

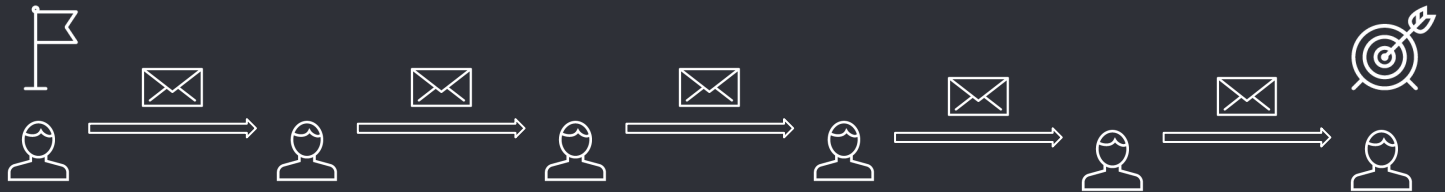
# SMALL WORLD PHENOMENON



1

# SIX DEGREES OF SEPARATION

“Given any two people in the world, person X & person Z, how many intermediate acquaintance links are needed before X & Z are connected?” - *Milgram (1967)*



## SIX DEGREES OF SEPARATION

Why are we surprised by short paths?



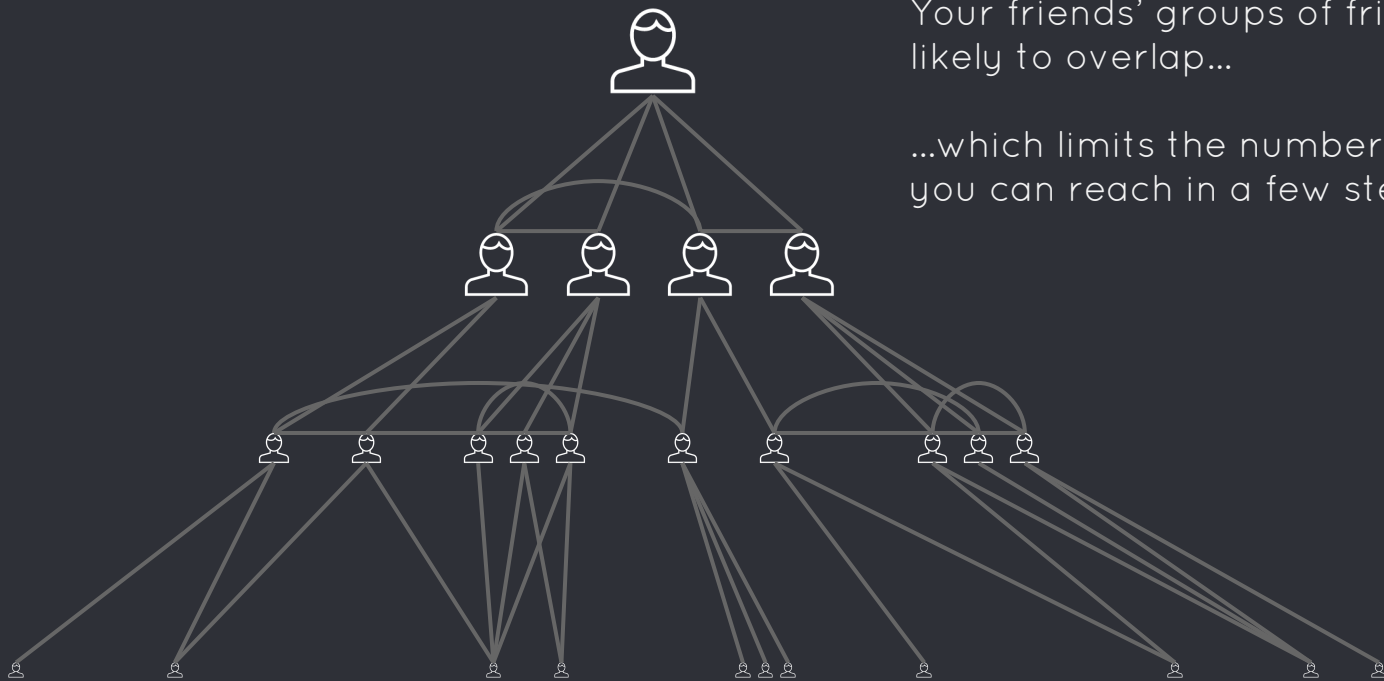
If everyone has at least 100 friends...

... you could in principle be 3 steps away from 1 million people...

...and 5 steps away from 10 billion.

