

# Bootstrap Percolation in Random Geometric Graphs

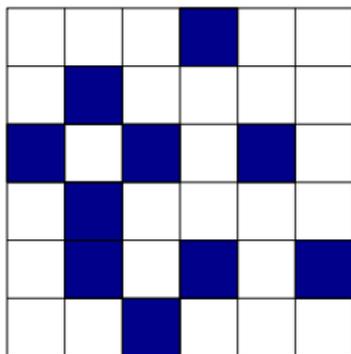
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Western Washington University

2 November 2022

Joint work with Victor Falgas-Ravry (Umeå University)

## Bootstrap percolation (Chalupa, Leath, Reich 1979)



Start with an  $n \times n$  grid  $S_n$

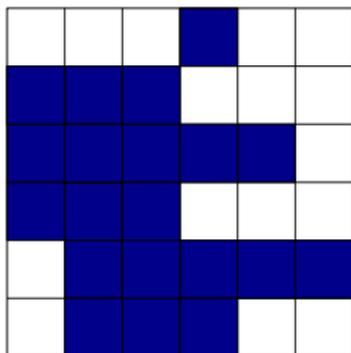
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Repeat to get  $A_2, A_3, \dots$

What is  $A_\infty = \bigcup_{t \geq 0} A_t$ ? Is it  $S_n$ ?

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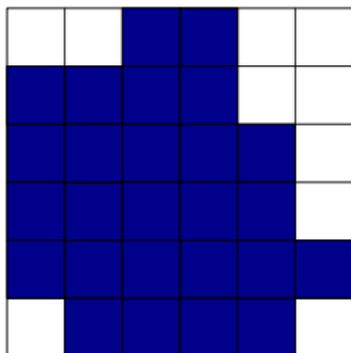
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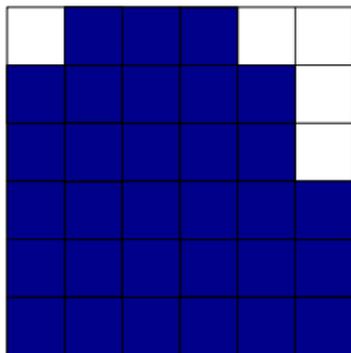
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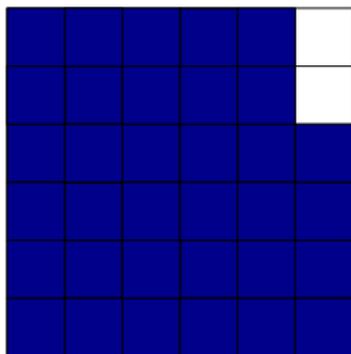
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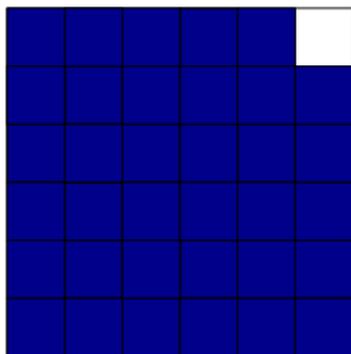
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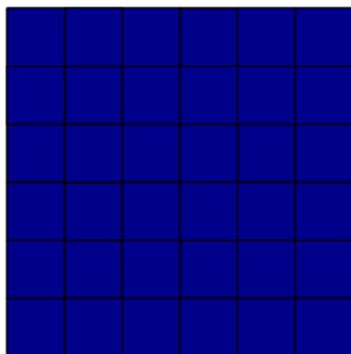
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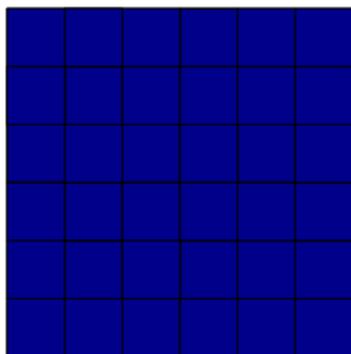
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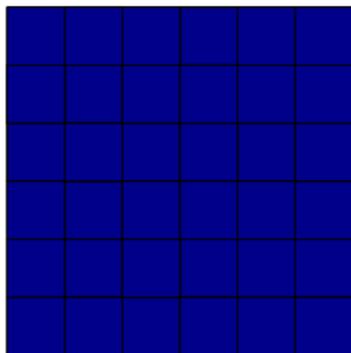
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Holroyd (2003) Sharp metastability threshold at  $p \log n = \pi^2/18$

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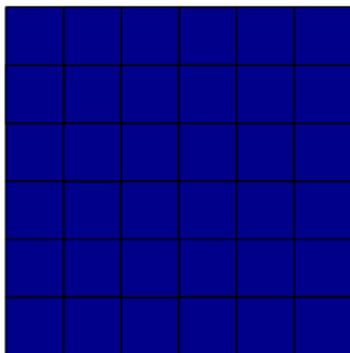
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Holroyd's results were extended to other dimensions  $d$  and thresholds  $s$  by Balogh, Bollobás, Duminil-Copin and Morris (2012)

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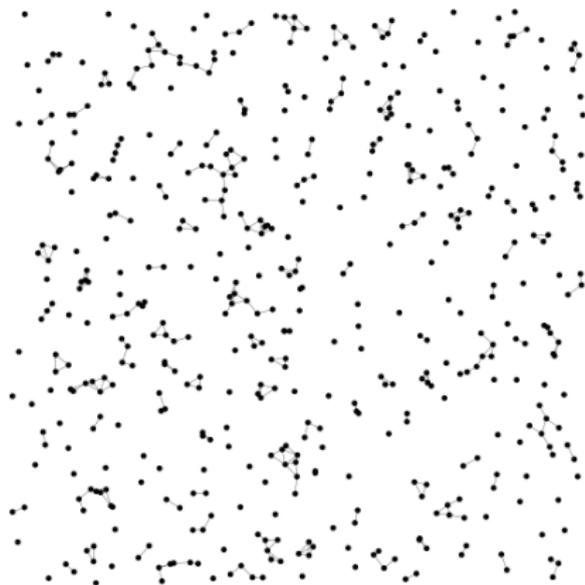
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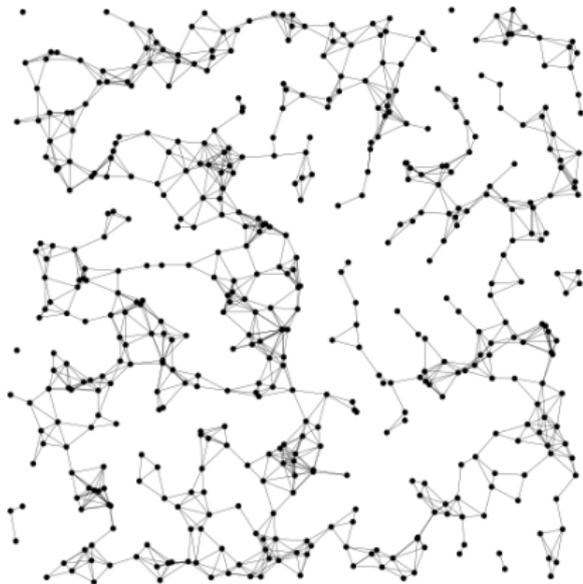
Janson, Łuczak, Turova and Vallier (2012) studied the model on Erdős-Rényi random graphs  $G(n, q)$

## Random geometric graphs (Gilbert 1961)



Vertices (nodes) are a Poisson process of intensity 1  
Edges join vertices at distance less than  $r$   
Gilbert's motivation: communications networks

