

The background is a solid dark blue. A large, white, curved swoosh shape starts from the left edge, dips down, and then curves back up towards the right edge. There are four green circles: one small circle in the top right corner, one medium circle in the bottom left corner, and two large circles on the left and right sides, each partially cut off by the edge of the frame.

# From Local Strategies to Global Patterns

Practical graph theory with Neo4j

# Nathan Smith

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- Organizer of Kansas City Graph Databases Meetup
- @nsmith\_piano



# Takeaways

1. Graph theory is a powerful tool for understanding our complex world
2. Experimenting with Neo4j tools makes graph theory accessible
3. Ideas for further exploration



Small world phenomena



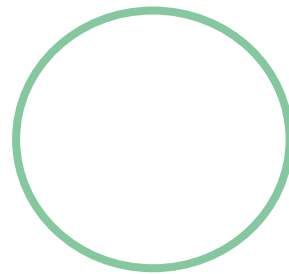
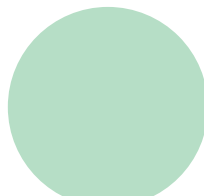
Power laws



Diffusion of innovations

# Setup

- Neo4j Desktop
- Bloom
- APOC (Awesome Procedures On Cypher)
- Graph Data Science Library
- Jupyter notebooks (Anaconda)



