

# PERCOLATION Theory and Applications

Student: Guglielmo Grillo

Course: Multi-scale methods in soft  
matter physics [145889]



# Porous Stone

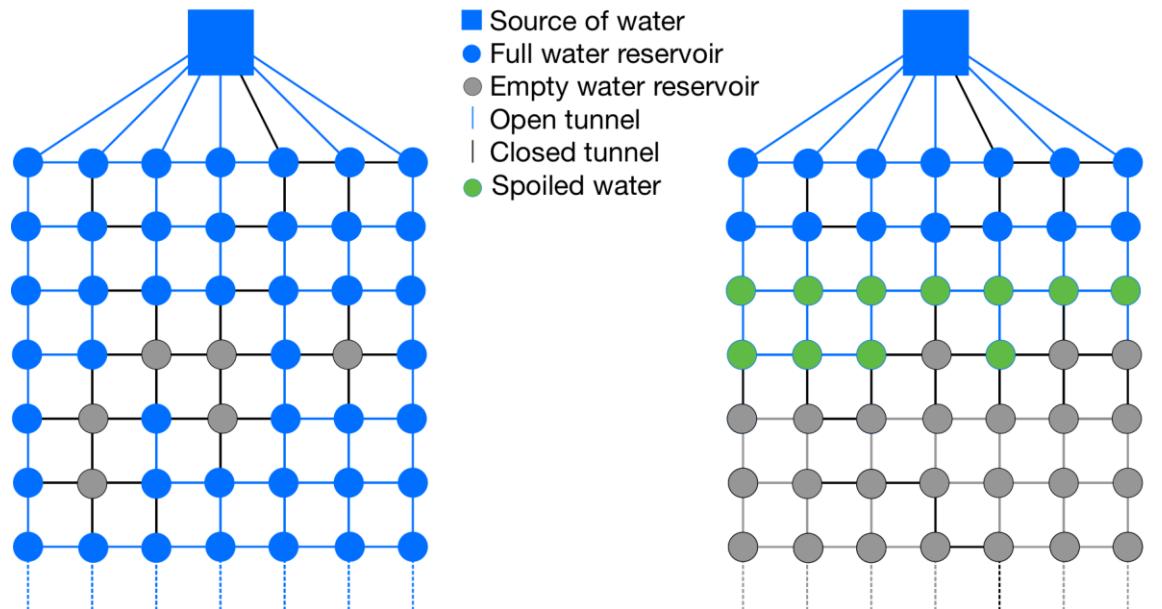
If a porous stone is immersed in water, which of its parts will get wet?

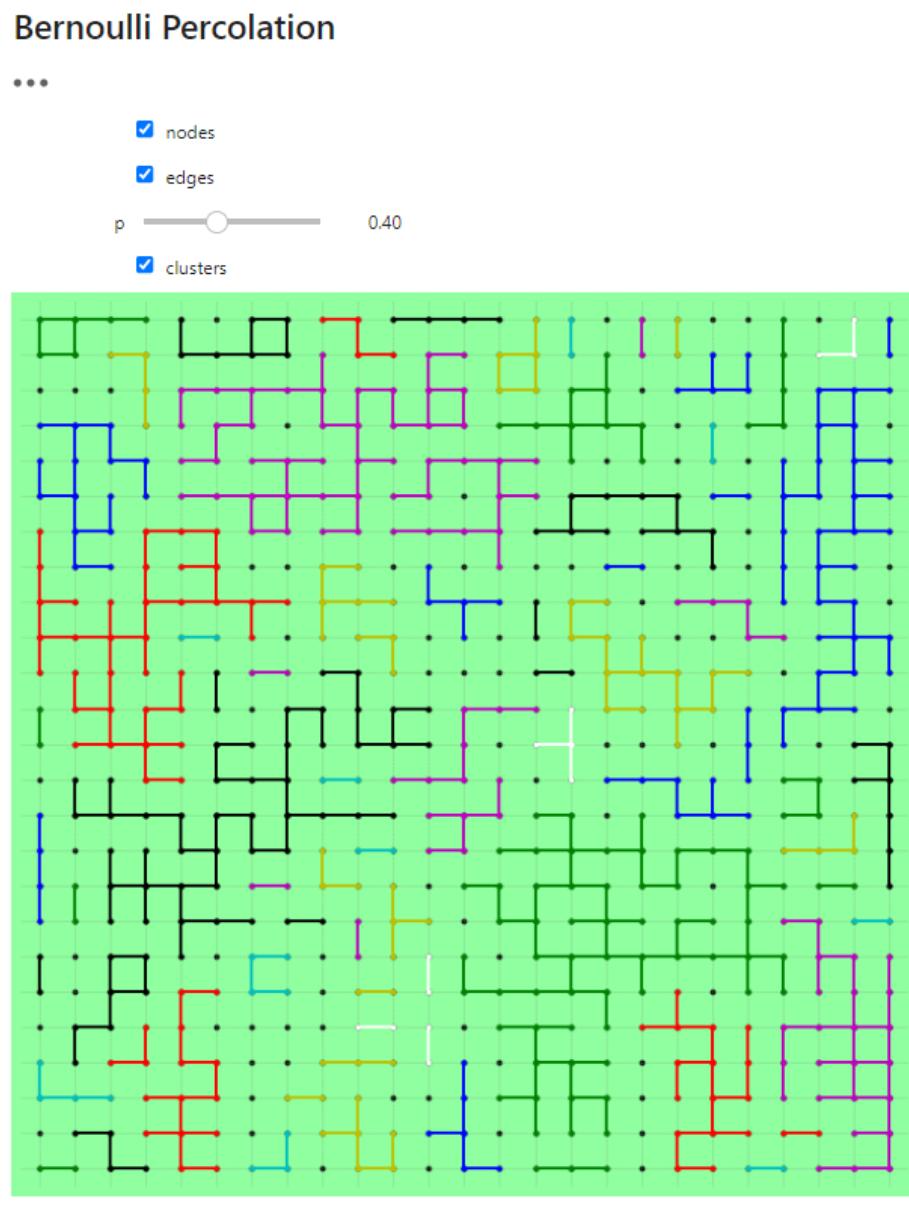
# Porous City

What is the critical clog probability for which a constant maintenance of the sewers is needed?

