

We will talk about Watts-Strogatz (SMALL WORLD)  
The original article is from 1998 (Nature 393)

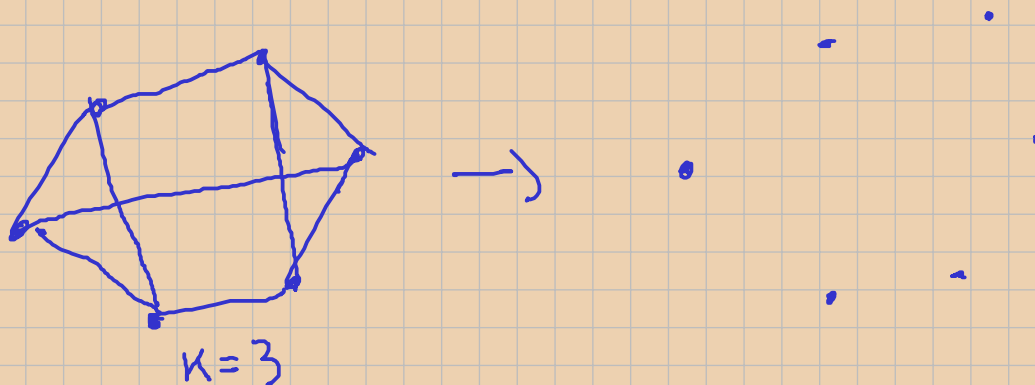
Everything important is in the "for dummies" slide

A regular graph is a graph where all the nodes have the same degree.

We start from a regular graph with fixed  $k$  (for example  $k=4$ )

We associate a probability  $0 < p < 1$ ,  $p$  is the probability that for each node, each link is disconnected and reconnected to a "far away node", a "far away node" is a node that was not linked in the original configuration. This process is called rewiring.

The average degree is the same, but the specific degree of a node could go up or down.



$\frac{Nk}{2}$  is the number of links in our regular graph

$p \frac{Nk}{2}$  is the average number of links that we rewire

It can be shown that every node, after the process, will have at least  $k/2$  links

$$k_i = \frac{k}{2} + c_i$$

$$c_i = c_i^1 + c_i^2$$

$$\left\{ \begin{array}{l} c_i^1 \leq \frac{k}{2} \quad \text{are the edges left in place (with probability } 1-p) \\ c_i^2 = c_i - c_i^1 \quad \text{are the edges that have been rewired with prob. } 1/N \text{ (for large } N) \end{array} \right.$$

By combining these two, we find that the degree distribution depends on  $p$   
The average value of  $k_{\text{max}}$  will remain the same for different values of  $p$ , the width of the distribution gets larger for larger  $p$ .

We start with something with a high clustering coefficient, we break a link and put it far away. This is the small world model.  
The small world model is a coreperiphery-like model.

The idea of the small world model is born with Stanley Milgram and his idea in 1967. He was a sociologist.

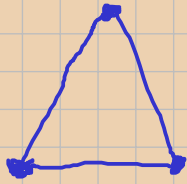
If the network is small world, then the average path lenght goes like  $\ln(N)$ , where  $N$  is the number of nodes. We will not demonstrate it.

With ER, if we have higher degree we have a smaller average path lenght (of course, because we have more ways to move between the nodes)

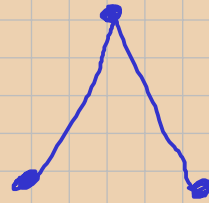
The average path lenght of a regular graph is  $APL = \frac{N}{2k}$

In a ER or BA type graph, the APL increases with  $N$ , and the local clustering coefficient decreases  $N$ .

- In a regular network:



triangle



connected triple

$$C = \frac{3 \cdot \text{total number of triangles}}{\text{total number of connected triples}} \equiv \text{global clustering coefficient}$$

$$C = \frac{3(n-2)}{4(n-1)}$$

we don't show how we get this formula, but it can be shown

- to recap, in a regular graph

$$APL = \frac{N}{2k} \equiv L(0)$$

$$C_{\text{eff}} = \frac{3}{4} \frac{(n-2)}{(n-1)} \equiv C(0)$$

- In the case of Watts-Strogatz (small world), we look at  $\underbrace{C(p)/C(0)}$  and  $\underbrace{L(p)/L(0)}$   
clustering coefficient after rewiring with  $p$  prob.      APL after rewiring with  $p$  probability.

The APL decreases with  $p$ , (if we have a high  $p$  it's easier to have connections with far away nodes, so the APL decreases, it's a small world!), even with  $p$  of just 0.1%, the APL is halved in respect to  $L(0)$  (it's from the starting regular graph)

The clustering coefficient decreases with  $p$  as well, of course. But way slower, with  $p = 1\%$  it is basically still the same as  $C(0)$ , even with  $p = 10\%$  is still about 70%.

To compare the  $C$  or the  $L$  of a graph we can't watch the absolute numbers, we can generate a random graph with same  $N$  and  $k$  for each node but connected random, and calculate the  $C_{\text{rand}}$  and  $L_{\text{rand}}$ , we say that for that graph  $L$  or  $C$  is big if they're big when compared to  $C_{\text{rand}}$  and  $L_{\text{rand}}$ .

- We talk about weak ties.

Granovetter talks about this in an article from 1973 (he was a sociologist)

After we do the rewiring, mutating a regular graph in a small world model, every link that is not changed (and thus remains local) is called a strong tie.  
Every link created during the rewiring (so with far away nodes) is called a weak tie.

Strong ties can be seen like a man links with members of his family,  
Weak ties can be seen like a husband-wife

Weak ties are **STRONG** in practice! They are very important in various aspect, for example they lower a lot the APL, they have "cohesive power".

A wedding makes a family much larger!

It's called "weak" because it's very vulnerable, if it's destroyed the graph suffers.

To know if a network is a small world we can do:

We generate  $C_{\text{rand}}$  and  $L_{\text{rand}}$ , if  $C$  is significantly bigger than  $C_{\text{rand}}$  and  $L$  is significantly smaller (or pretty similar) to  $L_{\text{rand}}$ ... Then the network is a small world!