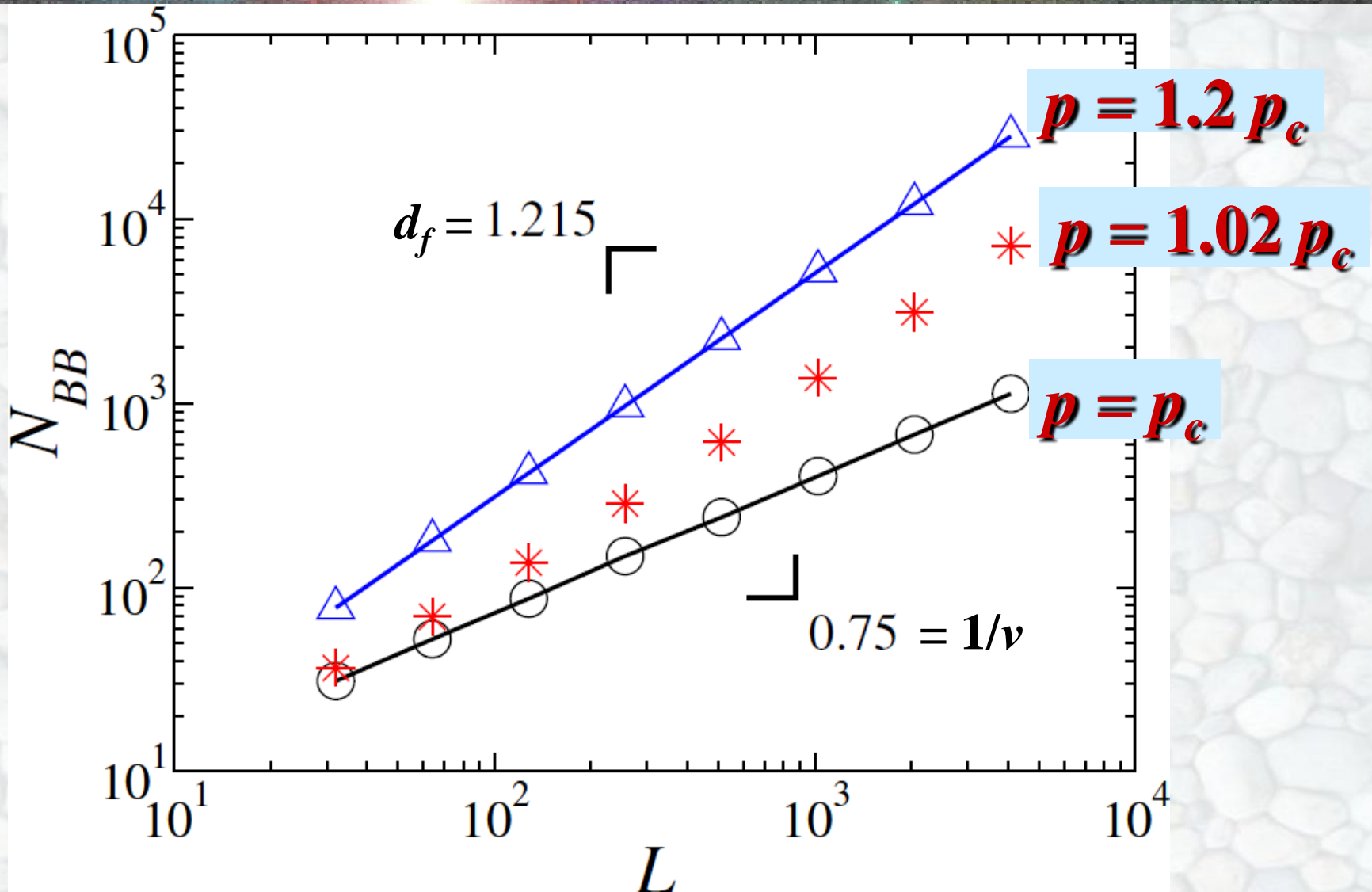
$p = p_c$

$p = 1.01 p_c$

$p = 1.05 p_c$

$p = 1$

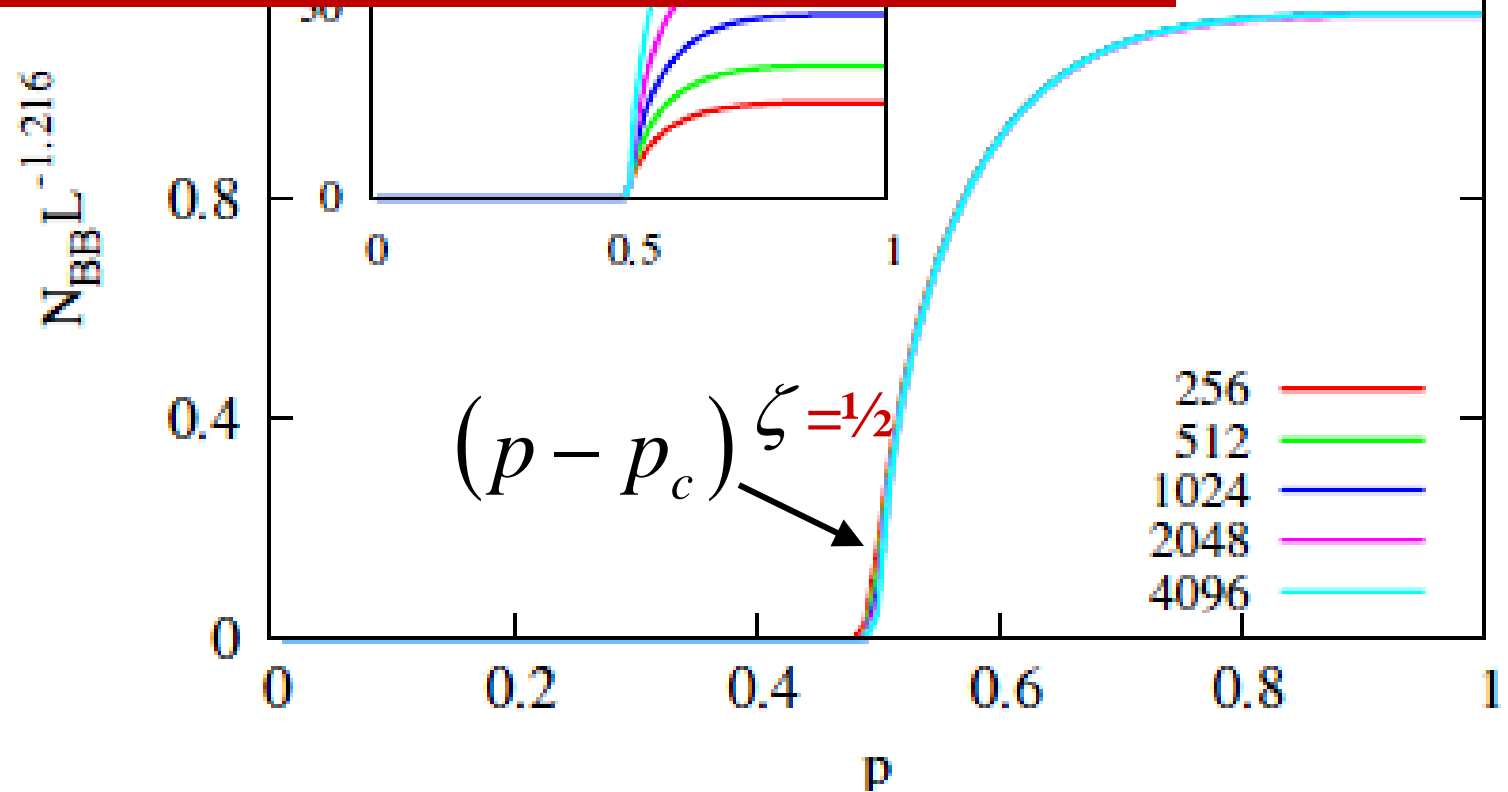
Bridge Percolation



Bridge Percolation

$$N_{BB} \sim \begin{cases} L^{1/\nu} & \text{for } p = p_c \\ L^{d_{BB}} (p - p_c)^\zeta & \text{for } p > p_c \end{cases}$$

N_{BB} is
number
of bridge
bonds.



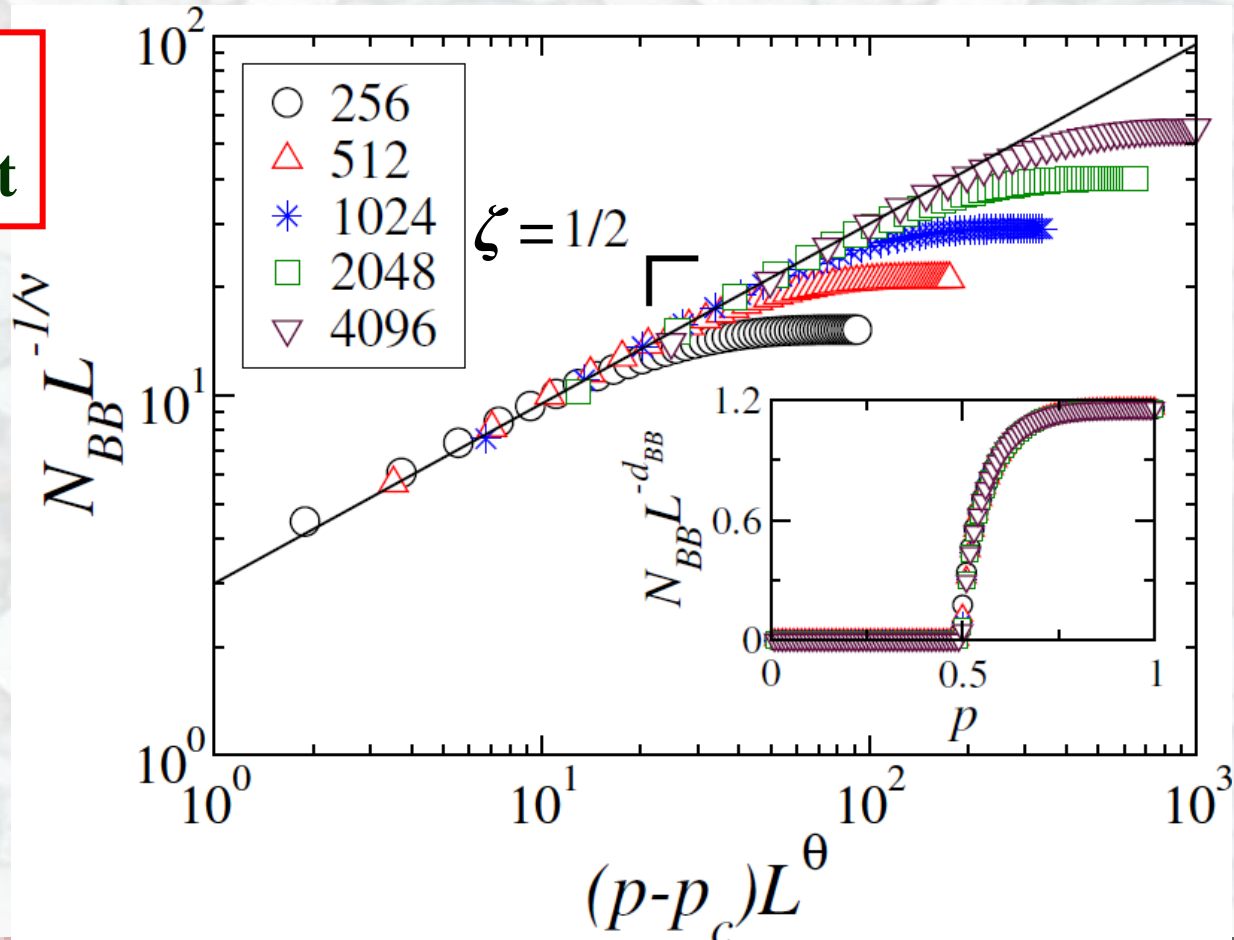
Bridge Percolation

$$N_{BB}(p, L) = L^{\frac{1}{\nu}} \mathcal{F}[(p - p_c)L^\theta] = L^{d_{BB}} \tilde{\mathcal{F}}[(p - p_c)L^\zeta]$$

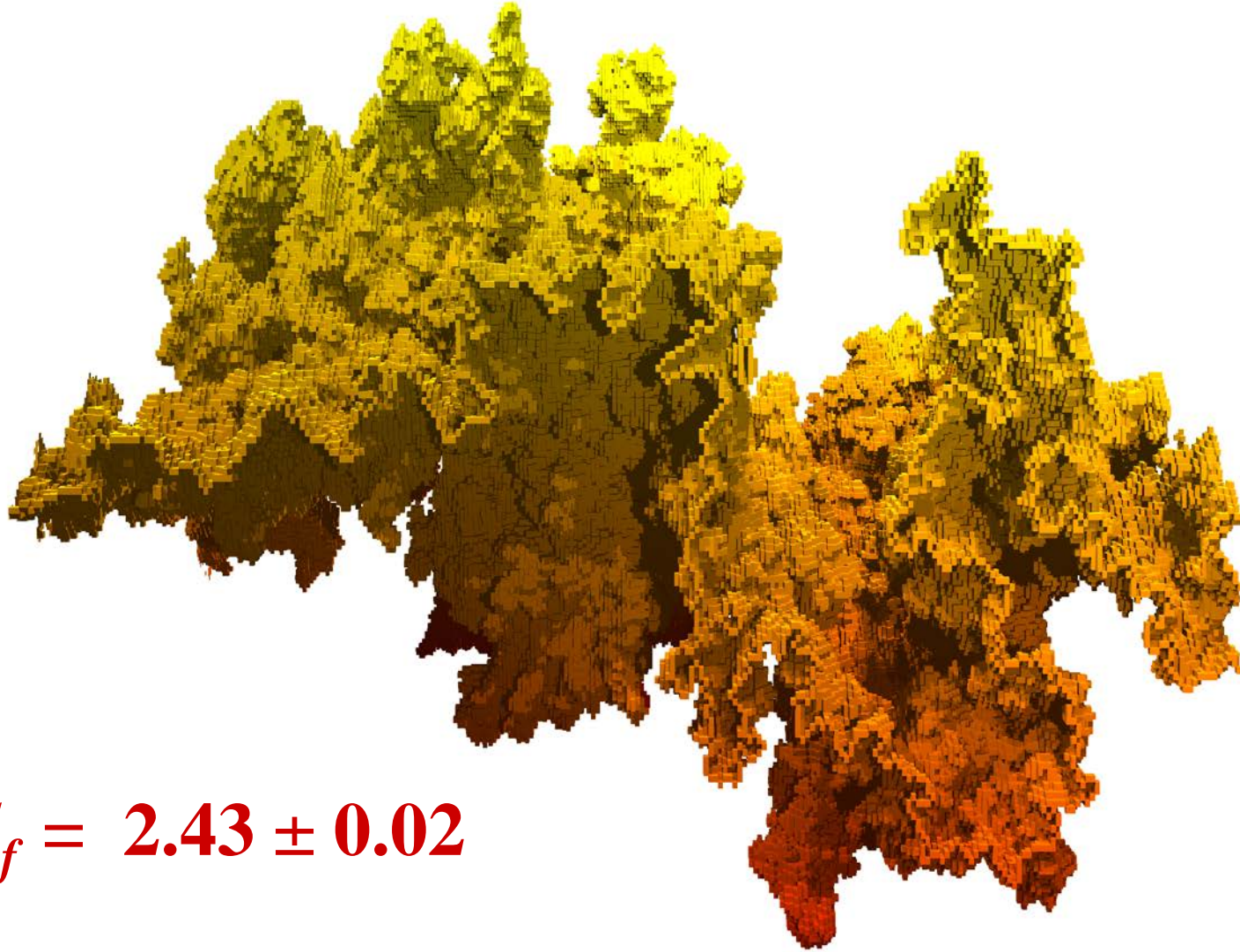
**Tricritical scaling
analogous to theta point**

