

# Social Computing

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CS 376

# Announcements

- Project abstract draft due Friday

Recall...

# Sociotechnical system

Emergent behaviors result from interactions  
between social relationships and technological interventions.

# Social computing

- Aims to understand how technology impacts human social behavior, and design those mediating systems more effectively
- Today we will cover:
  - Operationalizing theory: drawing on the social sciences
  - Designing online communities: what makes communities thrive?
  - Social influence: how do people impact each other?
  - Knowledge sharing: groups that share and gather information
  - Leadership and collective action: what role do these play online?

# Operationalizing theory



# Recall...

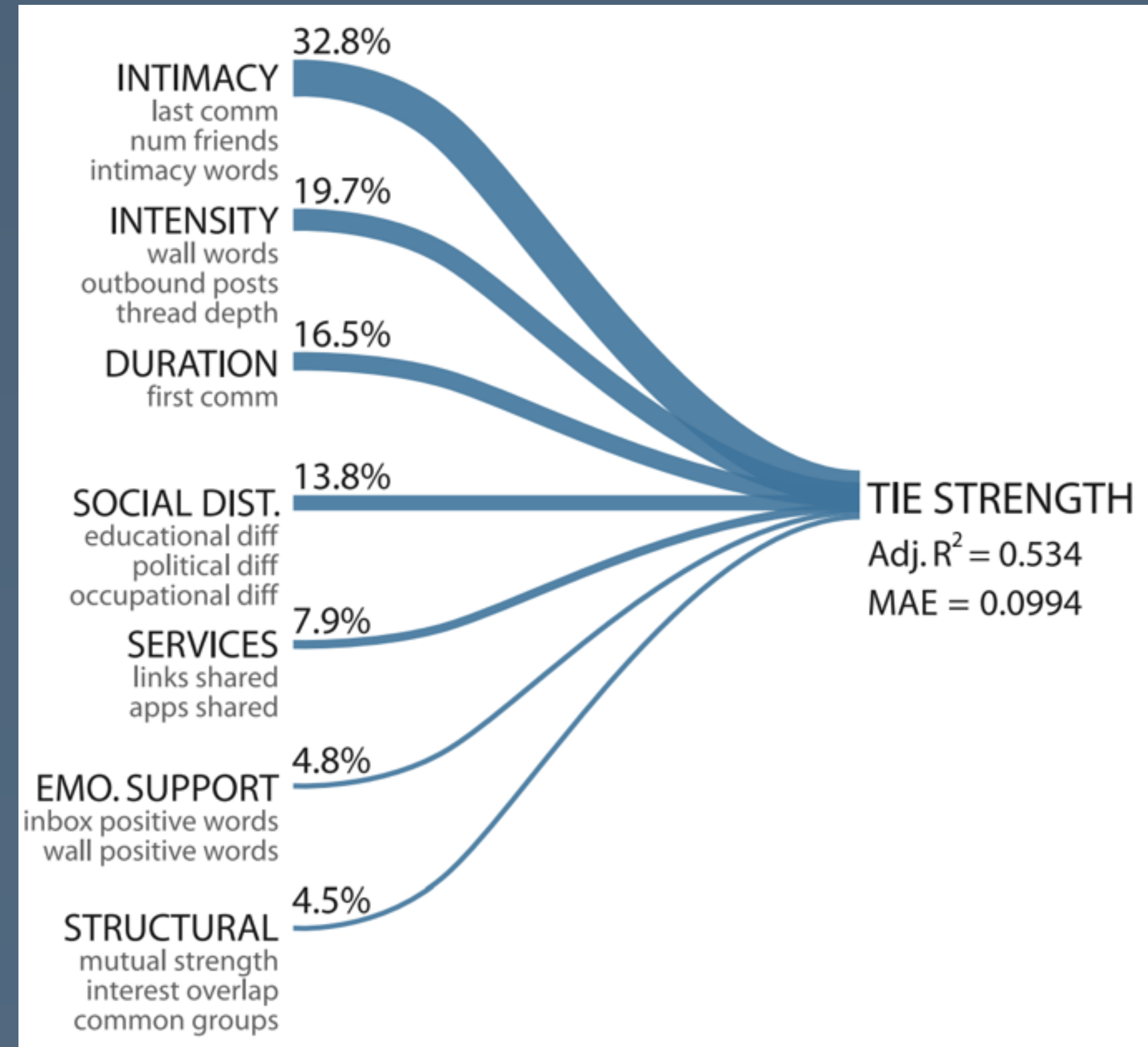
- Facebook usage increases all types of social capital, especially bridging social capital