## Percolation

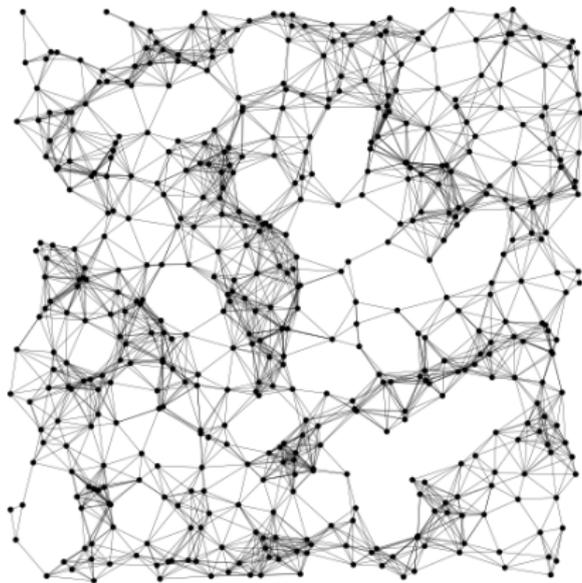


Hall (1985)  $0.833 < r_{\text{perc}} < 1.836$

Balister, Bollobás and Walters (2005)  $1.1978 < r_{\text{perc}} < 1.1989$

- semi-rigorous, high confidence result

## Connectivity



Penrose (1997)  $\pi r_{\text{conn}}^2(n) = \log n$

Obstruction to connectivity: isolated vertices

At the threshold,  $\mathbb{E}(\text{isolated vertices}) = 1$

## The Bradonjić-Saniee model (2014)

Start with the Gilbert model in a torus  $T_n$  of area  $n$ , above the connectivity threshold

$$\pi r^2 = a \log n \text{ with } a > 1$$

Initially infect vertices independently with probability  $p$ : this is  $A_0$   
Each vertex expects

$a \log n$  neighbors

$ap \log n$  infected neighbors

$A_t$  := set of infected vertices at time  $t$

In each discrete time step ( $t = 1, 2, \dots$ )

For each  $v \notin A_t$  (i.e. each uninfected  $v$ )

If  $v$  has at least  $a\theta \log n$  infected neighbors

- $v$  becomes infected (and stays infected forever)

Repeat for each vertex  $v$  to get  $A_{t+1}$

Repeat for each  $t$  to get  $A_\infty$

What proportion  $|A_\infty|/n$  of the graph eventually becomes infected?

## Motivation

- Activation of neurons
- Economic networks
- Social networks
- Spread of viruses

## Mathematical motivation

Extend methods developed to study connectivity in:

- the Gilbert model
- the  $k$ -nearest neighbor model

## The percolative regime

What if  $\pi r^2 = a$  and the infection threshold is  $k$ ?

### Theorem (Whittemore 2021)

Define

$$p^* = \frac{1}{n^{1/k} a^{1-1/k}}$$

Then for  $1 \ll a \ll n$  and  $p/p^* \rightarrow 0$  **whp** no initially inactive vertex becomes infected, but for  $1 \ll a \ll n$  and  $p/p^* \rightarrow \infty$  **whp** almost every initially uninfected vertex becomes infected.

### Theorem (Whittemore 2021)

For  $1 \ll a \ll n$  and  $p/p^* = \gamma$ , there exists  $\alpha = \alpha(\gamma)$  such that

$$\alpha \leq \mathbb{P}(A_1 \neq A_0) \leq 1 - \alpha$$

### Theorem (Bradonjić and Saniee 2014)

For  $x > 0$ , define

$$J(x) = \log x - 1 - 1/x$$

and write  $J_R^{-1}$  for the inverse of  $J$  on  $[1, \infty]$ . Then if

$$p < p' = \theta / J_r^{-1}(1/a\theta)$$

then no initially uninfected vertex becomes infected.

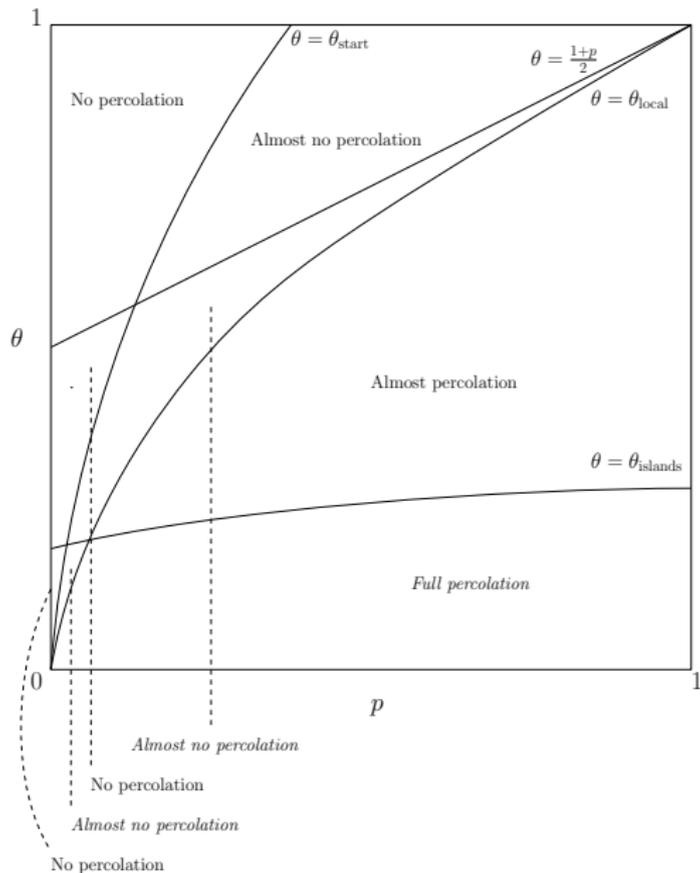
### Theorem (Bradonjić and Saniee 2014)

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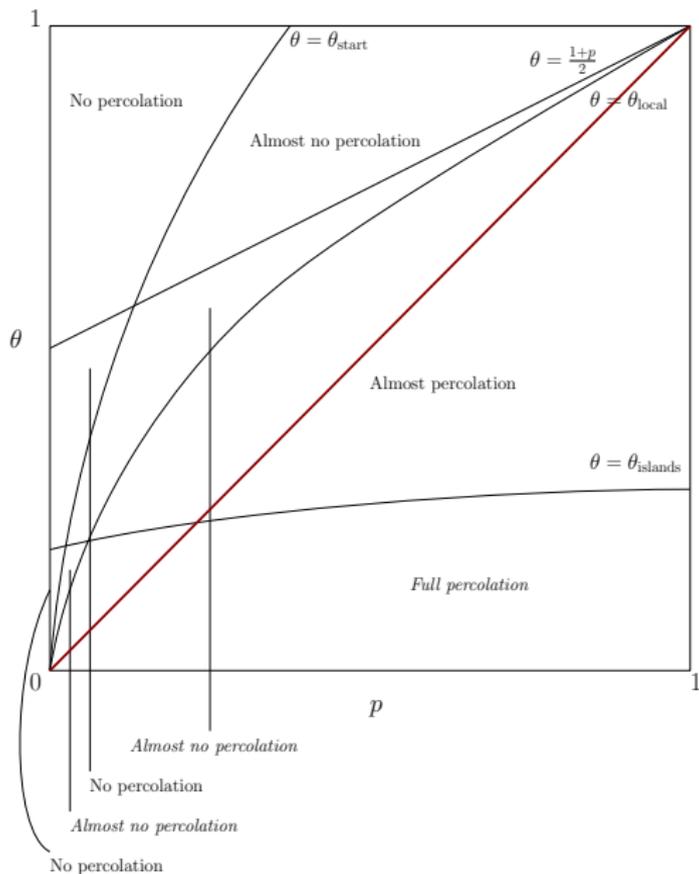
$$p > p'' = \min \left\{ \theta, \frac{5\pi\theta}{J_r^{-1}(1/a\theta)} \right\}$$

then every initially uninfected vertex becomes infected.