Periodic maintenance:  $T$

Clog probability:  $p_{clog} = p_{clog}(T)$





# Bernoulli Percolation

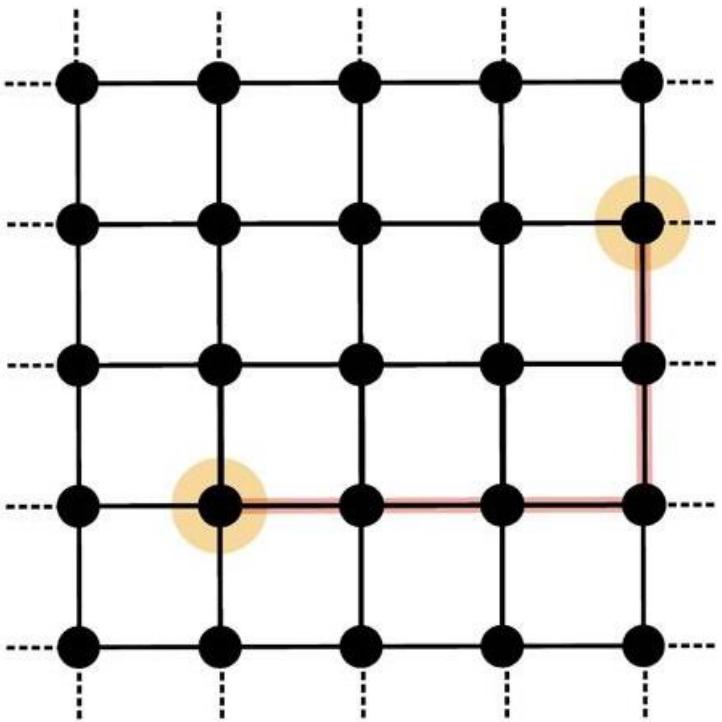
## Intuitive idea

- Square lattice
- Open and closed edges
- Clusters
- Two phases



# Mathematical Fundaments

$$\delta(\vec{x}, \vec{y}) = \sum_{i=1}^d |x_i - y_i|$$

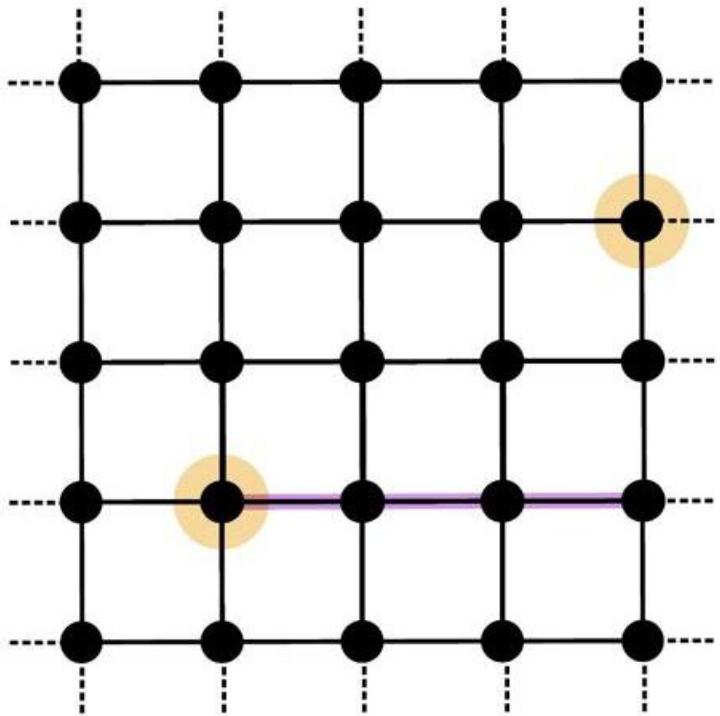


# Mathematical Fundaments

## Distance

- Taxicab distance

$$\|\vec{x}\| = \max \{|x_i| : 1 \leq i \leq d\}$$

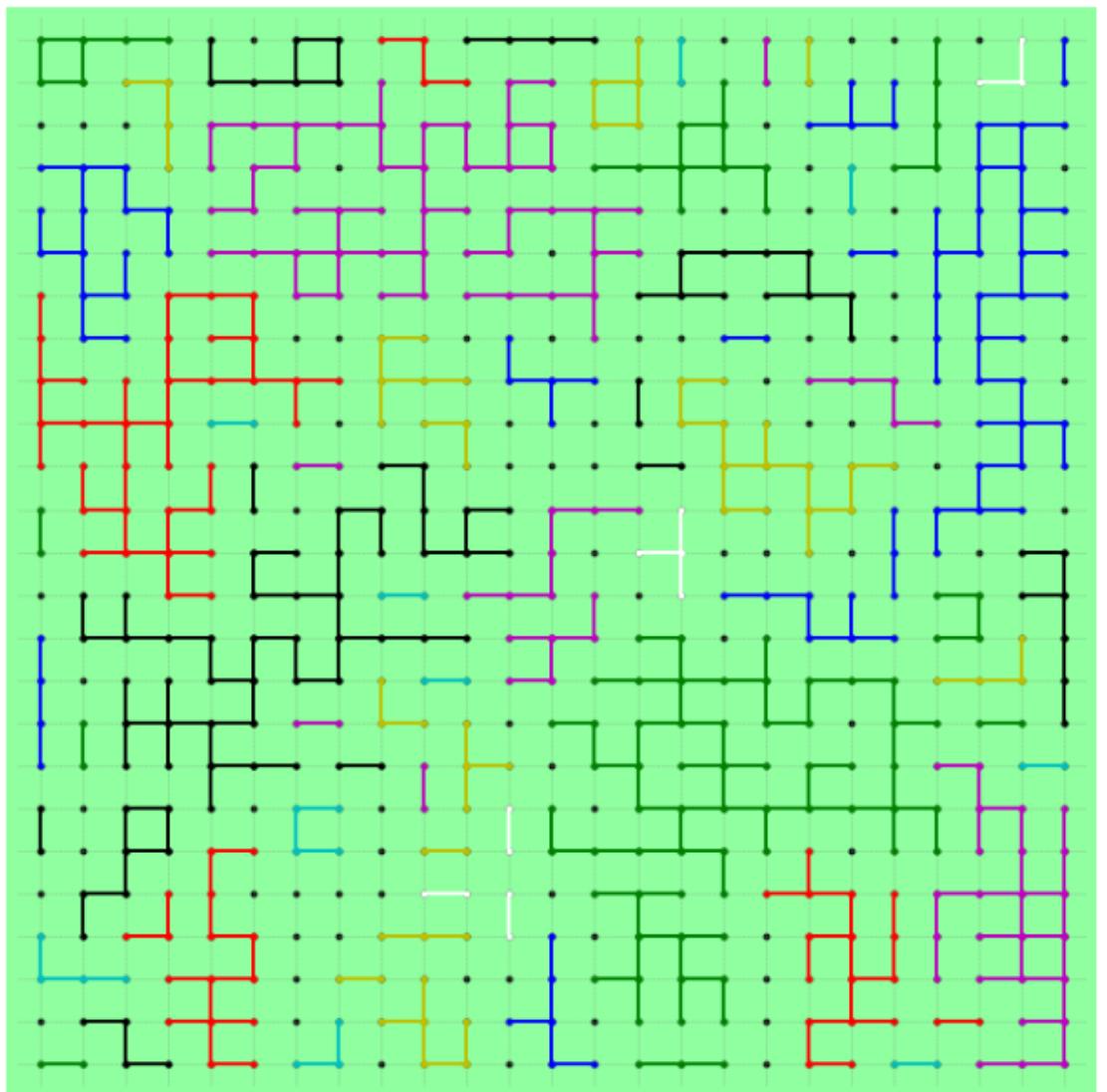


# Mathematical Fundaments

Distance

Pseudodistance

- Chebyshev distance



# Mathematical Fundamentals

- Distance
- Pseudodistance
- Clusters
- Connected components

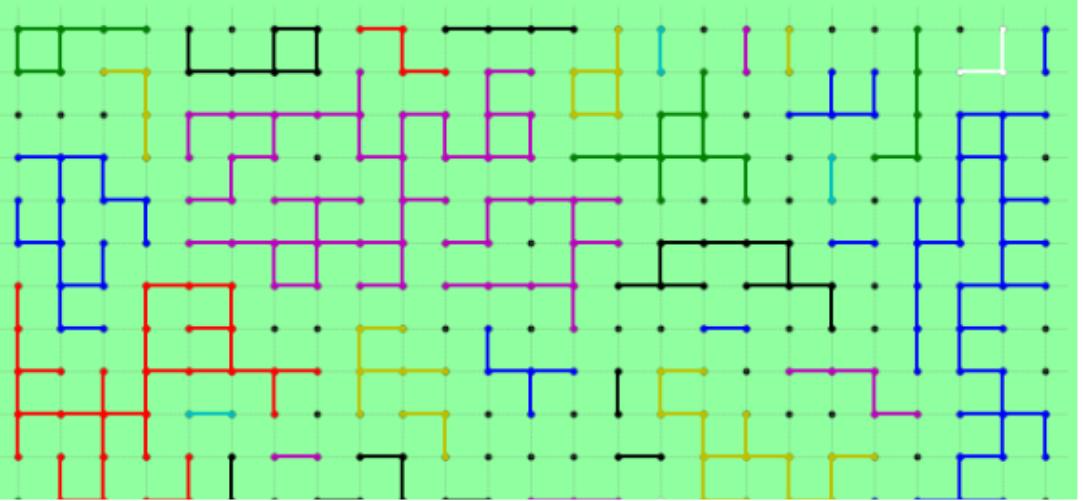
# Mathematical Fundamentals

Distance

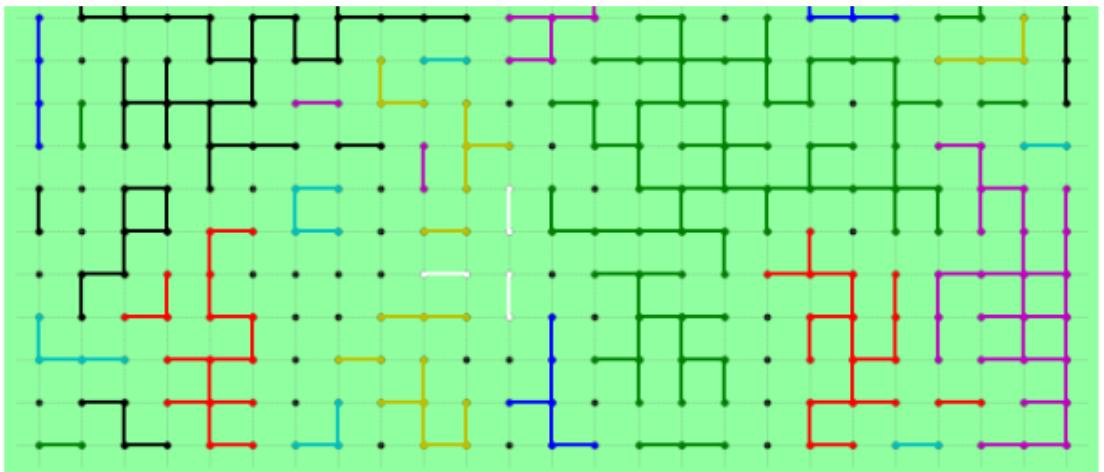
Pseudodistance

Clusters

- Connected components
- Length of a cluster



$$\|C\| = \max \{ \|\vec{x} - \vec{y}\| : \vec{x}, \vec{y} \in C \}$$



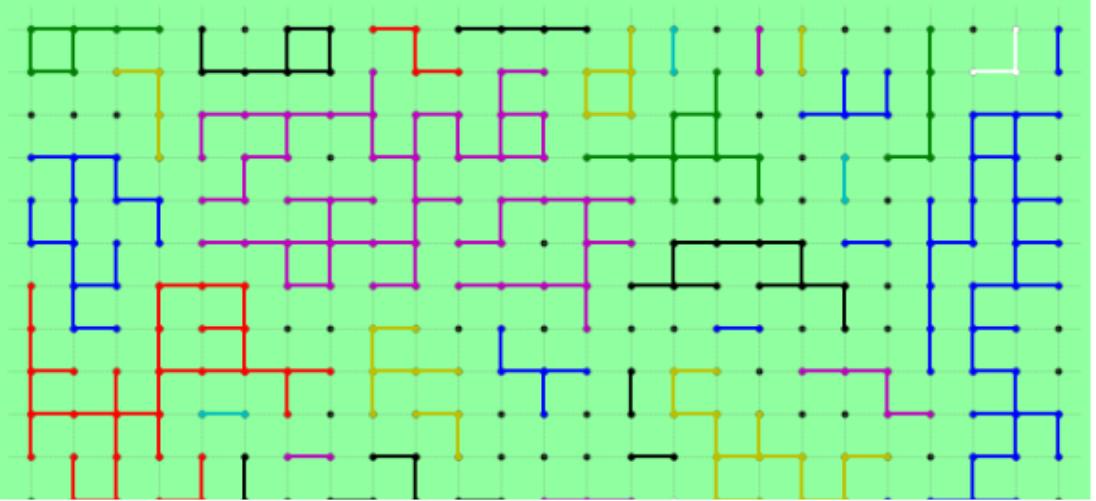
# Mathematical Fundamentals

Distance

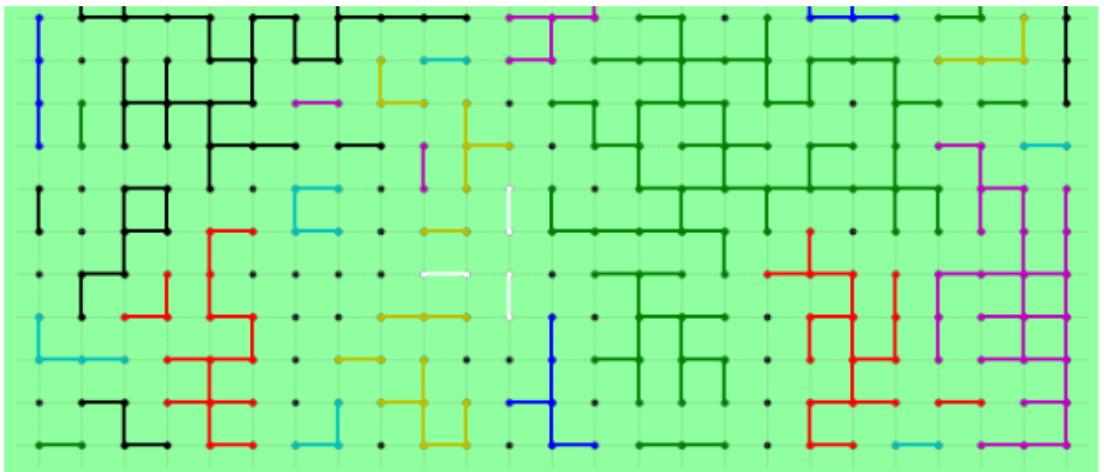
Pseudodistance

Clusters

- Connected components
- Length of a cluster
- Infinite cluster



$$||C|| = \max \{ ||\vec{x} - \vec{y}|| : \vec{x}, \vec{y} \in C \}$$



# Mathematical Fundamentals

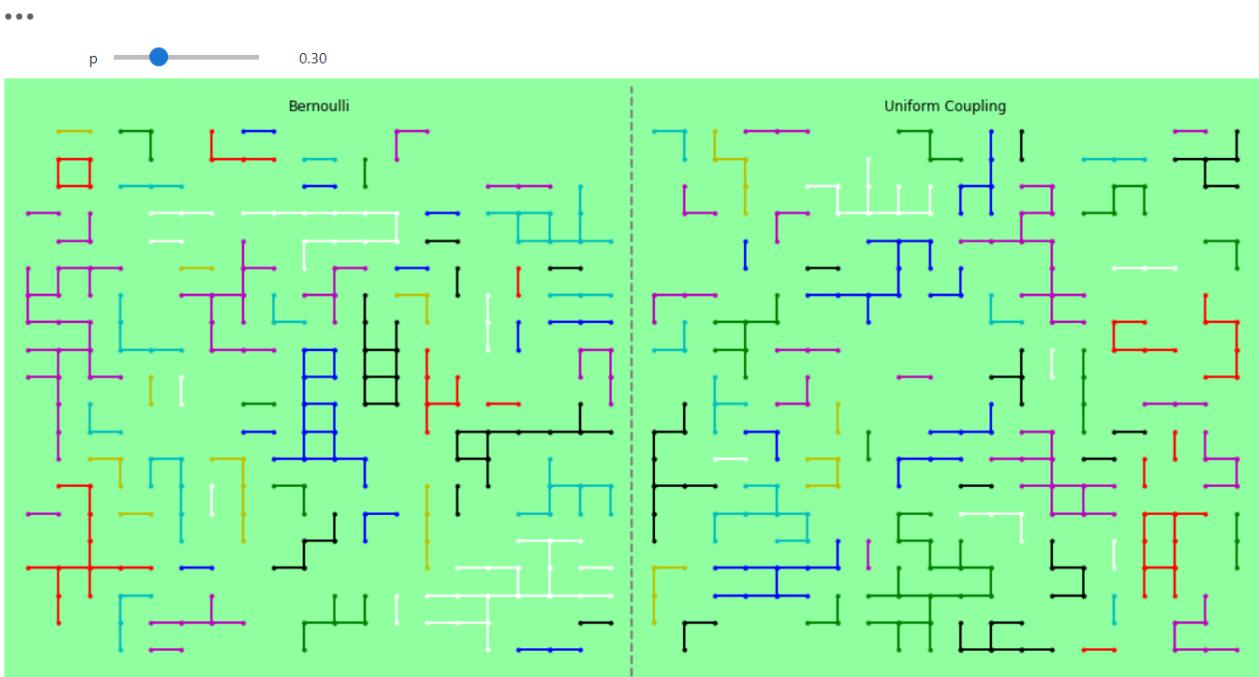
Distance

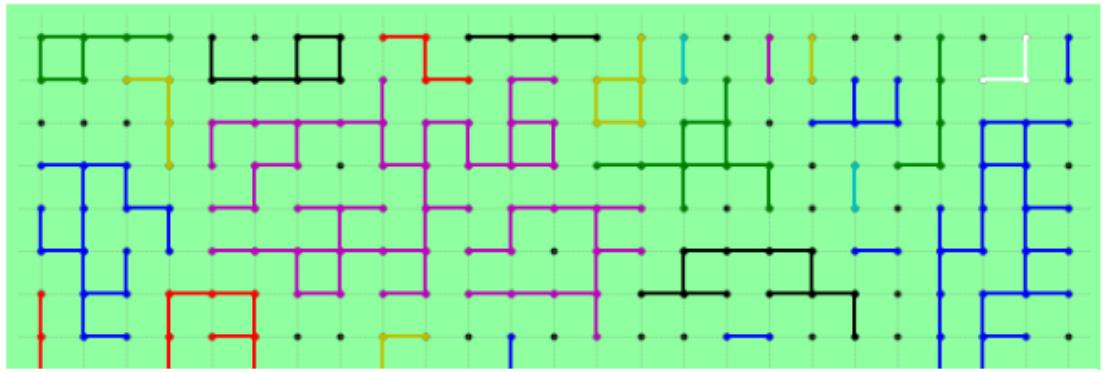
Pseudodistance

Clusters

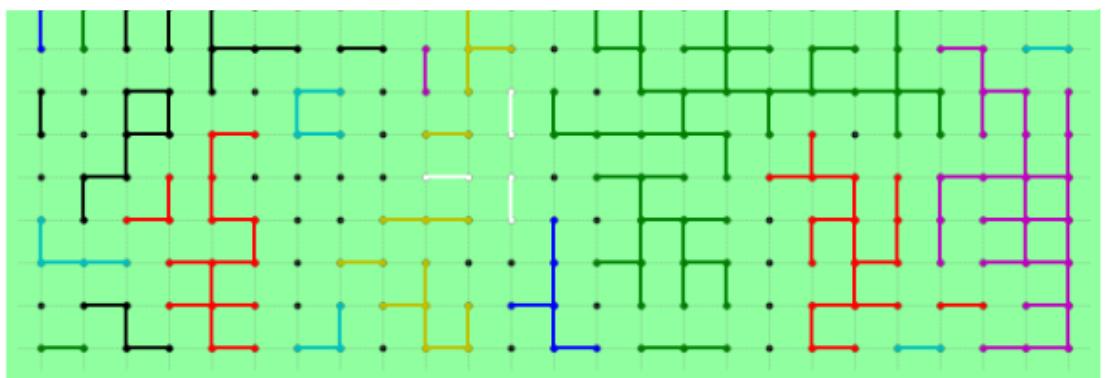
Uniform Coupling

Bernoulli Percolation vs Uniform Coupling





$$\begin{aligned}\theta(p) &= P_p(|C| = \infty) \\ &= 1 - \sum_{n=1}^{\infty} P_p(|C| = n)\end{aligned}$$