$$\theta = \zeta^{-1} \left(d_f - \frac{1}{\nu} \right)$$

$$\theta = 0.94$$

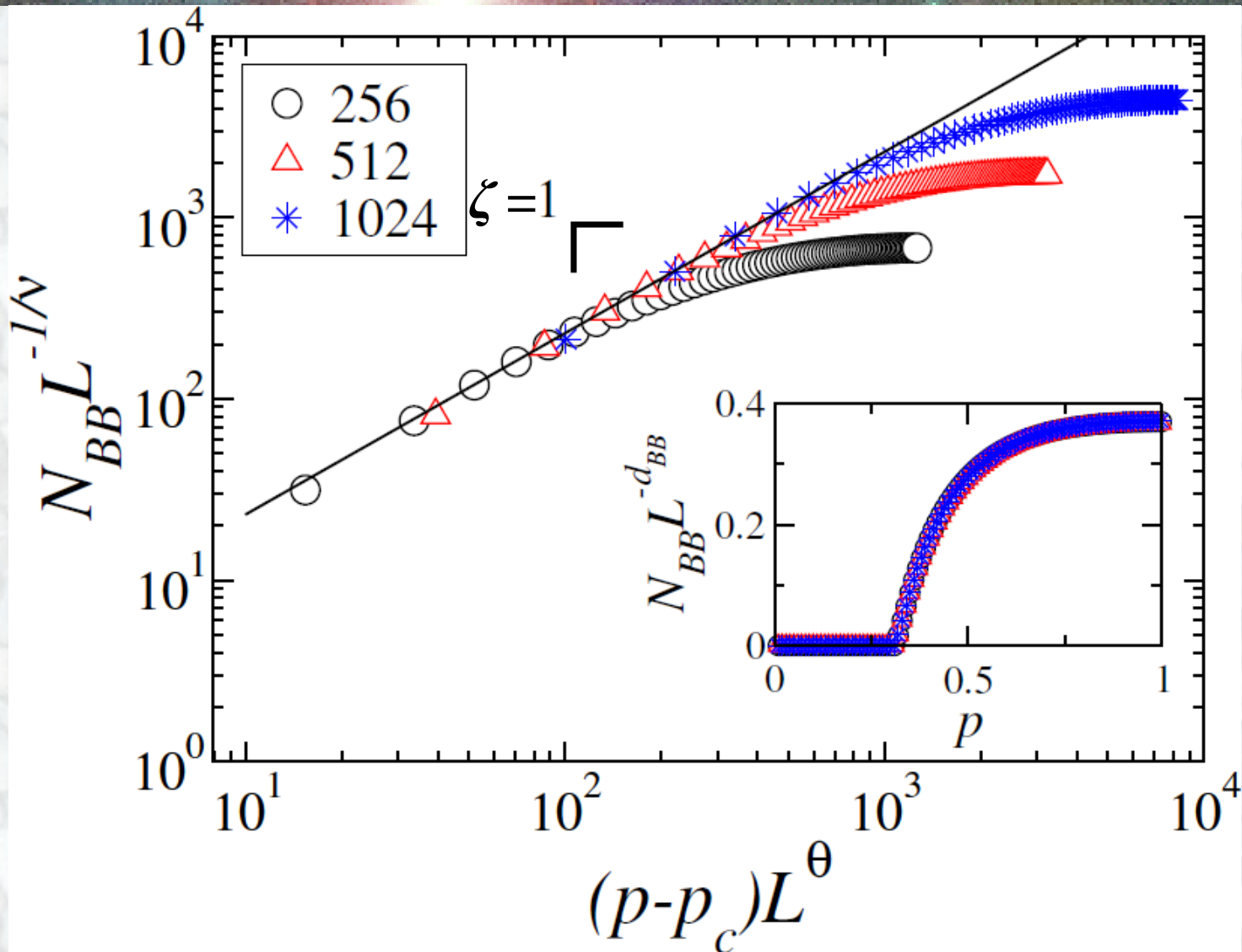


Bridge Percolation in 3D



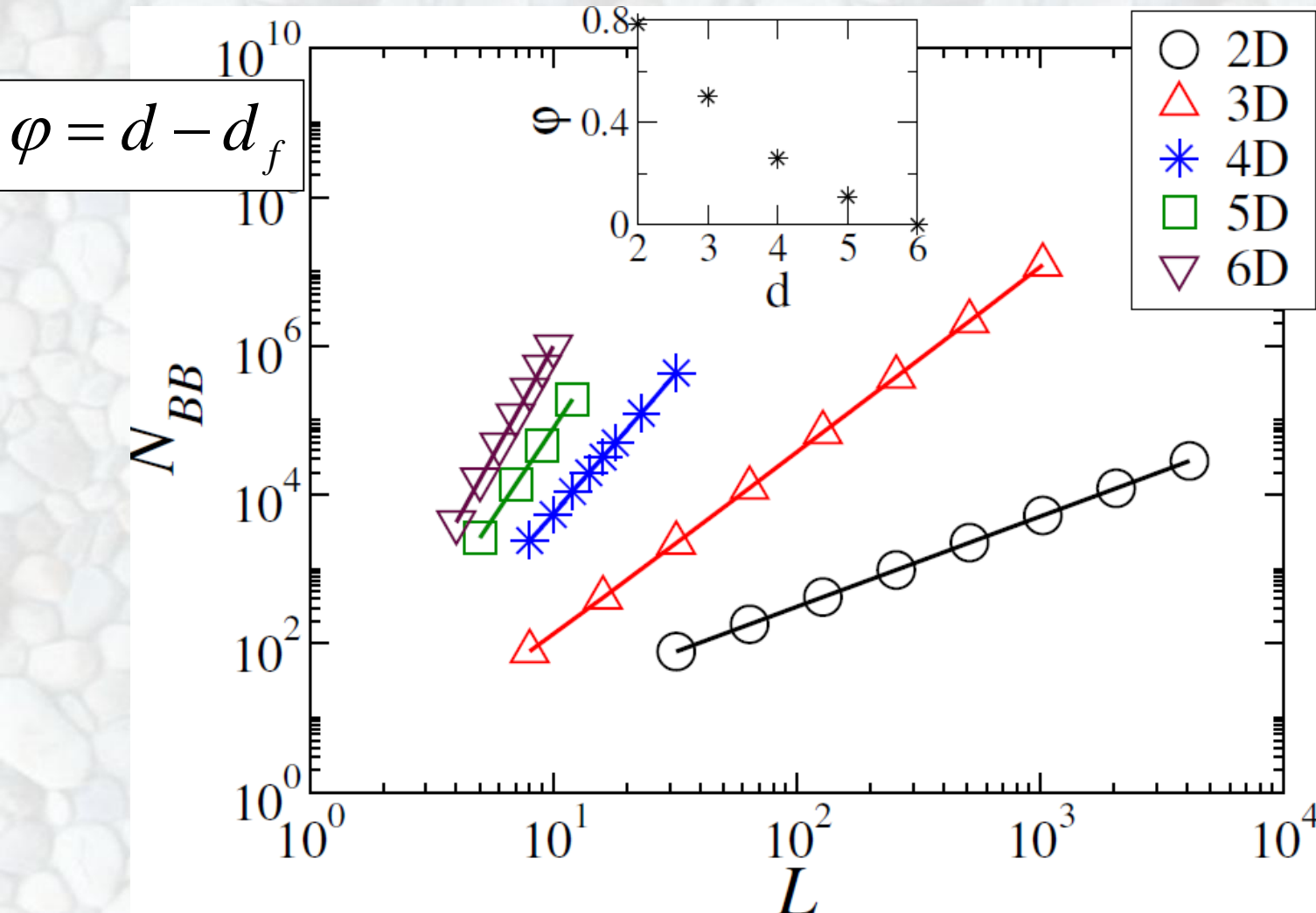
$$d_f = 2.43 \pm 0.02$$

Bridge Percolation in 3D



$$\theta = 1.36$$

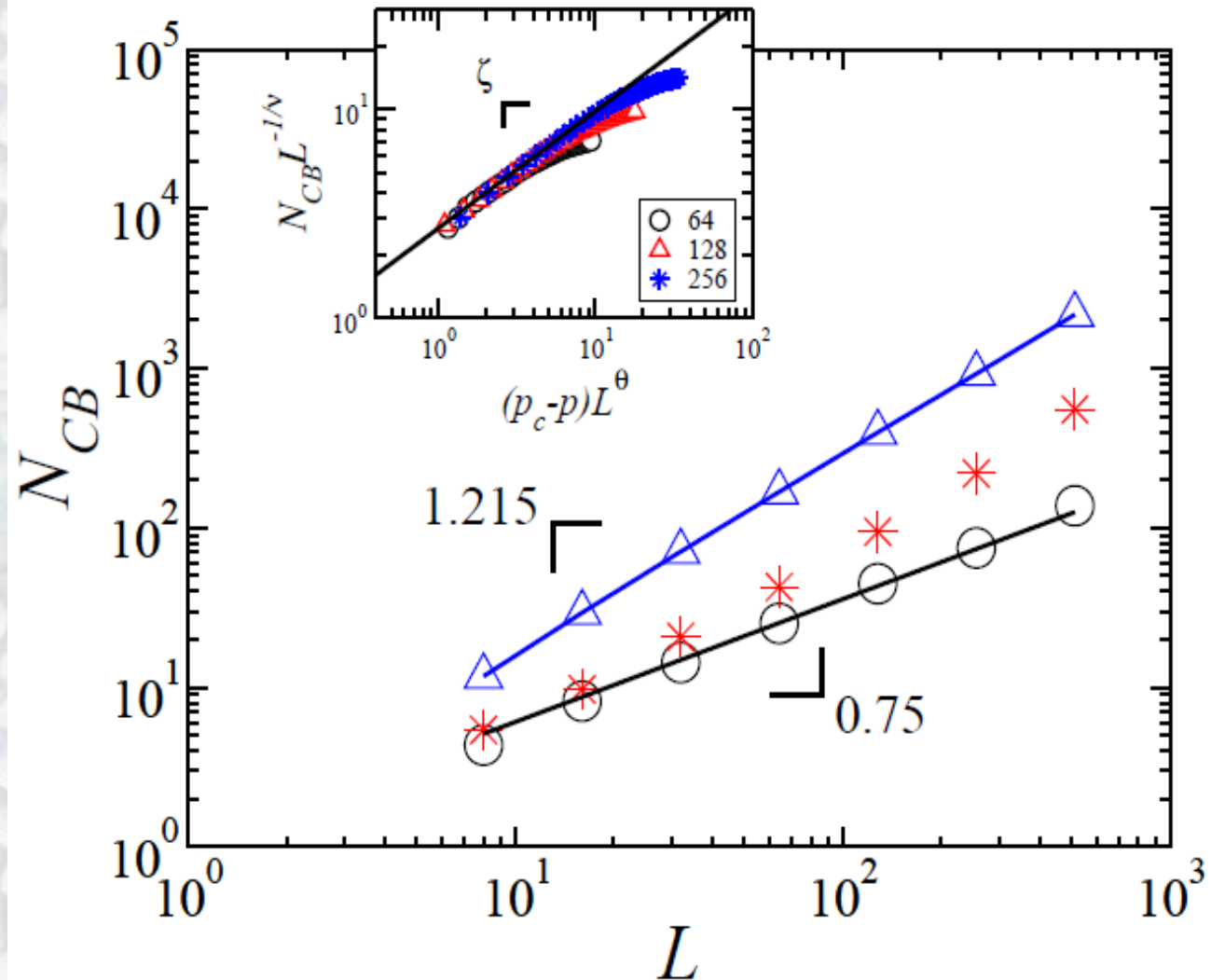
Bridge Percolation $d = 2 - 6$



Above the upper critical dimension $d_c = 6$ the set of bridges is dense.

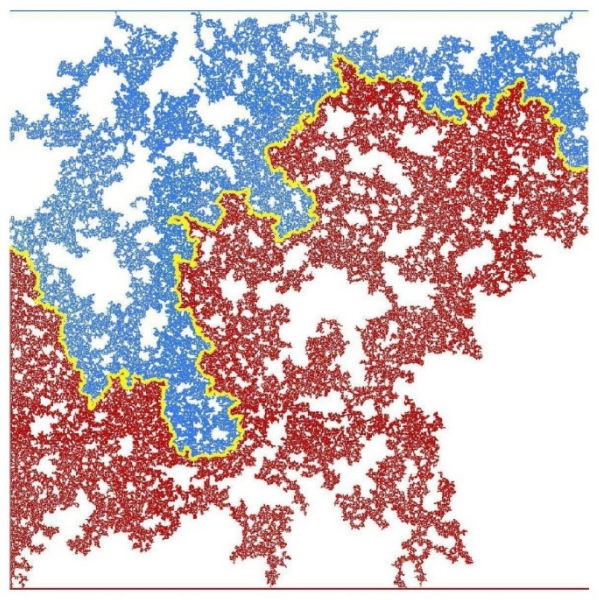
Cutting bonds

If one starts from a fully occupied lattice and removes bonds except if they are cutting bonds in 2d they have the same behavior as the bridges before (same exponents). In higher dimension the exponents are different.