## SIX DEGREES OF SEPARATION

Real social networks contain many triangles

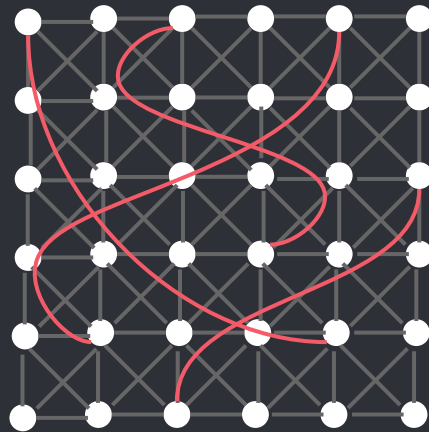


Your friends' groups of friends are likely to overlap...

...which limits the number of people you can reach in a few steps

# WATTS-STROGATZ MODEL

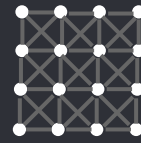
Many closed triads, but also very short paths



## WATTS-STROGATZ MODEL

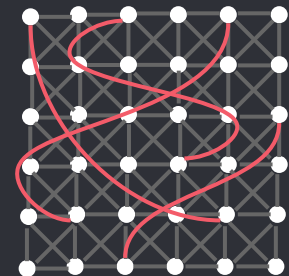
Idea:

- combine homophily
- with weak ties



Model:

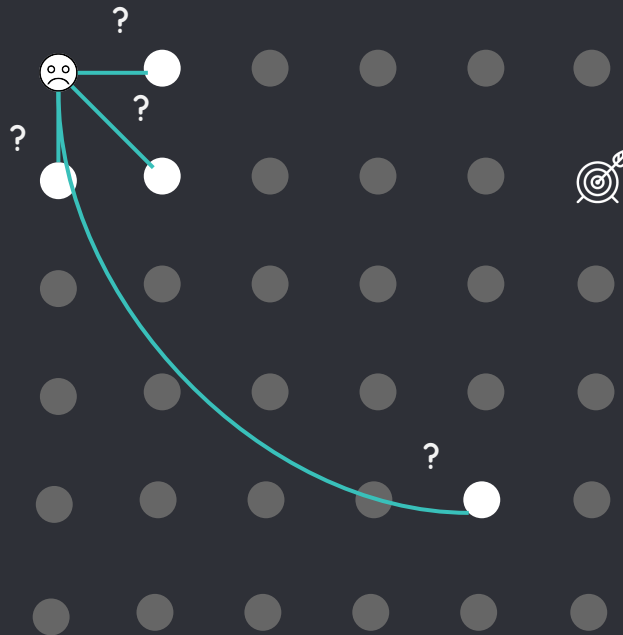
- Each node in lattice connected to all nodes within radius  $r$
- $k$  nodes have an extra random connection



3

# FINDING SHORT PATHS

... without a global map



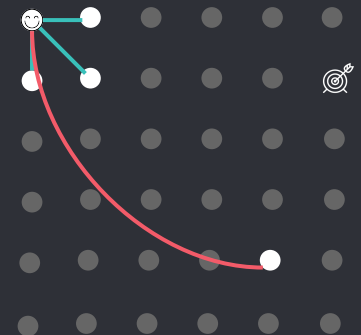
## FINDING SHORT PATHS

### Decentralised search algorithm

Using knowledge only of:

- layout of the grid
- location of the target
- locations of current node's immediate contacts

Greedily forward message along edge that brings it closest to target





## FINDING SHORT PATHS

### Decentralised search algorithm

Not effective on Watts-Strogatz networks

- Long-range contacts distributed **uniformly at random**
- For an  $n \times n$  lattice:
  - Average shortest path length:  $O(\log n)$
  - Path length via decentralised search:  $O(n^{2/3})$

## FINDING SHORT PATHS

### Kleinberg model

- Each node in lattice connected to all nodes within radius  $r$
- $k$  extra connections chosen with probability proportional

to  $d(v,w)^{-\alpha}$

lattice  
distance  
between  
nodes

tunable  
'clustering  
exponent'