[Ellison, Steinfeld and Lampe,  
JCMC '07]



# Recall...

- Can we observationally model tie strength? [Granovetter '73]
- Most predictive:
  - Days since last communication
  - Days since first communication
  - Wall words exchanged
  - Mean strength of mutual friends



# Does SNS use impact tie strength?

[Burke and Kraut 2014]

- “The Internet Paradox” [Kraut 1998]: people are more lonely the more they use the internet. Does Facebook use really displace other forms of social interaction?
- Method: longitudinal time-series analysis of self-reported tie strength, compared to Facebook activity logs
- Result: composed pieces (comments, posts, messages) increase it substantially, but one-click pieces (likes) only by a bit



# How does SNS impact \_\_\_\_\_?

- Well-being?
  - “Receiving targeted, composed communication from strong ties was associated with **improvements in well-being** while viewing friends' wide-audience broadcasts and receiving one-click feedback were not.”  
[Burke and Kraut 2016]
- Job hunting?
  - “Most people are helped through one of their numerous weak ties but **a single stronger tie is significantly more valuable at the margin**”  
[Gee, Jones and Burke 2017]

# Presentation of Self in Everyday Life

[Goffman 1959]

- Established face-to-face interaction between people as an object of study
- Metaphor: life as performance
  - People work to guide the impression that people develop of them
  - On-stage: public life
  - Off-stage: private life




# The Many Faces of Facebook

[Zhao et al., CHI '13]

- Facebook appears monolithic, but there are three functional regions
- Semistructured interviews
- Performance region (for now)
- Exhibition region (for later)
- Personal region (for reflection)




**Michael Bernstein**

February 24 

**CS 376 is the best and I am studying hard right now!**



**Michael Bernstein**

February 24 

**I got into Stanford! English major, here I come!**



**Michael Bernstein**

February 24 

**After a lot of soul-searching, English isn't for me...**



# Estimating audience size

[Bernstein et al., CHI 2013]

How might our activities be impacted if we are incorrectly estimating our audience size?

Method: compare survey results (“How many people do you think saw your most recent update?”) to log results

Facebook users underestimate audience size by **4x**

Median reach is **35% per post** and **61% per month**

Many want larger audiences but **already have them**



# Reasoning about FB's algorithms

[Eslami et al., CHI 2015]

- What are peoples' mental models of social news feed algorithms?
- Result: over half of Facebook users are unaware of the existence of the news feed algorithm
  - “Initial reactions for these previously unaware participants were surprise and anger.”
  - “Participants were most upset when close friends and family were not shown in their feeds.”

# Online communities

# Motivation: why participate?

- Intrinsic motivators: drawn from my own desires to complete a goal or task
  - Examples: pleasure, hobby, developing a skill, demonstrating a skill
- Extrinsic motivators: do not derive from my relationship with the goal or task
  - Examples: money, graduation, points, badges
- Motivation Crowding Theory
  - Applying external motivators to an intrinsically motivated task reduces participation

# Contributions via uniqueness

[Beenen et al., CSCW '04]

- Social loafing: why should I contribute if many others could as well?
- Hypothesis: calling out the uniqueness of contributions will increase participation
- Method: rating campaign on MovieLens
  - “As someone with fairly unusual tastes, you have been an especially valuable user of MovieLens [...] You have rated movies that few others have rated: [...]”
- Result: participants in the uniqueness condition rated 18% more movies