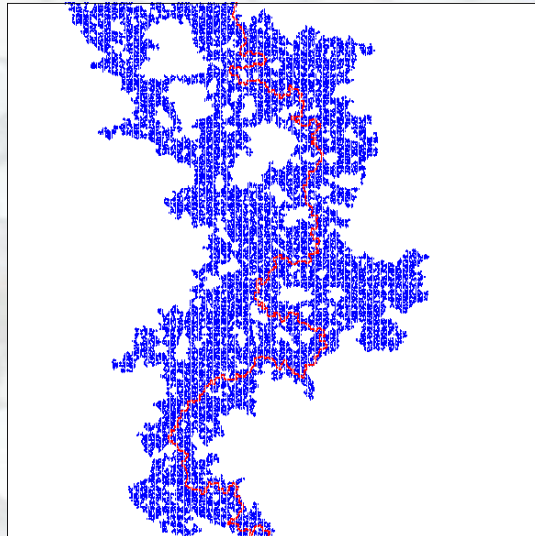
Same fractal dimension

watersheds

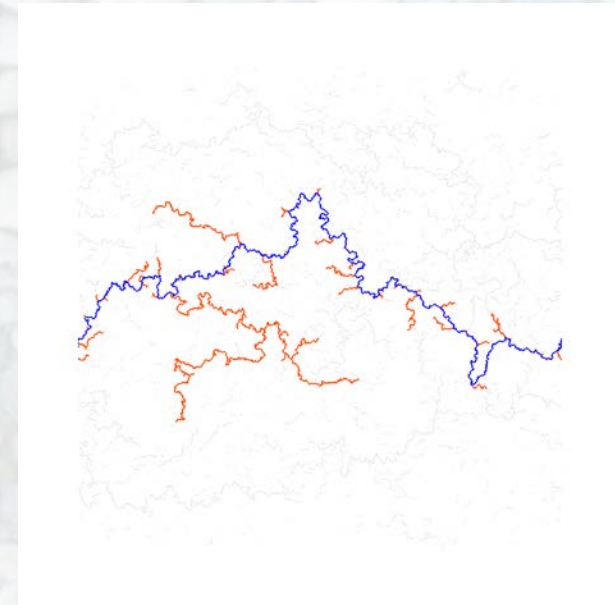


E. Fehr, J.S. Andrade Jr., S.D. da Cunha, L.R. da Silva, H.J.H., D. Kadau, **C.F. Moukarzel**, E.A. Oliveira, J. Stat. Mech. P09007 (2009)

shortest path
on loop-less
percolation



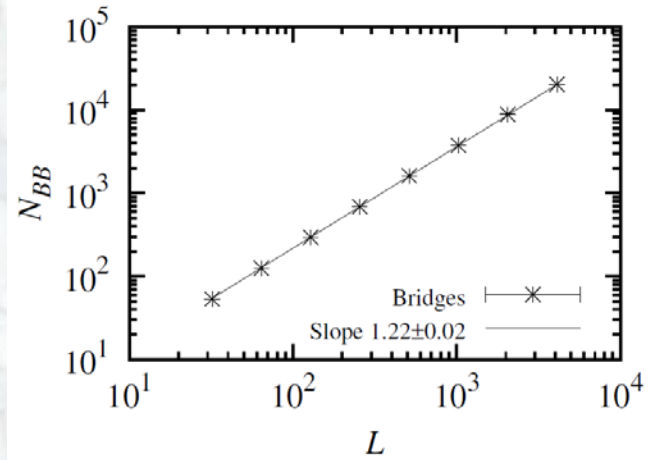
optimal path crack



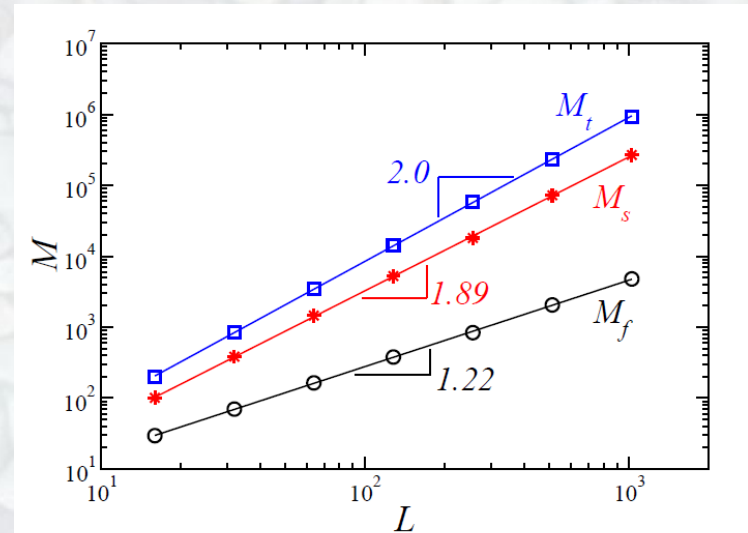
J.S. Andrade Jr., E. Oliveira, A. Moreira and HJH, Phys.Rev.Lett. 103, 225503 (2009)

Same fractal dimension

Two invading liquids touching

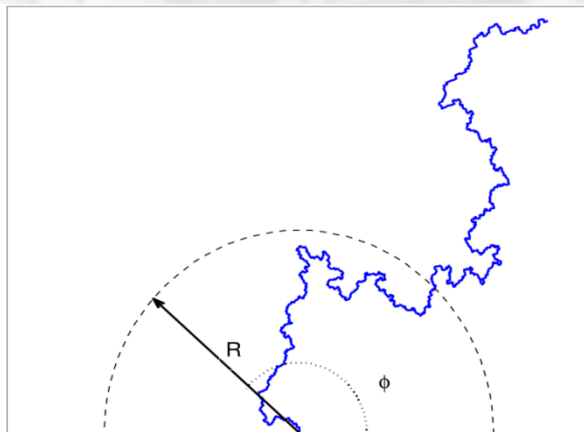


Fuses in infinite disorder



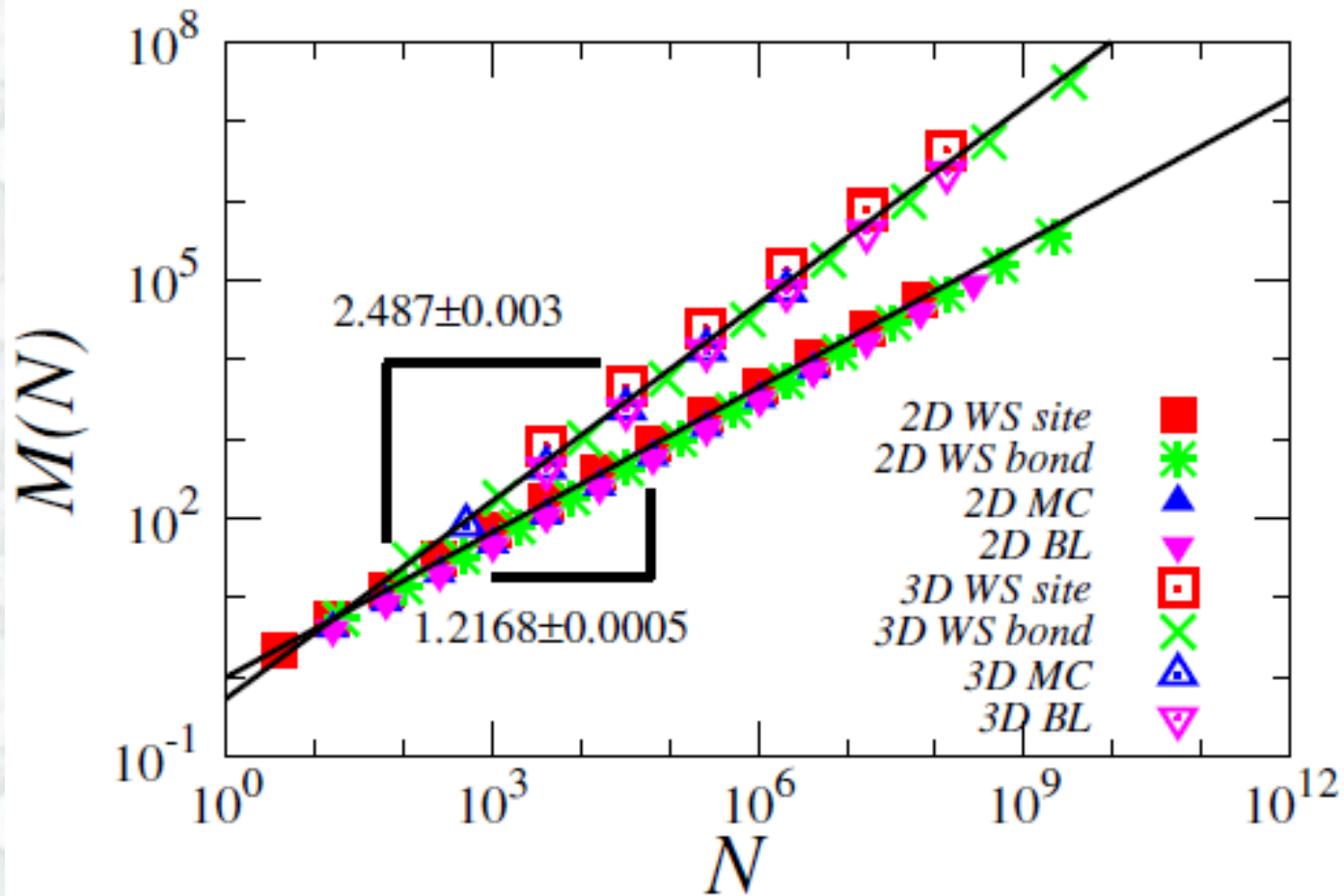
A.A. Moreira, C.L.N. Oliveira, A. Hansen,
 N.A.M. Araújo, H.J.H., J.S. Andrade Jr,
 Phys. Rev. Lett. 109, 255701 (2012)

Schramm-Loewner Evolution (SLE)



E. Daryaei, N. A. M. Araújo, K. J. Schrenk, S.
 Rouhani and H. J. H.
 Phys. Rev. Lett. 109, 218701 (2012)

High precision calculation

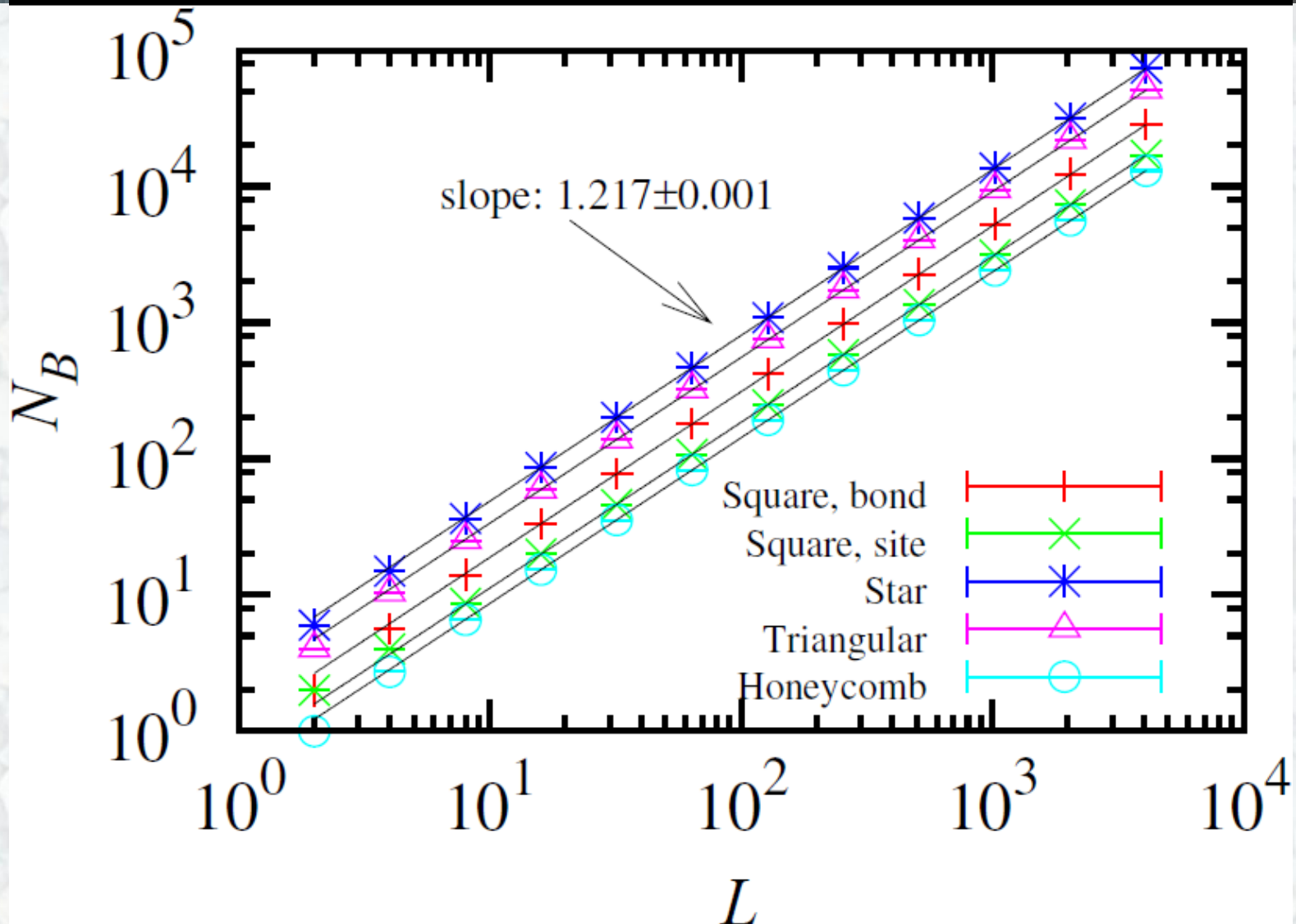


E. Fehr, K.J. Schrenk, N.A.M. Araújo, D. Kadau, P. Grassberger, J.S. Andrade Jr., H.J.H.

Phys. Rev.E 86, 011117(2012)