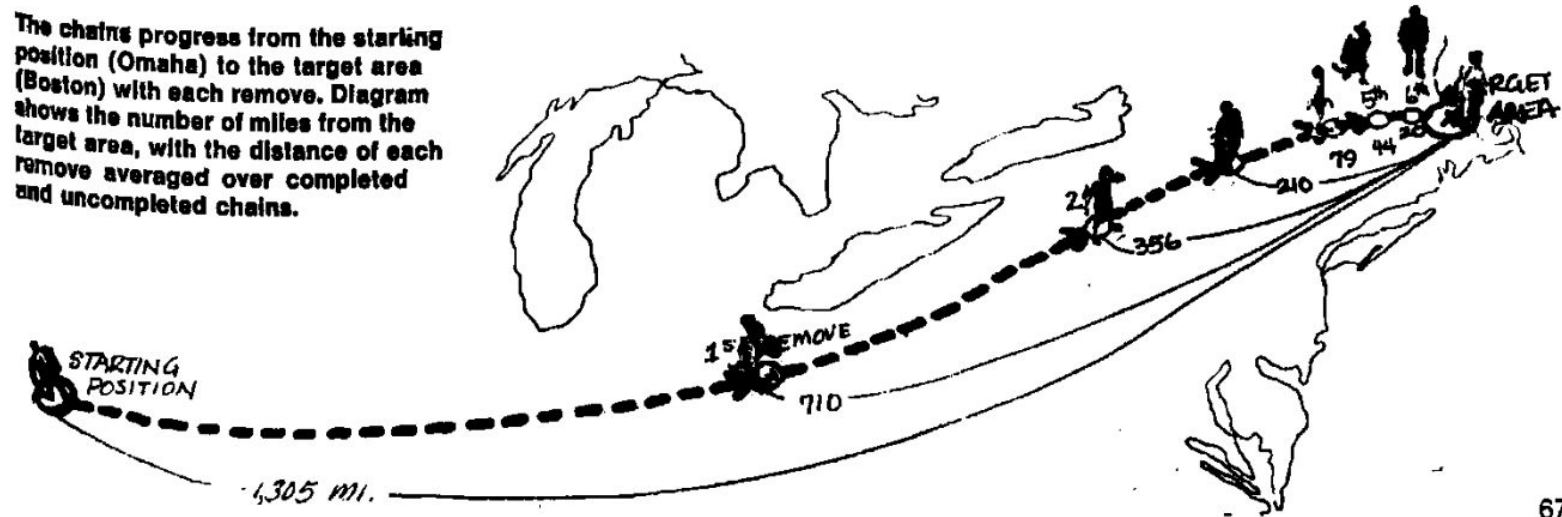


# Small world phenomena

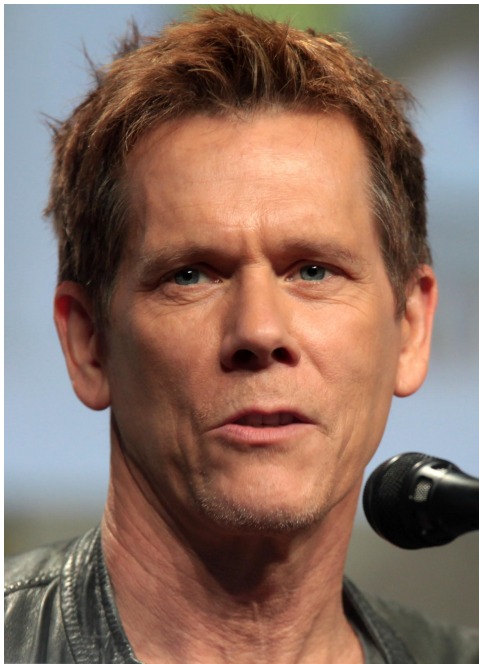
Bill Anders / Public domain

# Six degrees of separation

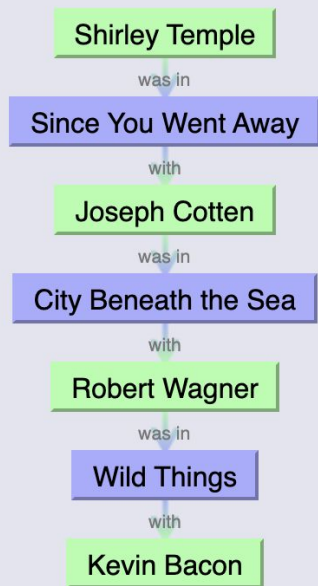
Milgram, S. The Small World Problem. *Psychology Today*, 2, 60-67 (1967).



# The Bacon number



Shirley Temple has a Bacon number of 3.