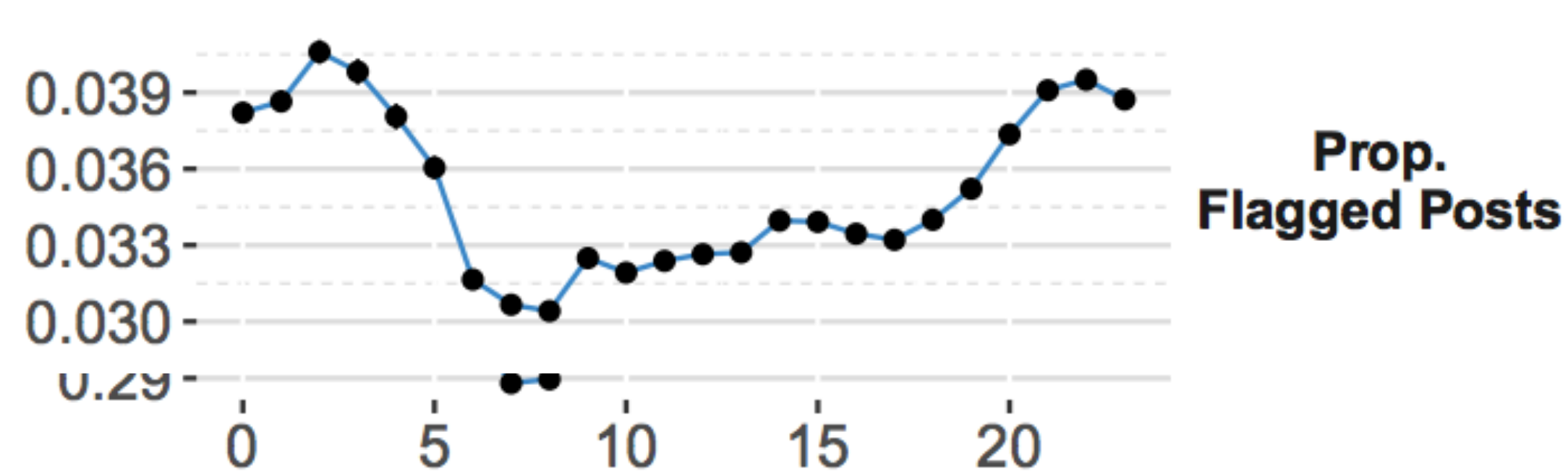
# Anyone can become a troll

[Cheng et al., CSCW 2017]

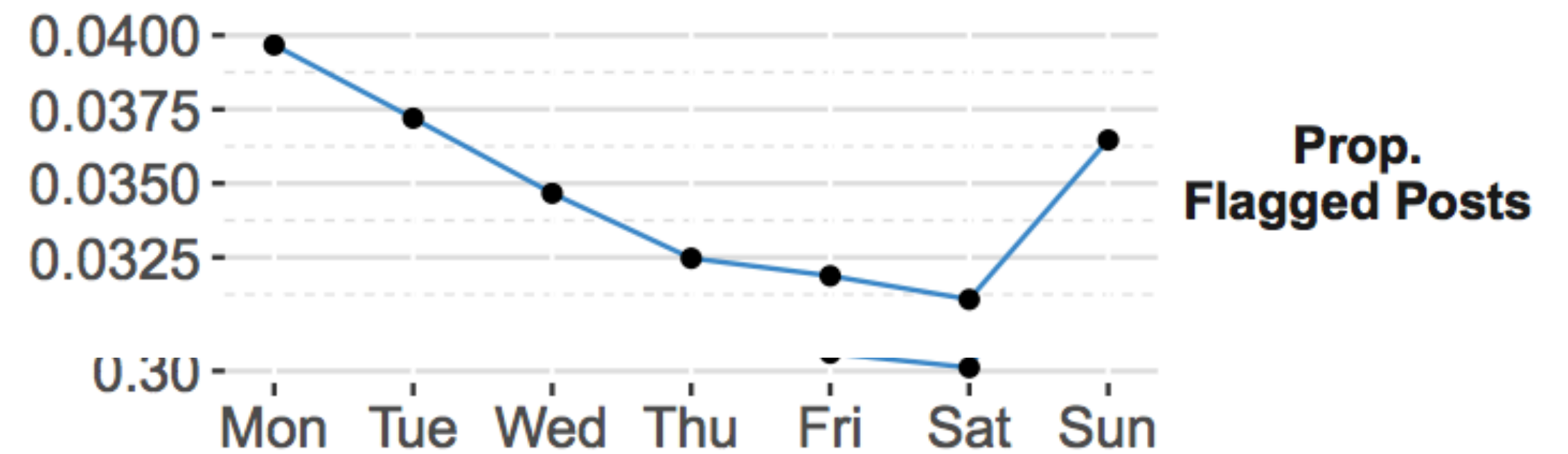
- Popular press: trolling is confined to an antisocial minority
- This paper: a substantial amount of online trolling is due to normal people on a bad day
- Experiment: put people in a good or bad mood, show them positive or negative initial posts in a thread
  - Measure resulting trolling behavior