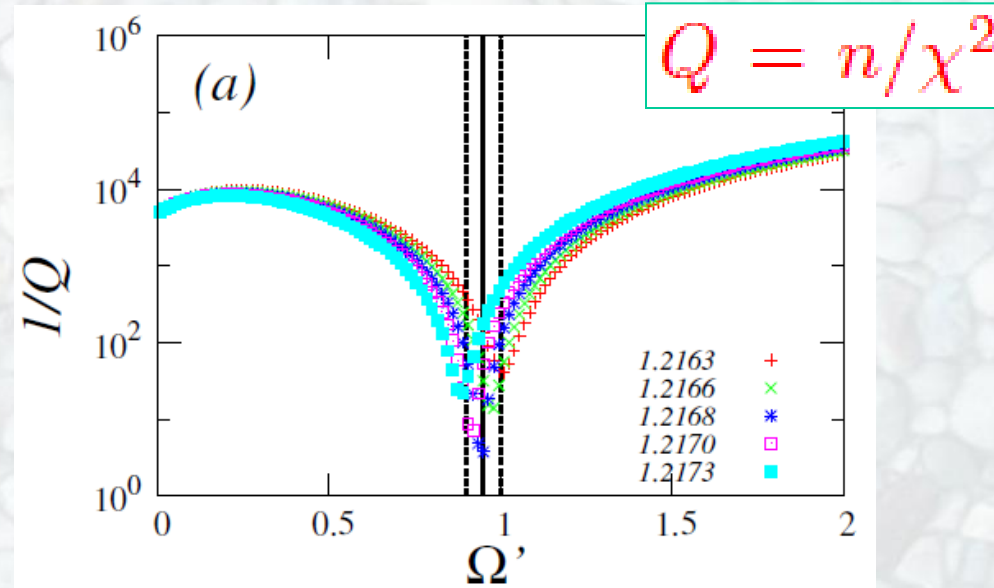
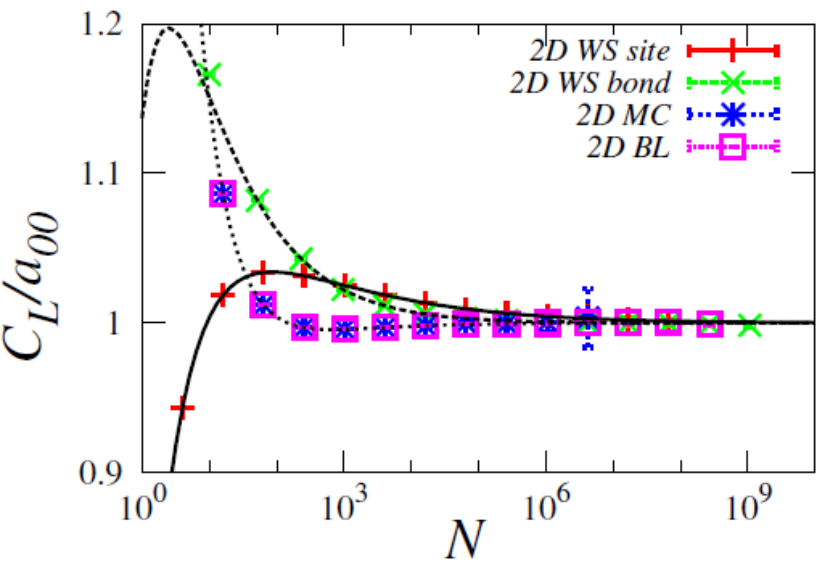
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Universality



Corrections to scaling

$$C_L^{2D} = a_{00} + a_{11}L^{-\omega} + a_{21}L^{-\Omega} + a_{22}L^{-\Omega-1}$$



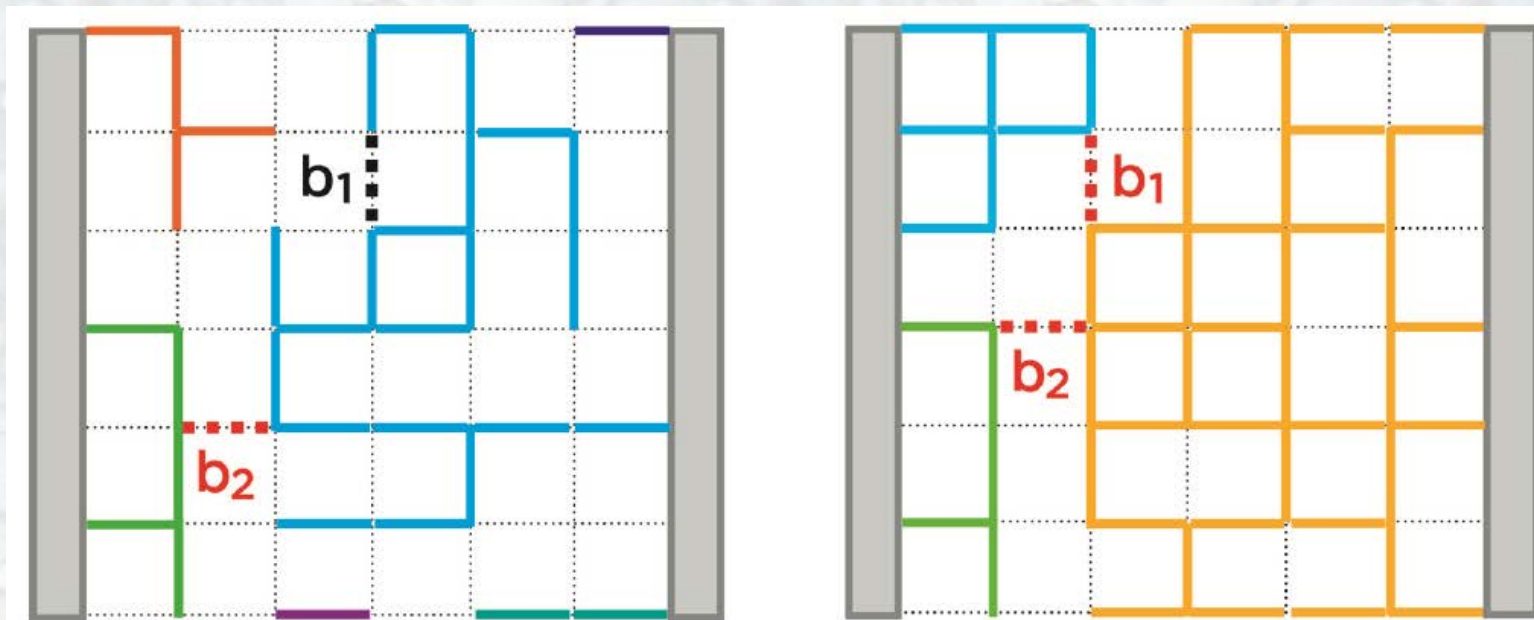
model	d	d_f	Ω
WS bond	2	1.2168 ± 0.0005	0.95 ± 0.05
WS site	2	1.21705 ± 0.00075	0.91 ± 0.19
BL	2	1.21655 ± 0.0015	0.87 ± 0.08
MC	2	1.21655 ± 0.0045	0.86 ± 0.11
WS bond	3	2.4865 ± 0.0025	0.96 ± 0.10
WS site	3	2.4865 ± 0.0025	0.98 ± 0.09
BL	3	2.4878 ± 0.0025	1.06 ± 0.16

Spanning cluster avoiding model

Y. S. Cho, S. Hwang, H.J.H., and B. Kahng, *Science*, 339, 1185 (2013)

Choose m unoccupied bonds and occupy randomly one which is not a bridge, if all are bridges then choose randomly one of these bridges.

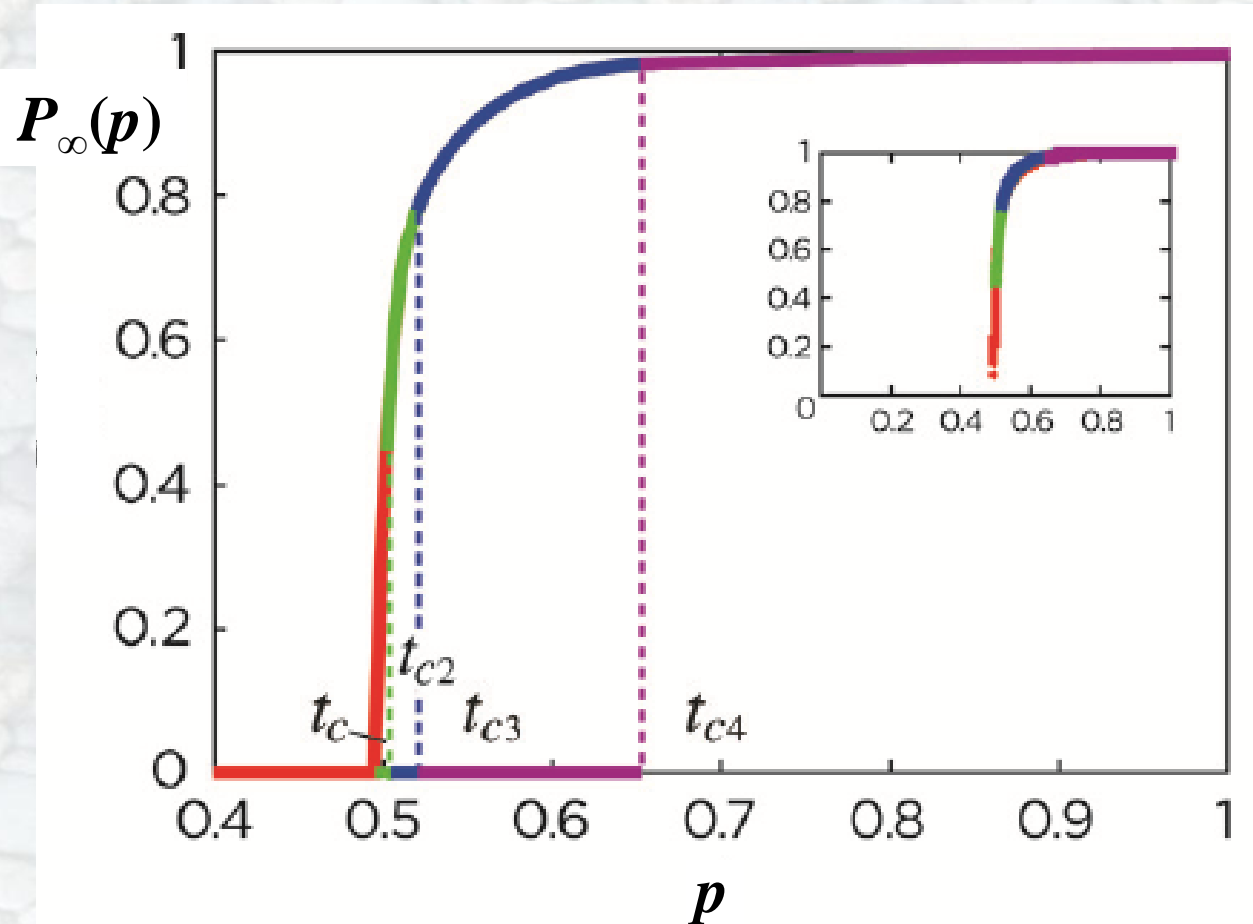
$$m = 2$$



Spanning cluster avoiding model

For finite systems there is a jump for $m > 1$.

fraction
of bonds
in the
spanning
cluster



$L = 1000$

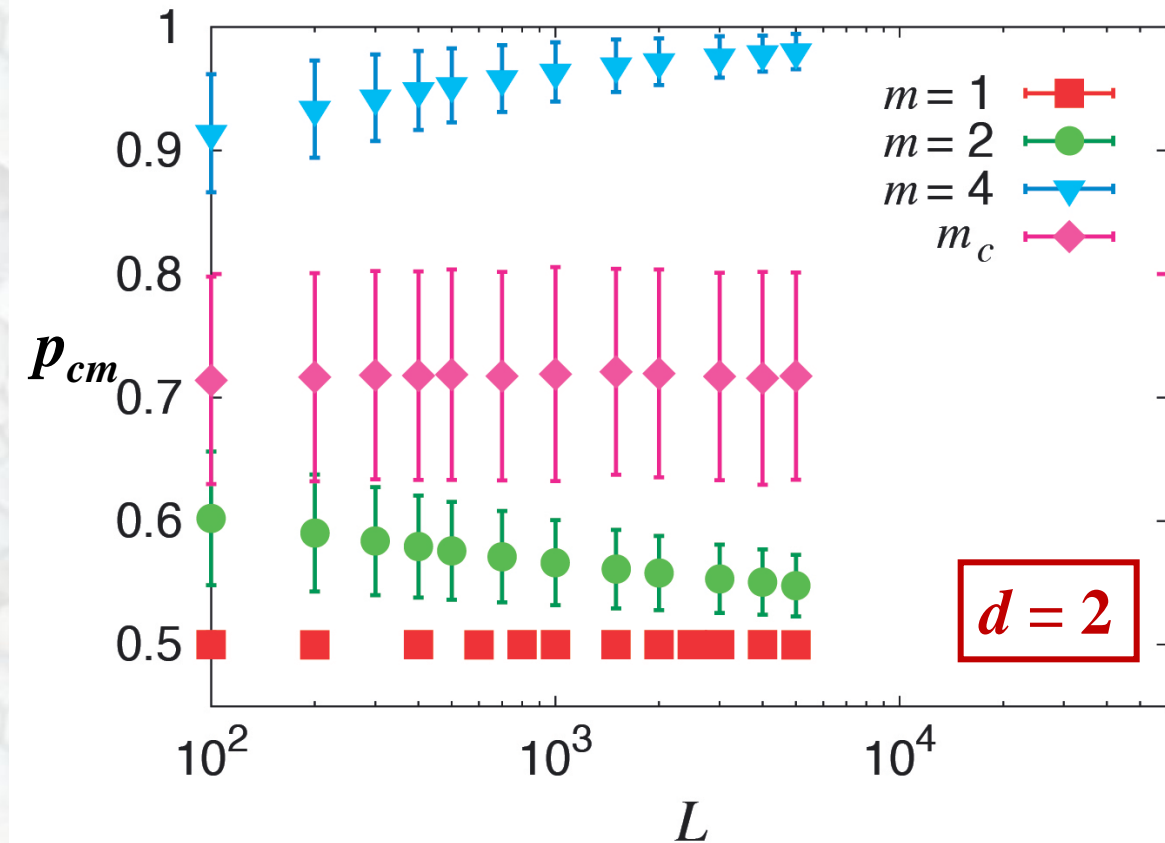
At each dimension d
there exists an m_c
so that for increasing
system size L
the transition

goes to

$$p_c = 0.5 \text{ for } m < m_c$$

and to

$$p_c = 1 \text{ for } m > m_c .$$



$$m_c(2) \approx 2.55 \pm 0.01 \quad m_c(3) = 5.98 \pm 0.07 \quad m_c(4) = 16.99 \pm 5.23$$