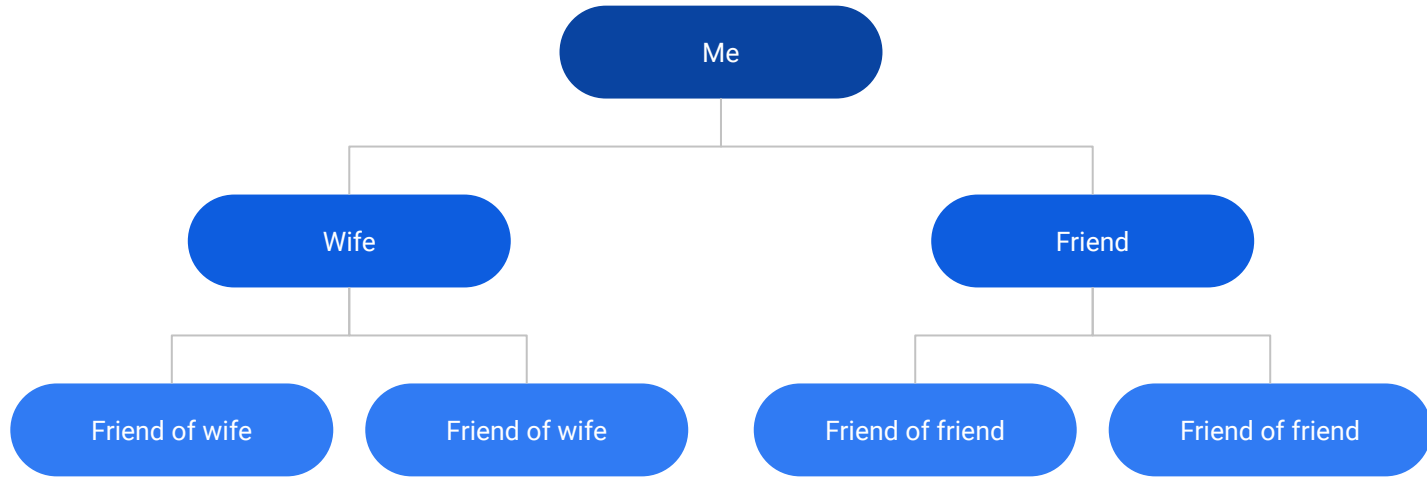


André the Giant has a Bacon number of 2.



[https://oracleofbacon.org/  
movie/links.php](https://oracleofbacon.org/movie/links.php)

# The multi-level marketer's dream

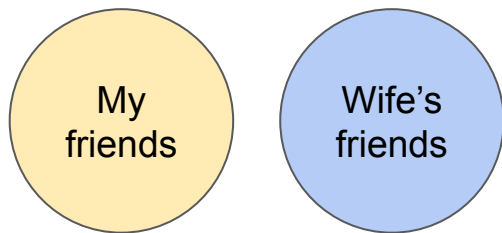


Number of new contacts grows exponentially with number of steps

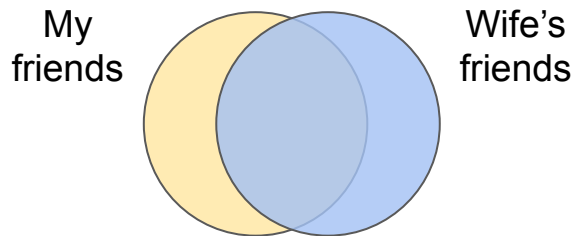


# Real communities overlap

Circles of friends don't usually look like this



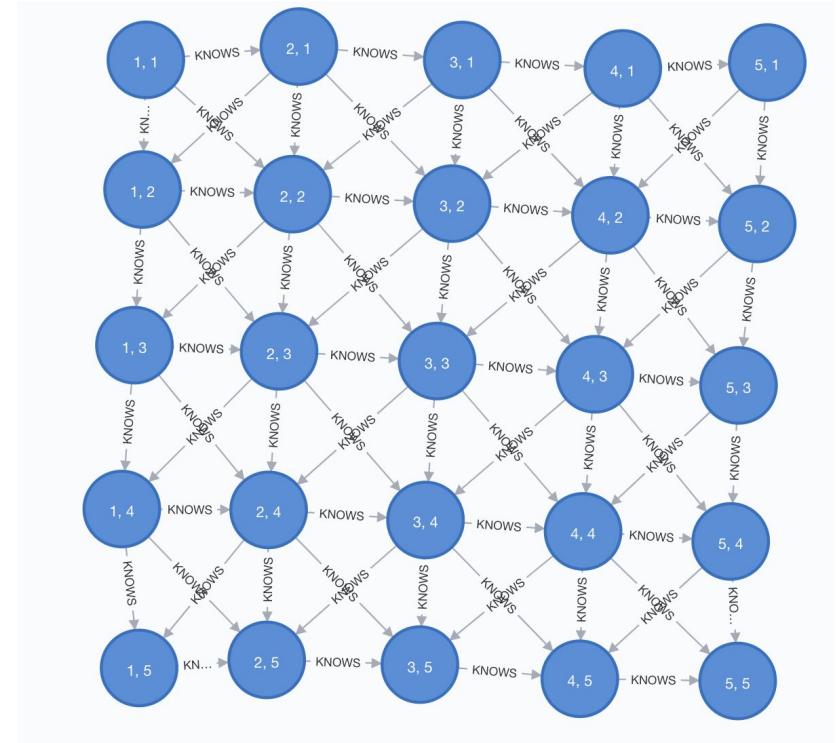
They are more like this



# Watts-Strogatz Model

Watts, D., Strogatz, S. Collective dynamics of 'small-world' networks. *Nature* 393, 440–442 (1998).

