



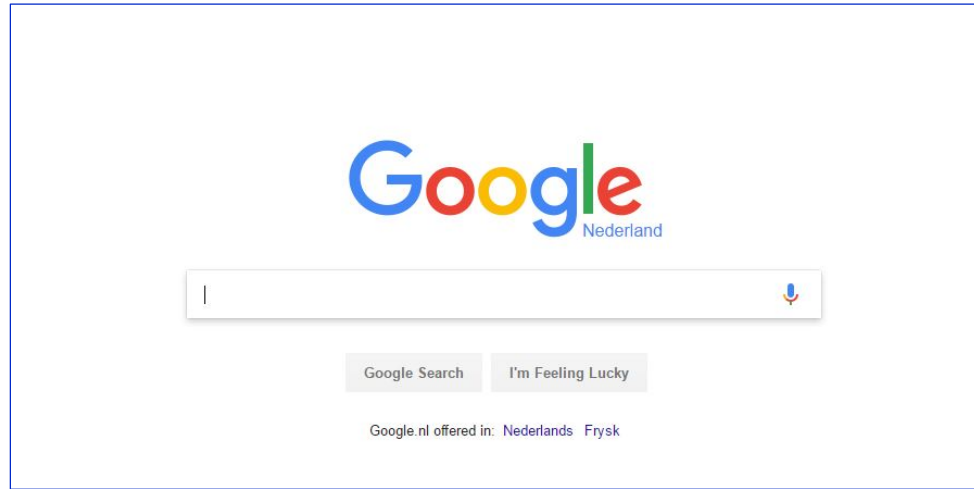
Mathemagics

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Internet

Internet



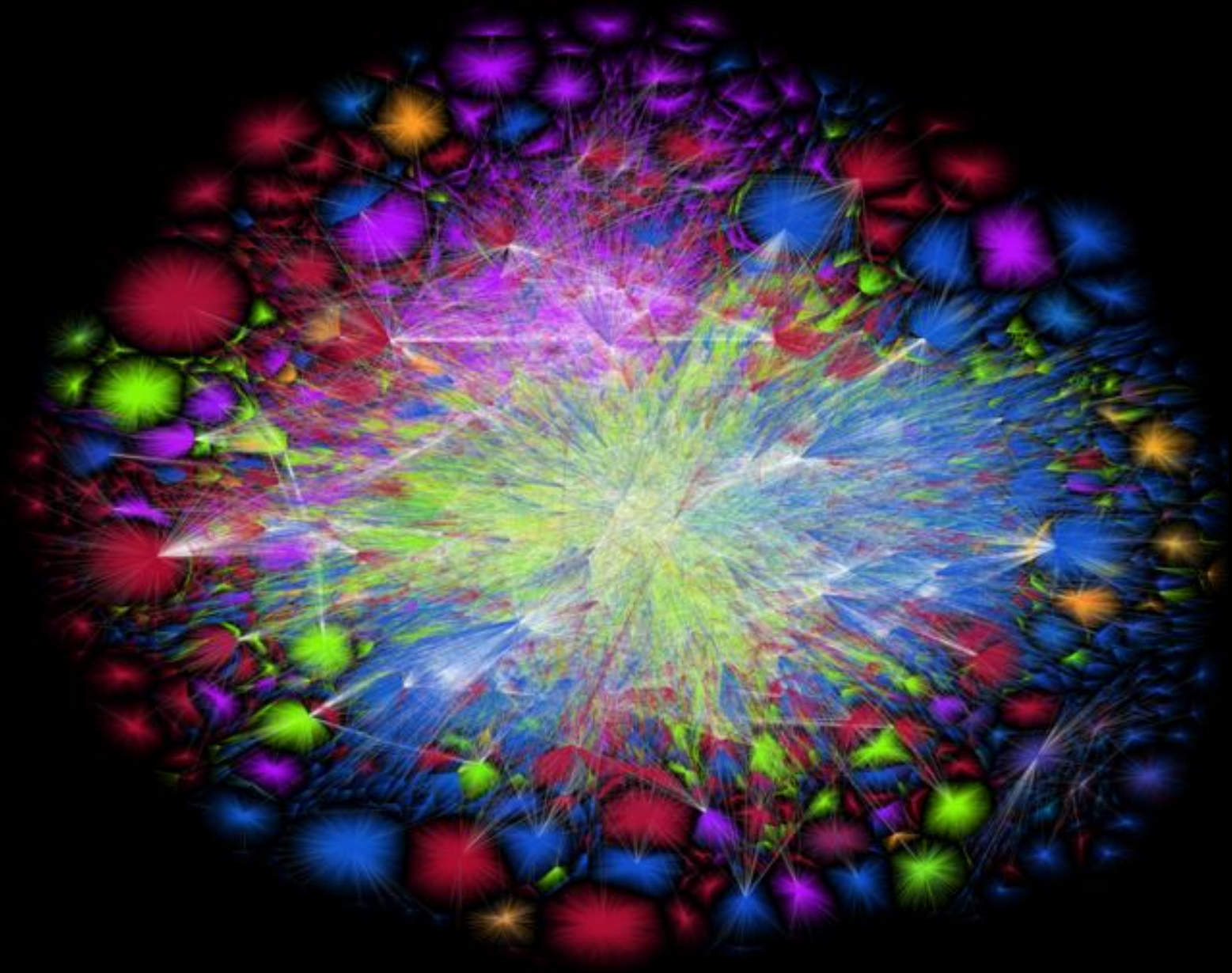
Internet



Will the Internet stay connected?