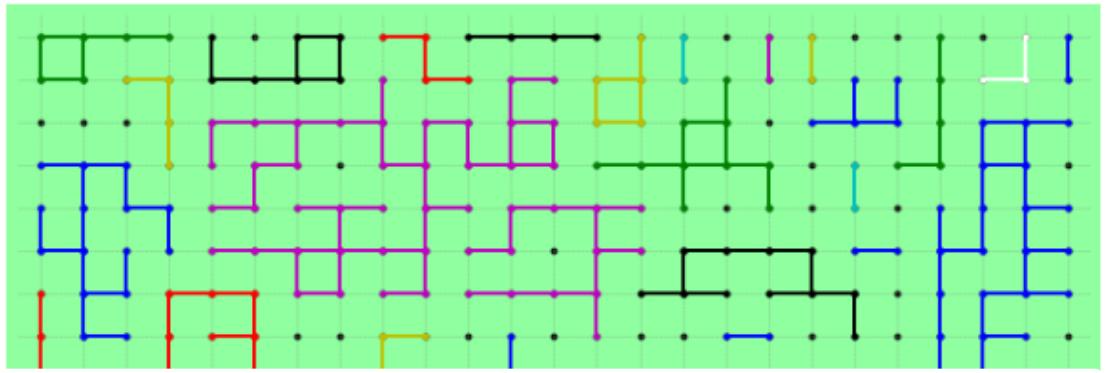
# Mathematical Fundamentals

Distance

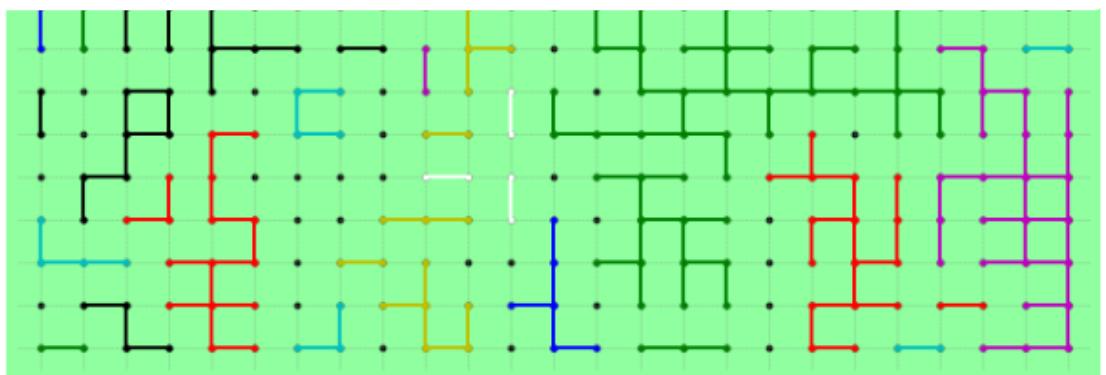
Pseudodistance  
Clusters

Uniform Coupling

Percolation Probability



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# Mathematical Fundamentals

Distance

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Uniform Coupling

Percolation Probability

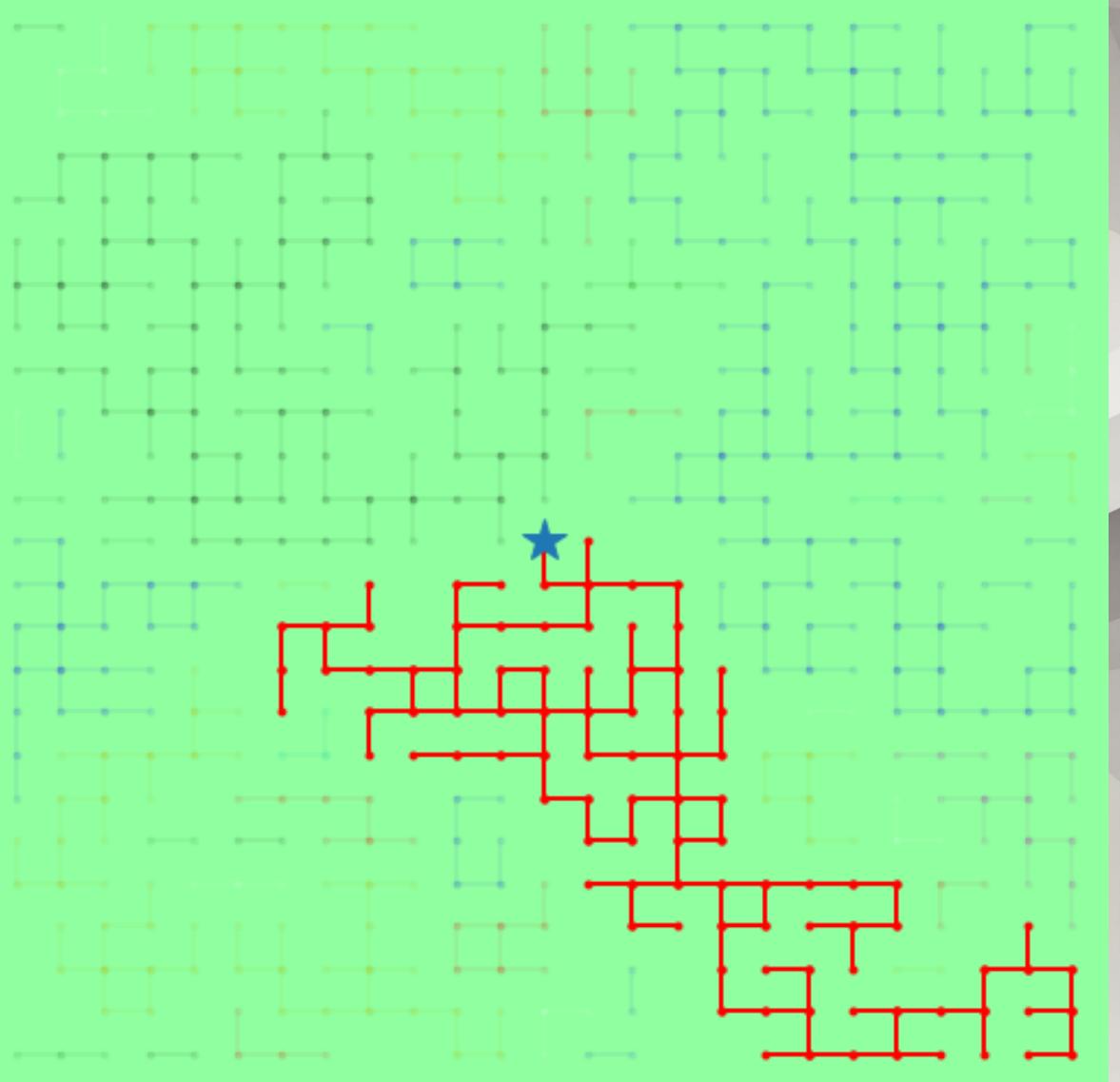
Critical Probability

$$p_c = \sup \{p : \theta(p) = 0\}$$



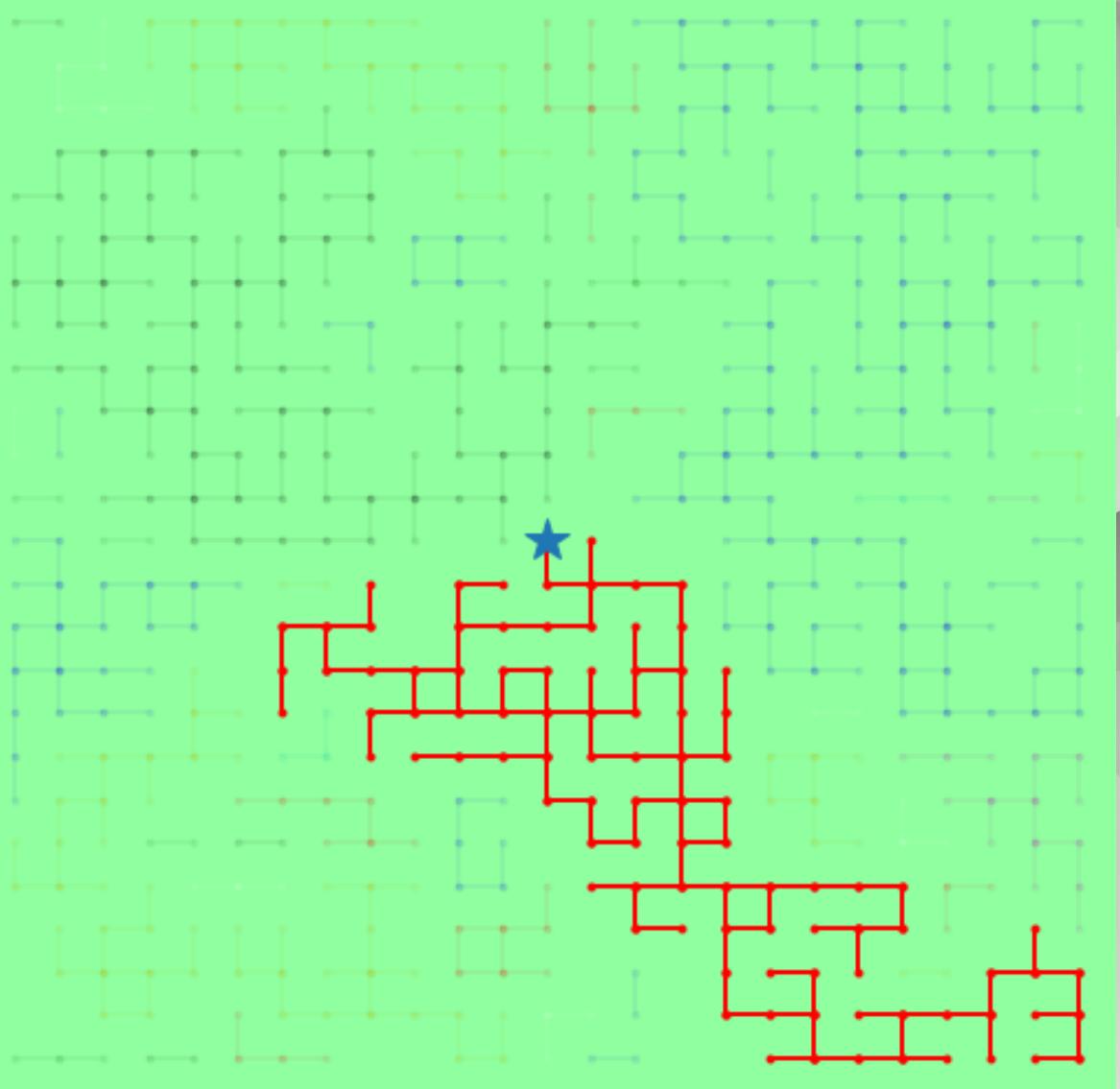
Lower Bound for  $p_c$

Peierls argument



Lower Bound for  $p_c$

Peierls argument

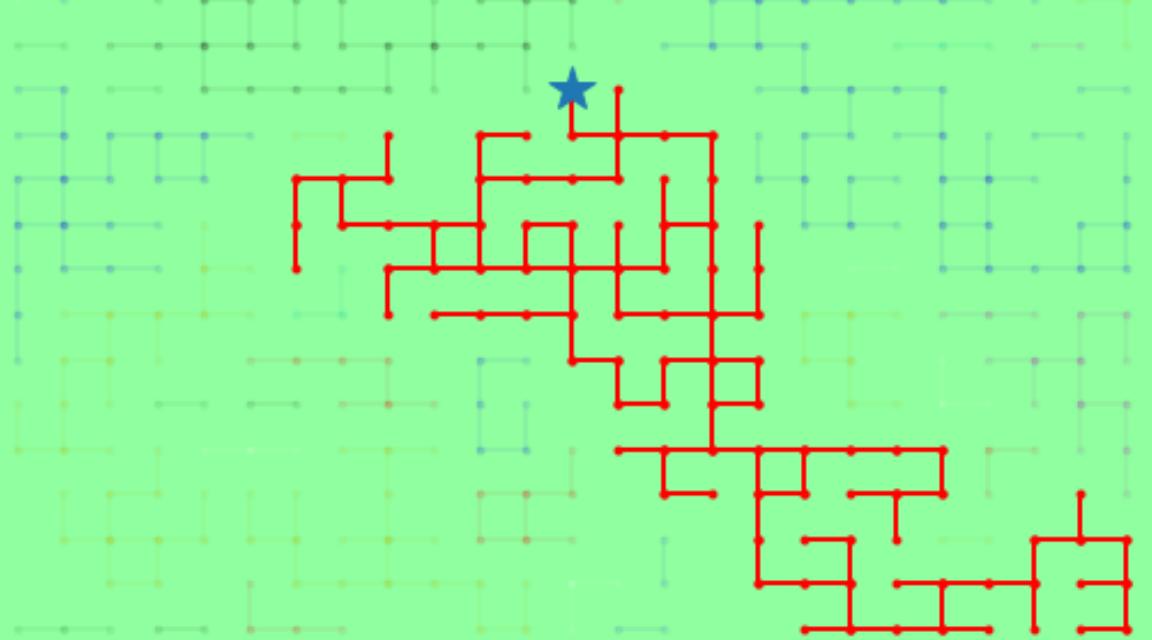


# Lower Bound for $p_c$

Peierls argument

$$\begin{aligned}\theta(p) &\leq P_p (|C| = l) \\ &\leq p^l \cdot \# \{ \text{of paths of length } l \} \\ &\leq p^l 2d(2d - 1)^{l-1} \\ &= \frac{2d}{2d-1} [p(2d - 1)]^l \\ &= \frac{4}{3} [3p]^l \quad \text{if } d = 2\end{aligned}$$

$$p_c \geq \frac{1}{2d-1} \Big|_{d=2} = \frac{1}{3}$$



## Lower Bound for $p_c$

Peierls argument

$$\begin{aligned}\theta(p) &\leq P_p(|C| = l) \\ &\leq p^l \cdot \# \{ \text{of paths of length } l \} \\ &\leq p^l 2d(2d-1)^{l-1} \\ &= \frac{2d}{2d-1} [p(2d-1)]^l \\ &= \frac{4}{3} [3p]^l \quad \text{if } d = 2\end{aligned}$$



