

# Phase Transitions in Random Discrete Structures

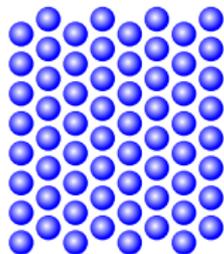
Mihyun Kang

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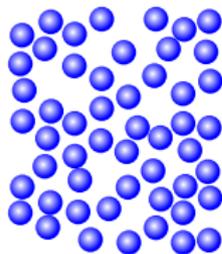


# Phase Transition in Thermodynamics

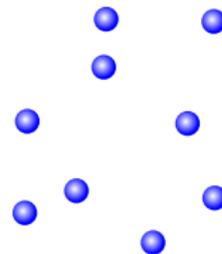
The **phase transition** deals with a **sudden change** in the properties of an asymptotically large structure by altering **critical** parameters.



dense



short range order

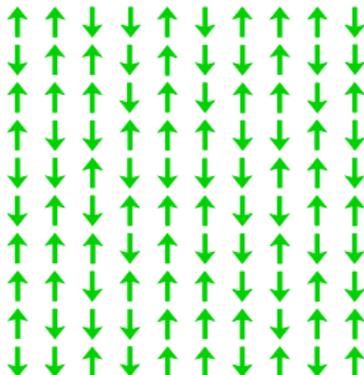


sparse, irregular

# Phase Transition in Statistical Physics

Ising model (mathematical model of ferromagnetism)

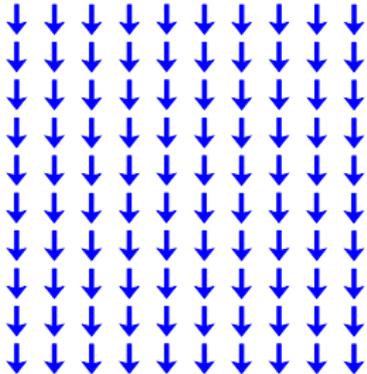
(up or down) Spins are arranged in lattice which interact with nearest neighbours



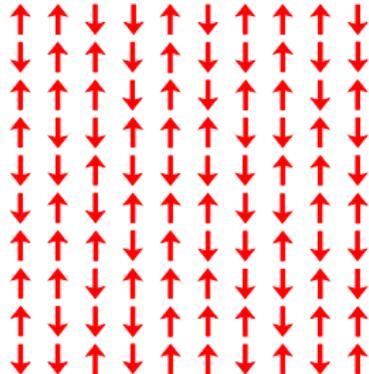
# Phase Transition in Statistical Physics

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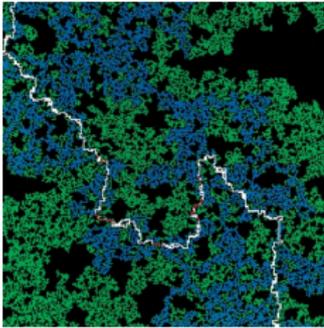
Ordered phase at low temperatures



Disordered phase at high temperatures

# Percolation in Physics, Materials Science and Geography

the passage of fluid or gas going through porous or disordered media

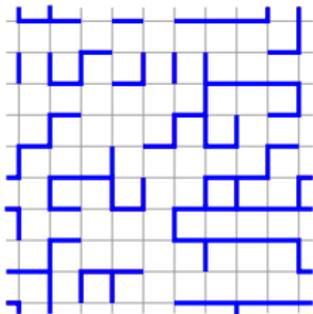


# Percolation in Physics, Materials Science and Geography

## Mathematical models of percolation

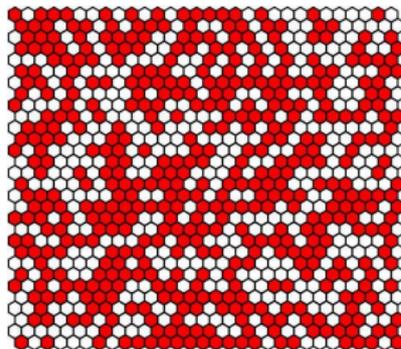
- **Bond** percolation: each **bond** (or edge) is either **open with prob.  $p$**  or closed with prob.  $1 - p$ , independently
- **Site** percolation: each **site** (or vertex) is either **occupied with prob.  $p$**  or empty with prob.  $1 - p$ , independently

$$p < p_c$$



Bond Percolation on Square Lattice

$$p > p_c$$



Site Percolation on Hexagonal Lattice

# Erdős–Rényi Random Graphs

- $G(n, p)$ : each edge of the complete graph  $K_n$  is open with probability  $p$ , independently of each other
- $G(n, m)$ : a graph sampled uniformly at random among all graphs on  $n$  vertices and  $m$  edges