Spanning cluster avoiding model

$N_b = d L^d$ is the number of bonds

$$N_{BB} \sim \begin{cases} L^{1/\nu} & \text{for } p = p_c \\ L^{d_{BB}} (p - p_c)^\zeta & \text{for } p > p_c \end{cases}$$

probability to have
 m bridge bonds:

$$q(p, m) = \left[\frac{N_{BB}}{N_b (1-p)} \right]^m \sim N_b^{-m/m_c} \left[\frac{(p - p_c)^\zeta}{1-p} \right]^m$$

$$\Rightarrow m_c(d) = \frac{d}{d - d_{BB}}$$

**For $d > 6$ the transition
is always continuous.**

One can also show analytically that:

for

$$m < m_c$$

$$p_{cm}(N) - p_c \sim N^{-1/\bar{\nu}_<}$$

$$1/\bar{\nu}_< = (1 - m/m_c) / (m\zeta + 1),$$

for

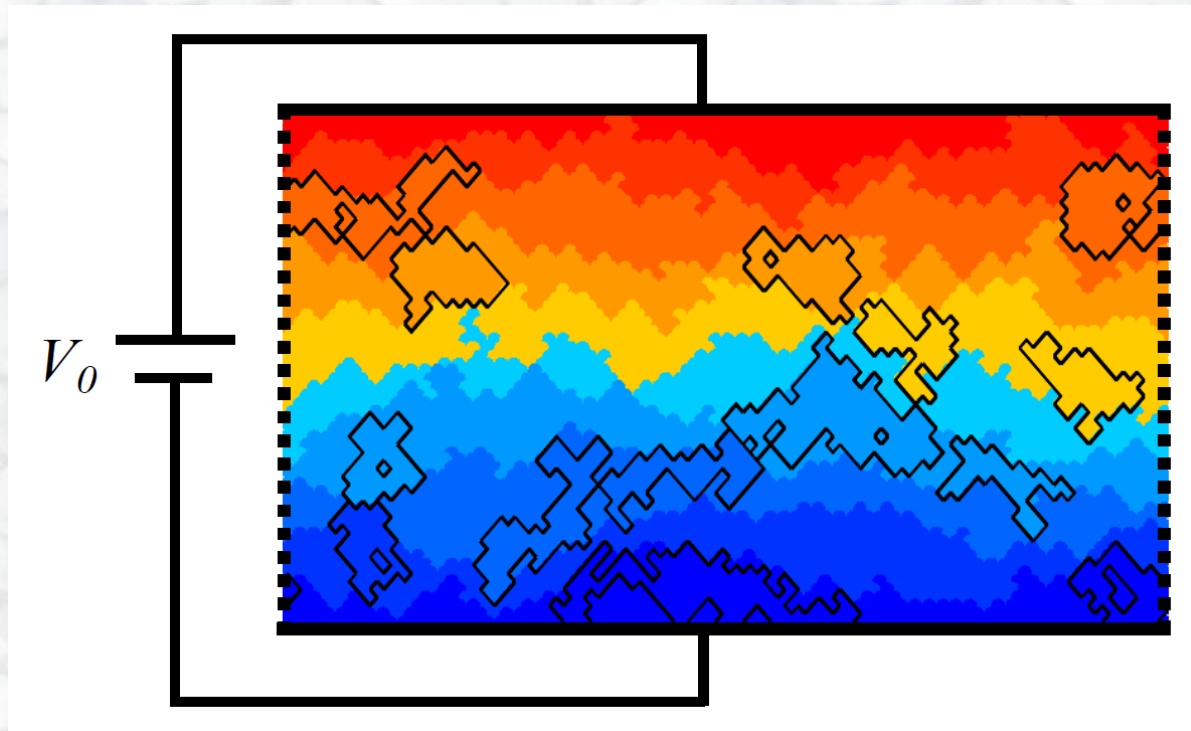
$$m > m_c$$

$$1 - p_{cm}(N) \sim N^{-1/\bar{\nu}_>}$$

$$1/\bar{\nu}_> = (m/m_c - 1) / (m - 1)$$

Metallic Breakdown

Deposition of metallic particles on a dielectric surface



$$\begin{aligned}q &= 10 \\L &= 128 \\ \gamma &= 0.1 \\ p &= 0.57\end{aligned}$$

C.L.N.Oliveira, N.A.M. Araújo, J.S. Andrade Jr., H.J.H.

Phys.Rev. Lett. 113, 155701 (2014)

Metallic Breakdown

Metallic particles can be adsorbed on the surface and desorbed again.

Adsorption is weaker, the stronger the local field.

Probability to replace a resistance by a metallic bond is:

$$W = \frac{p}{q} \left[1 - (1 - q) \left(1 - \left(\frac{\Delta V}{V_0} \right)^\gamma \right) \right]$$

$q > 1$ describes the relative deposition disadvantage due to the presence of the electric field.

For $\gamma = -\infty$ this is equivalent to classical bond percolation.

F. Gliozzi, Phys. Rev. E 66, 016115 (2002)

Simulate critical clusters of the q -state Potts model

(Kasteleyn-Fortuin or Coniglio-Klein or Swendsen-Wang clusters):

Be x a homogeneously distributed random number between 0 and 1.

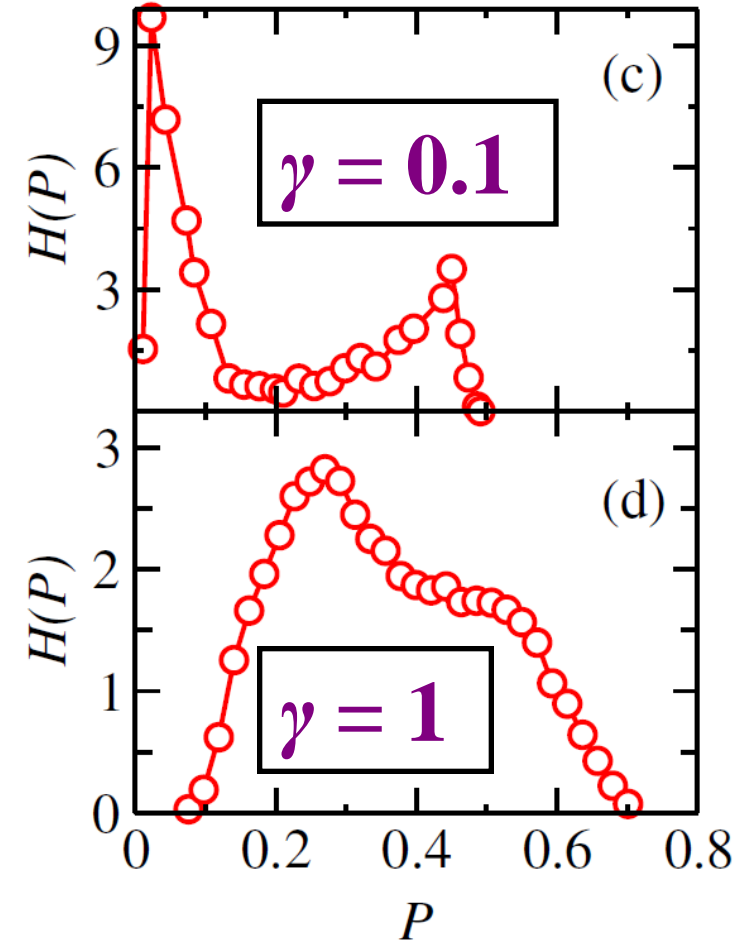
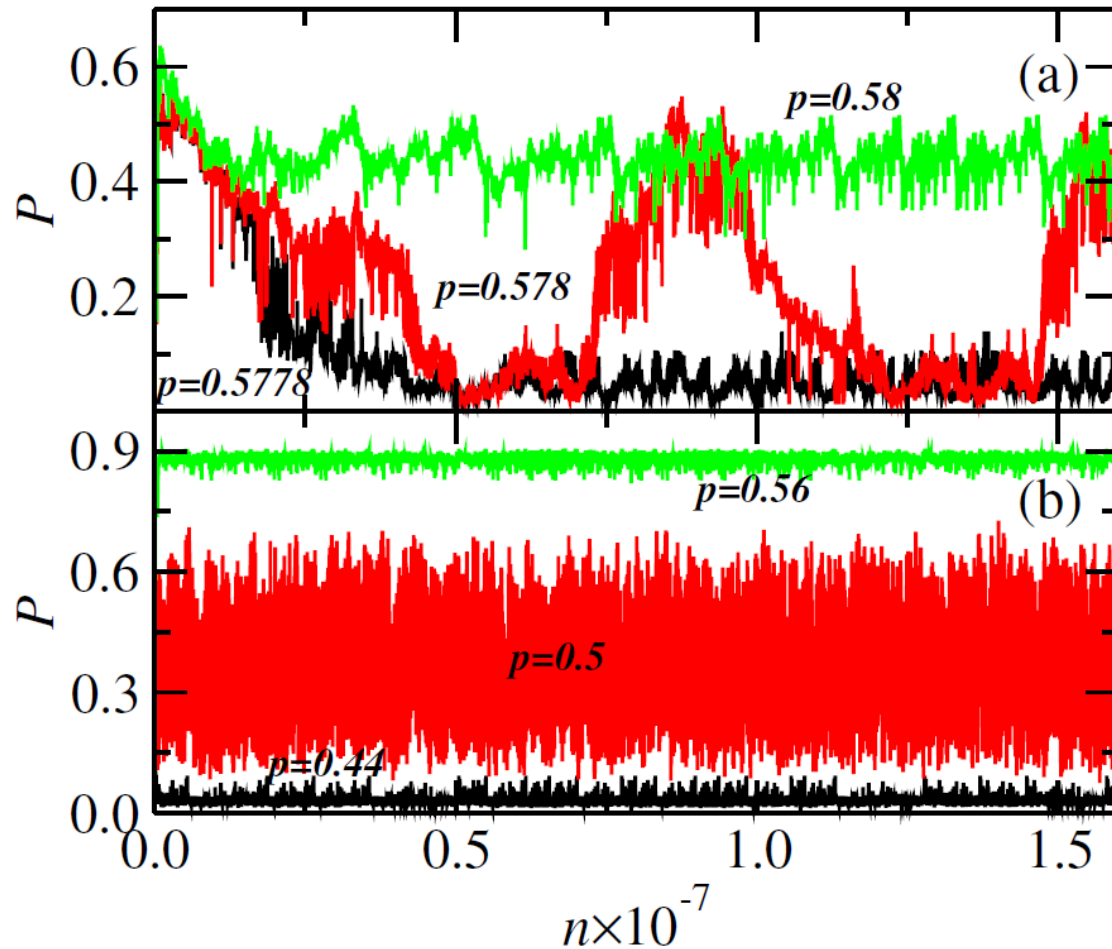
1. Occupy the bond, if $x < p/q$.
2. Make bond empty, if $x > p$.
3. Occupy if internal bond and make it empty, if it connects two metallic clusters, if $p/q < x < p$.

When $\gamma = 0$ our model is identical to Gliozzi's method,

because internal bonds are identified through $\Delta V = 0$.

Second order transition for $q \leq 4$ and first order transition for $q > 4$.

