

# Lecture 4: Understanding the small world phenomena

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Social Networks (Soc 204)  
Princeton University

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Review:

- ▶ empirical vs modeling approaches

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Today we will see two different small world models and then an empirical assessment

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- ▶ small overlapping groups that are linked by people who belong to multiple groups
- ▶ social network evolve
- ▶ not all relationships are equally likely
- ▶ occasionally we do things that are not determined by existing network structure

3.1

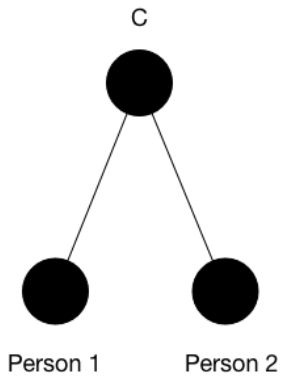
Likelihood  
that  
A meets B

Caveman World

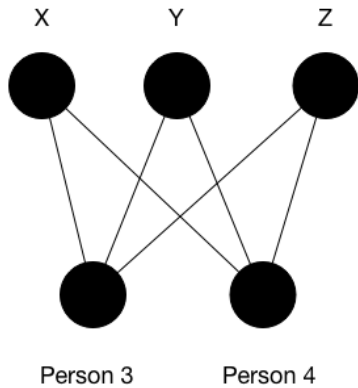
Solaria World

Number of mutual friends  
shared by A and B

The graph features a vertical y-axis and a horizontal x-axis, both ending in arrows. A smooth, S-shaped curve starts at the origin (0,0). The upper portion of the curve, which rises steeply and then levels off at a high value, is labeled 'Caveman World'. The lower portion of the curve, which remains near the x-axis for a long distance before rising steeply, is labeled 'Solaria World'. The two curves meet at the far right edge of the graph, where they both reach their maximum values.

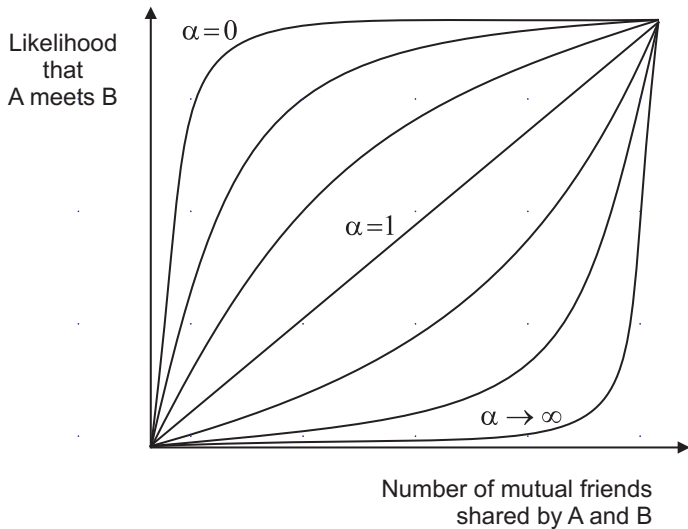


1 mutual friend

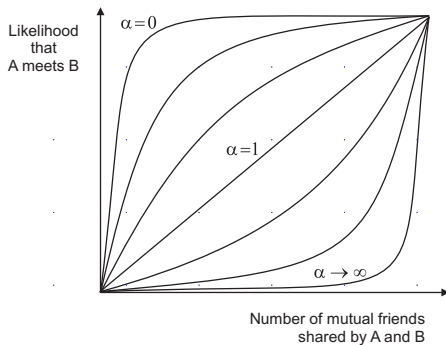


3 mutual friend

3.2



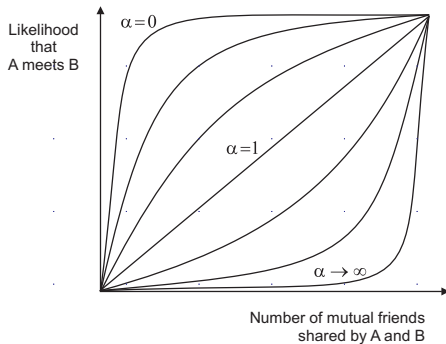
3.2



As technology changes do you think we are moving more toward:

1. caveman world ( $\alpha = 0$ )
2. solaria world ( $\alpha \rightarrow \infty$ )

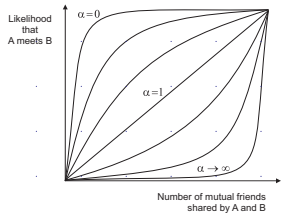
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As technology changes do you think we are moving more toward:

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$$R_{i,j} = \begin{cases} 1 & m_{i,j} \geq k \\ \left[ \frac{m_{i,j}}{k} \right]^\alpha (1-p) + p & k > m_{i,j} > 0, \\ p & m_{i,j} = 0 \end{cases} \quad (5)$$

Note on this process of modeling: the graph came before the equation.