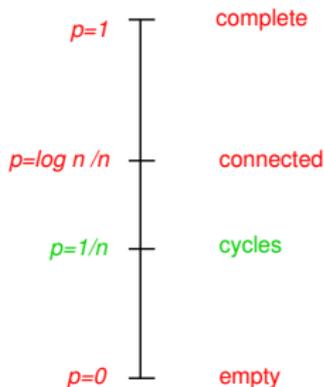
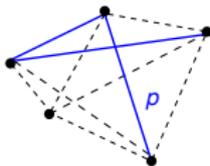
Paul Erdős (1913 – 1996)



Alfréd Rényi (1921 – 1970)

# Erdős–Rényi Random Graphs

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# Phase Transition

## Binomial random graph $G(n, p)$

[ ERDŐS-RÉNYI 60 ]

Let  $p = t/n$  for a constant  $t > 0$ .

- If  $t < 1$ , with probability tending to 1 as  $n \rightarrow \infty$  (whp) all the components have  $O(\log n)$  vertices.
- If  $t > 1$ , whp there is a unique largest component of order  $\Theta(n)$ , while every other component has  $O(\log n)$  vertices.



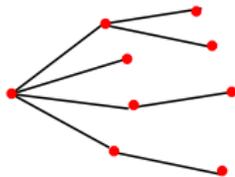
▷ Component exposure via breath-first search and Galton-Watson tree

# Galton-Watson Tree

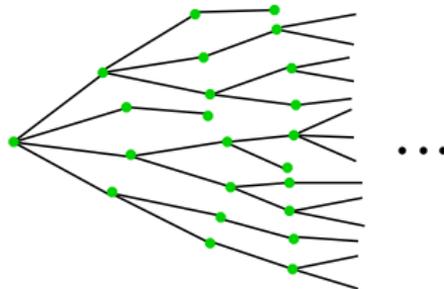
## Branching Process

The number of children is given by i.i.d. random variable  $\sim \text{Po}(t)$ .

- If  $t < 1$ , the process **dies out with probability 1**.
- If  $t > 1$ , with **positive probability** the process **continues forever**.



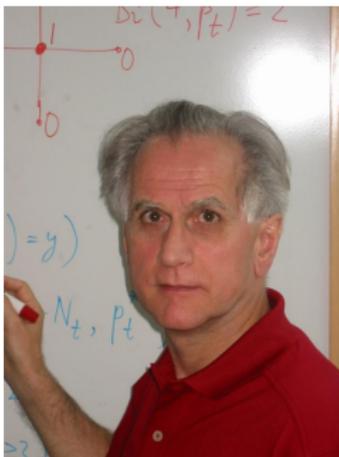
„small” component in  $G(n, p)$



„giant” component of order  $\rho n$  in  $G(n, p)$   
where  $1 - \rho = e^{-t\rho}$

## Critical Phase

How big is the largest component in  $G(n, p)$ , when  $pn = 1 + \varepsilon$  for  $\varepsilon = o(1)$  ?



Béla Bollobás



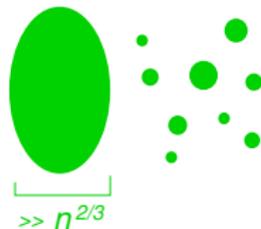
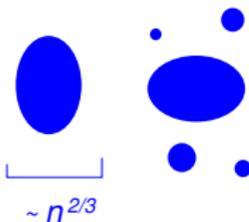
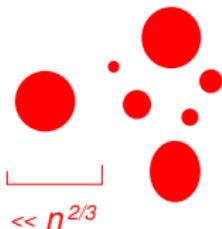
Tomasz Łuczak

# Critical Phase

How big is the largest component in  $G(n, p)$ , when  $pn = 1 + \varepsilon$  for  $\varepsilon = o(1)$  ?

[ BOLLOBÁS 84; ŁUCZAK 90; ŁUCZAK–PITTEL–WIEMAN 94]

- If  $\varepsilon n^{1/3} \rightarrow -\infty$ , whp all components are of order  $o(n^{2/3})$ .
- If  $\varepsilon n^{1/3} \rightarrow \lambda$ , whp the largest component is of order  $\Theta(n^{2/3})$ .
- If  $\varepsilon n^{1/3} \rightarrow \infty$ , whp  $\exists$  a unique component of order  $(1 + o(1)) 2\varepsilon n$ .