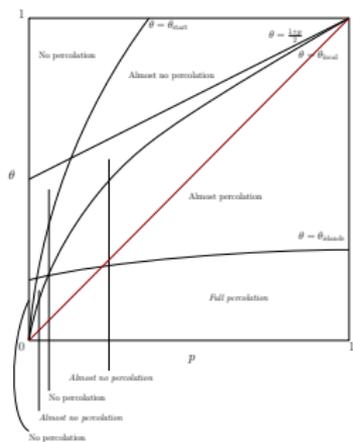
# Theorems (Falgas-Ravry and S 2022+)



## Basic orientation - the threshold $\theta = p$



## Basic orientation - the threshold $\theta = p$



If  $\theta < p$ , almost everything becomes infected immediately.

If  $\theta > p$ , almost no new infections occur initially.

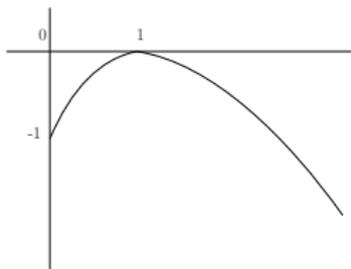
## A useful lemma

Let  $A \subset \mathbb{R}^d$  be measurable, and let  $\rho \geq 0$  be a real number such that  $\rho|A| \in \mathbb{Z}$ . Then the probability that a Poisson process in  $\mathbb{R}^d$  with intensity 1 has precisely  $\rho|A|$  points in the region  $A$  is given by

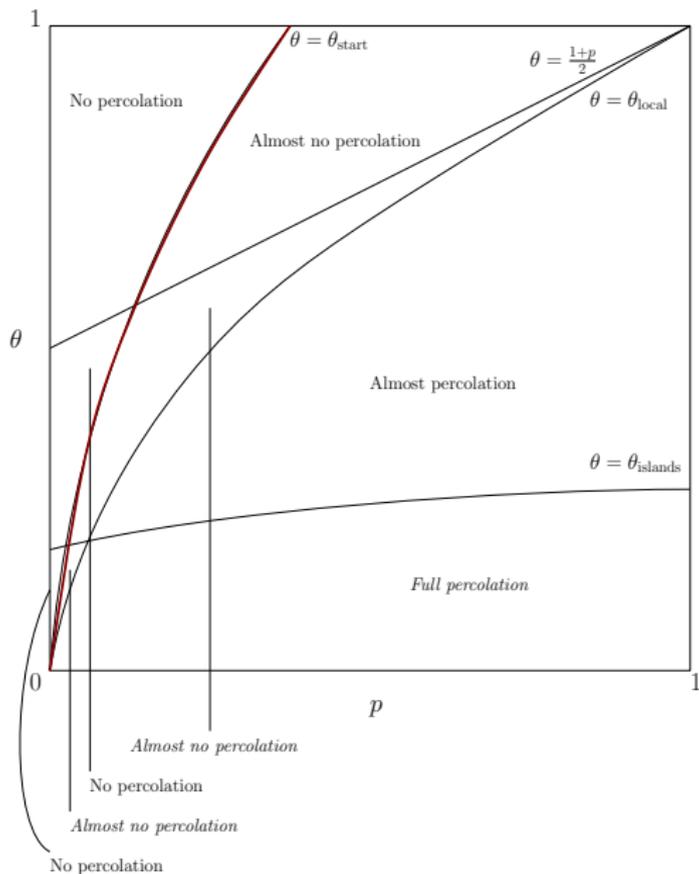
$$\exp \{ (\rho - 1 - \rho \log \rho) |A| + O(\log_+ \rho |A|) \}$$

with the convention that  $0 \log 0 = 0$ , and  $\log_+ x = \max(\log x, 1)$ . We will usually apply this lemma when  $|A| = C \log n$ , so that the relevant probability will be approximated by

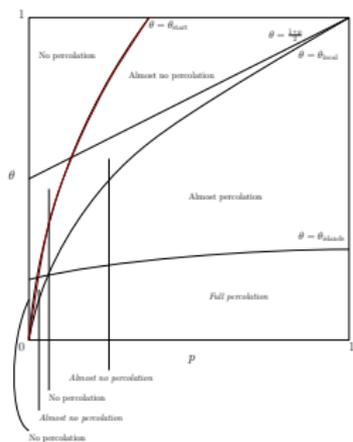
$$n^{-C(\rho-1-\rho \log \rho)}$$



# The starting threshold $\theta = \theta_{\text{start}}(p)$



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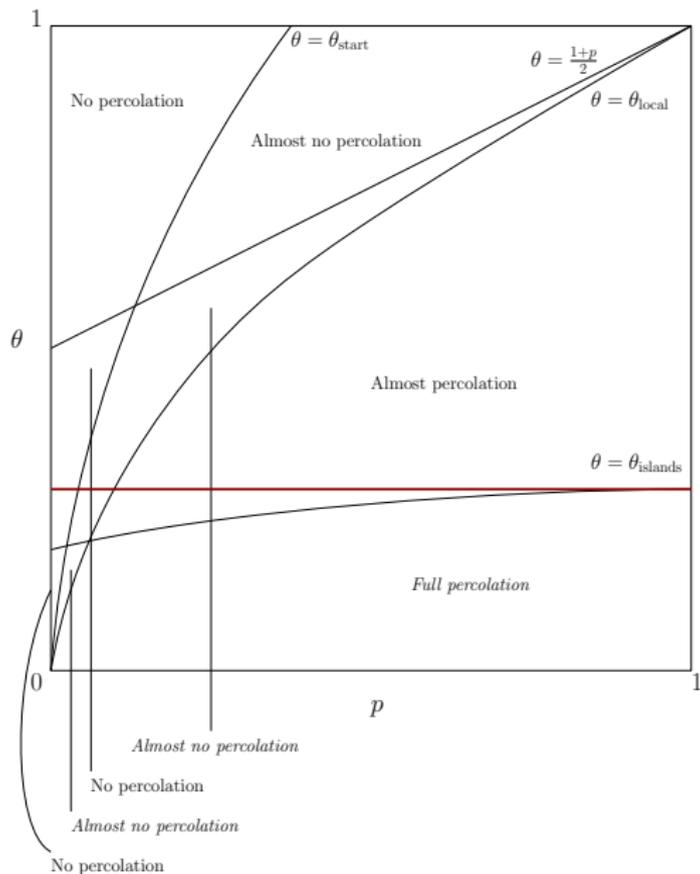


Sometimes, even when the threshold  $\theta$  is much greater than  $p$ , some uninfected vertices will see  $a\theta \log n$  infected neighbors, despite only expecting to see only  $ap \log n$ .