	Positive Mood	Negative mood
Positive context	35% trolling	49% trolling
Negative context	47% trolling	68% trolling

- Replicating on a large dataset of comments on CNN.com, trolling behavior tracks known regular human mood patterns:



(a) Time of Day (EDT)



(b) Day of Week

# How do we manage trolls?

[Chandrasekharan et al., CSCW 2017–2018]

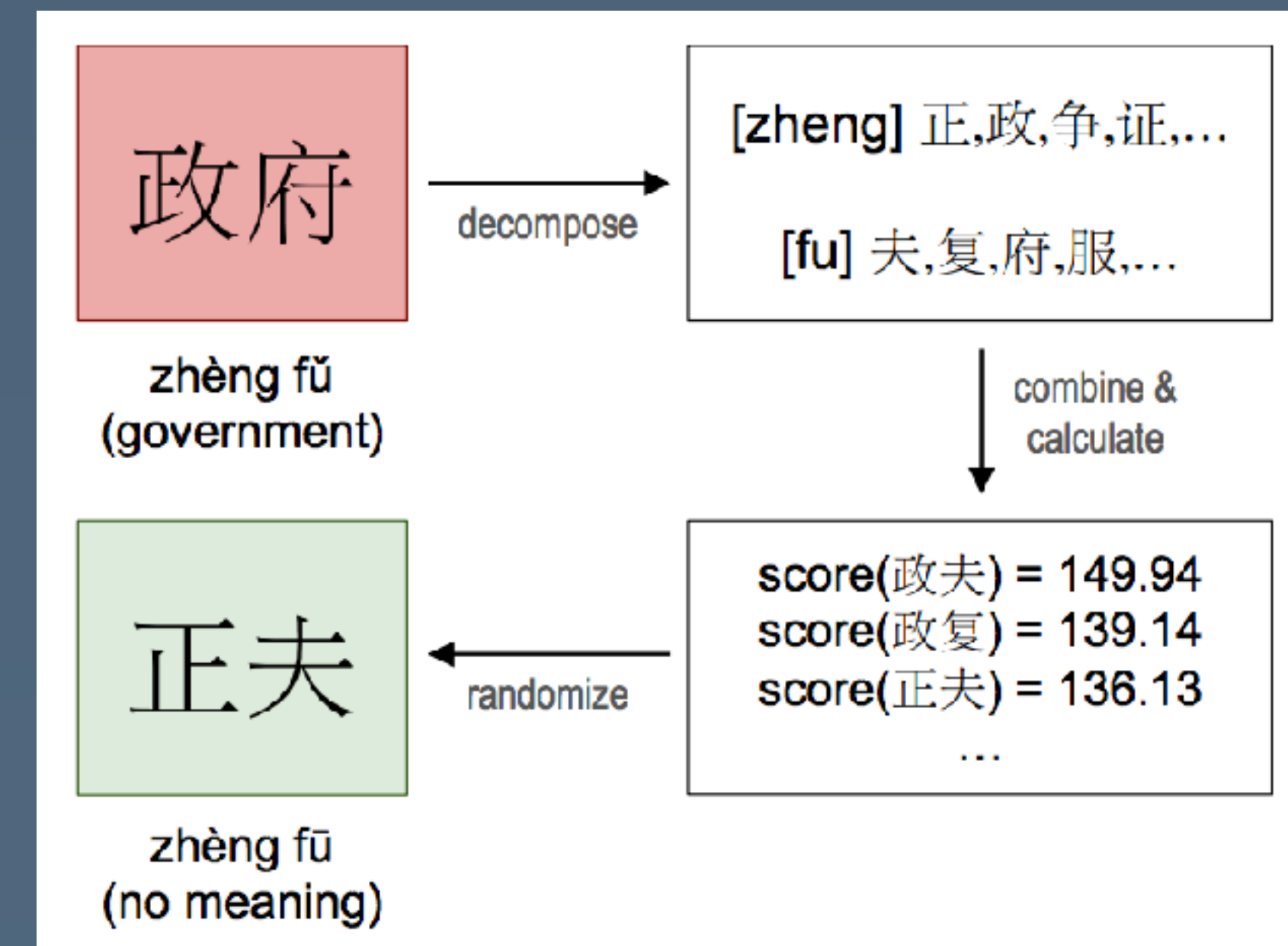
- Question: does banning bad behavior help, or just relocate the behavior?
- Dataset: Reddit banned /r/CoonTown and /r/FatPeopleHate as violating its hate speech policy
- Result: many accounts left; those that stayed, did not introduce hate speech into other subreddits they migrated into