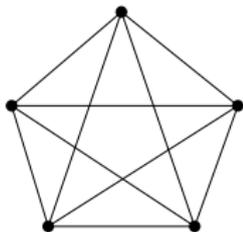
▷ Uniform random graph  $G(n, m)$ :  $m = n/2 + s$ ,  $s n^{-2/3} = \varepsilon n^{1/3}$

# Planar Graphs

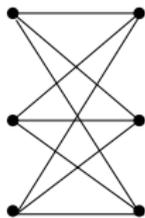
## Planar graphs

A **planar graph** is a graph that **can be embedded in the plane** (without crossing edges).

non-planar



$K_5$



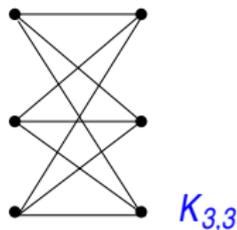
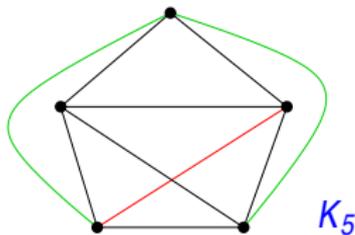
$K_{3,3}$

# Planar Graphs

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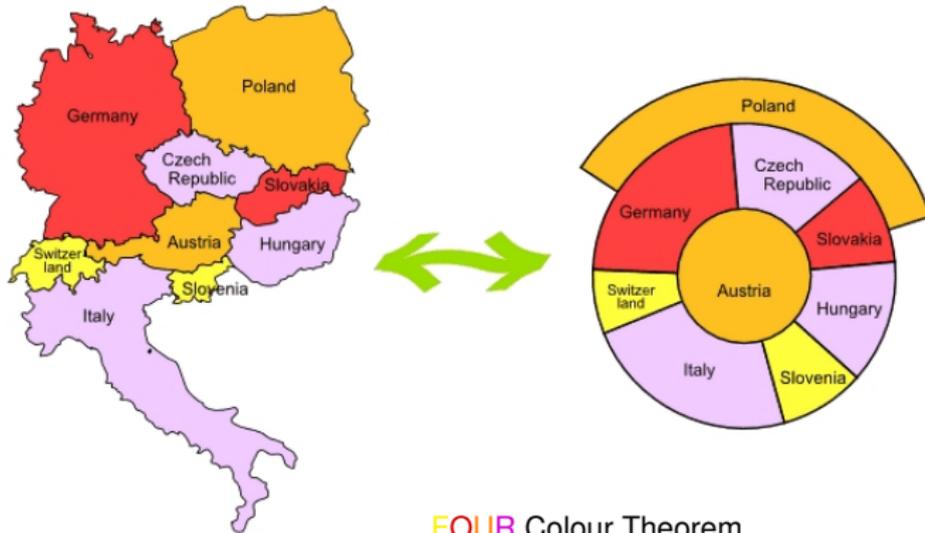
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# Planar Graphs

## Planar graphs

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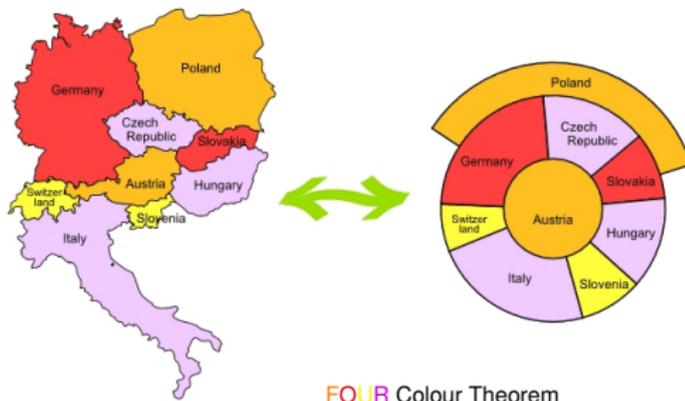


FOUR Colour Theorem

# Random Planar Graphs

## Planar graphs

A **planar graph** is a graph that **can be embedded in the plane** (without crossing edges).



## Random planar graphs

Let  $P(n, m)$  be a uniform random planar graph with  $n$  vertices and  $m$  edges.

# Phase Transition in Random Planar Graphs

Let  $L(n)$  denote the number of vertices in the **largest component** in  $P(n, m)$ .