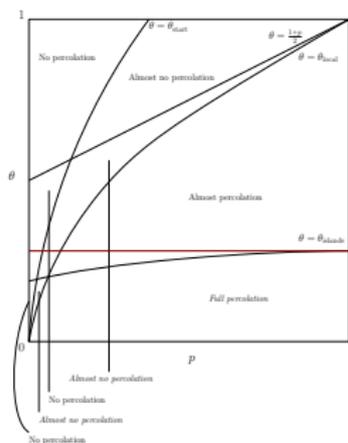
This will happen when

$$f_{\text{start}}(a, p, \theta) = a(p - \theta + \theta \log(\theta/p)) < 1$$

# The simple stopping threshold $\theta = \theta_{\text{stop}}$



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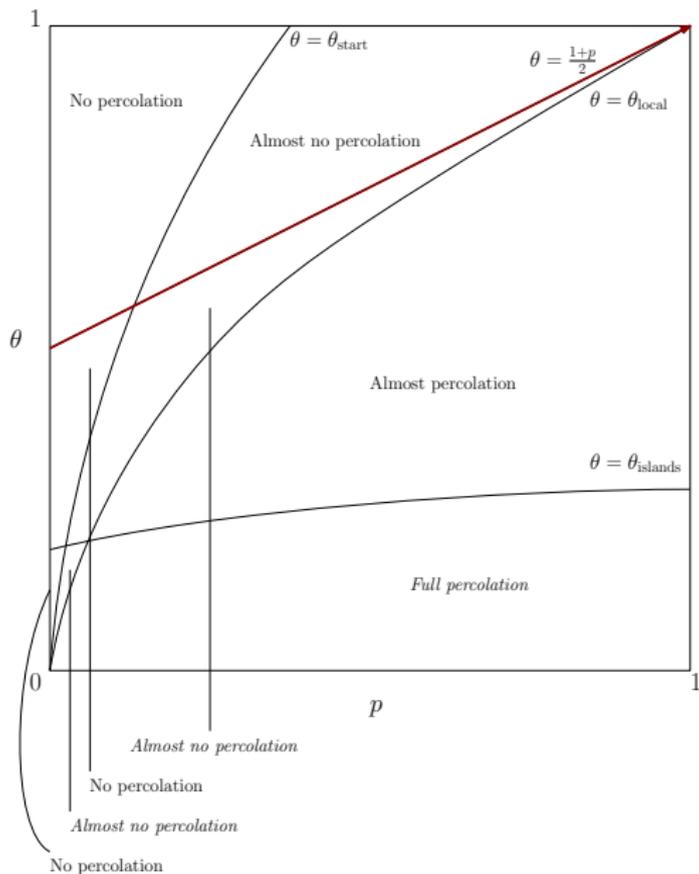


On the other hand, some initially uninfected vertices will not even have  $a\theta \log n$  neighbors, despite only expecting to see  $a \log n$ . These vertices can never become infected.

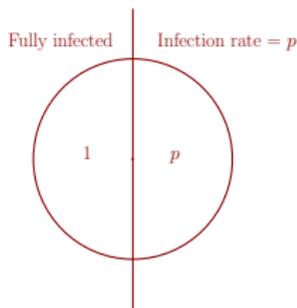
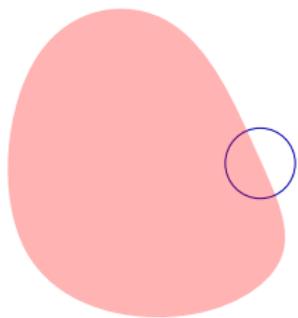
This will happen when

$$f_{\text{stop}}(a, \theta) = a(1 - \theta + \theta \log \theta) < 1$$

# The growing threshold $\theta = \frac{1+p}{2}$



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When infections have broken the logarithmic barrier, they will grow as long as

$$\theta < \frac{1+p}{2}$$

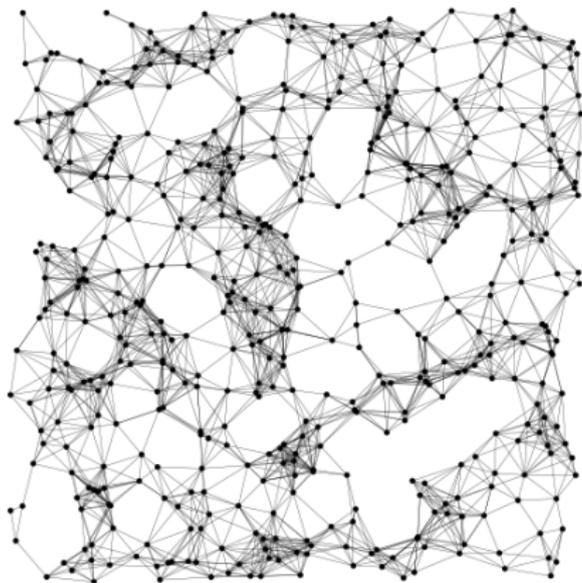
Though intuitive, this is nontrivial to prove.

## Main theorem

Let  $a, \theta, p$  be fixed. Then the following hold.

- 1 If  $\theta < \frac{1+p}{2}$ , then there exists a constant  $C = C(a, \theta, p)$  such that w.h.p. if any ball  $B$  in  $T_n^2$  of radius  $Cr$  is infected (either artificially or as a result of the bootstrap percolation process), then all but  $o(n)$  vertices of  $G_{n,r}^2$  eventually become infected. Furthermore, when the infection stops, all connected components of uninfected vertices in  $G_{n,r}^2[\mathcal{P} \setminus A_\infty]$  have Euclidean diameter  $O(\sqrt{\log n})$  in  $T_n^2$ .
- 2 If  $\theta > \frac{1+p}{2}$ , then for every constant  $C > 0$ , w.h.p. even if one adversarially selects a ball  $B$  in  $T_n^2$  of radius  $Cr$  and infects all the vertices it contains, only  $o(n)$  additional vertices of  $G_{n,r}^2$  become infected in the bootstrap percolation process starting from the initially infected set  $A_0 \cup (B \cap \mathcal{P})$ . Furthermore, all components of  $G_{n,r}^2[A_\infty \setminus (A_0 \cup B)]$  have Euclidean diameter  $O(\sqrt{\log n})$  in  $T_n^2$ .

## Connectivity



Penrose (1997)  $\pi r_{\text{conn}}^2(n) = \log n$

Obstruction to connectivity: isolated vertices

At the threshold,  $\mathbb{E}(\text{isolated vertices}) = 1$

## The isoperimetric argument for the Gilbert model in $T_n$

Suppose  $\pi r^2 = \log n$ .

Why are there no two large components in  $G_r(n)$ ?

Two vertices  $x$  and  $y$  of  $G_r(n)$  are joined iff  $\|x - y\| < r$ .

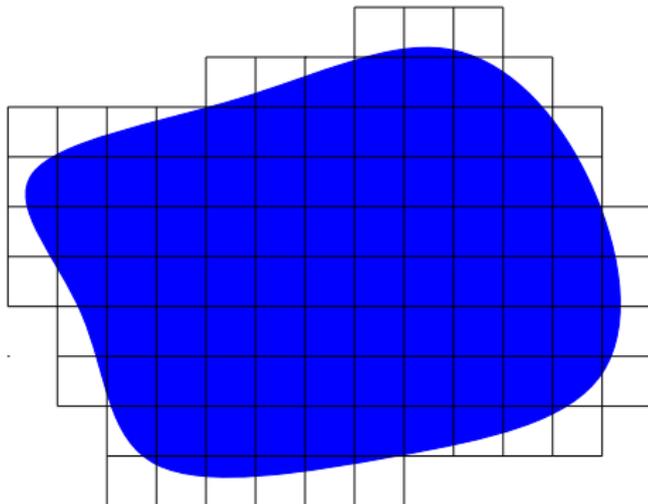
- Edges from different components of  $G_r(n)$  do not cross.
- Edges from different components of  $G_r(n)$  are separated by  $r/2$ .