# Combating censorship

[Hiruncharoenvate, Lin and Gilbert, ICWSM '15]

- The Chinese government censors sensitive topics on social media
- However, homophones can be difficult for censors to distinguish from intended use
  - 和谐 (slang 'censorship') vs. 河蟹 (river crab)



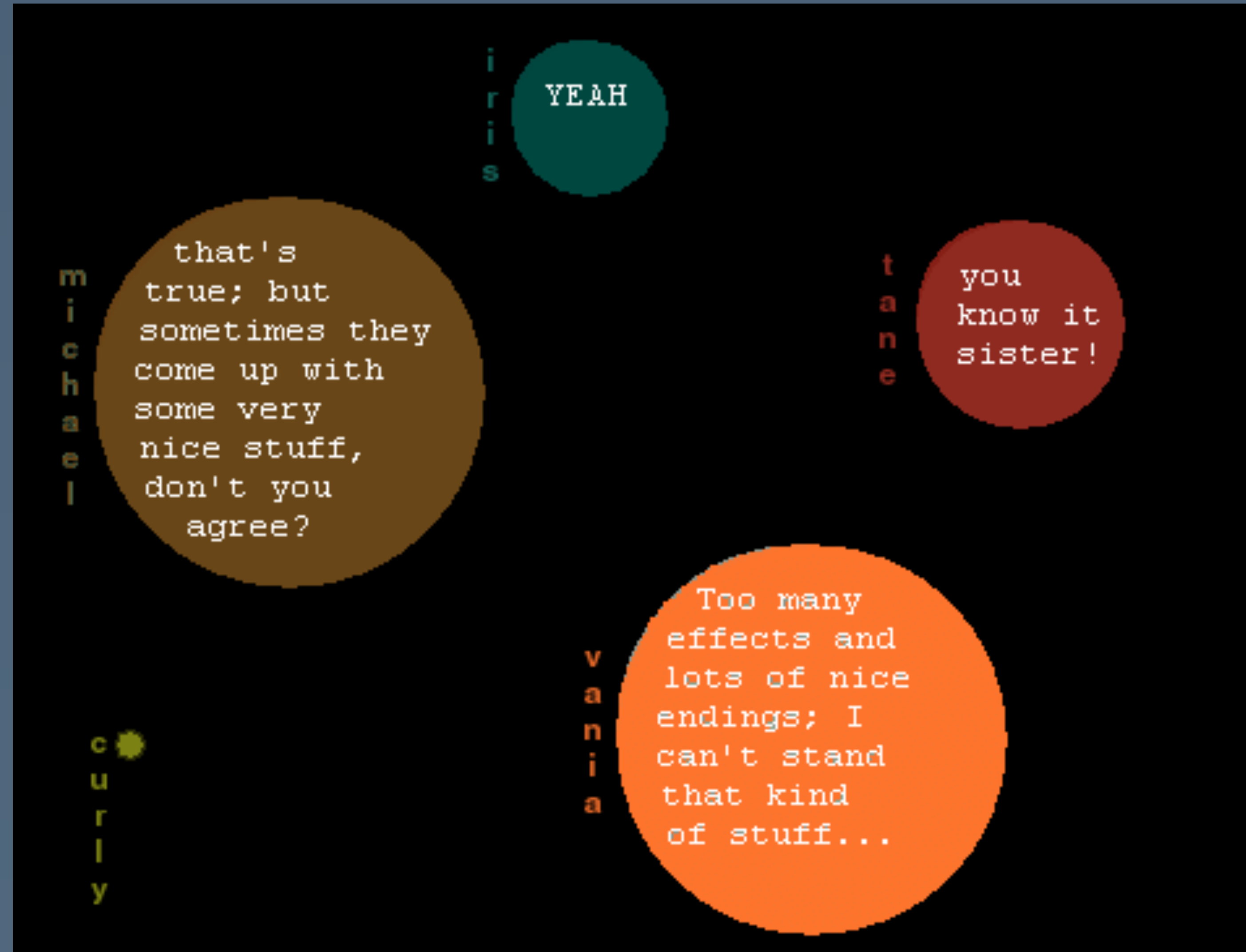
- This work introduces an algorithm that decomposes words and nondeterministically creates homophones that are likely to create confusion for censors