Internet as a graph

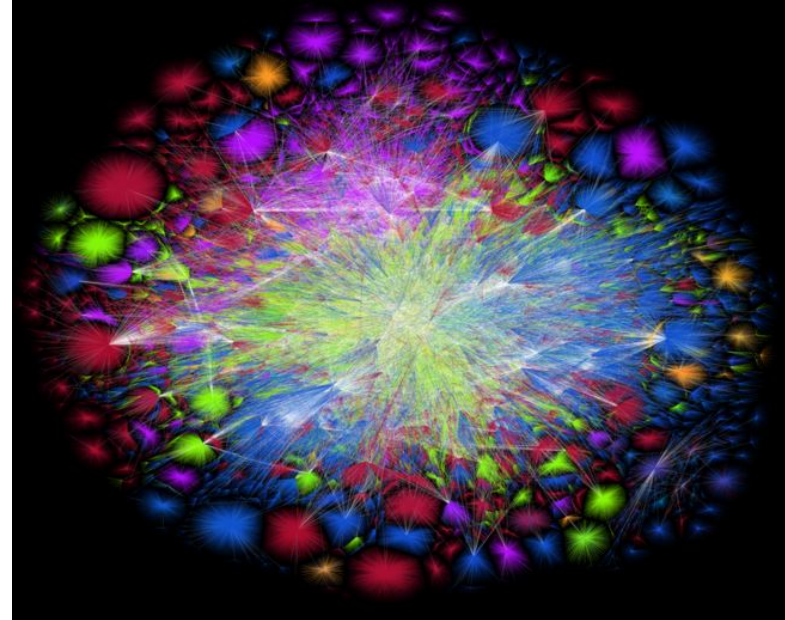
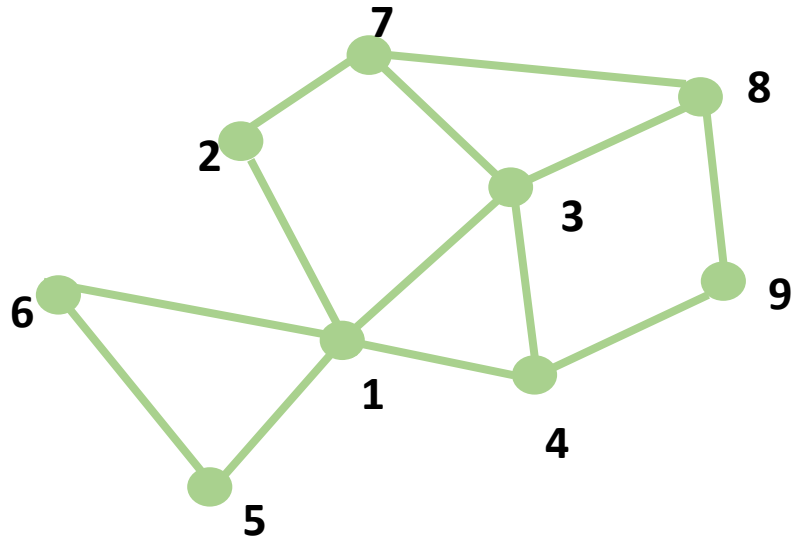
- Servers/computers = vertices
- Connections = edges
- How will this graph look like?