## Two critical periods

[K.- ŁUCZAK 12]

- Let  $m = n/2 + s$ .

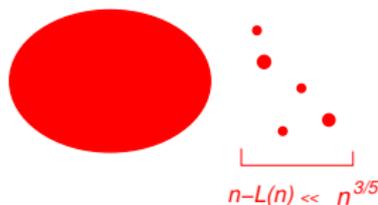
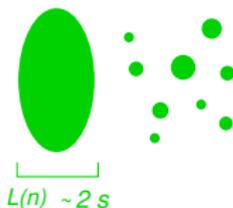
If  $s n^{-2/3} \rightarrow -\infty$ , whp  $L(n) \ll n^{2/3}$ .

If  $s n^{-2/3} \rightarrow \infty$ , whp  $L(n) = (2 + o(1))s \gg n^{2/3}$ .

- Let  $m = n + r$ .

If  $r n^{-3/5} \rightarrow -\infty$ , whp  $n - L(n) \gg n^{3/5}$ .

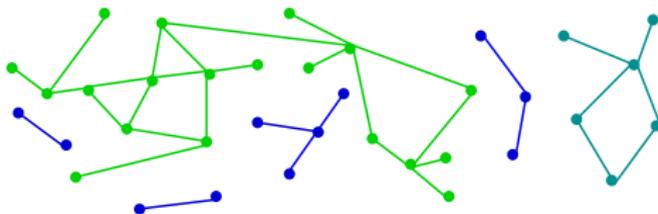
If  $r n^{-3/5} \rightarrow \infty$ , whp  $n - L(n) = \Theta(n^{3/2} r^{-3/2}) \ll n^{3/5}$ .



# Random Planar Graphs

Look into internal structure  $\Rightarrow$  Kernel of complex components

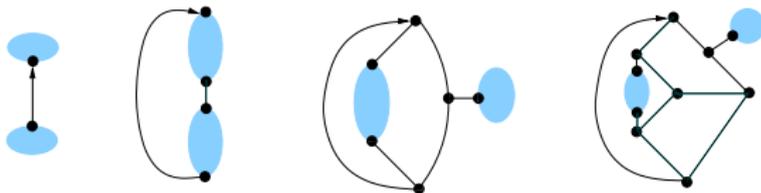
complex com.  
unicyc. com.  
trees



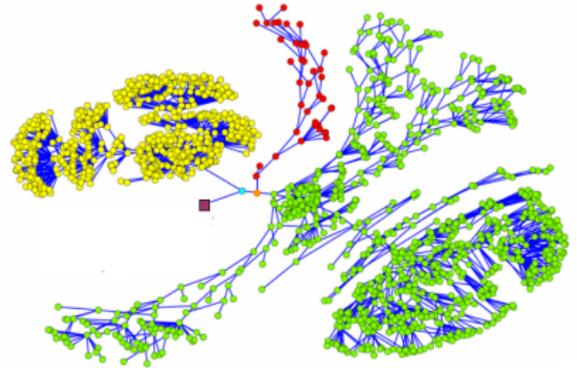
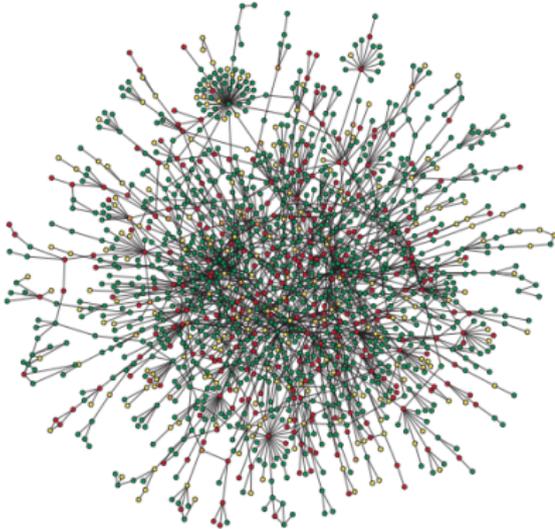
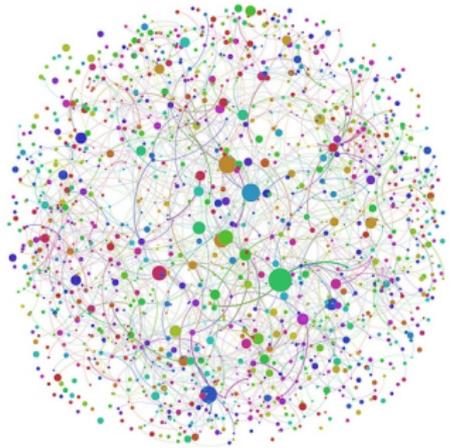
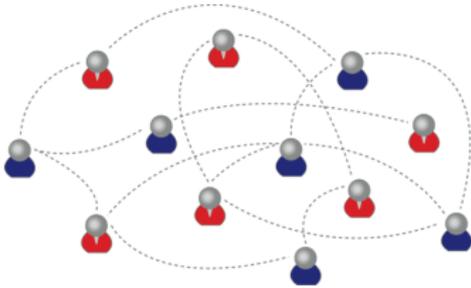
## Typical kernel