Metallic Breakdown



red is at transition

$q = 10$

Largest Metallic Cluster

$$q = 10$$

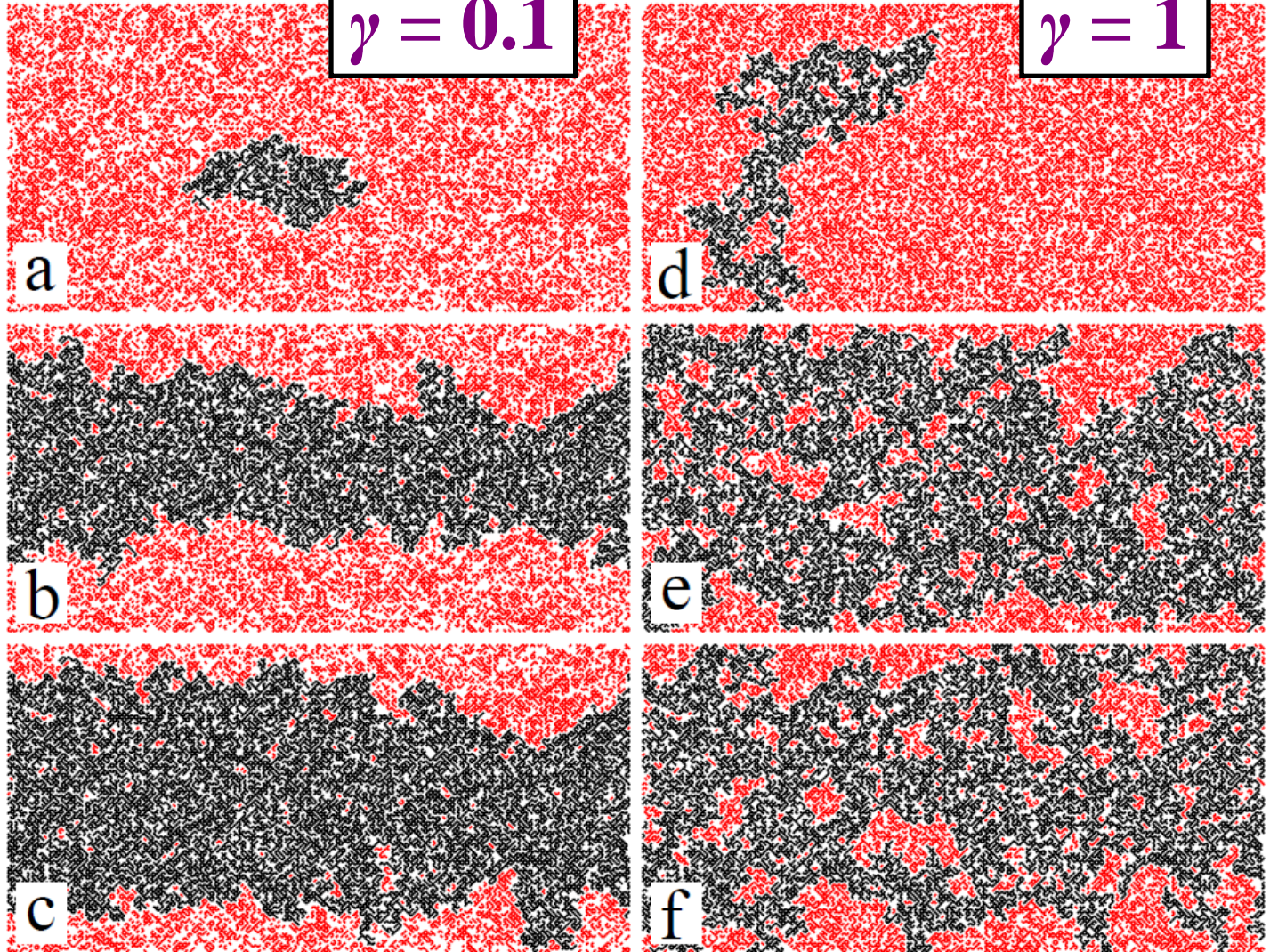
$$p = 0.57$$

$$p = 0.58$$

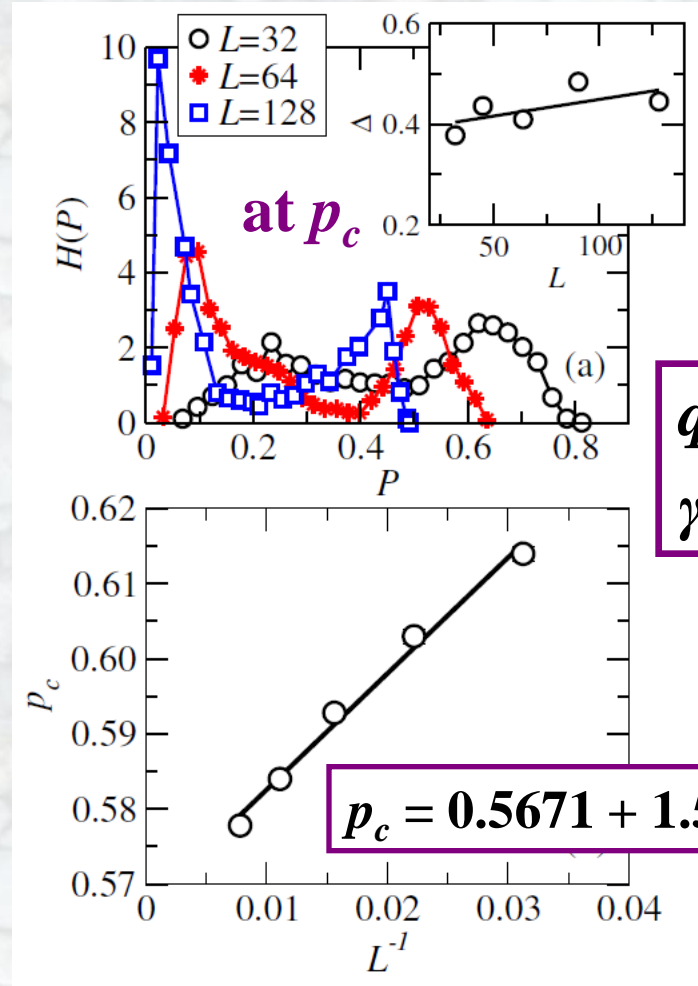
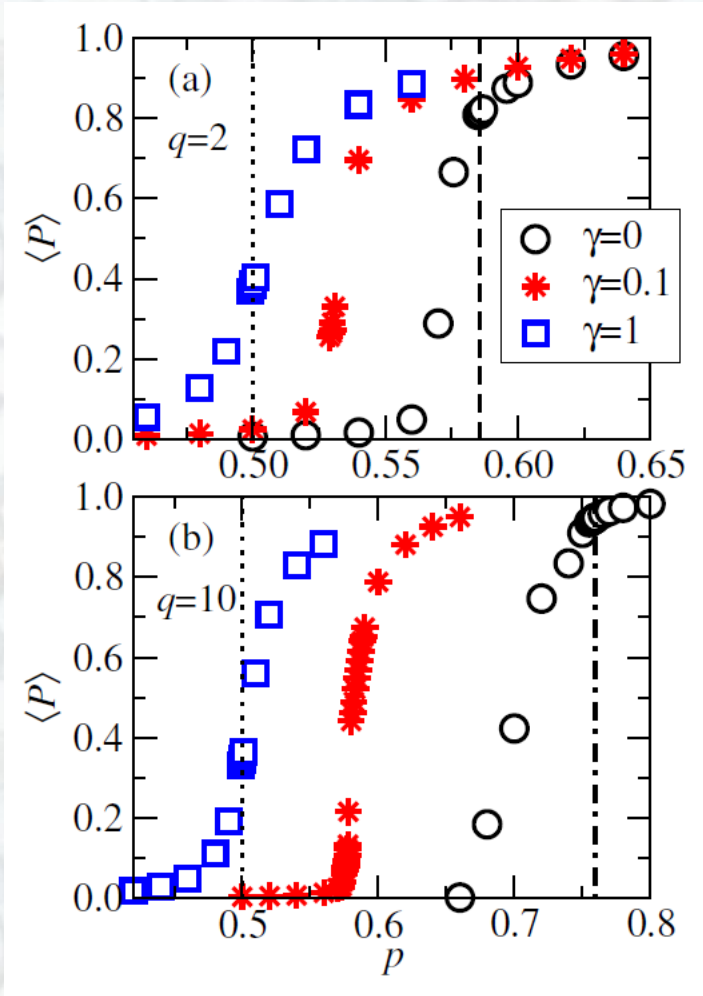
$$p = 0.59$$

$$\gamma = 0.1$$

$$\gamma = 1$$



Metallic Breakdown



Connecting the Disconnected



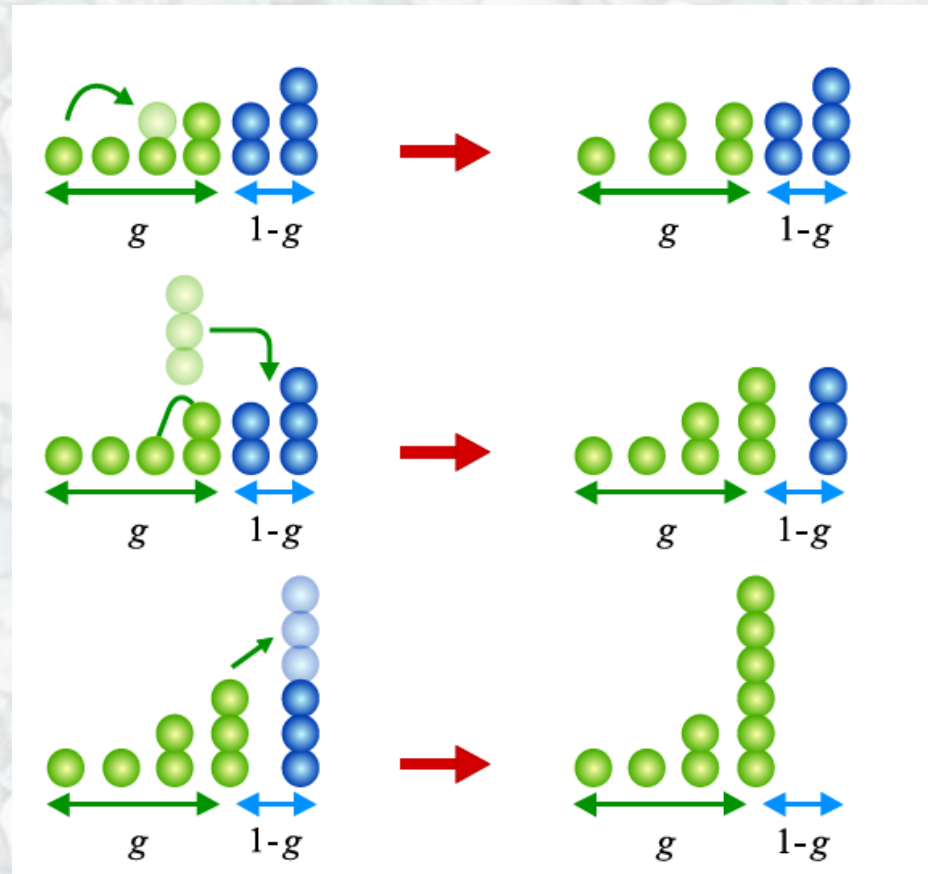
Young-Sul Cho



Byungnam Kahng

Y.S. Cho, J.S. Lee, H.J.H., B. Kahng, preprint 2015

Connect randomly individuals but with a law imposing that every new connection must at least involve one individual belonging to the fraction g of the most disconnected population.

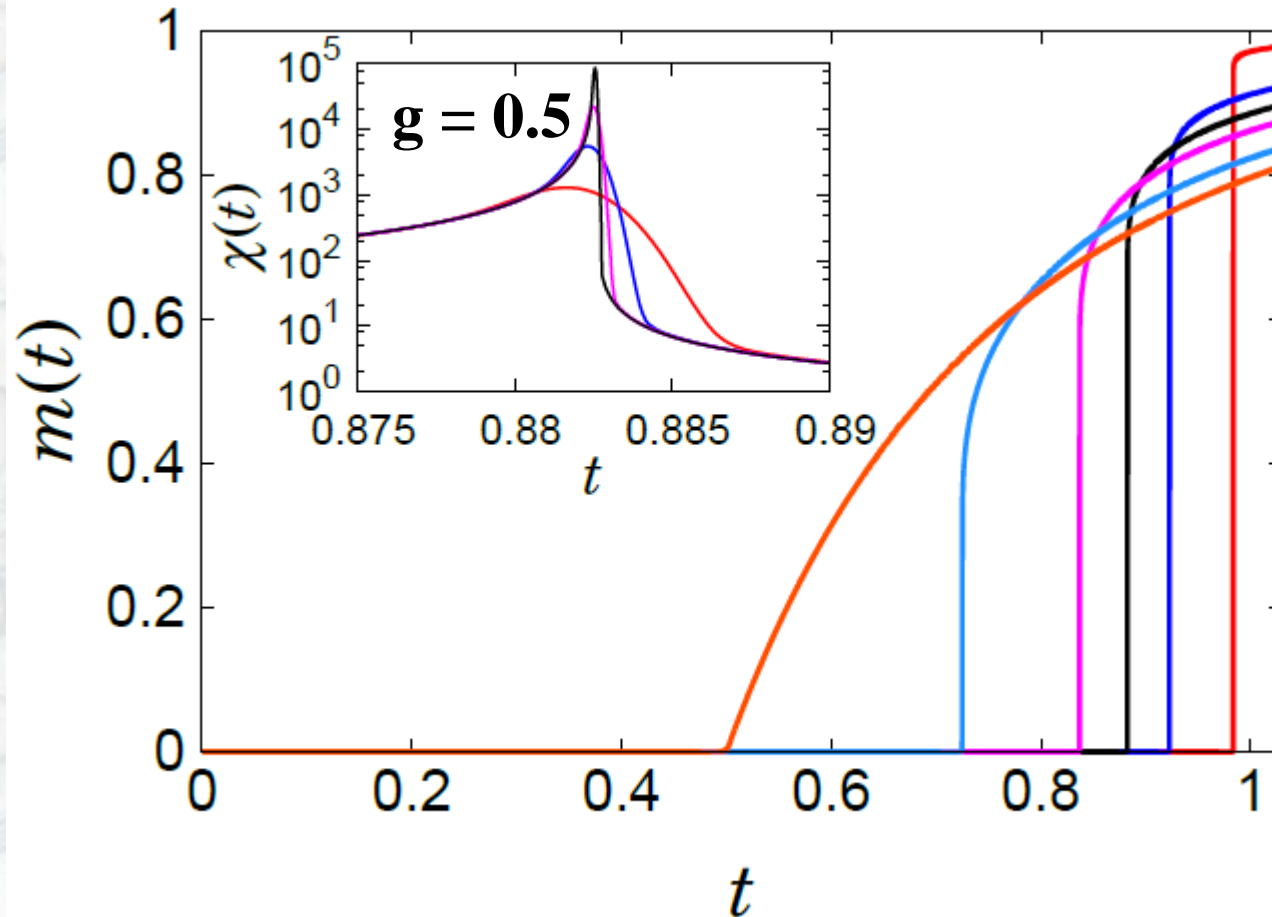


Y.S. Cho, J.S. Lee, H.J.H., B. Kahng, preprint 2015

- Start with N isolated individuals.
- R is the subset of sites belonging to the k clusters following

$$N_{k-1}(t) < [gN] \leq N_k(t) \quad \text{with} \quad N_k(t) = \sum_{l=1}^k s_l(t)$$

- At each step select uniformly at random one node from R and the other from the entire system.