First metric:

Characteristics path length  $L$ : number of edges in shortest path, averaged over all paths

$L$  is defined as the number of edges in the shortest path between two vertices



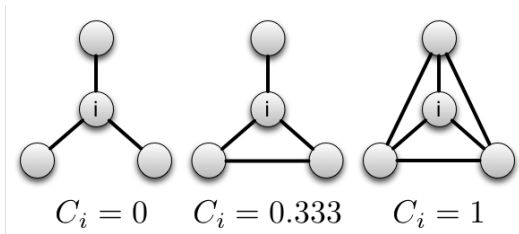
*shortest path  
is 1 edge*



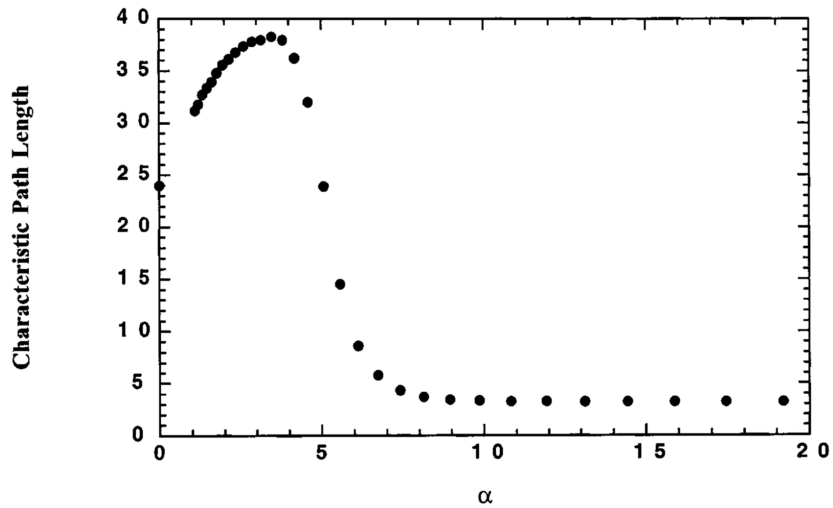
*shortest path  
is 3 edges*

Second metric:

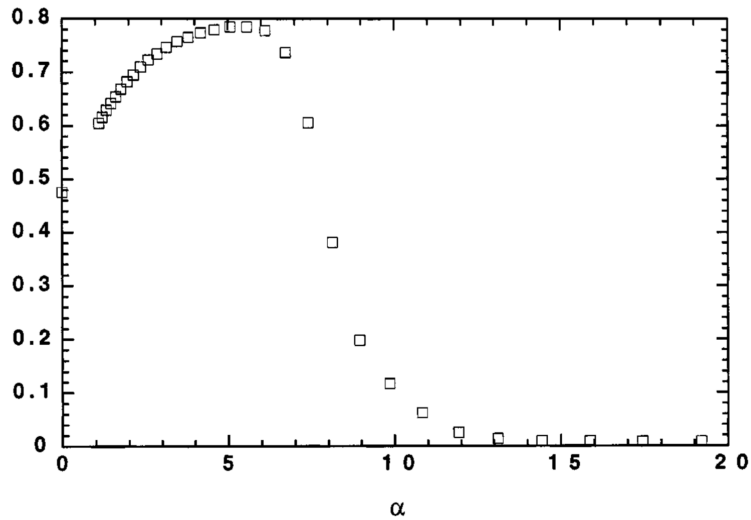
Clustering coefficient  $C$ : probability that two friends of a randomly chosen person are friends