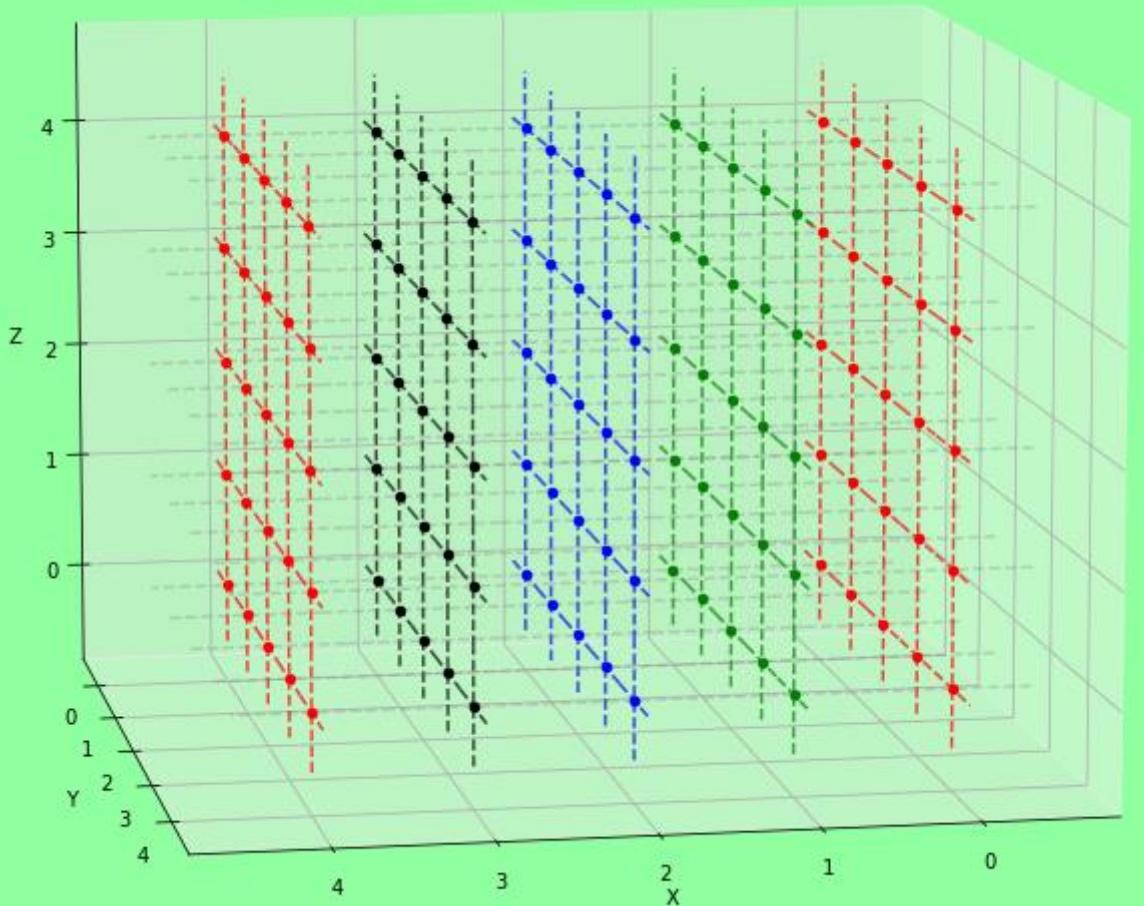
Upper Bound for  $p_c$

Peierls argument

# Upper Bound for $p_c$

Peierls argument

Lattice Embedding

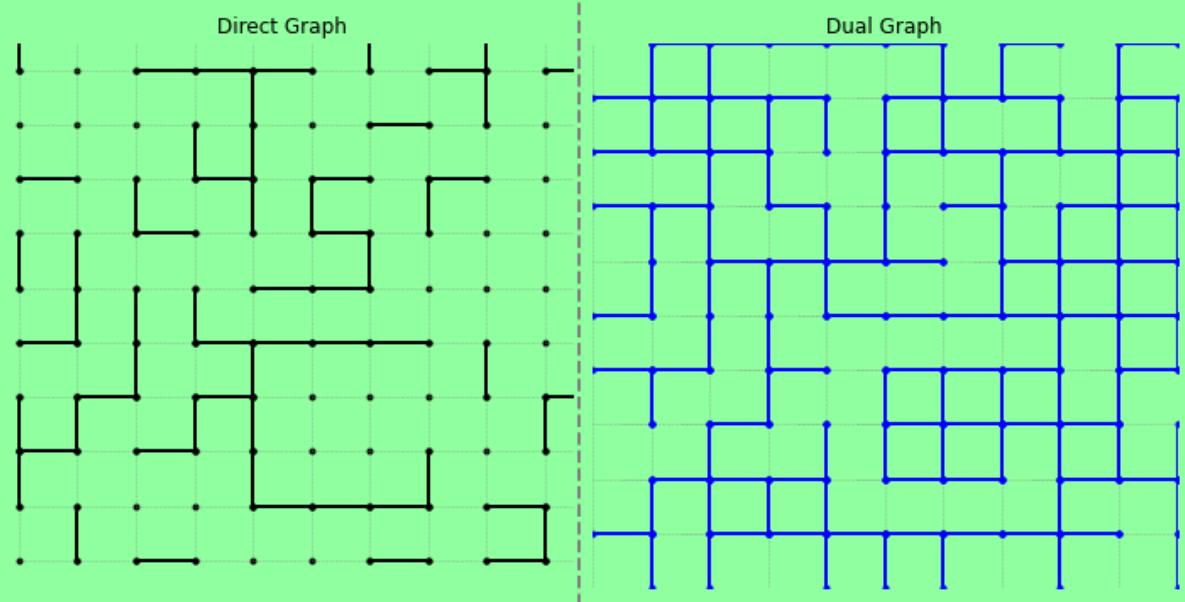
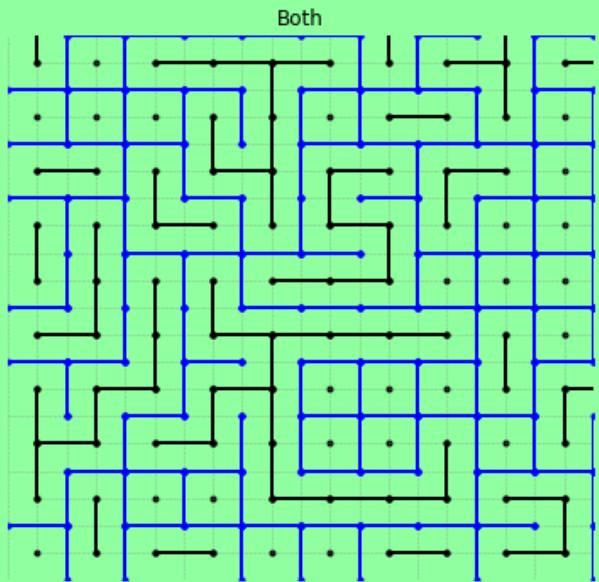


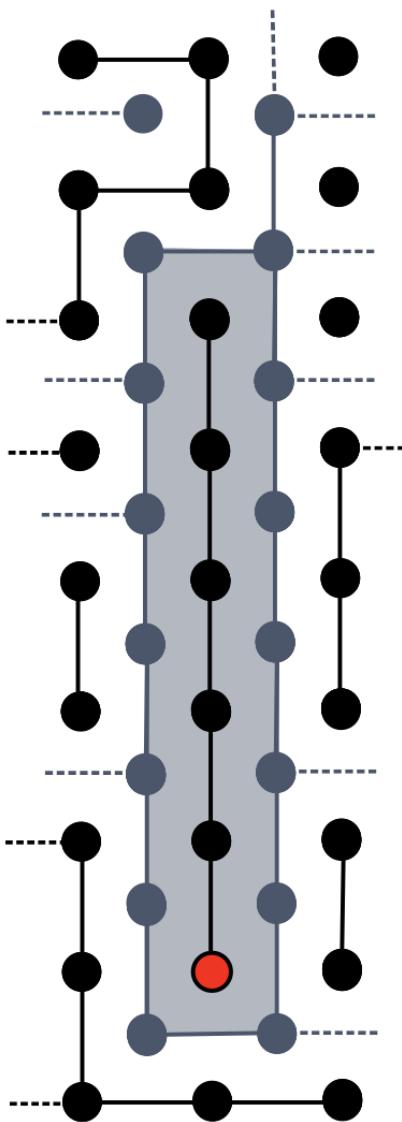
# Upper Bound for $p_c$

Peierls argument

Lattice Embedding

Dual Graph





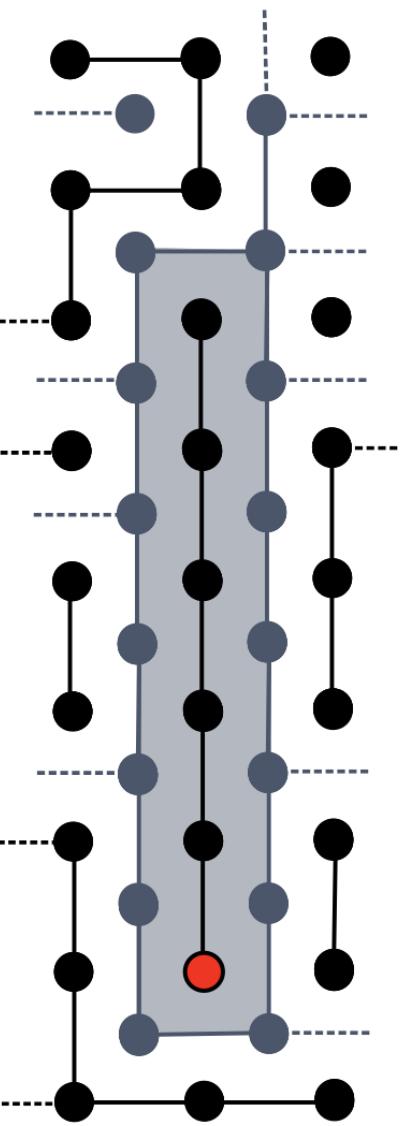
Upper Bound for  $p_c$

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Lattice Embedding

Dual Graph

Upper Bound



# Upper Bound for $p_c$

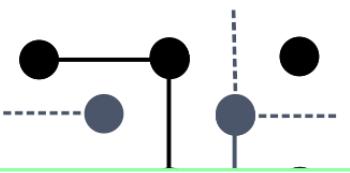
Peierls argument

Lattice Embedding

Dual Graph

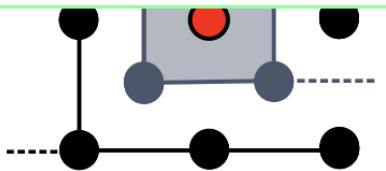
Upper Bound

$$\begin{aligned} P(\{\text{path of length } l \text{ encircling the origin}\}) &\leq P(\{\text{any path of length } l\}) \\ &\leq p_{dual}^l \cdot \#\{\text{of paths of length } l\} \\ &\leq p_{dual}^l 4 \cdot 3^{l-1} = \frac{4}{3} (3p_{dual})^l \end{aligned}$$



*No infinite path surrounding  
the origin can exist if*

$$p_{dual} < \frac{1}{3} \implies p_{primal} > \frac{2}{3}$$



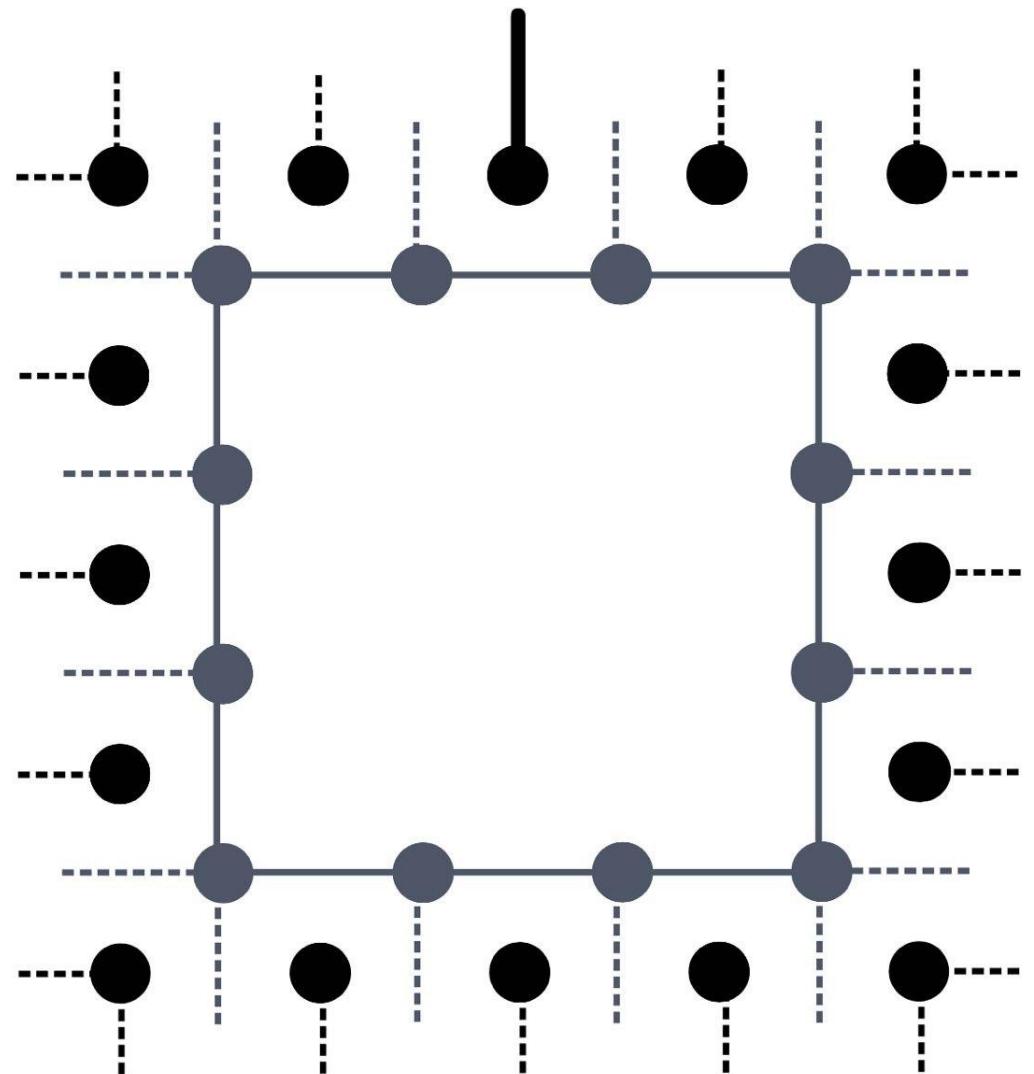
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Lattice Embedding  
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Upper Bound

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Upper Bound for  $p_c$

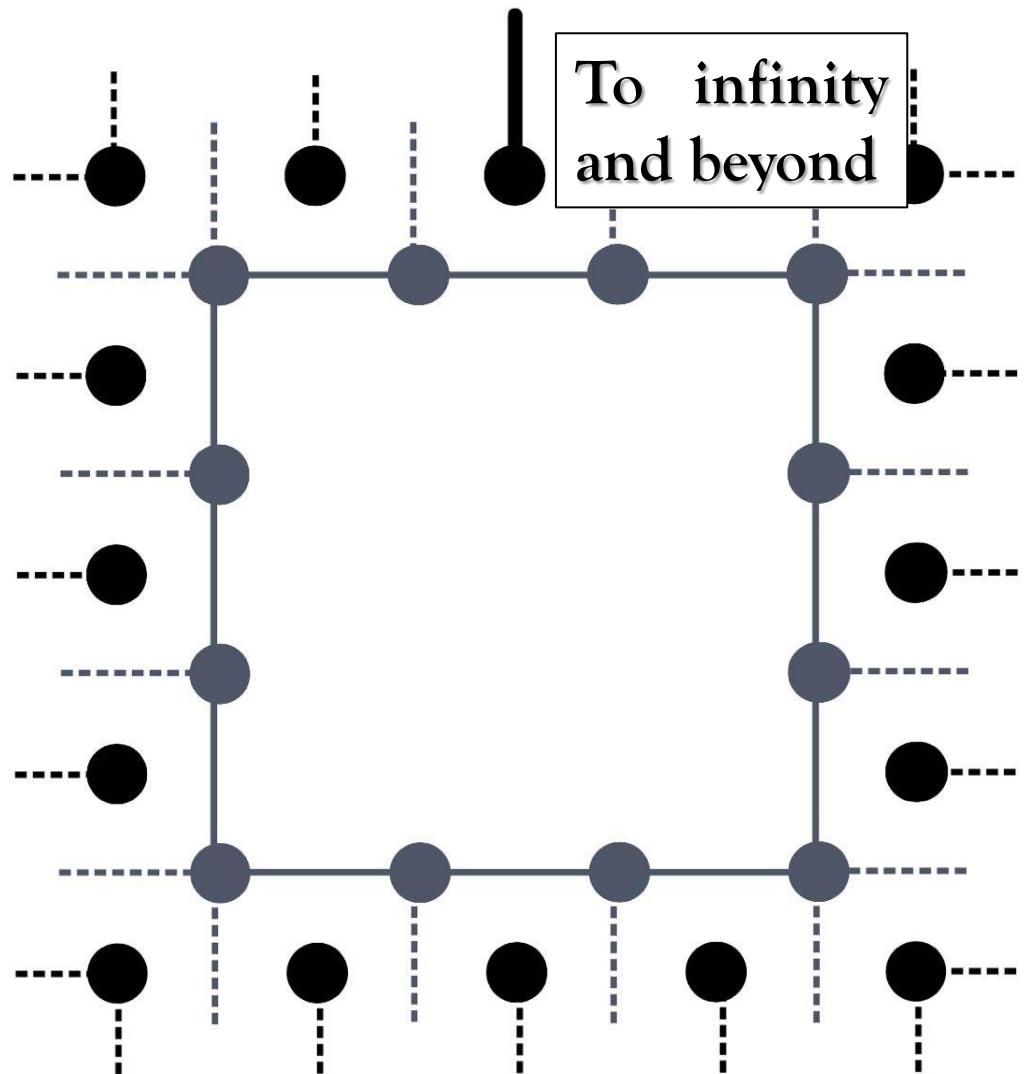
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Lattice Embedding