- Create a grid where every node is connected to adjacent neighbors
- Establish connections from nodes to random non-adjacent nodes



A satellite image of Earth from space, showing a large hurricane with a distinct eye over the ocean. The hurricane's clouds are white and swirling, contrasting with the dark blue of the ocean. To the left, a portion of a green, forested landmass is visible. The text "Power laws" is centered in a white box over the hurricane.

# Power laws

© NASA image courtesy Jeff Schmaltz, MODIS Land Rapid Response Team at NASA GSFC -

<http://modis.whoi.edu/page.do?pid=3&tid=3&cid=216720>, Public Domain, <https://commons.wikimedia.org/w/index.php?curid=216720>

# Popularity is not distributed evenly

← **Shakira** ✓  
7,031 Tweets



Shakira ✓  
@shakira  
[linktr.ee/shakira](https://linktr.ee/shakira)  
Barranquilla [linktr.ee/shakira](https://linktr.ee/shakira) Joined June 2009  
212 Following 52.3M Followers

Follow

← **Patrick Mahomes II** ✓  
16.8K Tweets



Patrick Mahomes II ✓  
@PatrickMahomes  
Tyler, TX [PatrickMahomes.com](https://PatrickMahomes.com) Joined August 2011  
448 Following 1.4M Followers

Follow

← **Nathan Smith**  
1,907 Tweets



Nathan Smith  
@nsmith\_piano  
Likes data that tells an honest story, playing the piano, church choir.  
Kansas City, MO Joined May 2009  
1,461 Following 615 Followers

Edit profile



# Preferential attachment

The more popular something is, the more likely that one of your friends will share it with you, and then you will know about it too.



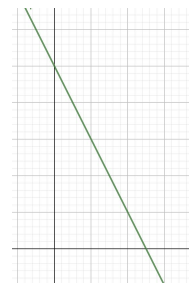
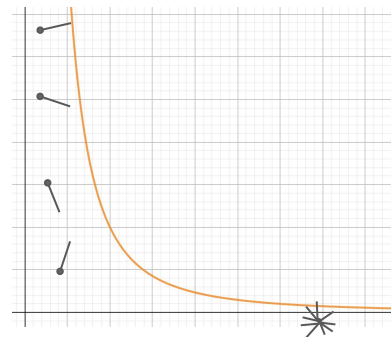
# Power law distribution

$k$  is the measure of popularity and  
 $f(k)$  is fraction of items having that level of popularity

$$f(k) = \frac{a}{k^c}$$

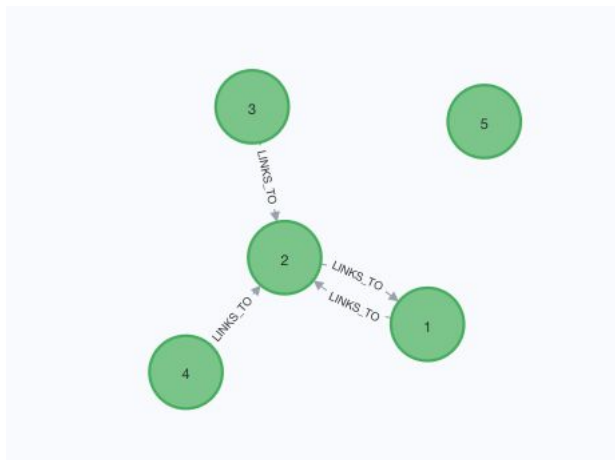
$$f(k) = ak^{-c}$$

$$\log f(k) = \log a - c \log k$$



# Web page linking simulation

- Pages are created one at a time
- Each new page looks at a random existing page
- With probability  $p$ , create a link to the existing page or the target of the existing page