[ K.- ŁUCZAK 12 ]

- ▷ **Cubic planar** weighted multigraphs through **singularity analysis** of generating functions



# Complex Networks



# Random Graph Processes

A random graph process is a Markov process defined on the set of graphs of interest; in each step one or several edges are added according to some rule.

▷ Achlioptas process, Bohman-Frieze process: **power of two choices**



Achlioptas



Bohman



Frieze

In each step, two random edges are present

- if the first edge would join two isolated vertices, it is added to a graph
- otherwise the second edge is added
- ▷ it **delays the appearance of the giant component**

[ BOHMAN-FRIEZE 01 ]

# Bohman-Frieze Process

## Phase Transition

[SPENCER–WORMALD 07; JANSON–SPENCER 10+]

- Susceptibility (= average component size): let  $t = 2 \# \text{ edges} / n$ .

$$S(t) = \frac{1}{n} \sum_{1 \leq i \leq n} |C(v_i)| = \frac{1}{n} \sum_{1 \leq k \leq n} k X_k(t, n).$$

Here  $X_k(t, n)$  is the number of **vertices in components of size  $k$**  at time  $t$ .

- Differential equations method:  $\exists$  a **deterministic function  $x_k(t)$**  s.t. whp

$$\frac{X_k(t, n)}{n} \sim x_k(t)$$



Janson



Spencer



Wormald

# Critical Phase in Bohman-Frieze Process

Let  $t_c$  be the critical point of the phase transition and  $t = t_c + \epsilon$  for  $\epsilon$  small.

## Finer behaviour

[ K.-PERKINS-SPENCER 12 ]

- The size of the **second largest component** at time  $t$  is whp  $\Theta(\epsilon^{-2} \log n)$ .
- **Vertices in small components**:  $\exists$  constants  $a, b > 0$  s.t.

$$x_k(t) \sim a k^{-3/2} \exp(-\epsilon^2 k b).$$

## Quasi-linear partial differential equation

[ K.-PERKINS-SPENCER 12 ]

- Susceptibility (= average component size):  $S(t) \sim \sum_{k \geq 1} k x_k(t)$
- The moment generating function  $G(t, z) = \sum_{k \geq 1} x_k(t) z^k$  satisfies

$$\frac{\partial G(t, z)}{\partial t} - z(G(t, z) - 1) \frac{\partial G(t, z)}{\partial z} = 0, \quad G(0, z) = z.$$

# Concluding Remarks

Ubiquitous phase transitions in  
thermodynamics, statistical physics, percolation, random graphs, ...

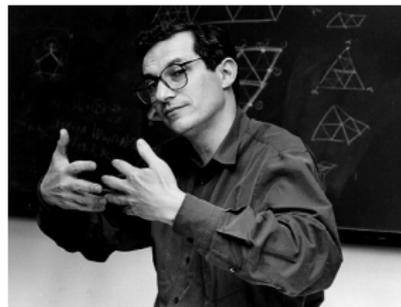
## Cut-off phenomenon of random walks

- How many riffle shuffles are necessary and sufficient to approximately randomise  $n$  cards?

[ DIACONIS 92 ]



Riffle shuffle



Persi Diaconis

# Concluding Remarks

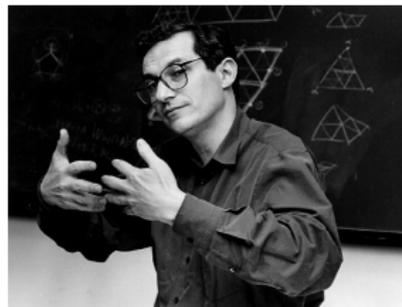
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Riffle shuffle



Persi Diaconis