Tessellate  $T_n$  with squares of side length  $r/\sqrt{20}$ .

Points in neighboring squares lie at distance at most  $r/2$ .

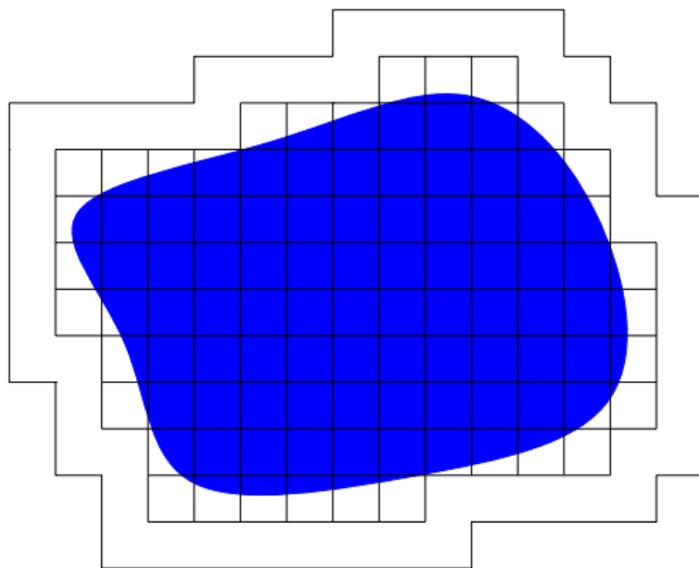
Color squares blue if they intersect an edge of a fixed large component of  $G_r(n)$ .

## The isoperimetric argument for the Gilbert model



Two large components in  $G_r$  are separated by a long boundary  $B$ .

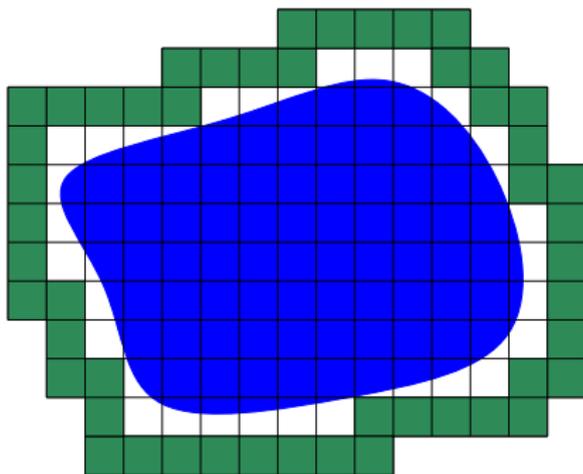
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$B$  yields a long *empty* external vertex boundary  $B_T$ .

## The isoperimetric argument for the Gilbert model



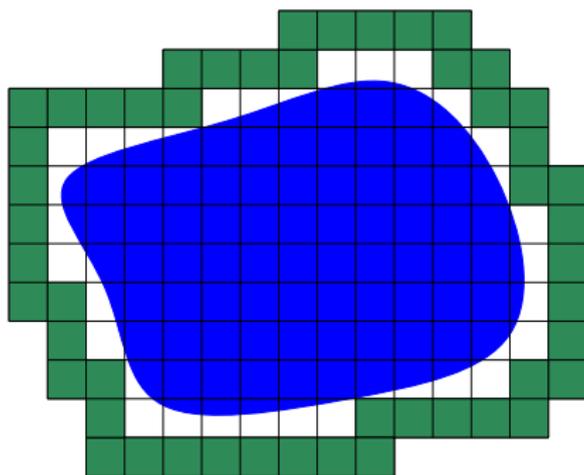
Suppose  $B_T$  consists of  $K \gg 1$  squares.

There are at most  $n(8e)^K$  choices for  $B_T$ .

Each square in  $B_T$  is empty with probability  $n^{-C}$ .

The expected number of such configurations is at most  $n(8e)^K n^{-CK} \rightarrow 0$  as  $n \rightarrow \infty$ , if  $K$  is sufficiently large.

## The Bradonjić-Saniee model when $\theta < \frac{1+p}{2}$



This time, the (frozen) boundary of a growing infection is not so well-defined.

On the boundary, there will be a mixture of infected and uninfected points.

Also, there need not be any vacant squares, just low-density regions.

## A tale of two tilings

Fine tiling  $\mathcal{F}$ : tiles of side length  $r/K, K \gg 1$

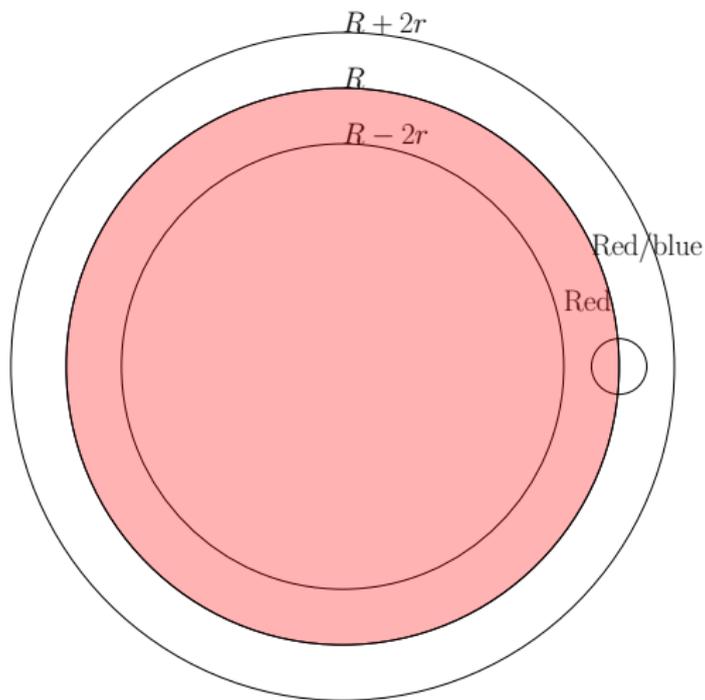
A fine tile  $T \in \mathcal{F}$  is coloured **white** if either it contains fewer than  $(1 - \eta)p|T|$  initially infected points, or fewer than  $(1 - \eta)|T|$  points in total. Otherwise, we colour  $T$  **red** if all its points are infected by the end of the bootstrap percolation process, and **blue** if this is not the case.

Rough tiling  $\mathcal{R}$ : tiles of side length  $Kr, K \gg 1$

A tile in  $\mathcal{R}$  is colored **white** if one of its subtiles in  $\mathcal{F}$  is coloured white, **red** if all its subtiles in  $\mathcal{F}$  are coloured red, and **blue** otherwise.  $\mathbb{P}(\text{rough tile is white}) = O(n^{-c})$ .