Dual Graph

Upper Bound

Finite Length Path



# Upper Bound for $p_c$

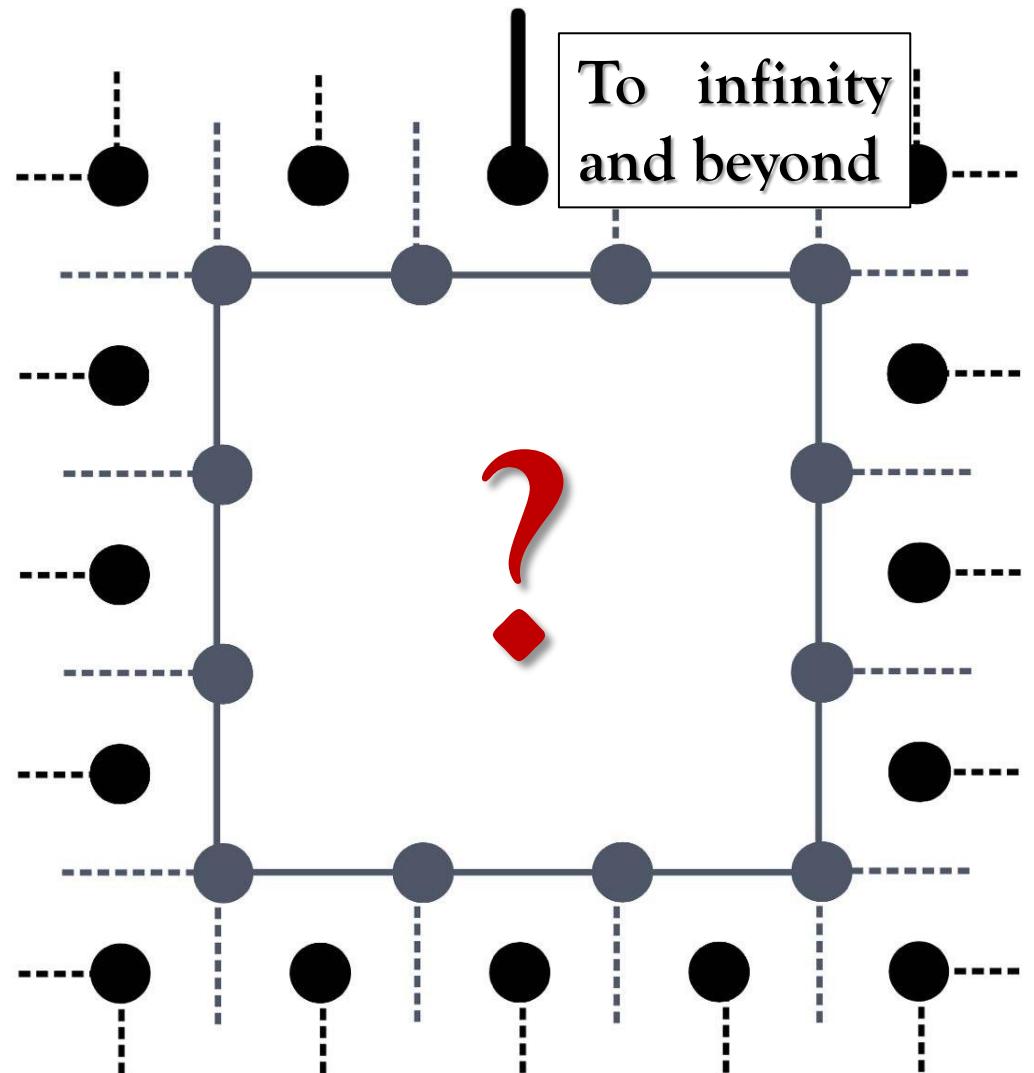
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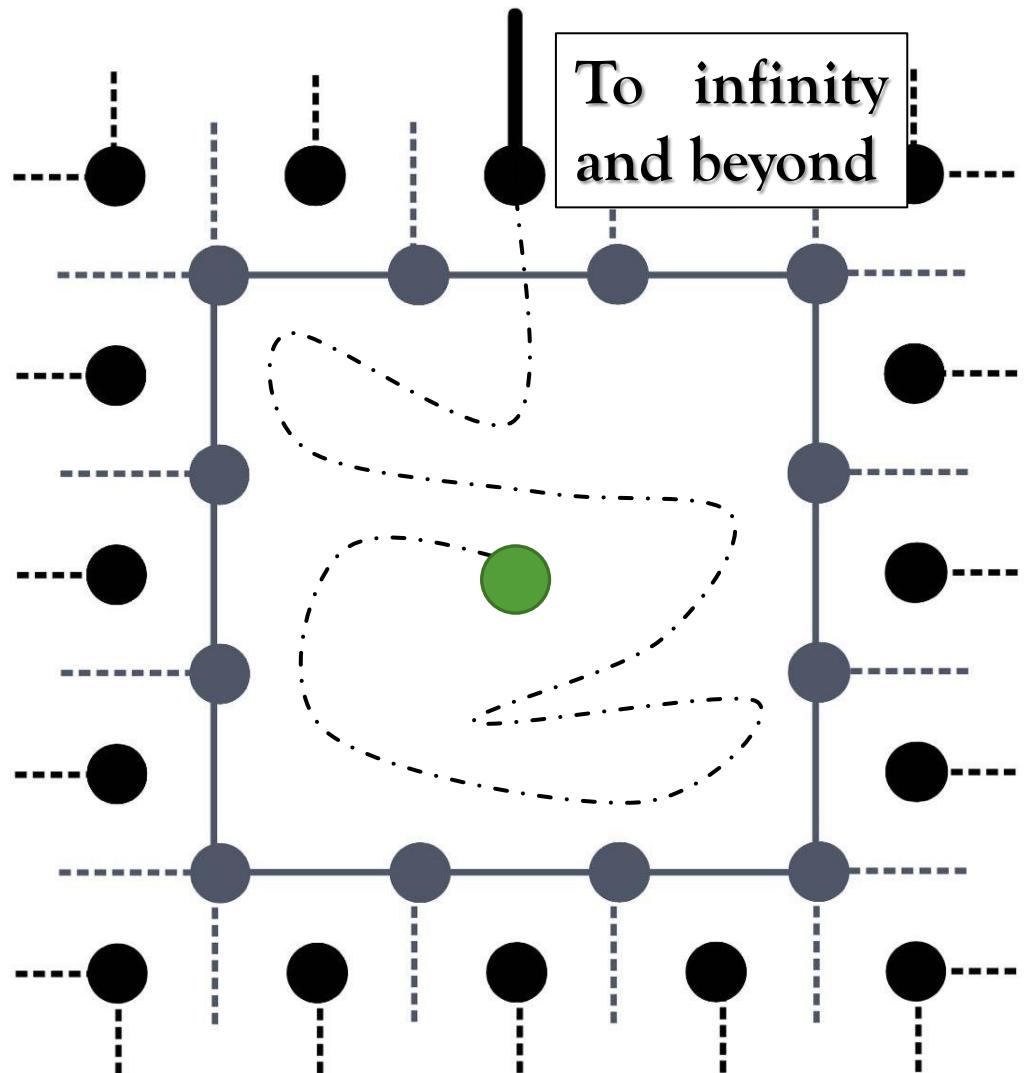
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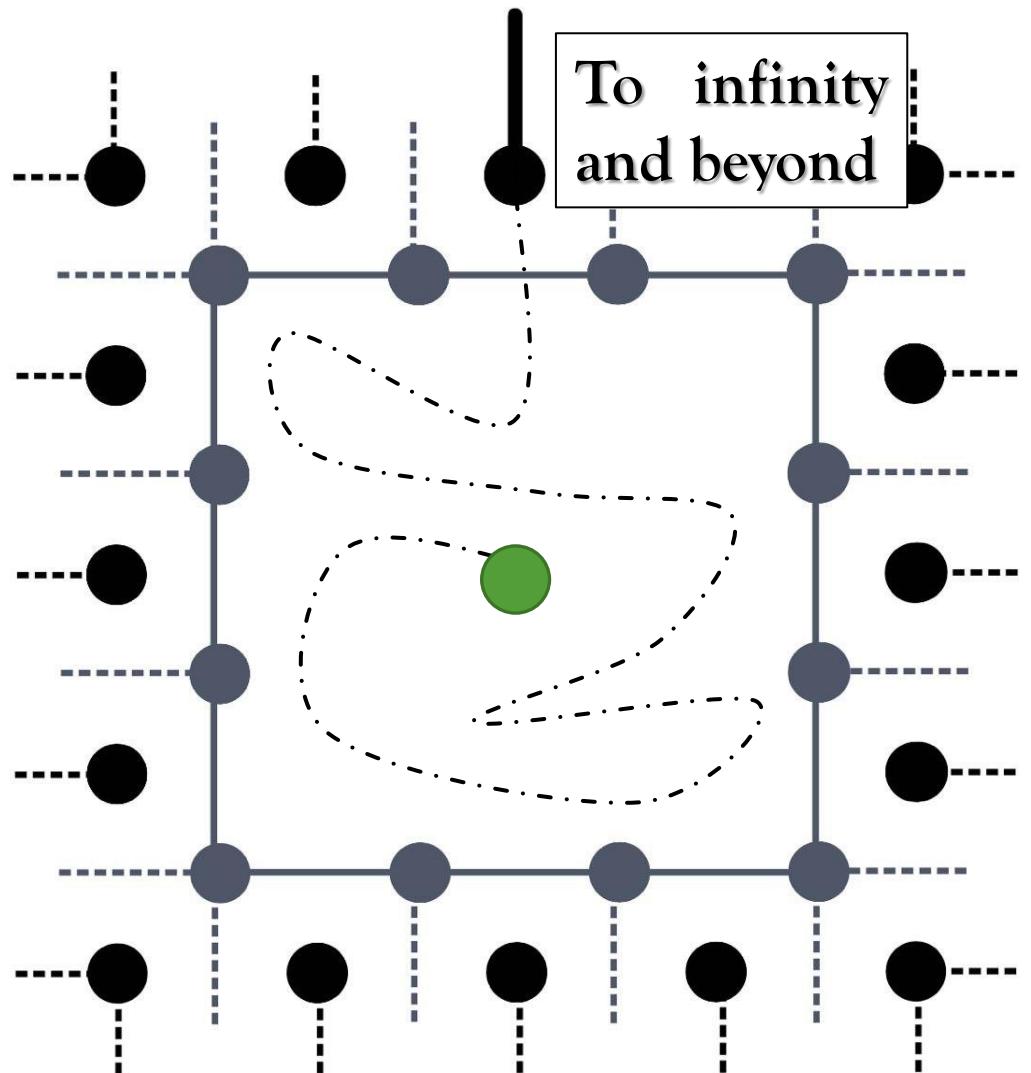
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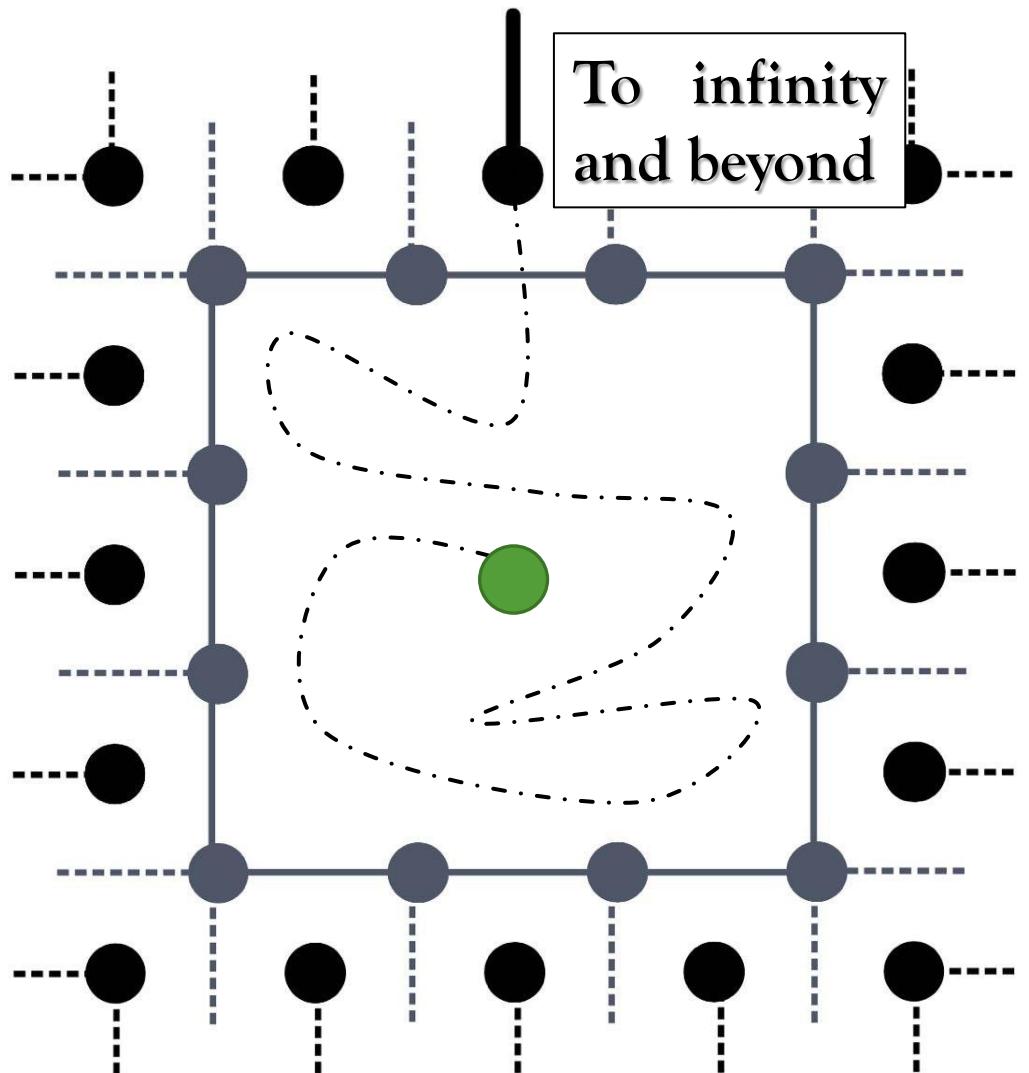
Lattice Embedding

Dual Graph

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Finite Length Path

$$p_c \leq \frac{2}{3}$$



## Recap

There exists a critical probability  $p_c$  that divides the two phases and is such that

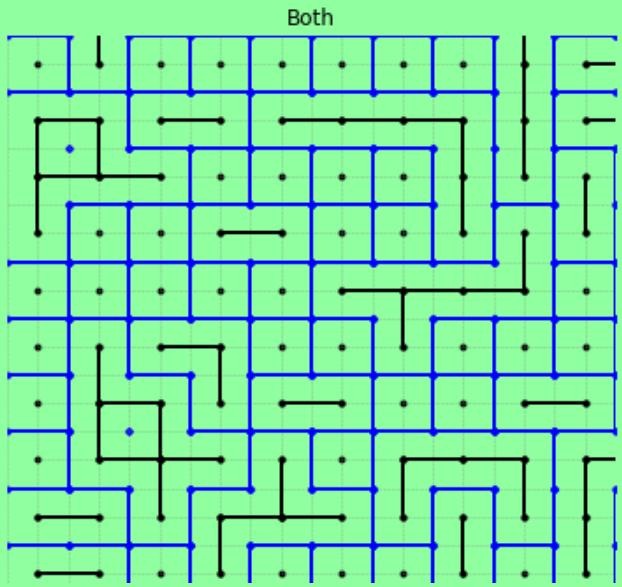
$$\frac{1}{d-1} \leq p_c \leq \frac{2}{3}$$

for any number of dimensions  $d \geq 2$ .