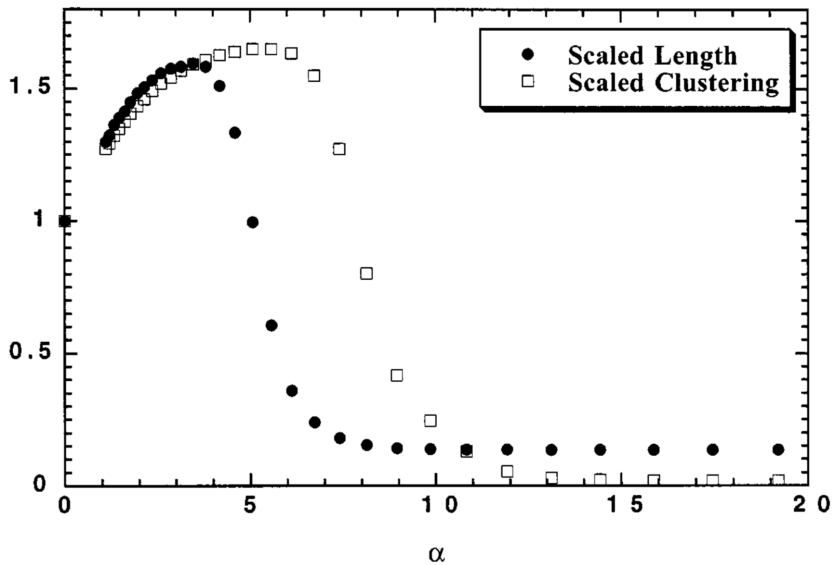


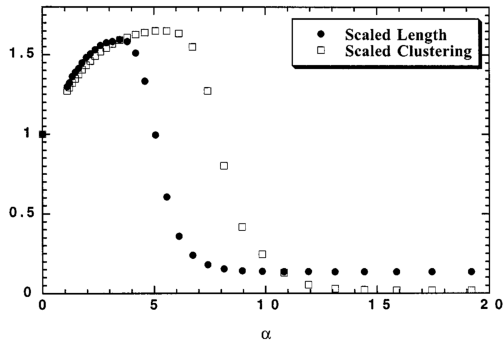
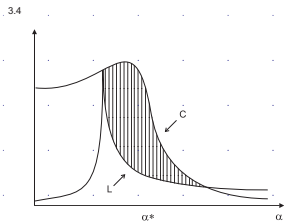
If we simulate lots of people following these rules, what kinds of networks get created?



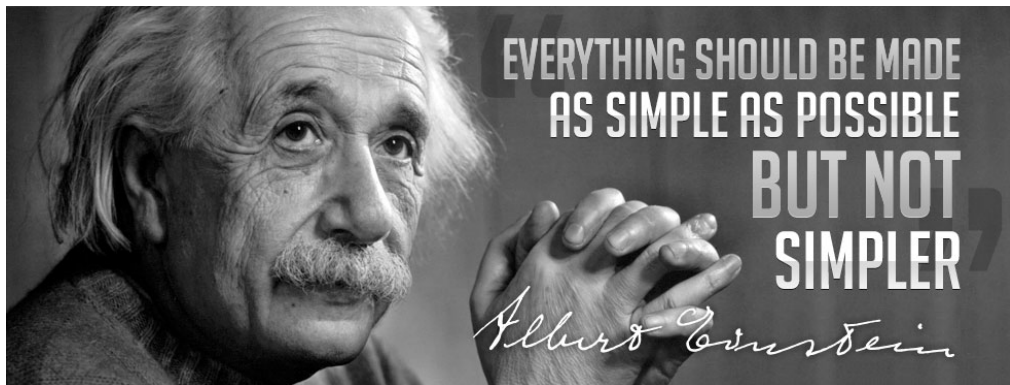
Clustering Coefficient







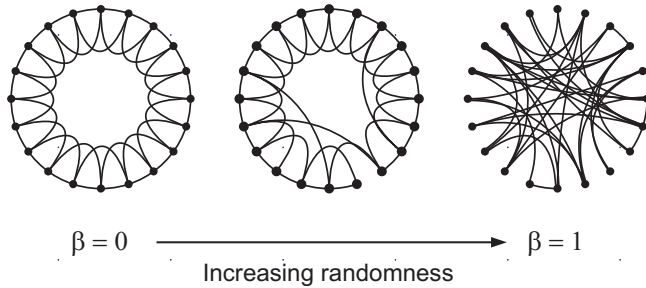
Paper and book look different because paper does not include the disconnected region



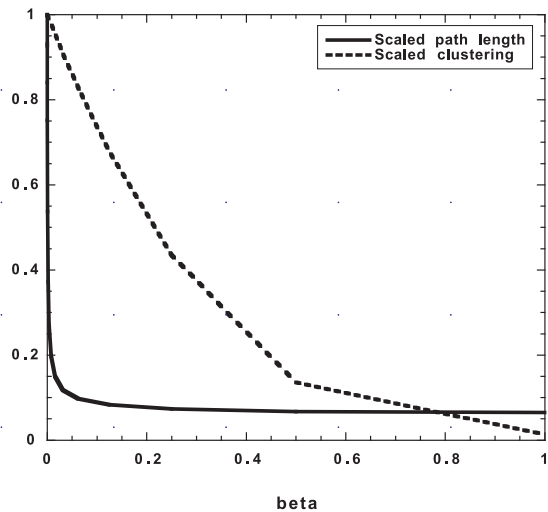
<http://vireomd.net/blog/dhc/einstein-kiss.html>



