# 18.177: Lecture 3 Critical percolation

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### Outline

#### Recollections

Exponential decay

Intuition when d is very large

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### Recall

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- Consequence of lack of atoms above p<sub>c</sub> for time vertex joins infinite cluster: θ(p) continuous on [p<sub>c</sub>, 1].
- Consequence of FKG: Can't have both infinite cluster/dual-cluster when d = 2. Thus θ(1/2) = 0, p<sub>c</sub> ≥ 1/2.

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- You say, "There's at least a tiny positive chance that there's a squirrel somewhere."
- I say, "Any sufficiently large box has probability at least .99999 of being infested by positive density of squirrels."

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#### Exponential decay in sub-critical regime

► Claim: If  $p < p_c$  then there is a  $\psi(p) > 0$  such that  $P_p(A_n) < e^{-n\psi(p)}$  where  $A_n$  is event  $C \not\subset \Lambda_n$ .

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- This claim now implies Kesten's theorem, that  $p_c = 1/2$ .
- Proof requires some new tools.

#### Another fundamental tool: Russo's formula

Consider event A depending on finitely many vertices and look at P<sub>p</sub>(A) as a function of p.

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▶ Derivative <u>∂</u><sub>p</sub> P<sub>p</sub>(A) = E<sub>p</sub>(N(A)) where N(A) is number of edges *pivotal* for A.

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• Thus 
$$\frac{\partial}{\partial p} P_p(A)$$
 is  $p^{-1} E_p(N(A); A)$ .

## Exponential decay (per Grimmett pages 88 to 102)

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- $g_{\alpha}(n) = g_{\beta}(n) \exp\left(-\int_{\alpha}^{\beta} \frac{1}{p} E_{p}(N(A_{n})|A_{n})dp\right)$
- If we can can show E<sub>p</sub>(N(A<sub>n</sub>)|A<sub>n</sub>) grows roughly linearly in n when p < p<sub>c</sub> (the bound should hold uniformly for an interval of p values), then this will imply that when p < p<sub>c</sub> there is a ψ(p) > 0 such that P<sub>p</sub>(A<sub>n</sub>) < e<sup>-nψ(p)</sup>.

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- ▶ Write M = max{k : A<sub>k</sub> occurs}. Idea: try to show that number N(A<sub>n</sub>) (conditioned on A<sub>n</sub>) is at least as large as number of renewals of renewal process whose elements have approximately same distribution as M. We'd like the individual sausages to be smaller than copies of M.

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- It's kind of annoying that we don't even know a priori that M has finite expectation. We'll have to find some sort of bootstrapping trick for getting around this eventually.

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- ▶ Lemma: fix k > 0, integers  $r_1, r_2, ..., r_k$  such that  $\sum_{i=1}^{k} r_i \le n k$ . Then

$$P_p(\rho_k \leq r_k, \rho_i = r_i \text{ for } 1 \leq i < k | A_n) \geq$$

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We have to have at least two disjoint paths up to starting point of first pivotal edge. BK inequality implies P<sub>p</sub>({ρ<sub>1</sub> > r<sub>2</sub>} ∩ A<sub>n</sub>) ≤ P<sub>p</sub>(A<sub>r1+1</sub>)P<sub>p</sub>(A<sub>n</sub>).

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- Extend to the general case.

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- Summing over k we obtain

$$E_p(N(A_n)|A_n) \ge \sum_{k=1}^{\infty} P(M_1 + \ldots + M_k \le n)$$

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where  $K = \min\{k : M_1 + ... + M_k > n\}$ .

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where  $K = \min\{k : M_1 + \ldots + M_k > n\}$ . •  $E(K) > \frac{n}{E(M_1)} = \frac{n}{1 + E(\min\{M_1, n\})} = \frac{n}{\sum_{i=0}^{n} g_P(i)}$ .

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- Plugging this into earlier formula lets us show that ∑<sub>n=1</sub><sup>∞</sup> g<sub>α</sub>(n) < ∞ for α < p<sub>c</sub>, and complete the exponential decay proof.

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- Get approximately a critical Galton-Watson tree with Poisson offspring numbers.
- Expect to have lots of large tree like clusters intersecting the n<sup>d</sup> box.
- Heuristically, tree with k vertices should have a longest path of length  $\sqrt{k}$ . Is distance of tip from origin about  $k^{1/4}$ ?