Barrett Lyon www.opte.org

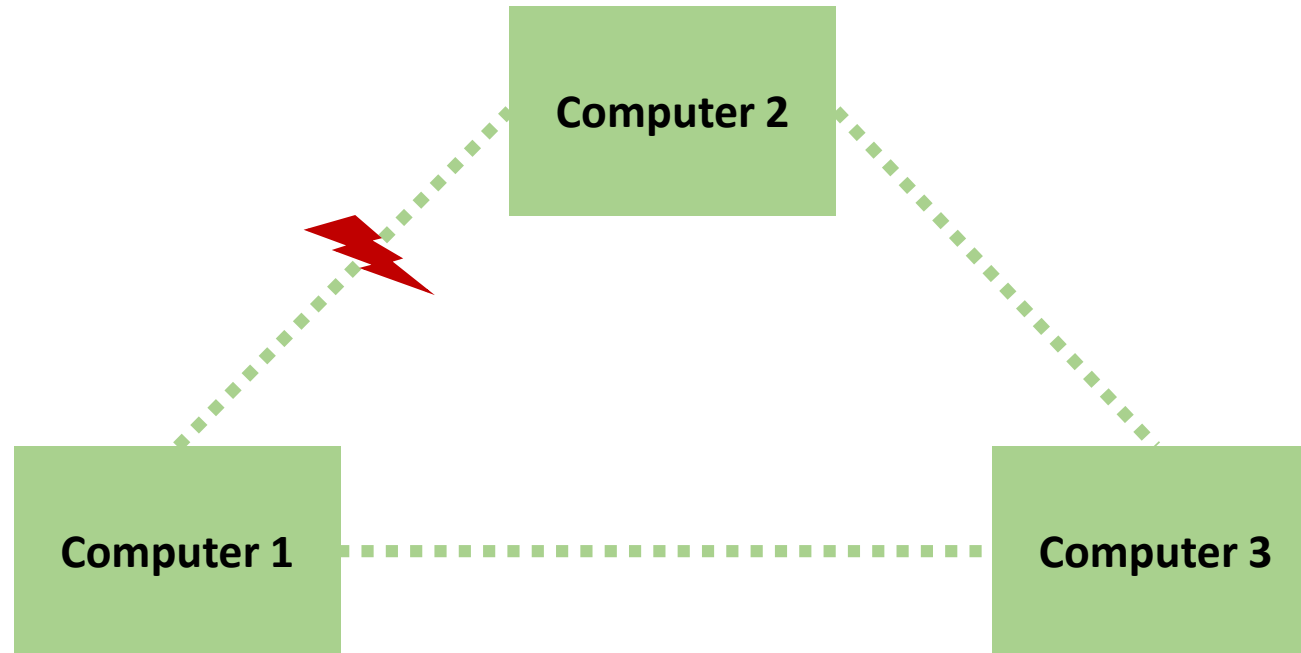
- **Connected graph:**

There is path along edges from any vertex to any other vertex



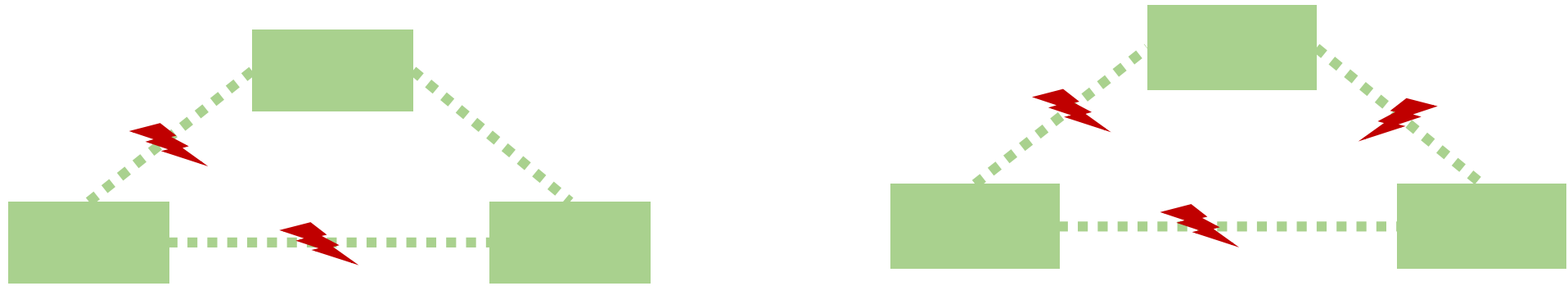
- Will the Internet stay connected under failures, overloads, attacks?