Actual value for  $p_c$

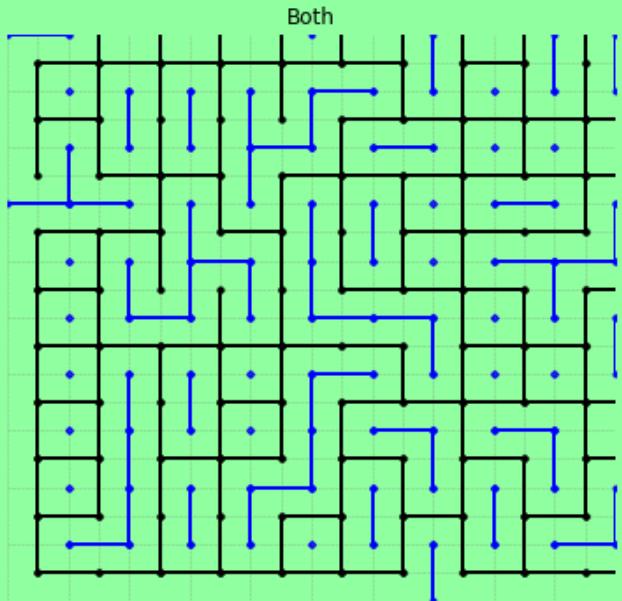
Actual value for  $p_c$

Theoretical considerations



$$p_{primal} = 0.30$$

$$p_{dual} = 0.70$$

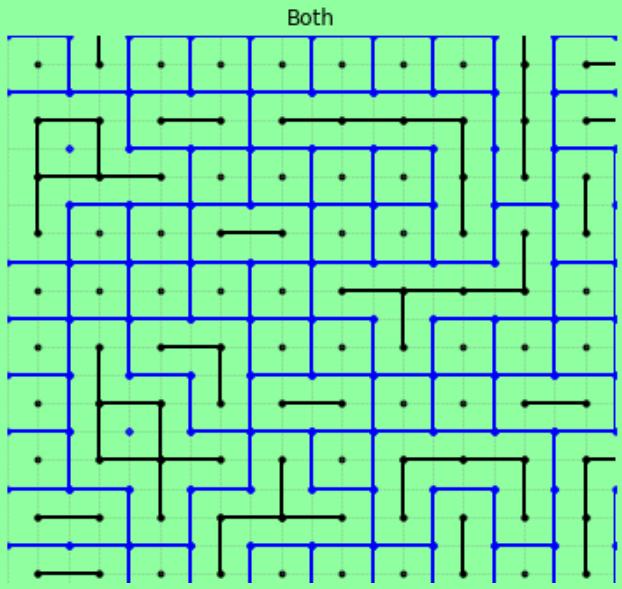


$$p_{primal} = 0.70$$

$$p_{dual} = 0.30$$

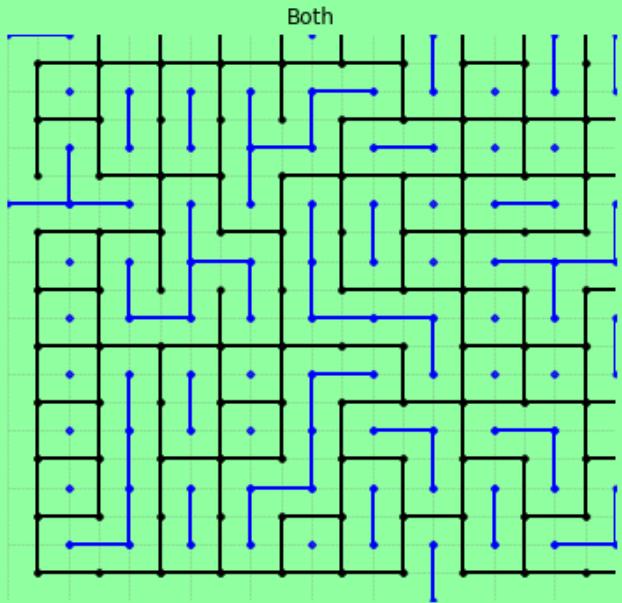
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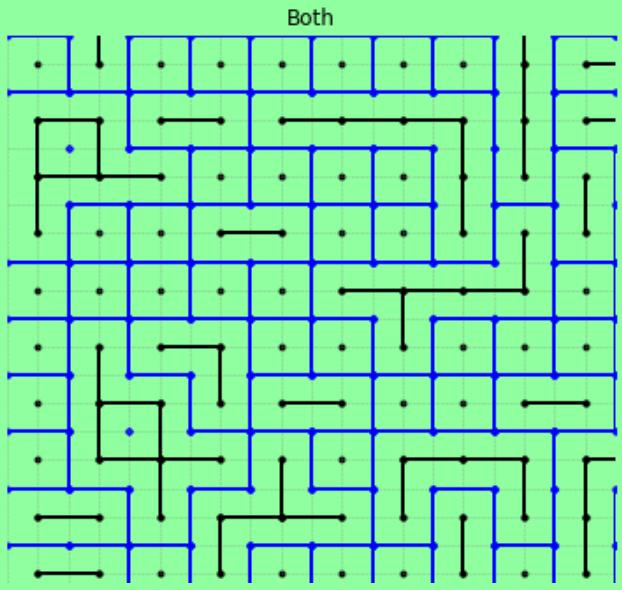
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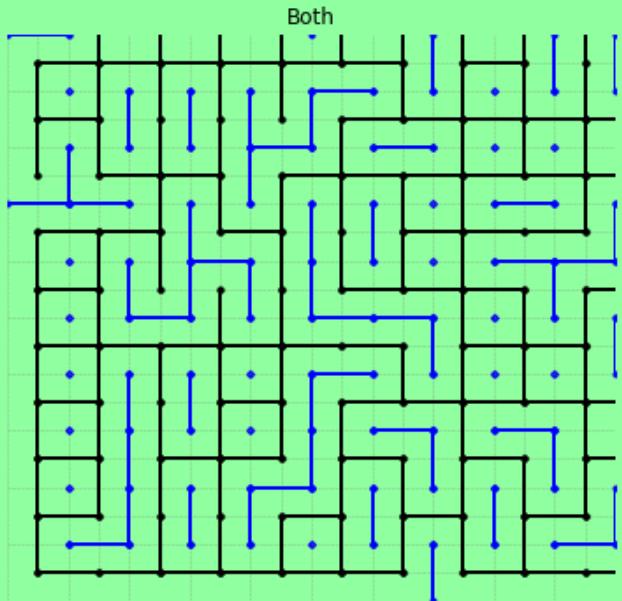
Theoretical considerations

$$p_{dual} = 1 - p_{primal}$$



$$p_{primal} = 0.30$$

$$p_{dual} = 0.70$$



$$p_{primal} = 0.70$$

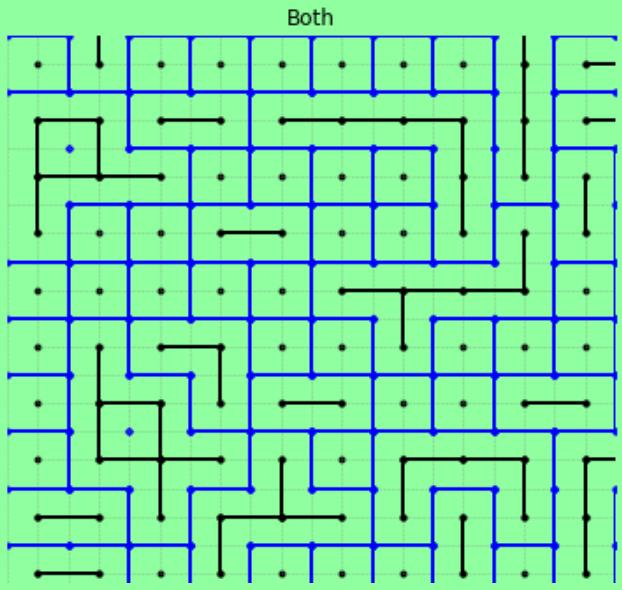
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Actual value for  $p_c$

Theoretical considerations

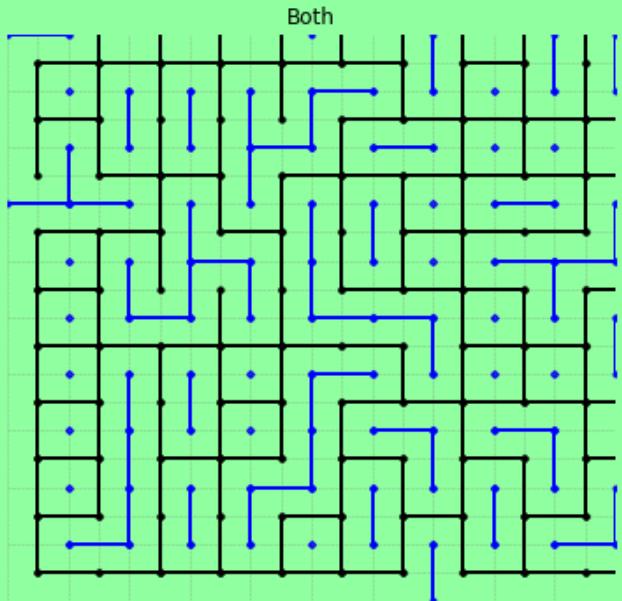
$$p_{dual} = 1 - p_{primal}$$

$$p_c^{dual} = 1 - p_c^{primal}$$



$$p_{primal} = 0.30$$

$$p_{dual} = 0.70$$



$$p_{primal} = 0.70$$

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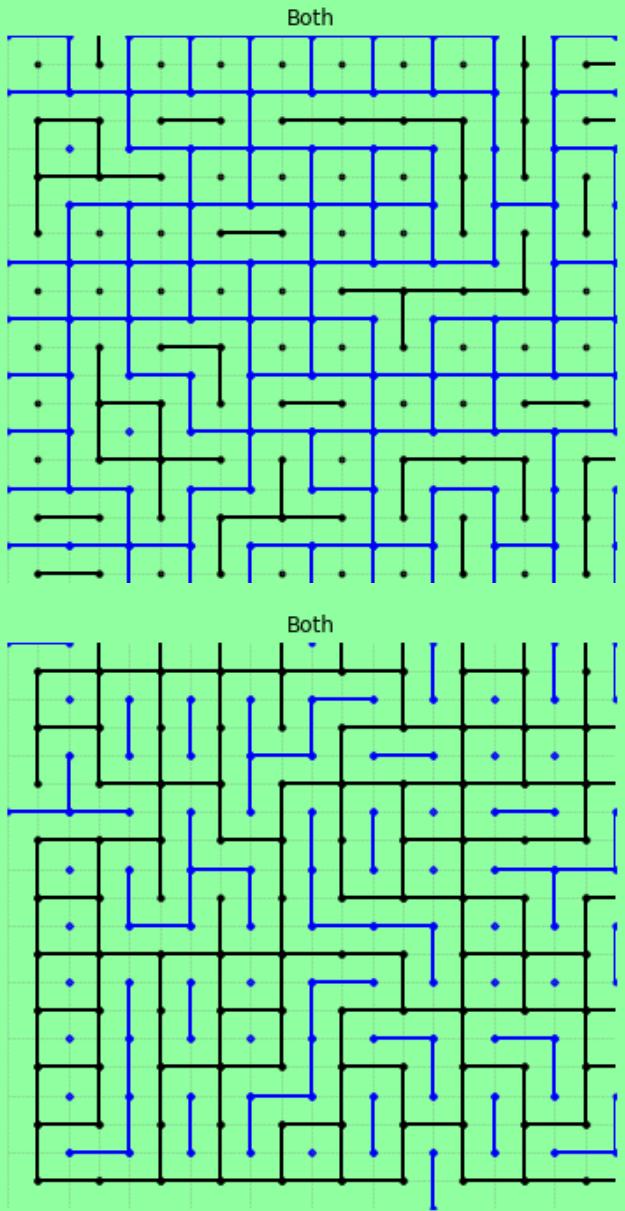
Actual value for  $p_c$

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$$p_{dual} = 1 - p_{primal}$$

$$p_c^{dual} = 1 - p_c^{primal}$$

$$p_c^{dual} = p_c^{primal}$$



Actual value for  $p_c$

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$$p_c^{dual} = 1 - p_c^{primal}$$

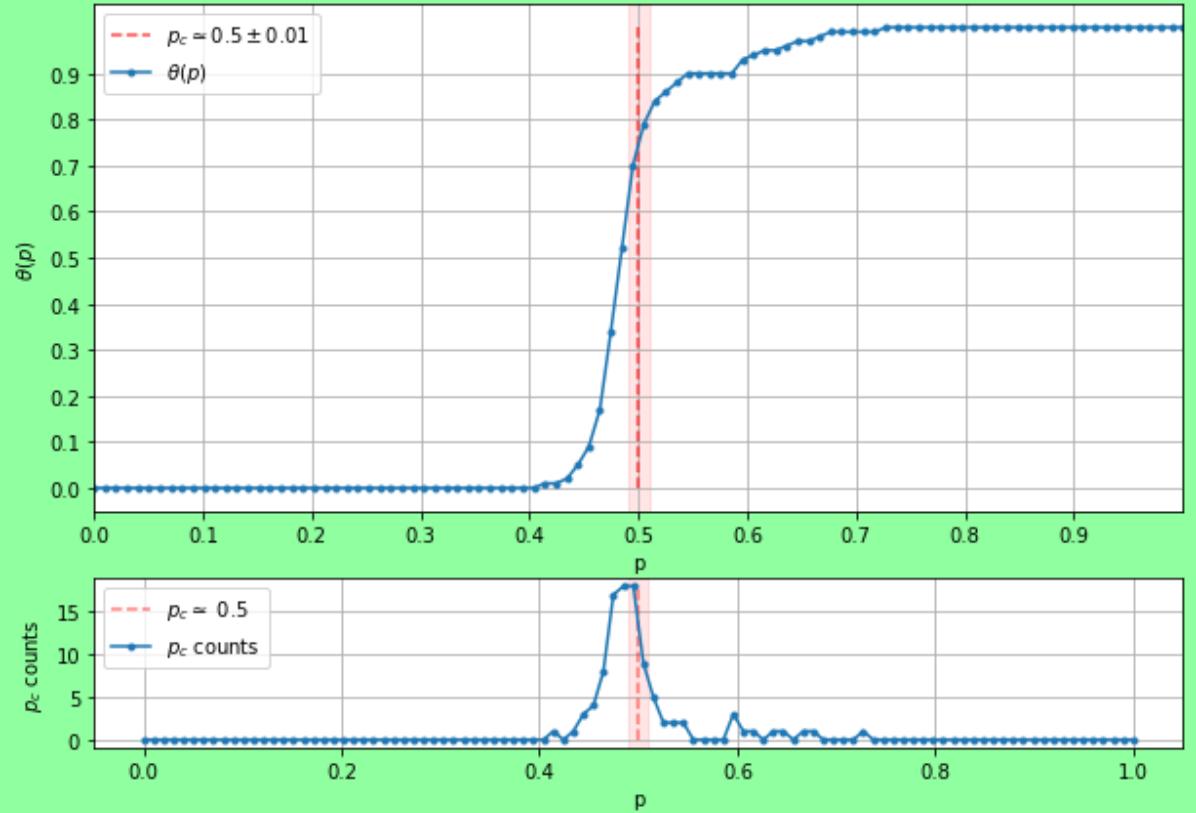
$$p_c^{dual} = p_c^{primal}$$

$$p_c^{dual} = p_c^{primal} = \frac{1}{2}$$

# Actual value for $p_c$

Theoretical considerations

Monte Carlo Simulations



$\exists$  of Infinite Cluster

Kolmogorov's Zero-One Law

# $\exists$ of Infinite Cluster

Kolmogorov's Zero-One Law

If  $p > p_c$  it exists

$$\begin{aligned} 0 < P(\{\text{cluster of the origin is infinite}\}) \\ \leq P(\{\exists \text{ infinite cluster on any point}\}) \end{aligned}$$