**Hybrid
Transition**

$g = 1, 0.8, 0.6, 0.5, 0.4, 0.2 ; N = 4096$

Hybrid Transition

$$m(t) = \begin{cases} 0 & \text{for } t < t_c \\ m_0 + r(t - t_c)^\beta & \text{for } t \geq t_c \end{cases}$$

g	τ^*	τ
0.1	2.012	2.03 ± 0.04
0.2	2.061	2.08 ± 0.04
0.3	2.111	2.12 ± 0.04
0.4	2.155	2.16 ± 0.04
0.5	2.194	2.18 ± 0.04
0.6	2.231	2.20 ± 0.04
0.7	2.268	2.22 ± 0.04
0.8	2.310	2.25 ± 0.04
0.9	2.364	2.28 ± 0.04

In mean-field the cluster size exponent

$$2 < \tau < 2.5$$

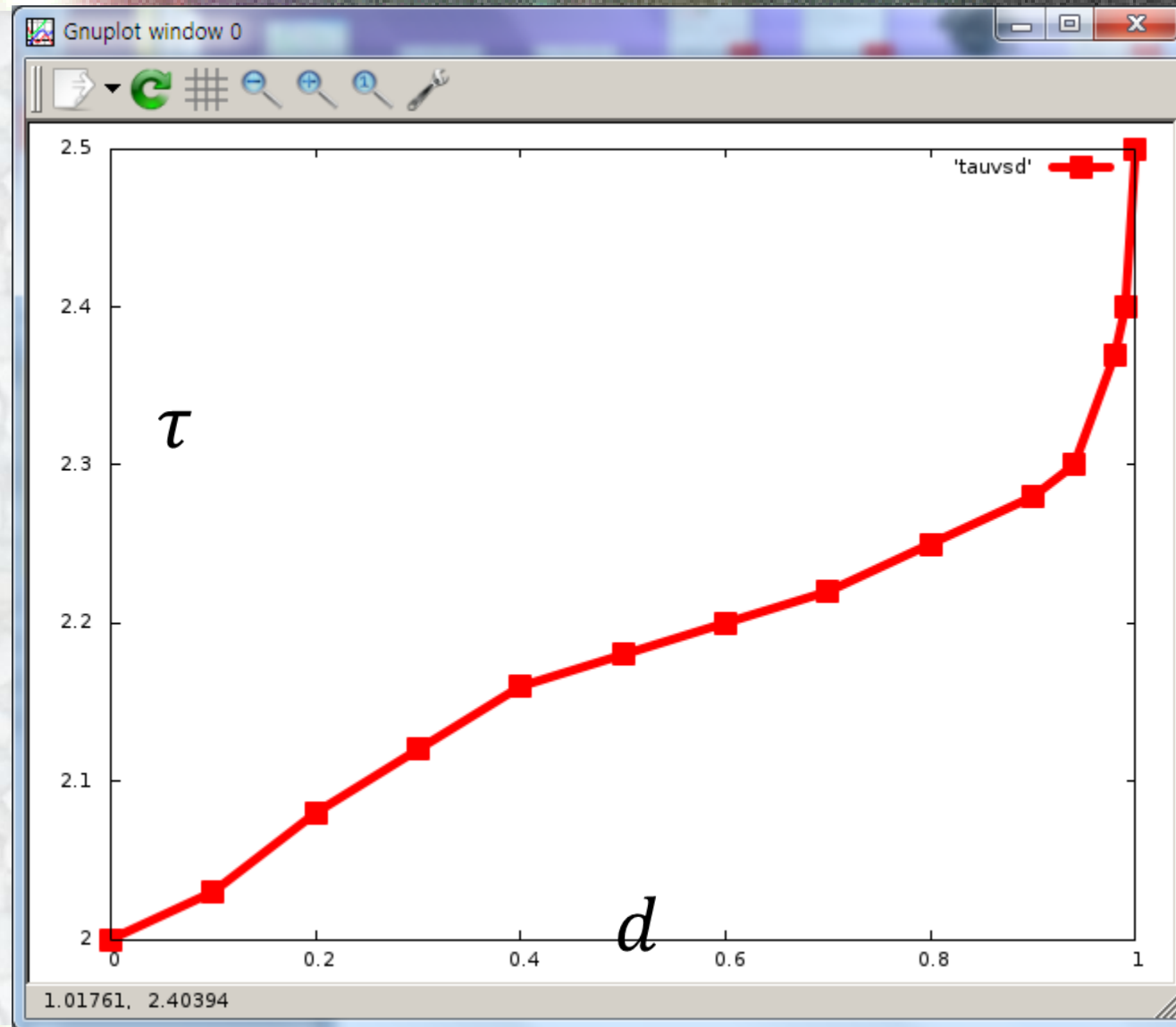
varies continuously with g as:

$$\frac{\zeta(\tau)}{\zeta(\tau - 1)} = \frac{1}{g} - \frac{1}{g + 1} \ln \left(\zeta(\tau - 1) \left(\frac{g + 1}{2} \right)^{-\left(1 + \frac{1}{g}\right)} \right)$$

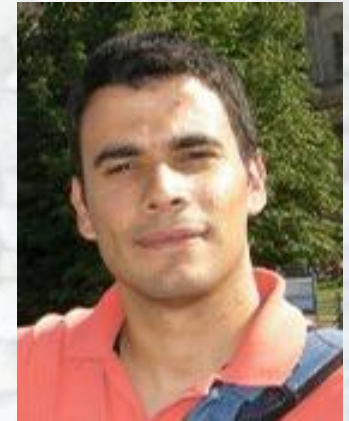
Y.S. Cho, J.S. Lee, H.J.H., B. Kahng, preprint 2015

Connecting the Disconnected

d	τ
0.1	2.03 ± 0.04
0.2	2.08 ± 0.04
0.3	2.12 ± 0.04
0.4	2.16 ± 0.04
0.5	2.18 ± 0.04
0.6	2.2 ± 0.04
0.7	2.22 ± 0.04
0.8	2.25 ± 0.04
0.9	2.28 ± 0.04
0.94	2.3 ± 0.04
0.98	2.37 ± 0.04
0.99	2.4 ± 0.04



Epidemy with Global Budget



Dirk Helbing

Lucas Böttcher

Olivia Wooley-Meza

Nuno Araújo

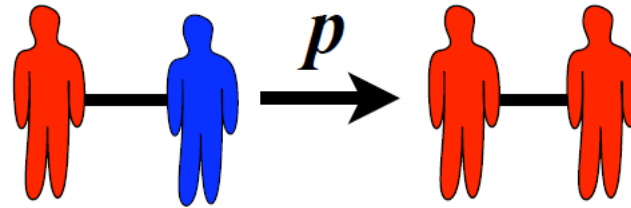
Endogenous resource constraints trigger explosive pandemics

**L. Böttcher, O. Wooley-Meza, N.A.M. Araújo, H.J.H., D. Helbing
preprint**

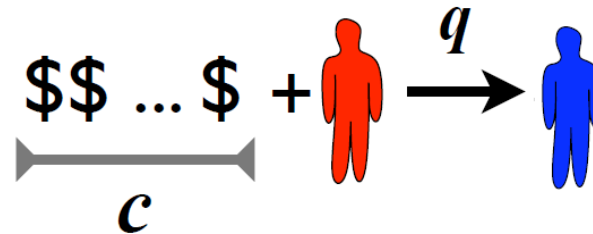
Epidemy with Global Budget

Budget-constrained Susceptible-Infected-Susceptible (bSIS) model

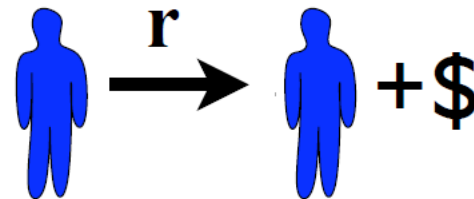
contact



recovery

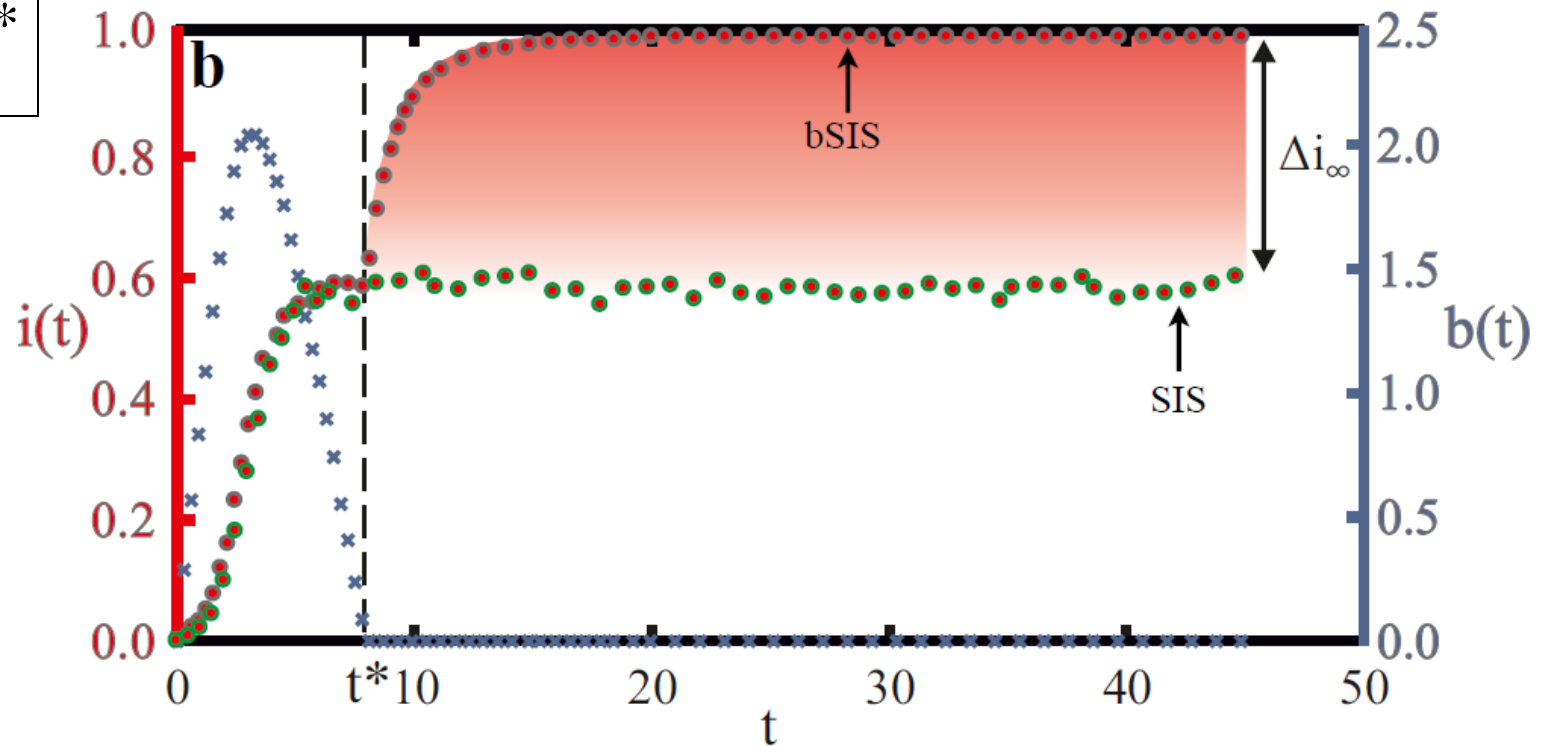


generation

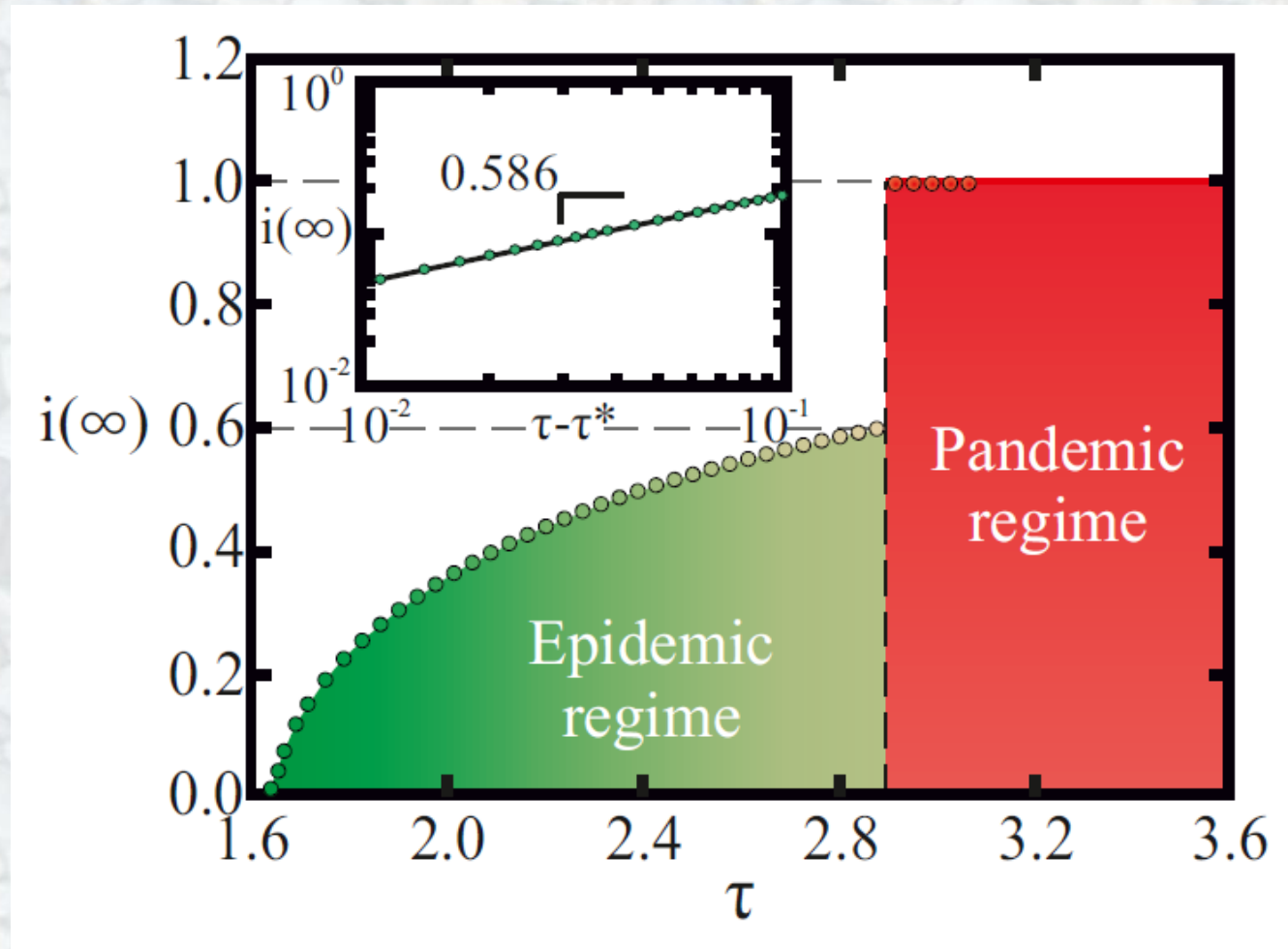


Time evolution in the epidemic regime:

