## Random Graphs

Social and Technological Networks

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## Today

- What are random graphs?
- How can we define "random graphs"?
- Some properties of random graphs


## Erdos - Renyi Random graphs



## Erdos - Renyi Random graphs

$$
\mathcal{G}(n, p)
$$

- n : number of vertices
- p: probability that any particular edge exists
- Take V with n vertices
- Consider each possible edge. Add it to E with probabilityp


# Expected number of edges in an ER graph 

- Expected total number of edges
- Expected number of edges at any vertex


## Expected number of edges

- Expected total number of edges $\binom{n}{2} p$
- Expected number of edges at any vertex

$$
(n-1) p
$$

## Expected number of edges

- For $p=\frac{c}{n-1}$
- The expected degree of a node is : ?


## Isolated vertices

- How likely is it that the graph has isolated vertices?


## Isolated vertices

- How likely is it that the graph has isolated vertices?
- What happens to the number of isolated vertices as $p$ increases?


## Threshold phenomenon: Probability or number of isolated vertices

- The tipping point, phase transition

- Common in many real systems


## Probability of Isolated vertices

- Isolated vertices are
- Likely when: $\quad p<\frac{\ln n}{n}$
- Unlikely when: $\quad p>\frac{\ln n}{n}$
- Let's deduce


## Terminology of high probability

- Poly(n) means a polynomial in $n$
- A polynomial in n is considered reasonably 'large’
- Whereas something like constant, or $\log \mathrm{n}$ is considered 'small'
- Something happens with high probability if

$$
\operatorname{Pr}[\text { event }] \geq\left(1-\frac{1}{\operatorname{poly}(n)}\right)
$$

- Thus for large n , w.h.p there is no isolated vertex
- Expected number of isolated vertices is miniscule


## Useful inequalities

$$
\begin{aligned}
& \left(1+\frac{1}{x}\right)^{x} \leq e \\
& \left(1-\frac{1}{x}\right)^{x} \leq \frac{1}{e}
\end{aligned}
$$

## Union bound

- For events $A, B, C$...
- $\operatorname{Pr}[\mathrm{A}$ or B or $\mathrm{C} . ..] \leq \operatorname{Pr}[\mathrm{A}]+\operatorname{Pr}[\mathrm{B}]+\operatorname{Pr}[\mathrm{C}]+\ldots$
- Theorem 1:
- If $\quad p=(1+\epsilon) \frac{\ln n}{n-1}$
- Then the probability that there exists an isolated vertex

$$
\leq \frac{1}{n^{\epsilon}}
$$

- Theorem 2
- For $p=(1-\epsilon) \frac{\ln n}{n-1}$
- Probability that vertex $v$ is isolated $\geq \frac{1}{(2 n)^{1-\epsilon}}$
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- For $p=(1-\epsilon) \frac{\ln n}{n-1}$
- Probability that vertex $v$ is isolated $\geq \frac{1}{(2 n)^{1-\epsilon}}$
- Expected number of isolated vertices:

$$
\geq \frac{n}{(2 n)^{1-\epsilon}}=\frac{n^{\epsilon}}{2}
$$

Polynomial in $n$

## Global CC in ER graphs

- What happens when $p$ is very small (almost 0)?
- What happens when $p$ is very large (almost 1)?


## Global CC in ER graphs

- What happens at the tipping point?


## Theorem

- For $p=c \frac{\ln n}{n}$
- Global cc in ER graphs is vanishingly small
$\lim _{n \rightarrow \infty} c c(G)=\lim _{n \rightarrow \infty} \frac{\# \text { closed triads }}{\# \text { all triads }}=0$
- In other words, there is no constant c
- Such that cc(ER-graph) >c
- At the tipping point


# Random graphs: Emergence of giant component 

- Suppose $\mathrm{N}_{\mathrm{G}}$ is the size of the largest connected component in an ER graph
- How does $\mathrm{N}_{\mathrm{G}} / \mathrm{N}$ change with p ?
- When is $\mathrm{N}_{\mathrm{G}} / \mathrm{N}$ at least a constant?
- (giant component: at least a constant fraction of nodes)


## Giant component

- When $p=(1-\varepsilon) / n$
- W.h.p no GC, components of size $O(\log n)$
- When $p=(1+\varepsilon) / n$
- W.h.p GC exists, where $N_{G} / N \sim \varepsilon$
- When $p=1 / n$
- W.h.p Largest component has size $n^{2 / 3}$


## Project

- Topics will be out today.
- Check email/piazza
- You can work/discuss in groups 2 of 3
- But final submission is individual.
- Select Project by Friday Oct 11
- Don't rush. Think carefully what you might do in that topic. Look at the dataset.
- Once selected. Don’t delay. Start working immediately.
- Final submission due: Thursday November 14.


## Project

- October 21:
- Due date for midway project plan.
- Submit a 1 page description of topic and problem statement, and how you plan to approach it. And get comments.
- No marks. Feedback only.
- Office hours: Tuesdays 2pm. IF 3.45.