Mini-Internet



- A channel is available with probability p , $0 < p < 1$
- A channel is unavailable with probability $1-p$

Probability to disconnect the network



$$3p(1-p)^2 + (1-p)^3$$



- When $(1-p)$ is small, $(1-p) > 3p(1-p)^2 + (1-p)^3$
- The network is more robust than one channel!
- **What about large networks?**

Erdős-Rényi random graph (1959)

- n vertices
- An edge between two vertices exists with probability p
- Independently of other edges
- Take $p=p(n)$
- **Theorem (Erdős-Rényi).**
 - If $p > \ln(n)/n$, then with high probability the network is **connected**
 - If $p < \ln(n)/n$, then with high probability the network is **disconnected**
 - If $p = \ln(n)/n$, then the network is **disconnected with probability, which converges to e^{-1}**

Phase transition



Ice turning to water at 0°C

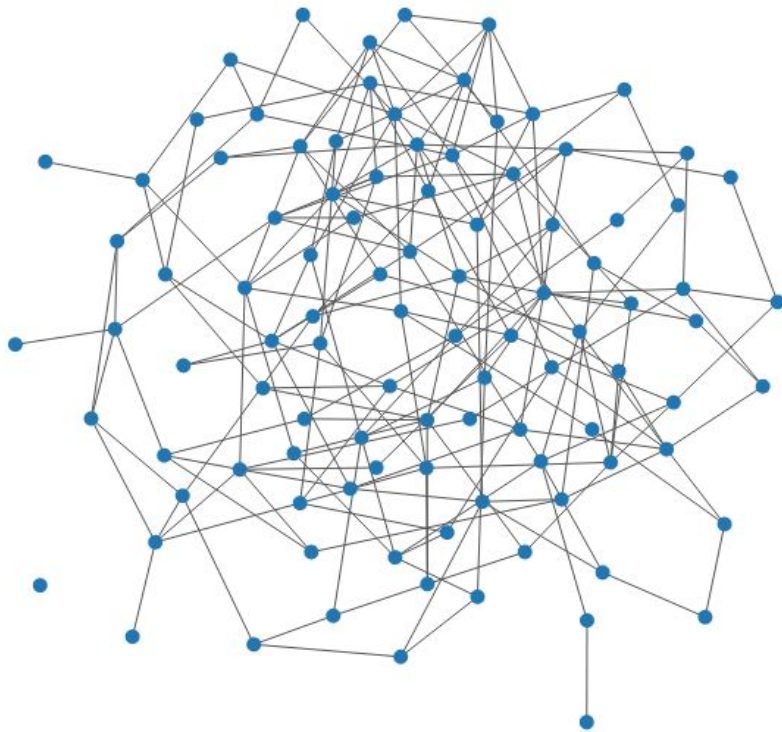
Phase transition

- **Theorem (Erdős-Rényi).**

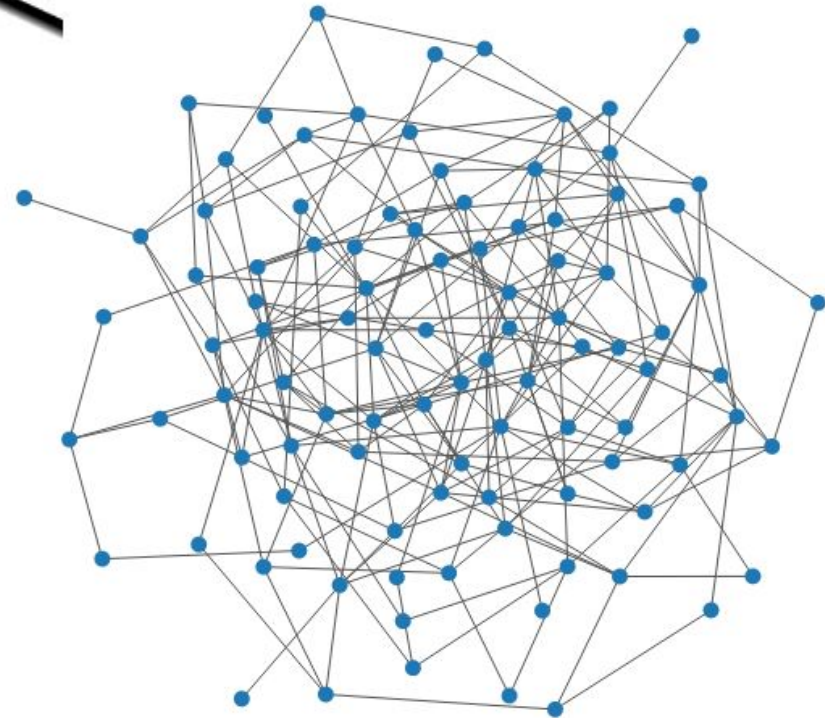
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-
- Critical probability $p = \ln(n)/n$
 - Decreases with n
 - Again, larger networks are more robust