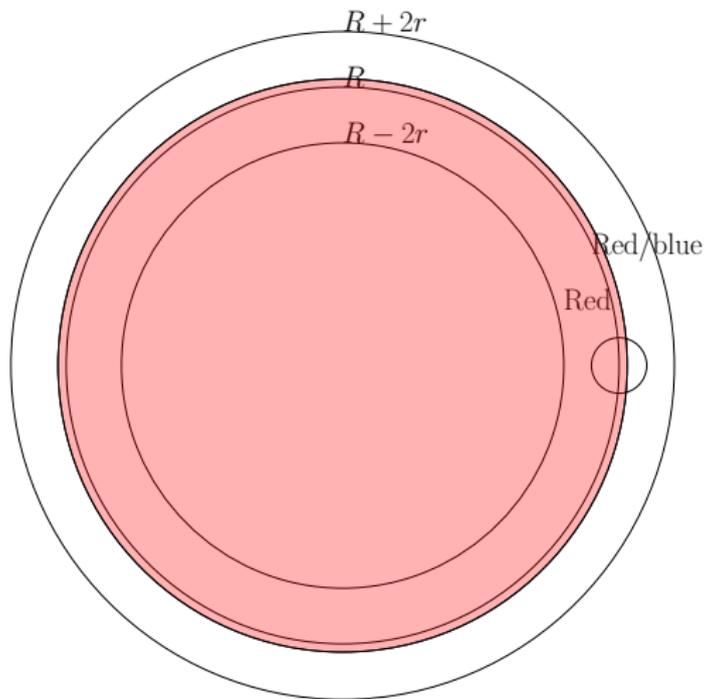
## The fine tiling $\mathcal{F}$

If a large circular component of fine red tiles has no fine white tiles in its vicinity



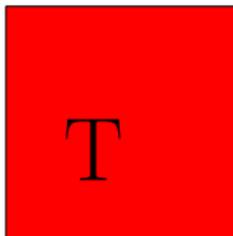
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If a large circular component of fine red tiles has no fine white tiles in its vicinity its radius expands by at least  $\delta r$ .



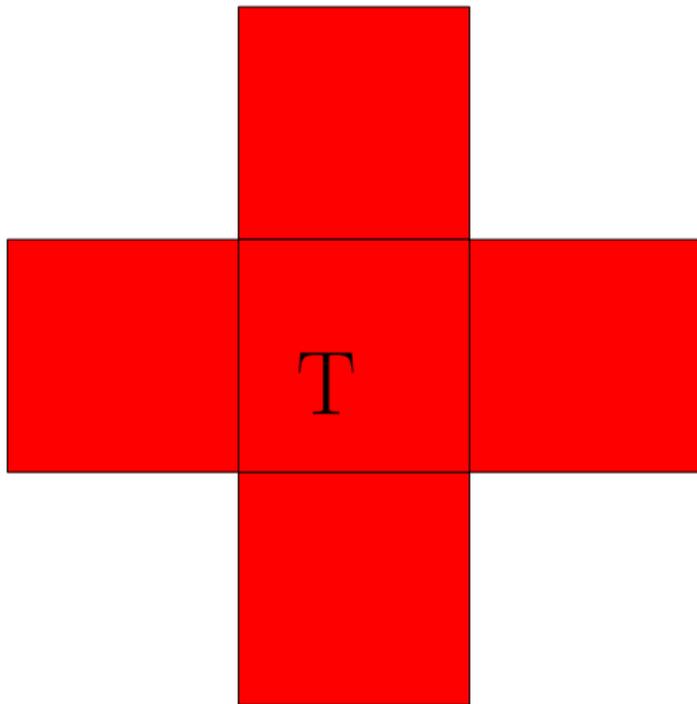
## The rough tiling $\mathcal{R}$

Suppose a rough tile  $T$  is red.



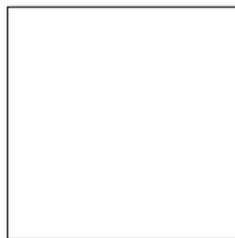
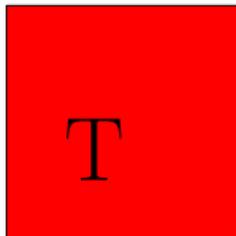
## The rough tiling $\mathcal{R}$

Then either all its neighbors are red...



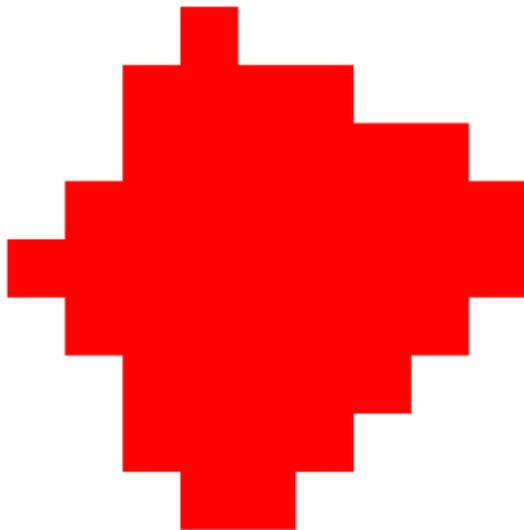
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or there is a white rough tile at graph distance at most 3 from  $T$ .



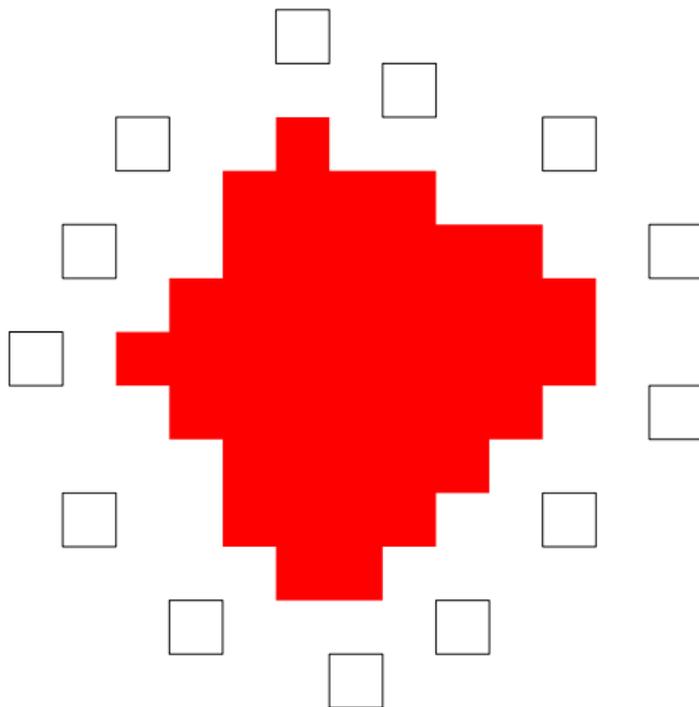
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Consequently, any large component of red rough tiles



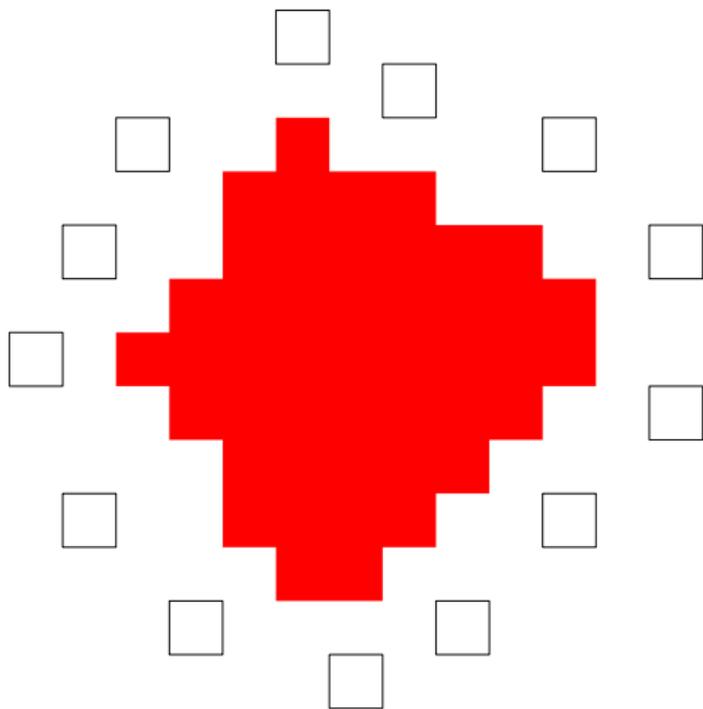
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Consequently, any large component of red rough tiles must be associated with a long cycle of white rough tiles in  $H^8$ .