$\exists$  of Infinite Cluster

Kolmogorov's Zero-One Law

If  $p > p_c$  it exists

If  $p < p_c$  it does NOT exists

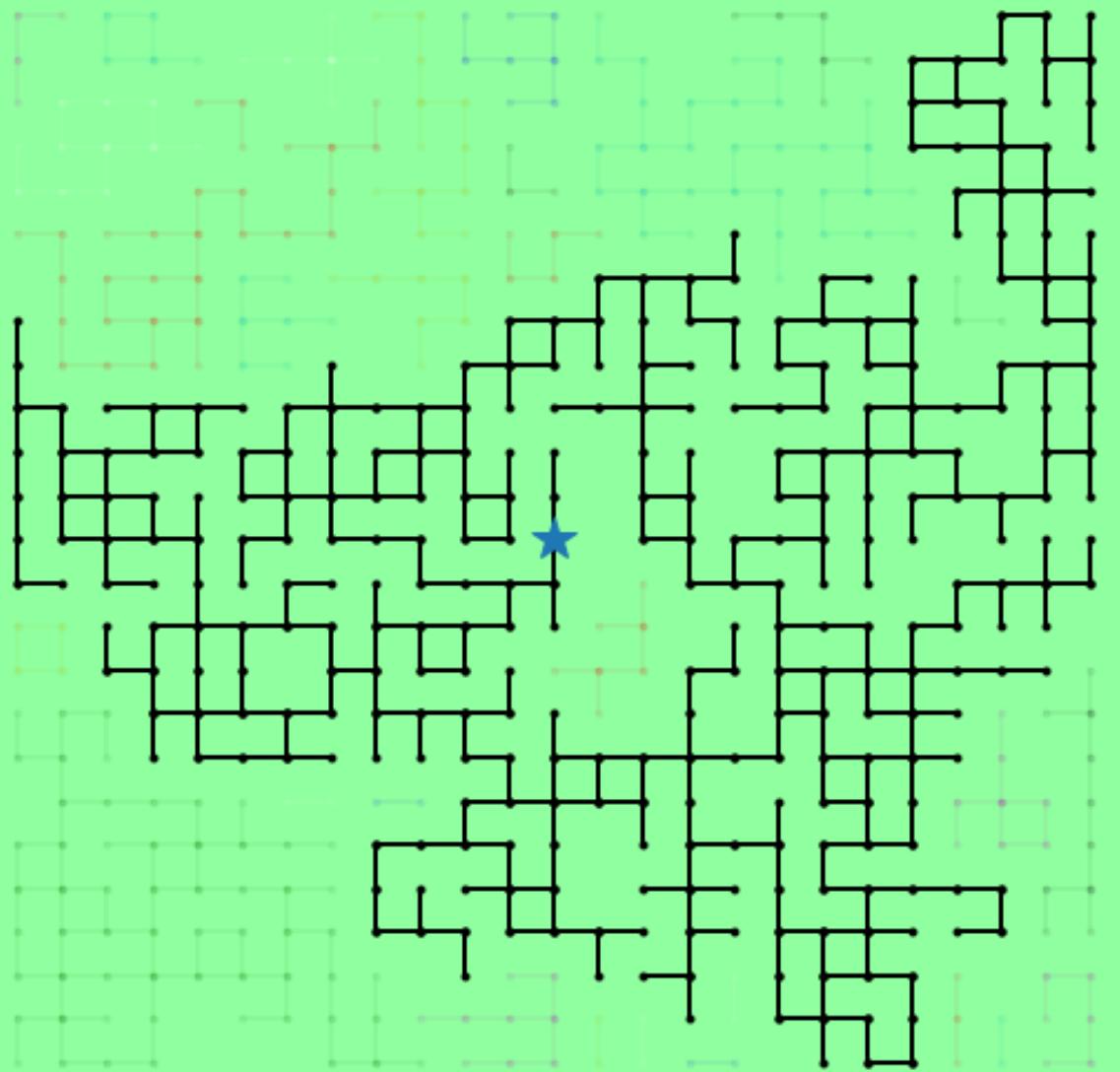
# $\exists$ of Infinite Cluster

Kolmogorov's Zero-One Law

If  $p > p_c$  it exists

If  $p < p_c$  it does NOT exists

How many infinite clusters?



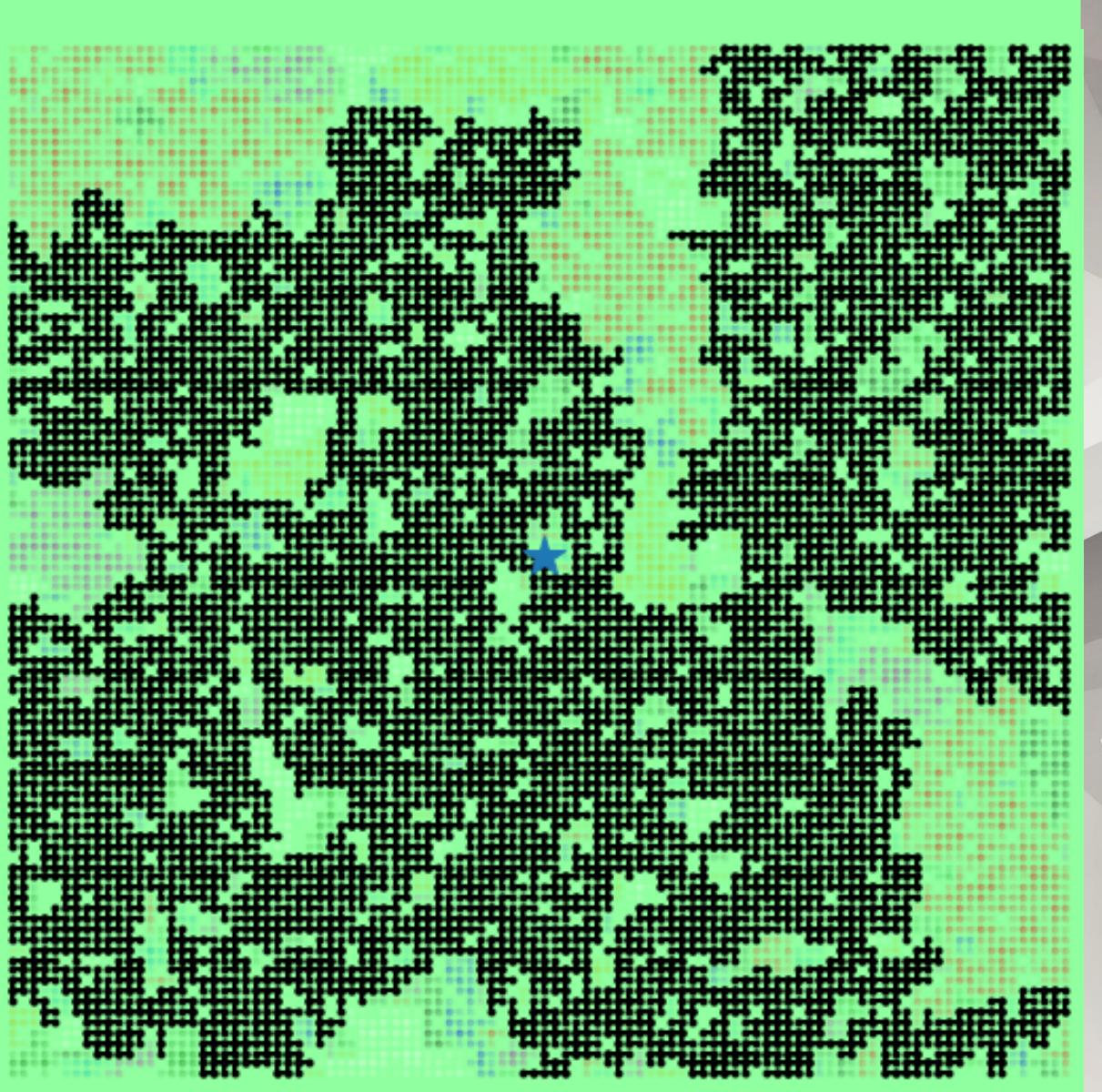
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How many infinite clusters?



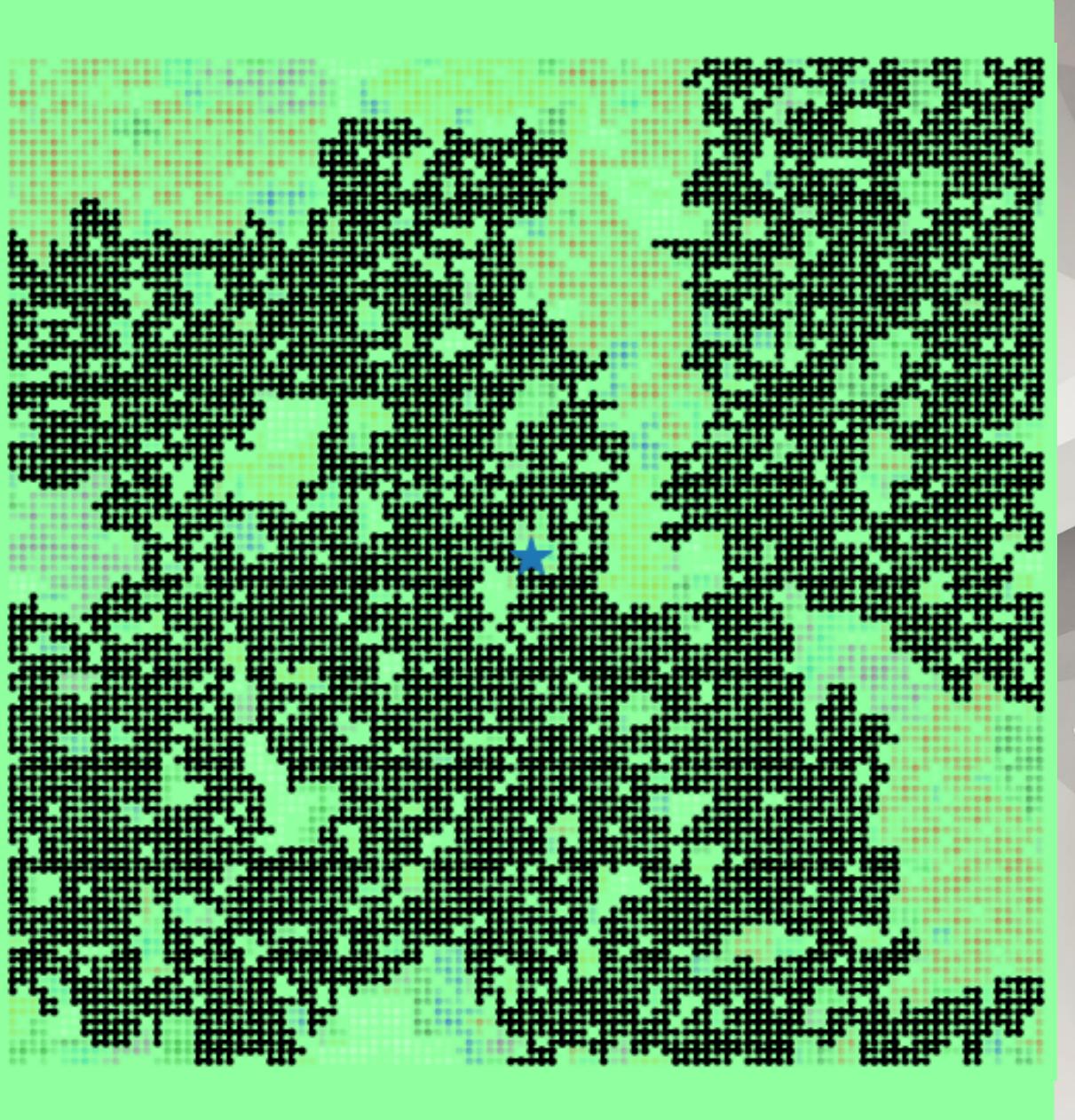
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How many infinite clusters?



$\exists$  of Infinite Cluster

Kolmogorov's Zero-One Law

If  $p > p_c$  it exists

If  $p < p_c$  it does NOT exists

How many infinite clusters?