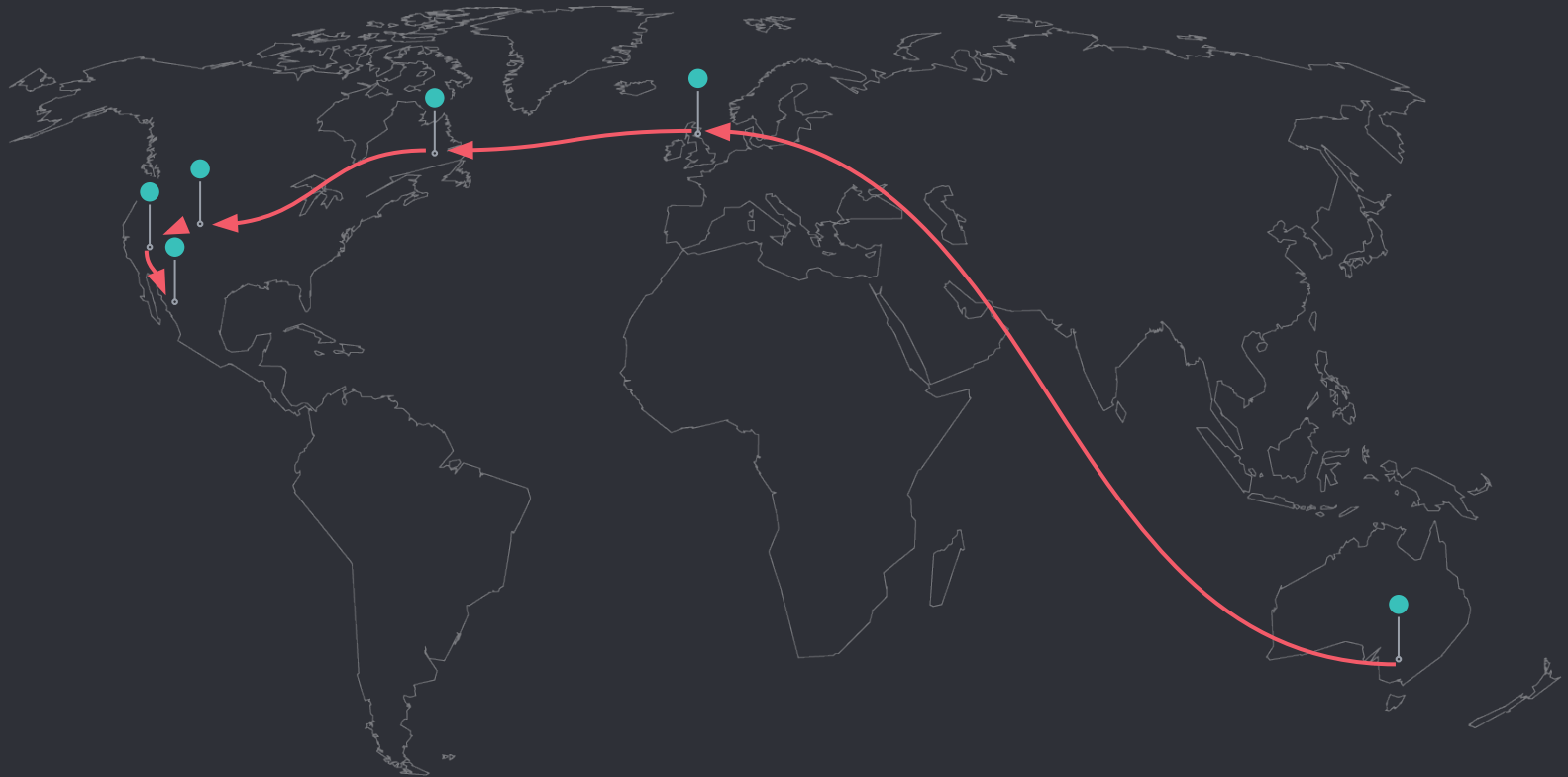
- small  $\alpha \Rightarrow$  extra edges span long distances
- large  $\alpha \Rightarrow$  extra edges tend to be shorter
- Watts-Strogatz model:  $\alpha = 0$

## FINDING SHORT PATHS

### Kleinberg model

- Optimal value  $\alpha = 2$  (for a 2 dimensional lattice)
- Extra ties distributed uniformly over all “distance scales”
- Path length via decentralised search:  $O(\log^2 n)$
- Allows people to consistently find ways of reducing their distance to the target, no matter how near or far they are from it

## FINDING SHORT PATHS



“There is a progressive closing in on the target area as each new person is added to the chain” - Milgram (1967)



4

# APPLICATIONS

of small-world networks



## ● APPLICATIONS

### ○ Freenet

- Secure peer-to-peer communication network
- Nodes can only send data to their direct connections
- Needs efficient routing



## ● APPLICATIONS

### ○ Freenet

- Organises nodes by giving them locations (initially random)
- Nodes constantly attempt to reduce distance to their connections
- Network self-organises into small-world

## ● APPLICATIONS

### ○ Neuroscience

- Networks of cortical neurons have small-world structure
- Could explain:
  - working memory (Roxin et al, 2004)
  - epileptic seizures (Netoff et al, 2004)





Mirko Monti - [Simple line icons](#)  
Webalys - [Streamline iconset](#)

# THANKS

S. Milgram, ``The small world problem," Psychology Today 1, 61 (1967).

D. Watts and S. Strogatz, ``Collective dynamics of small-world networks," Nature 393, 440 (1998).

J. Kleinberg, ``The small-world phenomenon: An algorithmic perspective," Proc. 32nd ACM Symposium on Theory of Computing (2000)

T. Netoff, R. Clewley, S. Arno, T. Keck, and J. White, ``Epilepsy in small-world networks", J Neurosci 24, (2004)

A. Roxin, H. Riecke, and S. Solla, ``Self-sustained activity in a small-world of excitable neurons", Phys Rev Lett 92, (2004)