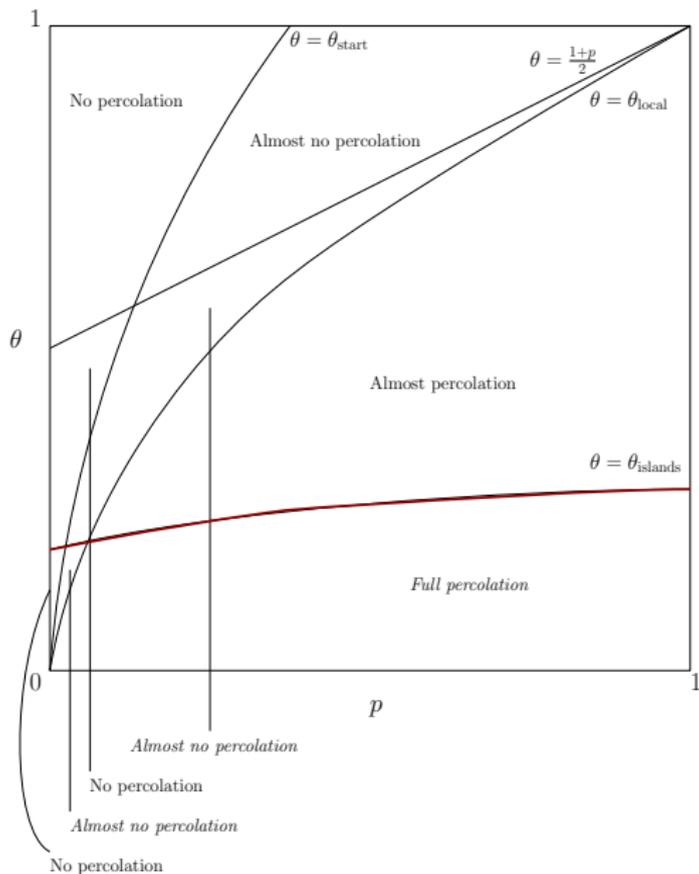


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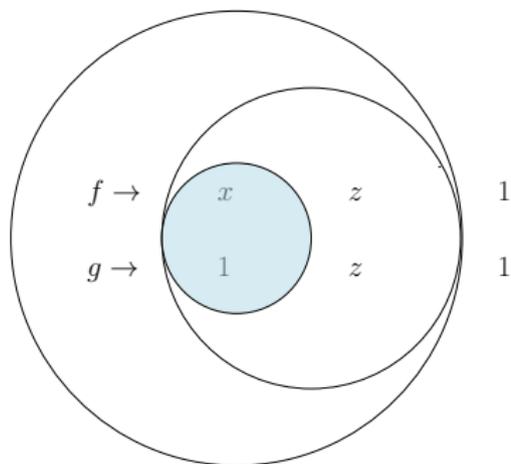
Consequently, any large component of red rough tiles must be associated with a long cycle of white rough tiles in  $H^{\circ}$ . This has probability  $o(n^{-1})$ , and so is unlikely to occur anywhere in  $T_n$ .



# The threshold for full percolation $\theta = \theta_{\text{islands}}(p)$



## An obstruction to full percolation with diameter $r$

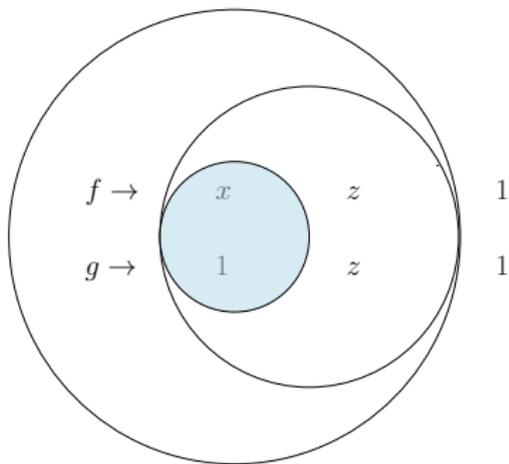


Condition for non-infectability:  $G(x, z) = 3z + px < 4\theta$

Probability of configuration:  $q = \exp \left\{ \frac{a \log n}{4} F(x, z) \right\}$

$F(x, z) = 8(z - 1 - z \log z) + p(x - 1 - x \log x)$

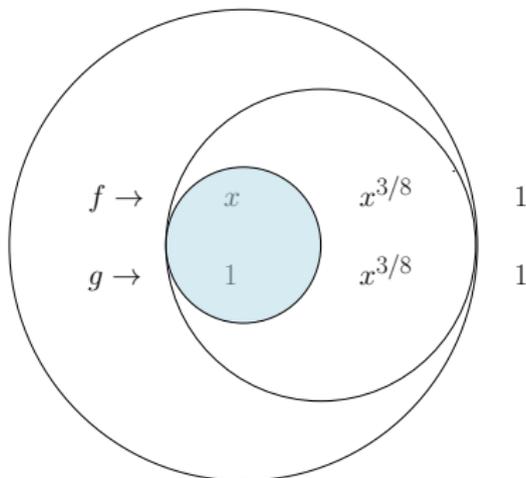
## An obstruction to full percolation with diameter $r$



Maximize:  $F(x, z) = 8(z - 1 - z \log z) + p(x - 1 - x \log x)$

subject to:  $G(x, z) = 3z + px = 4\theta$

## An obstruction to full percolation with diameter $r$

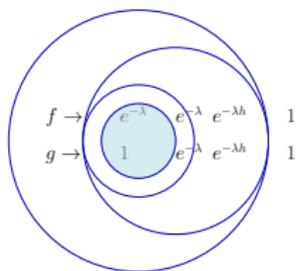


Solution:  $z = x^{3/8}$  (recall  $3z + px = 4\theta$ )

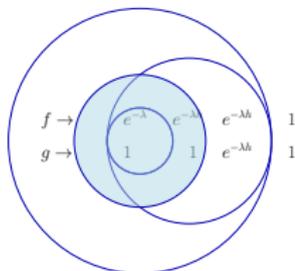
Threshold:

$$4 + a \left\{ 8(x^{3/8} - 1 - \frac{3}{8}x^{3/8} \log x) + p(x - 1 - x \log x) \right\} = 0$$