1

# *The Two Phases*

## Subcritical Phase

$$\exists \alpha(p) > 0 : P_p(|C| = n) \sim e^{-n\alpha(p)}$$

as  $n \rightarrow \infty$

## Supercritical Phase

$$e^{-\beta_1(p)} \leq e^{n^{(d-1)/d}} P_p(|C| = n) \leq e^{-\beta_2(p)}$$

$$\delta(p) = \lim_{n \rightarrow \infty} \left\{ -n^{-(d-1)/d} \log (P_p(|C| = n)) \right\}$$

# Critical Exponents

**At the critical point**

$$P_{p_c}(|C| > n) \sim n^{-1/\delta}$$

as  $n \rightarrow \infty$

**Near the Critical Point**

$$\gamma = - \lim_{p \rightarrow p_c^-} \frac{\log \chi(p)}{\log |p - p_c|}$$

$$\beta = \lim_{p \rightarrow p_c^+} \frac{\log \theta(p)}{\log(p - p_c)}$$

$$\delta^{-1} = - \lim_{n \rightarrow \infty} \frac{\log P_{p_c}(|C| \geq n)}{\log(n)}$$

*The Two Phases*

Subcritical Phase

$$\exists \alpha(p) > 0 : P_p(|C| = n) \sim e^{-n\alpha(p)}$$

as  $n \rightarrow \infty$

Supercritical Phase

$$e^{-\beta_1(p)} \leq e^{n^{(d-1)/d}} P_p(|C| = n) \leq e^{-\beta_2(p)}$$
$$\delta(p) = \lim_{n \rightarrow \infty} \left\{ -n^{-(d-1)/d} \log (P_p(|C| = n)) \right\}$$



PAPER

## Molecular jenga: the percolation phase transition (collapse) in virus capsids

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<sup>3</sup> The Biocomplexity Institute, Indiana University, Bloomington, IN 47405, United States of America

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**Keywords:** capsid, hepatitis B virus, self-assembly, icosahedral symmetry

### Abstract

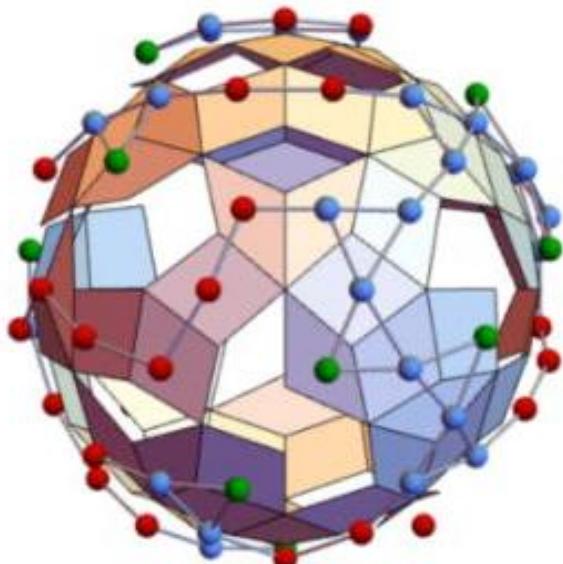
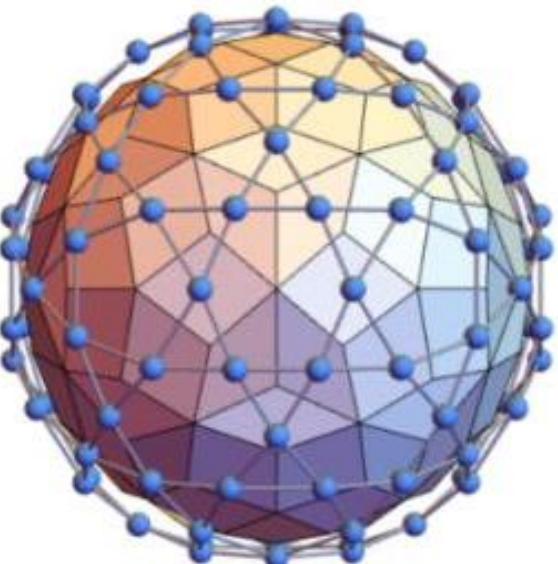
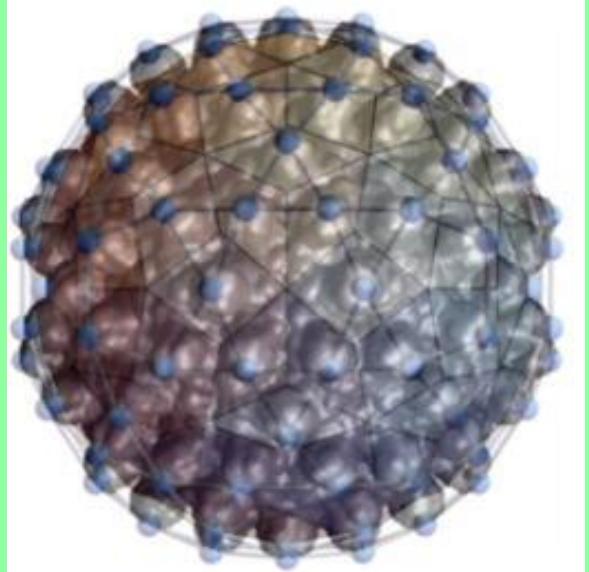
Virus capsids are polymeric protein shells that protect the viral cargo. About half of known virus families have icosahedral capsids that self-assemble from tens to thousands of subunits. Capsid disassembly is critical to the lifecycles of many viruses yet is poorly understood. Here, we apply a graph and percolation theory to examine the effect of removing capsid subunits on capsid stability and fragmentation. Based on the structure of the icosahedral capsid of hepatitis B virus (HBV), we constructed a graph of rhombic subunits arranged with icosahedral symmetry. Though our approach neglects dependence on energetics, time, and molecular detail, it quantitatively predicts a percolation phase transition consistent with recent *in vitro* studies of HBV capsid dissociation. While the stability of the capsid graph followed a gradual quadratic decay, the rhombic tiling abruptly fragmented when we removed more than 25% of the 120 subunits, near the percolation threshold observed experimentally. This threshold may also affect results of capsid assembly, which also experimentally produces a preponderance of 90 mer intermediates, as the intermediate steps in these reactions are reversible and can thus resemble dissociation. Application of percolation theory to understanding capsid association and dissociation may prove a general approach to relating virus biology to the underlying biophysics of the virus particle.

# Virus Capsids Collapse

- Capsid of Hepatitis B (HBV)
- 120 dimer with T=4 icosahedral symmetry
- Experimental studies show no fragmented capsid with less than 90 dimers

# Hypothesis

- Capsid can be modelled as a 2D graph
- Fragmentation is seen as percolation on finite graph
- Dimers are assumed completely identical



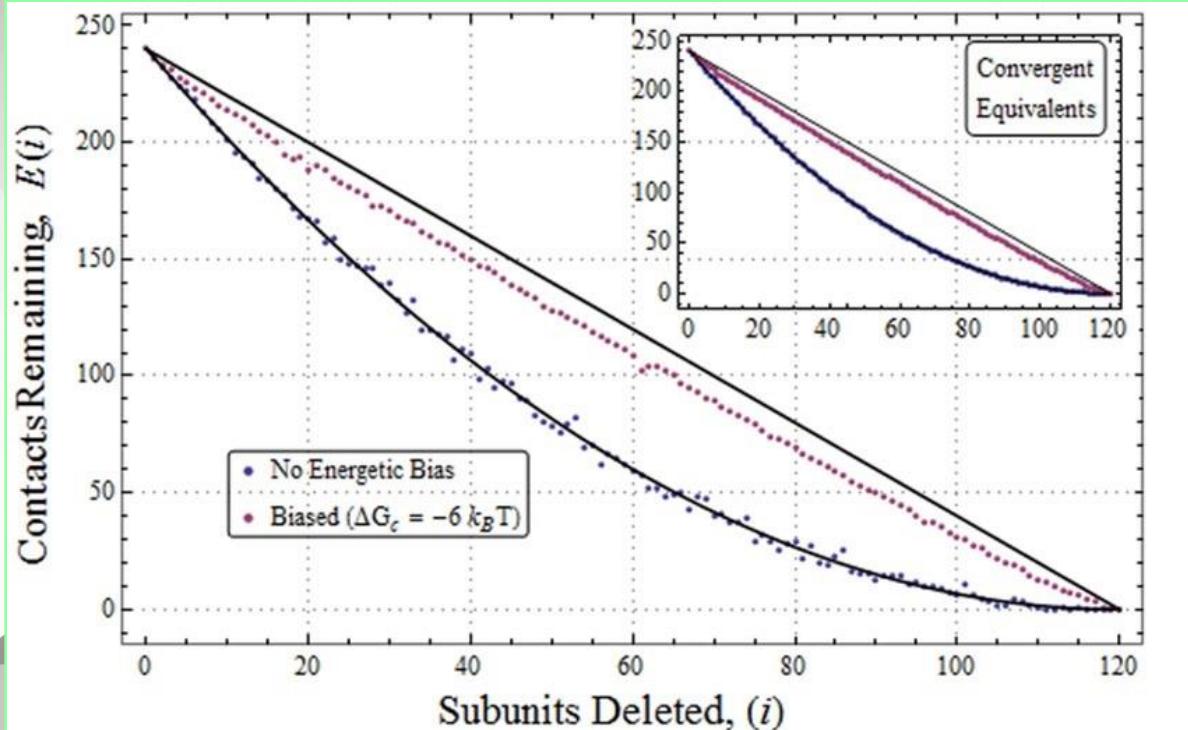
# Dimer-Dimer interaction

No dimer-dimer interaction

$$\bar{E}(i) \simeq E_0 - \bar{k}_o i + \frac{\bar{k}_0}{2} \frac{i}{V_0} i$$

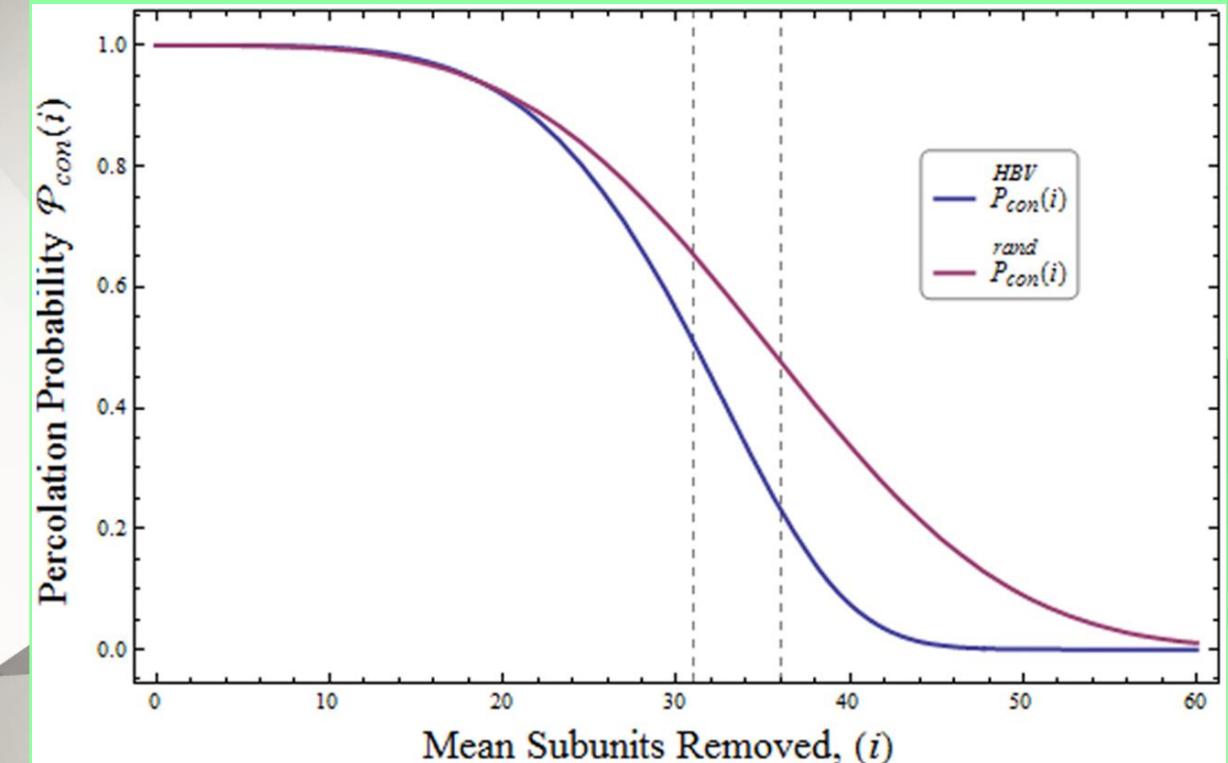
Dimer-dimer interaction

$$\bar{E}(i) \simeq E_0 - \frac{E_0}{V_0} i$$



# Percolation Probability

- Fragmentation is defined as maximum change of percolation probability
- Fragmentation occurs at 25%
- Similar results are obtained with other graphs



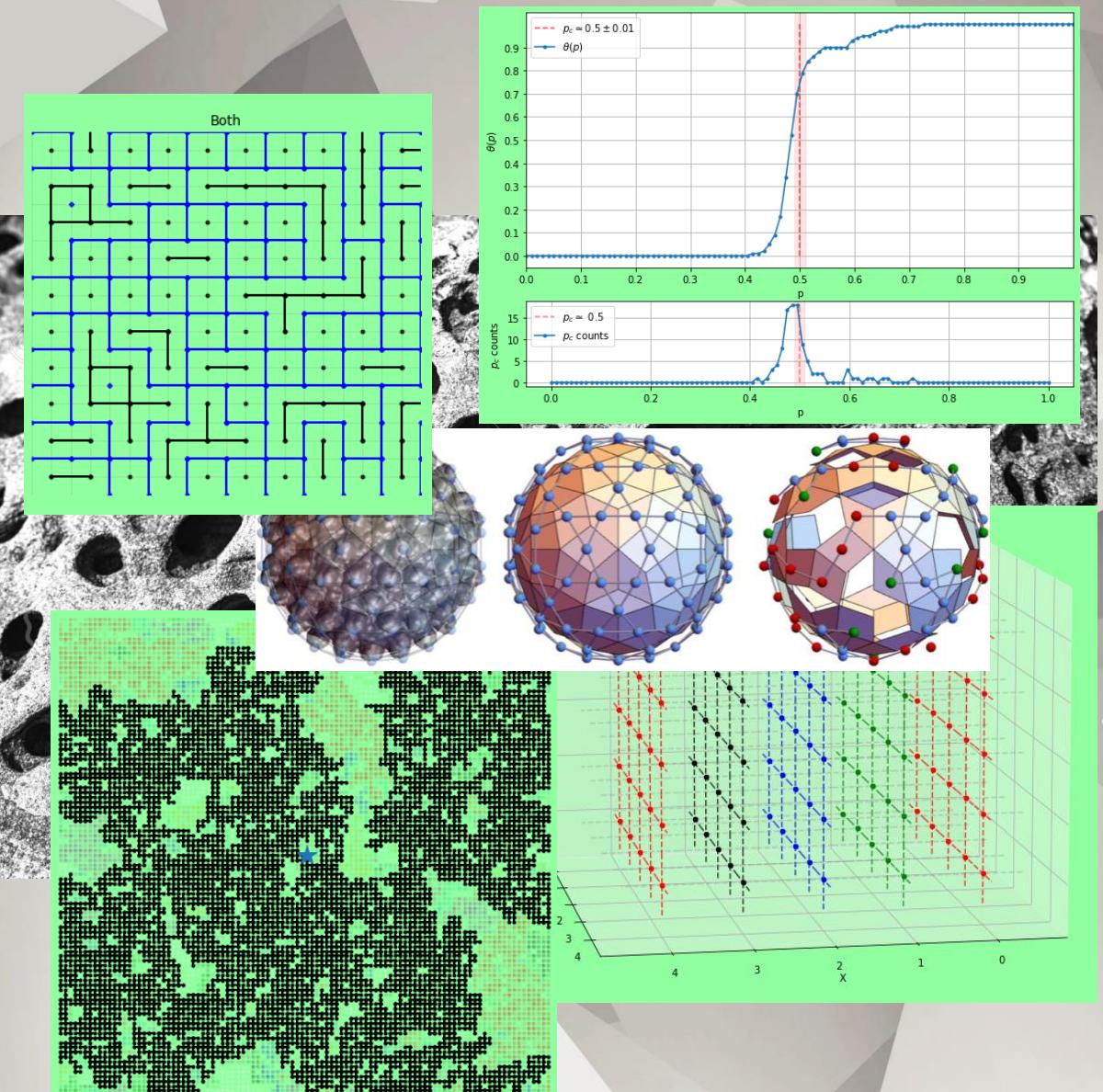
# Conclusions

## About the model

The analogies with the Ising Model are due to **random cluster model**.

## About applications

Quantitative predictions seems forced but qualitative behaviour is enlightening.



# References

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