#### CS 103: Lecture 16 Small Worlds

Dan Sheldon

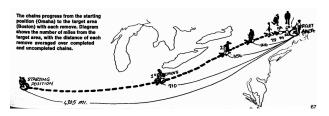
December 7, 2015

#### Announcements

- ► HW 6 due Tuesday
- ▶ Office hour Sunday 3-4pm in Clapp 202
- ▶ Or on Monday by appt.

# 6 Degrees of Separation

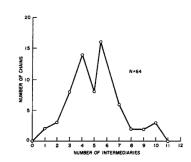
Stanley Milgram, 1960s



- > 296 "random" starters in Omaha, NE and Wichita, KS
- "Forward letter to target by sending to someone you know on first name basis with same instructions
- ► Target = stock-broker in Sharon, MA; known address and occupation

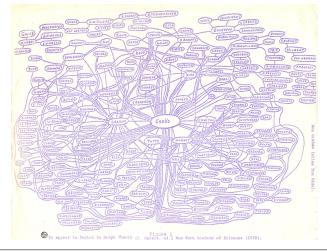
# 6 Degrees of Separation

Results



- Results: 64 chains completed
- ► median path length of complete chains =

## Erdos Number



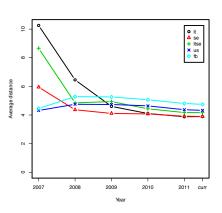
# Other Examples in Pop Culture

- ▶ Kevin Bacon game. "Bacon number"
- ► Erdos-Bacon number

# Four Degrees of Separation

Distance measurements on Facebook graph

# The World is Getting Smaller

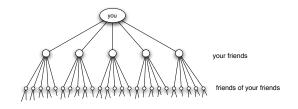


## Should real networks have short paths?

Exercise: discuss with a partner. One of you argue why. One of you argue why not.

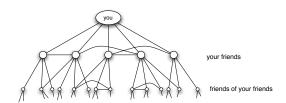
## Should real networks have short paths?

Argument for "yes" answer: exponential growth in number of contacts at increasing distance



#### Should real networks have short paths?

Argument for "no" answer: real graphs exhibit triadic closure



Which one of these forces wins? (exponential growth)

# Watts-Strogatz: Small World Networks

Is there a natural model for networks that have triadic closure and short paths?

Watts-Strogatz late 1990s:

- ▶ n nodes arranged in a grid (1d, 2d, etc.) that "wraps around"
- ► Each node has links to
  - ightharpoonup all nodes within grid distance d (triadic closure)
  - ightharpoonup k random nodes

#### **Example and Demo**

## Watts-Strogatz: Small World Networks

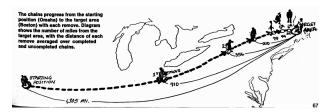
Can show mathematically that Watts-Strogatz networks have:

- many triangles
- short paths (roughly logarithmic in number of nodes)

Board work: what is a short path?

### Milgram's Experiment Reconsidered

OK, so short paths exist. But how do people find them?



Simple algorithm: pass the message to your neighbor that is closest to the target. Will this work?

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This does **not** work for Watts-Strogatz models. Long-range contacts are "too random"

Enter Kleinberg...

# Kleinberg's Model for Decentralized Search

- ▶ Nodes arranged in 2d-grid
- ▶ Each node has connections to
  - ► Grid neighbors
  - One random long-range contact (but not uniformly random...)

Long-range contact: select a node at distance d with probability proportional to  $1/d^{r} \\$ 

Example and demo of

#### Effect of r

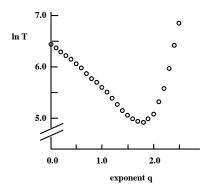
- ightharpoonup Small r: links are very long-range. Like Watts-Strogatz
- ightharpoonup Big r: links are short-range
- $\blacktriangleright$  Kleinberg's main result: r=2 is "just right". Links spread over many different distance scales

**Result**: when r=2, then short paths exist and people can find them. For grids with n nodes, the number of hops to find the target is about  $(\log n)^2$ 

As  $n\to\infty$  , r=2 is the  $\mathit{only}$  value that works.

#### Effect of r

Empirical evaluation on grid with 400M nodes



Demo

# To Be Continued

#### Next time:

- ► A rough calculation to justify this
- $\qquad \qquad \mathbf{Empirical\ support\ for\ exponent}\ r=2$

# A Rough Calculation to Justify This

(Informal) If r=2, then a user has roughly equal probability of having a link at any distance scale

Revisit Milgram figure

Rough calculation on board

# **Empirical Support**

Next time: empirical support for the exponent  $r=2. \ \ \,$