

# From mafia expansion to analytic functions in percolation theory

Agelos Georgakopoulos



Joint work with John Haslegrave,  
and with Christoforos Panagiotis

A “social” network evolves in  
(continuous or discrete)  
time according to the following rules

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**It is finite almost surely**

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**finite** in the synchronous case,  
we **don't know** in the asynchronous case

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Theorem (G & Haslegrave (thanks to G. Ray), 18+)

*As time goes to infinity, the distribution of the component of a designated vertex converges (to a random graph  $M(\lambda)$ ).*

How does the expected size depend on  $\lambda$ ?

# The expected size of $M(\lambda)$

Let  $\chi(\lambda) := \mathbb{E}(|M(\lambda)|)$

Theorem (G & Haslegrave '18+)

$$e^{c\lambda} \leq \chi(\lambda) \leq e^{e^{C\lambda}}$$



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Is  $\chi(\lambda)$  continuous in  $\lambda$ ?

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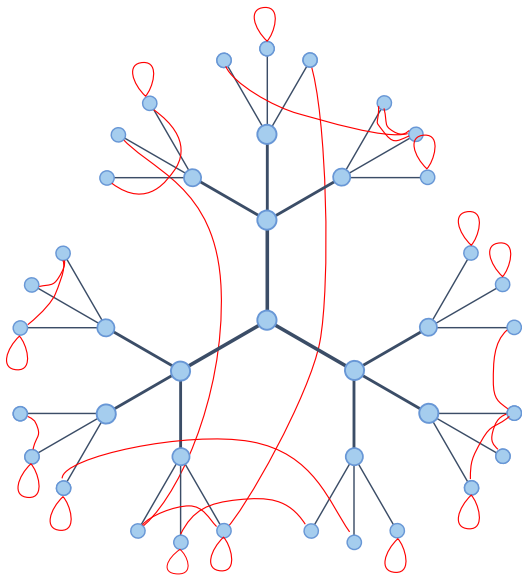
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Percolation ...

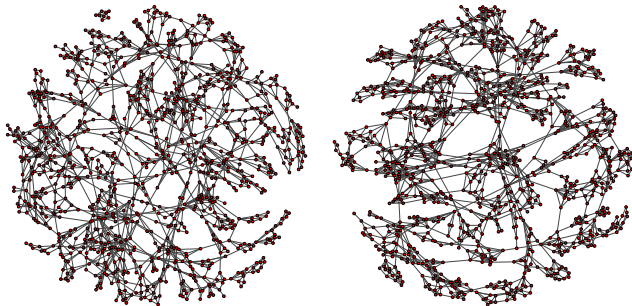


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Simulations by C. Moniz.



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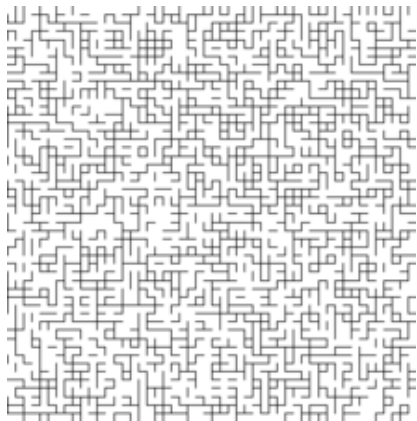
**Theorem (Newman & Schulman, Aizenman & Newman '86)**

*In long range percolation on  $\mathbb{Z}$ , percolation occurs for large enough  $\lambda$  iff  $s \leq 2$ .*





# Percolation model



Bernoulli bond percolation on an infinite graph, i.e.

Each edge

-present with probability  $p$ ,

and

-absent with probability  $1 - p$

independently of other edges.

Percolation threshold:

$$p_c := \sup\{p \mid \mathbb{P}_p(\text{component of } o \text{ is infinite}) = 0\}$$



# Historical remarks on percolation theory

## Classical era:

Introduced by physicists Broadbent & Hammersley '57

$p_c(\text{square grid}) = 1/2$  (Harris '59 + Kesten '80)

Many results and questions on phase transitions, continuity, smoothness etc. in the '80s:

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Thought of as part of statistical mechanics

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Theorem ( $\Leftarrow$  Aizenman, Kesten & Newman '87,  
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See the textbooks [Lyons & Peres '15], [Pete '18+] for more.

## Back to classics: analyticity below $p_c$

$$\chi(p) := \mathbb{E}_p(|C(o)|),$$

i.e. the expected size of the component of the origin  $o$ .

### Theorem (Kesten '82)

*$\chi(p)$  is an analytic function of  $p$  for  $p \in [0, p_c)$  when  $G$  is a lattice in  $\mathbb{R}^d$ .*

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Proved by extending  $p$  and  $\chi(p)$  to the complex numbers, and using classical complex analysis (Weierstrass).

# Some complex analysis basics

**Theorem (Weierstrass):** Let  $f = \sum f_n$  be a series of analytic functions which converges uniformly on each compact subset of a domain  $\Omega \subset \mathbb{C}$ . Then  $f$  is analytic on  $\Omega$ .

**Weierstrass M-test:** Let  $(f_n)$  be a sequence of functions such that there is a sequence of 'upper bounds'  $M_n$  satisfying

$$|f_n(z)| \leq M_n, \forall z \in \Omega \quad \text{and} \quad \sum M_n < \infty.$$

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## Theorem (Aizenman & Barsky '87)

*In every vertex-transitive percolation model,*

$$\mathbb{P}_p(|C| > n) \leq c_p^{-n},$$

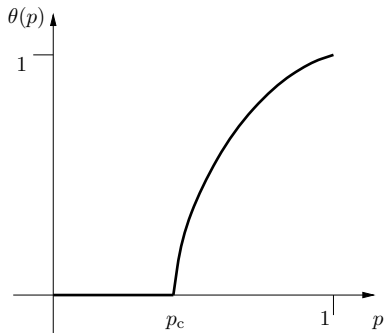
*for every  $p < p_c$  and some  $c_p > 1$ .*

# Conjectures on the percolation probability

$\theta(p) := \mathbb{P}_p(|C| = \infty)$ ,  
i.e. the percolation probability.

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*Geoffrey Grimmett*



*Fig. 1.1.* It is generally believed that the percolation probability  $\theta(p)$  behaves roughly as indicated here. It is known, for example, that  $\theta$  is infinitely differentiable except at the critical point  $p_c$ . The possibility of a jump discontinuity at  $p_c$  has not been ruled out when  $d \geq 3$  but  $d$  is not too large.

# $\theta(p)$ analytic?

Open problem:

Is  $\theta(p)$  analytic for  $p > p_c$ ?

Appearing in the textbooks Kesten '82, Grimmett '96,  
Grimmett '99.

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- $p_C \leq 1/2$  on certain families of triangulations.  
– progress on questions of Benjamini & Schramm '96, and Benjamini '16.

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*'...this is not just an academic matter. For instance, there are examples of disordered systems in statistical mechanics that develop a Griffiths singularity, i.e., systems that have a phase transition point even though their free energy is a  $C^\infty$  function.'*

–Braga, Proccaci & Sanchis '02

## Theorem (Hardy & Ramanujan 1918)

*The number of partitions of the integer  $n$  is of order*

$$\exp(\sqrt{n}).$$

Elementary proof: [P. Erdős, *Annals of Mathematics* '42]

# Finitely presented Cayley graphs

Theorem:  $p_{\mathbb{C}} < 1$  for every finitely presented Cayley graph.

Similar arguments, but we had to generalise *separating curves* to all graphs.

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