$$\tau > \tau^*$$



Square lattice



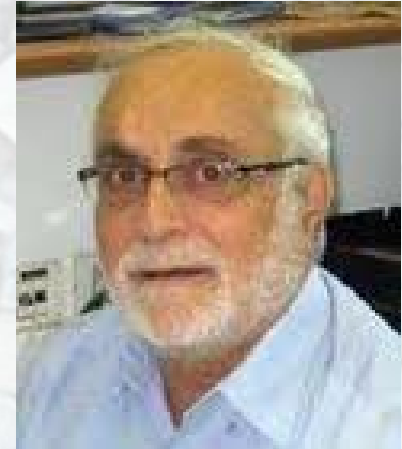
Coupled Networks



Nuno Araújo



Christian Schneider



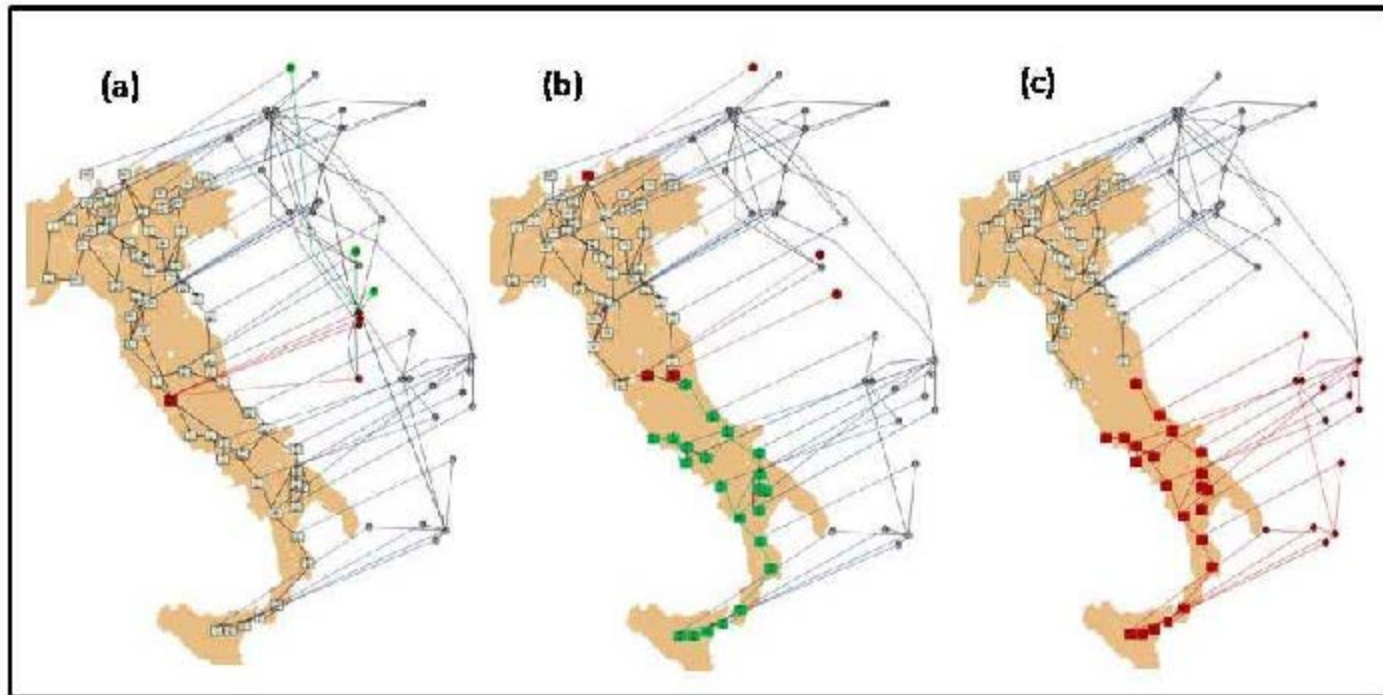
Shlomo Havlin

C. Schneider, N. Yazdani, N. Araújo, S. Havlin, HJH, Sci. Rep. 3, 1969 (2013)

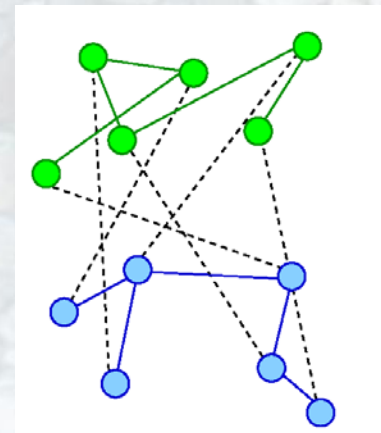
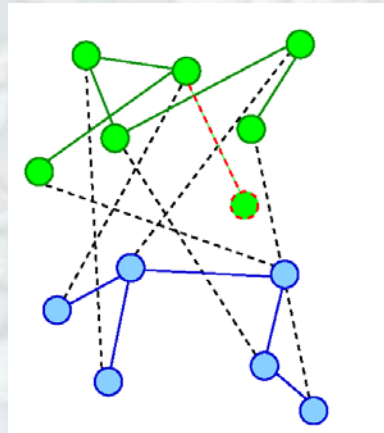
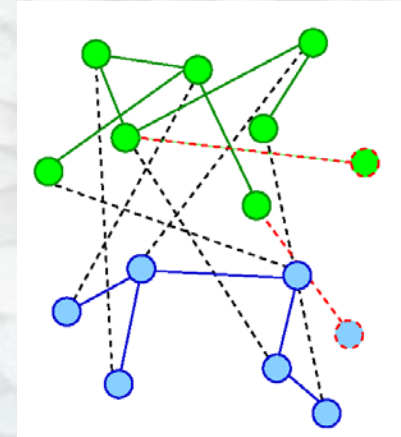
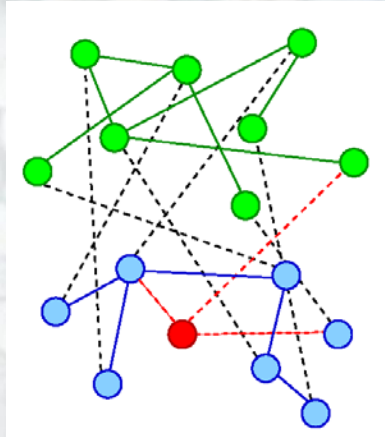
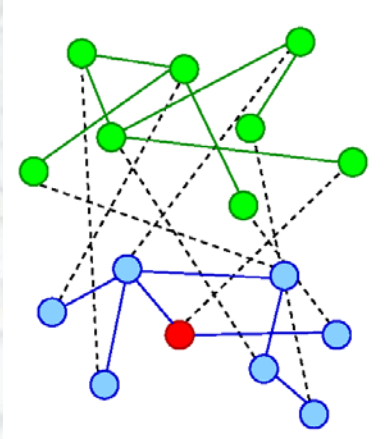
Coupled Networks

C. Schneider, N. Yazdani, N. Araújo, S. Havlin, HJH, Sci. Rep. 3, 1969 (2013)

The 2033 blackout in Italy and Switzerland

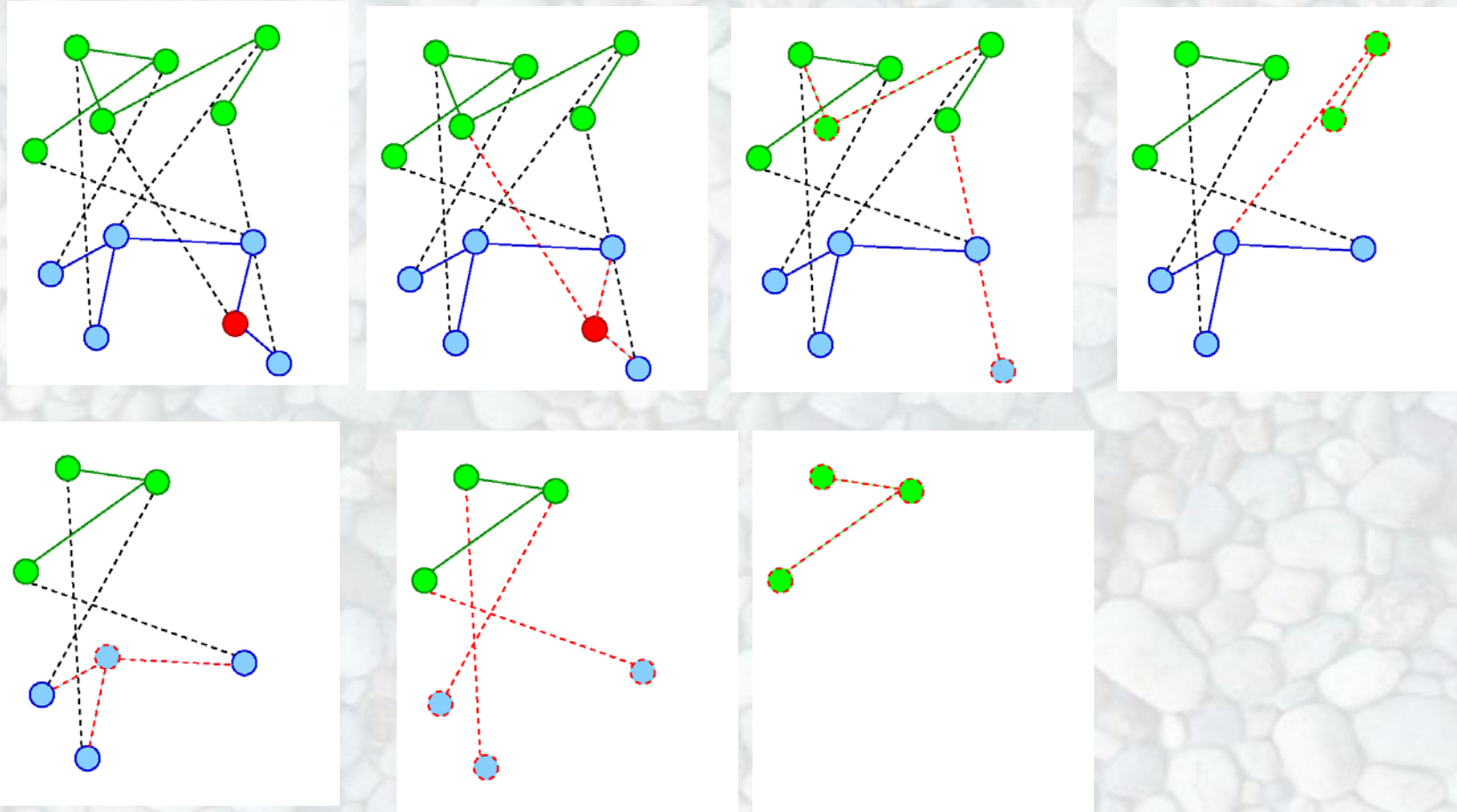


Collapse of Coupled Networks



S. V. Buldyrev, R. Parshani, G. Paul, H. E. Stanley, S. Havlin. *Nature* 464, 1025 (2010)

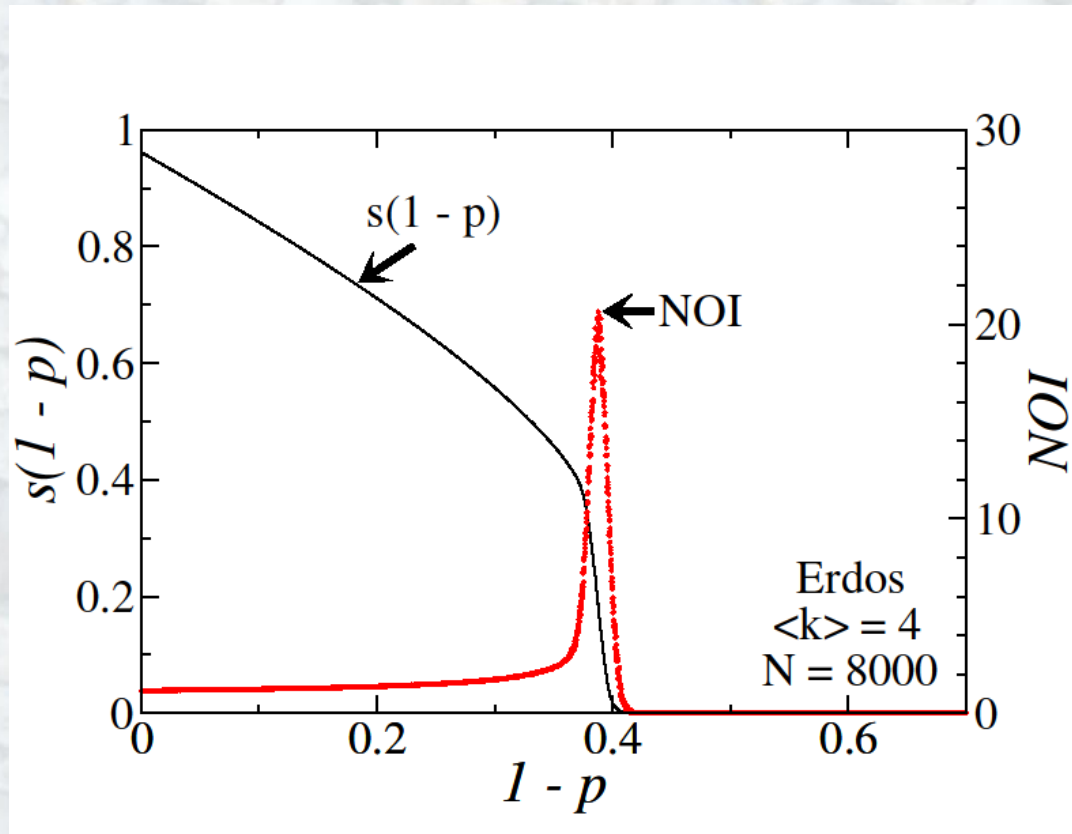
Collapse of Coupled Networks



S. V. Buldyrev, R. Parshani, G. Paul, H. E. Stanley, S. Havlin. *Nature* 464, 1025 (2010)

Collapse of Coupled Networks

Largest
cluster



Number of
iterations

Fraction of attacked nodes

Summary

Three Ways of creating Jump in P_∞

- **Compress the p -axis (e.g. by culling)**
- **Suppress the formation of a spanning cluster**
- **Increase the formation of internal bonds**

The Product Rule does the two last ones but not strongly enough.