## The threshold for full percolation $\theta = \theta_{\text{islands}}(p)$



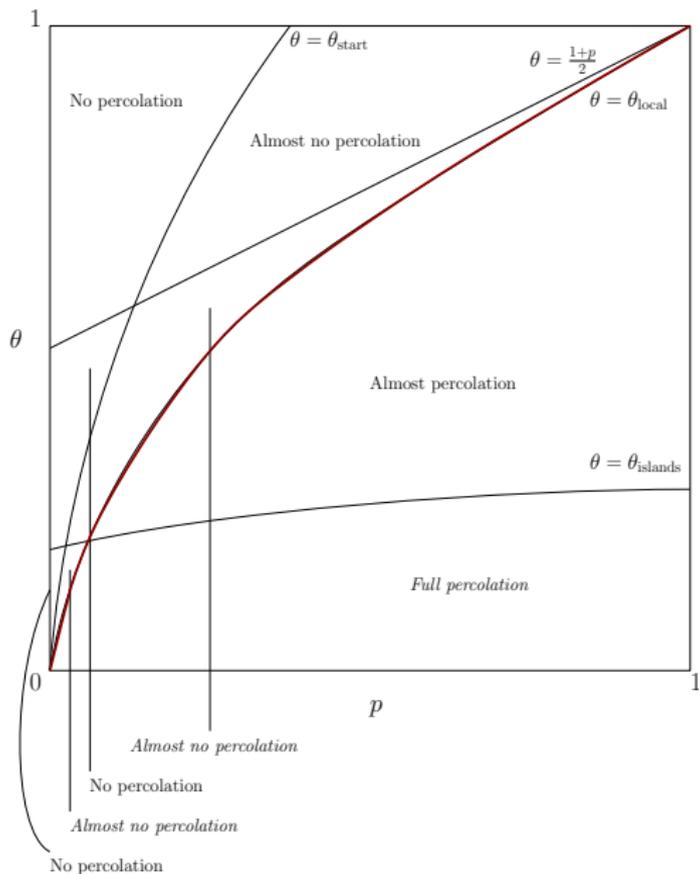
$$\tau \leq 1/2$$



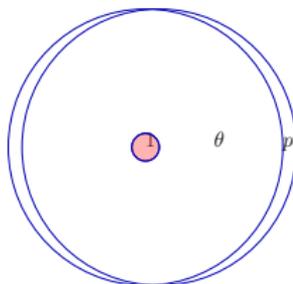
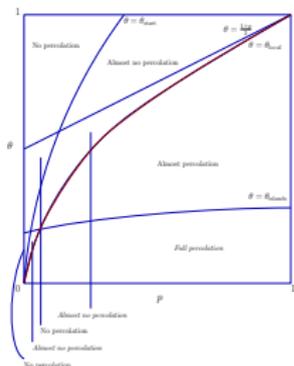
$$1/2 \leq \tau \leq 1$$

- Vary diameter  $D = 2\tau r$  and let densities  $f, g$  vary continuously
- For fixed  $\tau$ , optimize  $f, g$
- Then optimize over  $\tau$

# The local growth threshold $\theta = \theta_{\text{local}}(p)$



## The local growth threshold $\theta = \theta_{\text{local}}(p)$

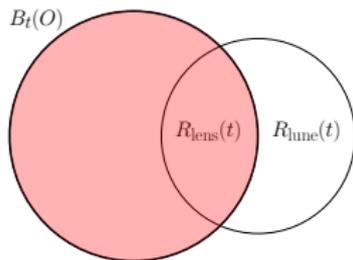


To break the logarithmic barrier, infections need to do more than just start.

They need to be able to expand beyond each radius  $\tau r$ .

This yields a Lagrange multiplier problem with **infinitely many conditions**.

## The local growth threshold $\theta = \theta_{\text{local}}(\rho)$



Find functions  $f, g$  which maximize

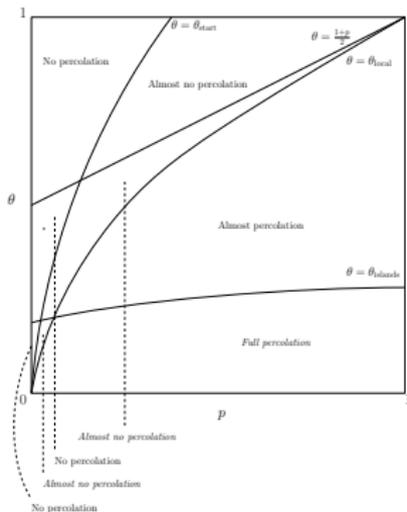
$$q(f, g) := \int_{x \in \mathbb{R}^2} \rho(f(\|x\|) - 1 - f(\|x\|) \log[f(\|x\|)]) + (1 - \rho)(g(\|x\|) - 1 - g(\|x\|) \log[g(\|x\|)]) dx$$

subject to

$$I(f, g)(t) := \int_{x \in R_{\text{lens}}(t)} (\rho f(\|x\|) + (1 - \rho)g(\|x\|)) dx + \int_{x \in R_{\text{lune}}(t)} \rho f(\|x\|) dx > \theta$$

for all  $t \geq 0$ .

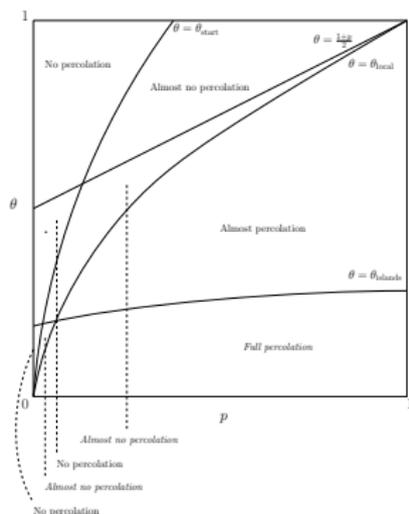
## What did we actually prove?



The local growth threshold is only a sufficient condition for local growth, and the islands threshold is only a necessary condition for full percolation.

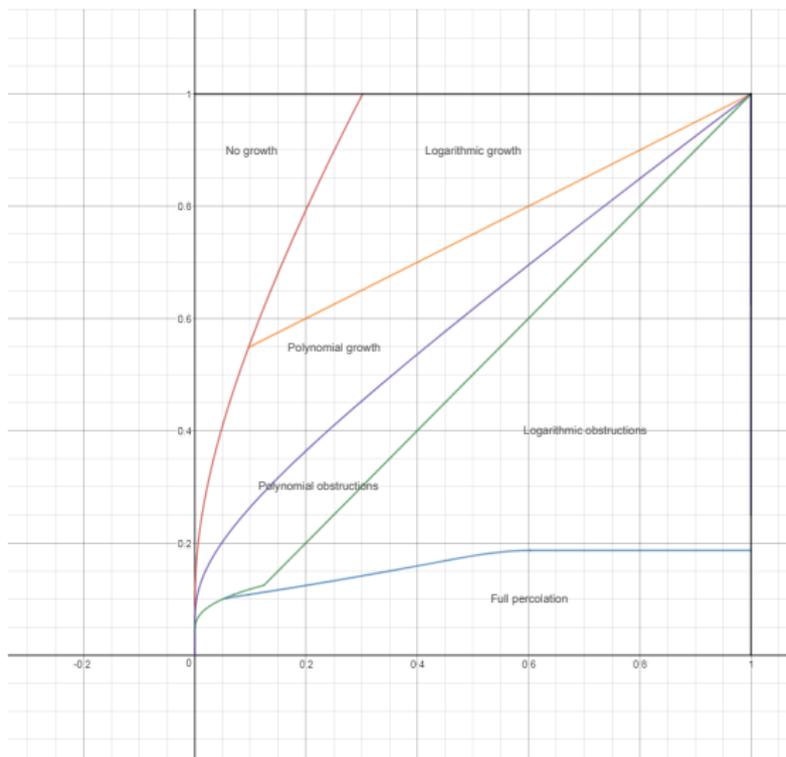
Accordingly, these thresholds only provide a lower bound for local growth and an upper bound for full percolation.

## The main open questions



- Prove that the local growth threshold is also a necessary condition for local growth, so that the solution to the above optimization problem yields the correct threshold for local growth.
- Prove that the symmetric islands described above are in fact the last obstacles to full percolation, so that the islands threshold is the correct threshold for full percolation.

# It's more complicated in one dimension



Thank you for your attention!