Example

- $n=100$, $\ln(n)/n \approx 0.046$



$p=0.04$



$p=0.05$

Magic revealed

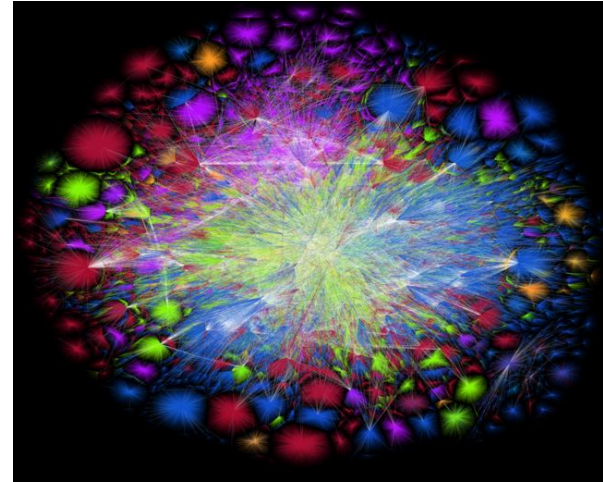
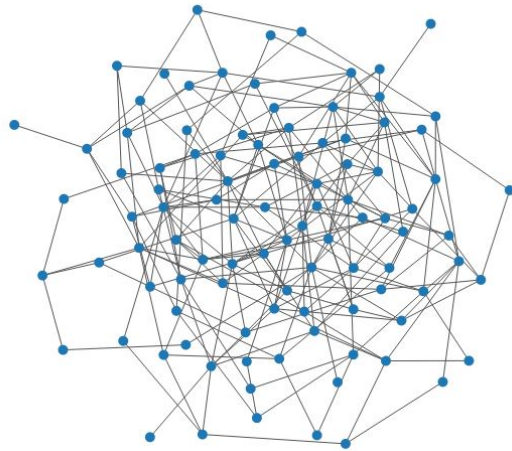
- Most likely way to get the network disconnected: completely disconnect at least one of the vertices
 - It is more difficult to disconnect a group of vertices
- $P(\text{one vertex is disconnected}) = (1 - p(n))^{n-1}$
- Average number of disconnected vertices = $n (1 - p(n))^{n-1}$
- Substitute $p(n) = c \ln(n)/n$

$$\lim_{n \rightarrow \infty} n \left(1 - \frac{c \ln(n)}{n} \right)^{n-1} = \lim_{n \rightarrow \infty} n e^{-c \ln(n)} = \lim_{n \rightarrow \infty} n^{1-c}.$$

- If **$c < 1$** then the average number of disconnected vertices goes to infinity
- If **$c > 1$** then the average number of disconnected vertices goes to zero
- The actual number of disconnected vertices is close to its average
- If **$c = 1$** , the number of disconnected vertices converges to a Poisson(1) distribution, and $P(\text{no disconnected vertices}) = e^{-1}$

Back to the Internet

- Erdős-Rényi random graph is not a realistic model for the Internet



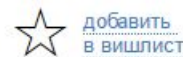
- Hubs, backbone, bandwidth
- A lot of research on robustness of the Internet
- However, even the simplest model given important insights:
 - Robustness of large network
 - Phase transition

Mathemagics forever!





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N. Litvak, A. Raigorodskii. *Who needs mathematics? A clear book about how the digital world is arranged.* MIF publishers, Moscow.

Release date: **02-03-2017**