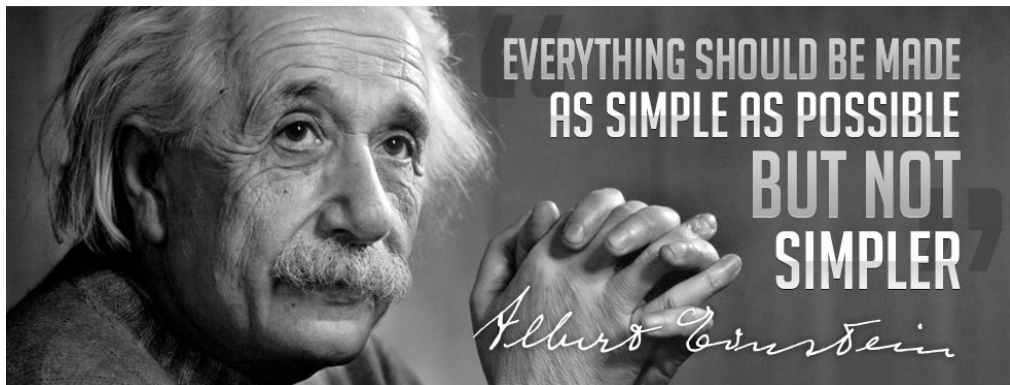
3.6



3.7

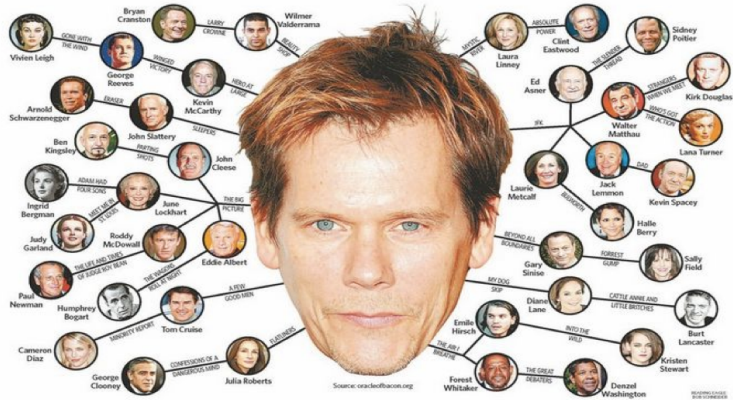


Demo: [http://mathinsight.org/small\\_world\\_network](http://mathinsight.org/small_world_network)



<http://vireomd.net/blog/dhc/einstein-kiss.html>

# Are real networks small world networks?



Small world means:

▶  $L_{actual} \approx L_{random}$

▶  $C_{actual} \gg C_{random}$

---

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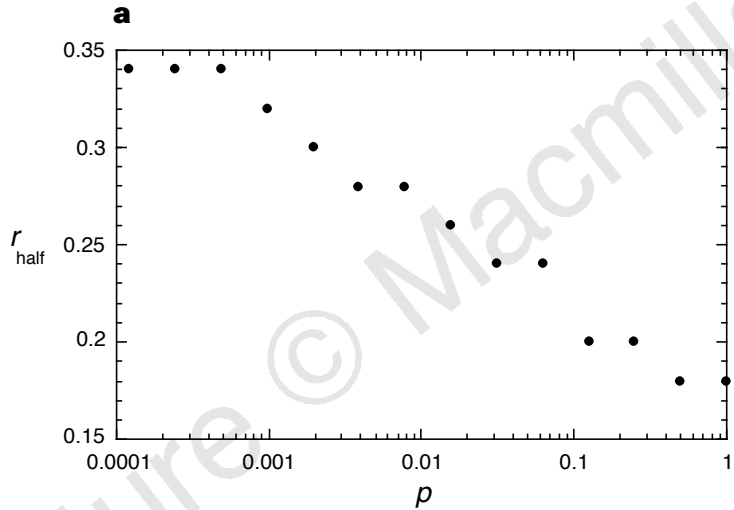
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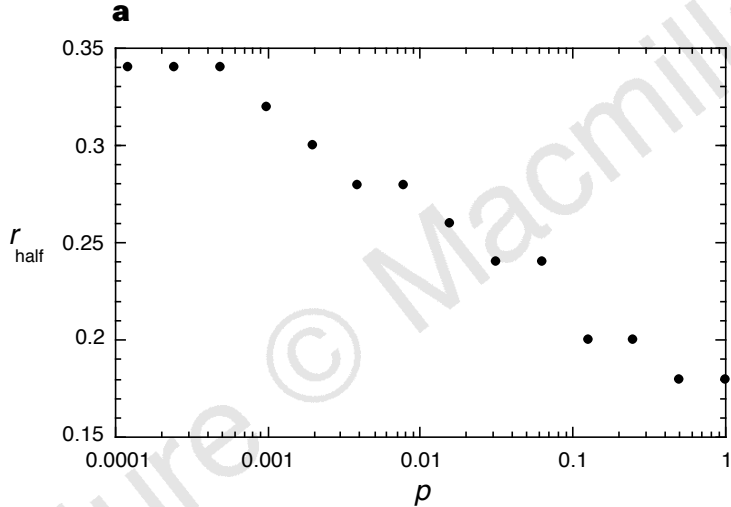
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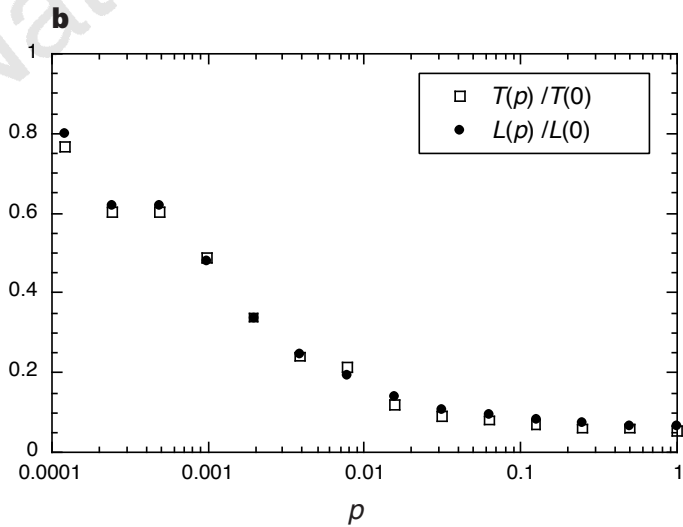
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Movie actors	3.65	2.99	0.79	0.00027
Power Grid	18.7	12.4	0.080	0.005
C. Elegans	2.65	2.25	0.28	0.05

Who cares?

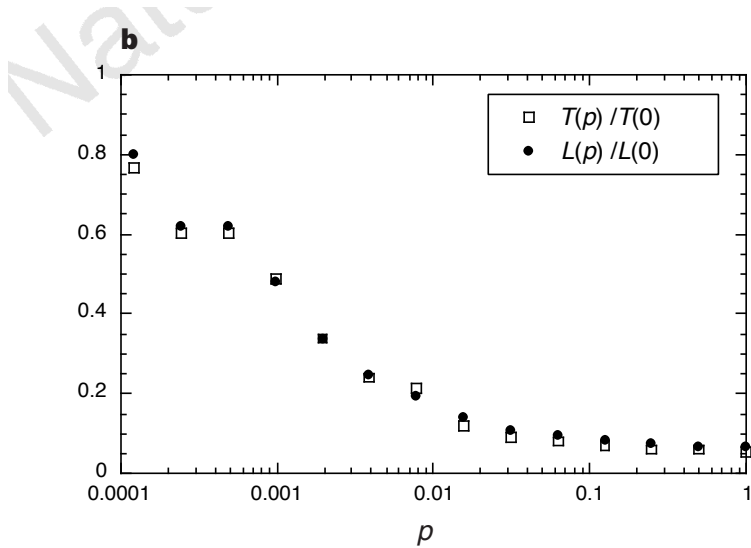




The more shortcuts the less infectious ( $r$ ) a disease needs to be to spread







The more shortcuts the faster a disease spreads

Making length contractions concrete . . . .

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- ▶ similarity across networks of different types
- ▶ network structure impacts dynamics

Feedback: <http://bit.ly/soc204-2021>



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Next class. Power law networks

- ▶ Watts, Chapter 4, 101-114.
- ▶ Barabasi, A.L. and Bonabeau, E. (2003) Scale-free networks. *Scientific American*, 50-59.
- ▶ Barabasi, A.L. and Albert, R. (1999) The emergence of scaling in random networks. *Science*, 286:509-512.
- ▶ Liljeros, F. et al. (2001). The web of human sexual contacts. *Nature*, 411:907-908 with comment and rejoinder.