# Diffusion of innovations



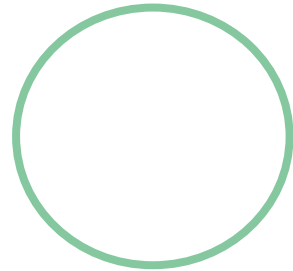
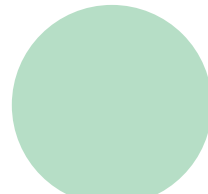
Photo by [Chaozzy Lin](#) on [Unsplash](#)



# Factors that influence adoption

- Complexity
- Observability
- Trialability
- Compatibility

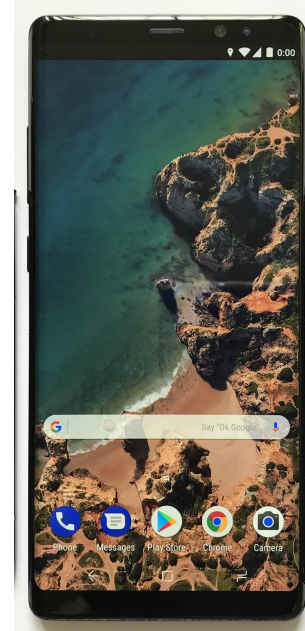
Everett Rogers. *Diffusion of Innovations*. Free Press, fifth edition, 2003.



# Product value can depend on others' adoption



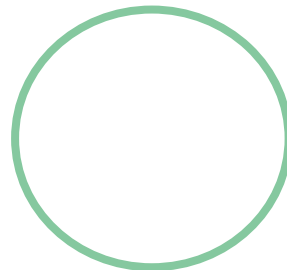
Photo by [Vinoth Ragunathan](#) on [Unsplash](#)



Android Open Source project / CC BY  
(<https://creativecommons.org/licenses/by/2.5>)

# Diffusion of innovation simulation

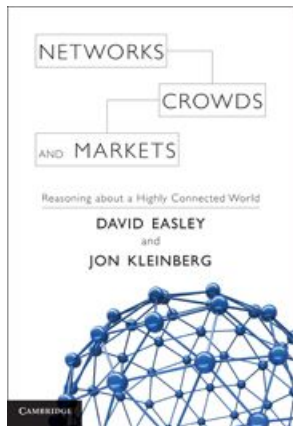
- Set numeric rewards for matching neighbors using the incumbent technology and the new technology
- Start a few members of the graph on the new technology
- Switch members of the graph to the new technology if they have a better payoff from matching neighbors with the new technology than the old technology
- Repeat previous step until nobody is switching



# Local strategies - Global patterns

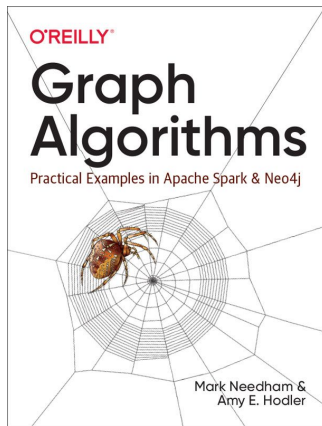


# Books and resources



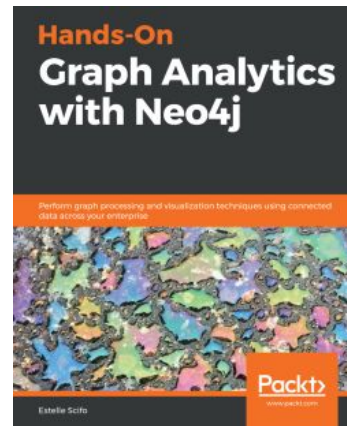
## Networks, Crowds, and Markets

David Easley and  
Jon Kleinberg



## Graph Algorithms

Mark Needham and  
Amy E. Hodler



## Hands on Graph Analytics with Neo4j

Estelle Scifo

- [Amy Hodler resource list](#)
- <https://github.com/smithna/NODES2020>