# Discussion

[Viégas and Donath, CHI '99]

- Chat circles:  
“narrowcasting” via  
physical proximity



**Social influences  
on the  
wisdom of crowds**

# Unpredictability in an artificial cultural market

[Salganik, Dodds, and Watts, Science '06]

- Puzzle: it is extremely difficult for experts to predict which songs, movies and books will be hits
- Method: 14,000 participants download free music from an online site
  - Random assignment: no download info, or one of eight worlds that all start with zero downloads
- Result: huge variance in download counts
  - Best songs rarely did poorly, worst songs rarely did well; any other outcome was possible

# Reputation systems

[Resnick and Zeckhauser, Adv. Appl. Microeconomics '02]

- Reputation is a core signal in social systems
- Study of eBay feedback
  - Despite incentives to free ride, over half of eBay transactions leave feedback
  - Feedback is almost always positive
  - High reputations didn't lead to higher seller prices
  - Evidence of reciprocation and retaliation

**nfekt** (69 ★ )  
100% Positive feedback

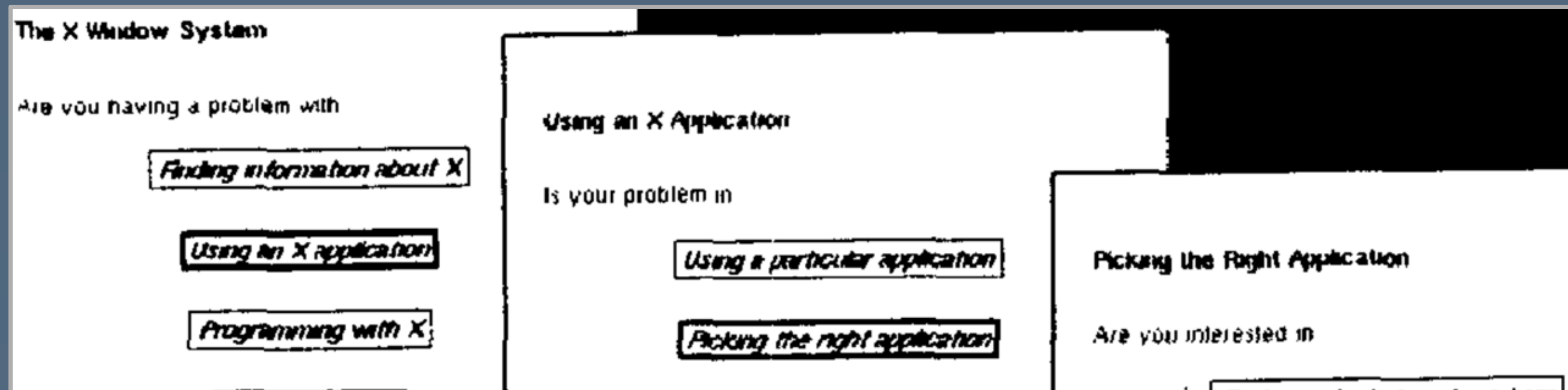


Knowledge  
sharing

# Answer Garden

[Ackerman and Malone, OIS '90]

- An “organizational memory” system: knowing what the company knows
- Main idea: members leave traces for others to solve their questions
- The original Yahoo! Answers, Quora, Aardvark



# Expertise recommendation

[McDonald and Ackerman, CSCW '00]

- Recommend people, not documents
- Goal: help organizations know who can tackle each problem

The screenshot shows a window titled "Expertise Recommendation". It displays the following information:

**Expertise Request:**

Topic Area: Tech Support      Filter: Social Network

Request: I/O Error 16 in program M.013 customer PCI

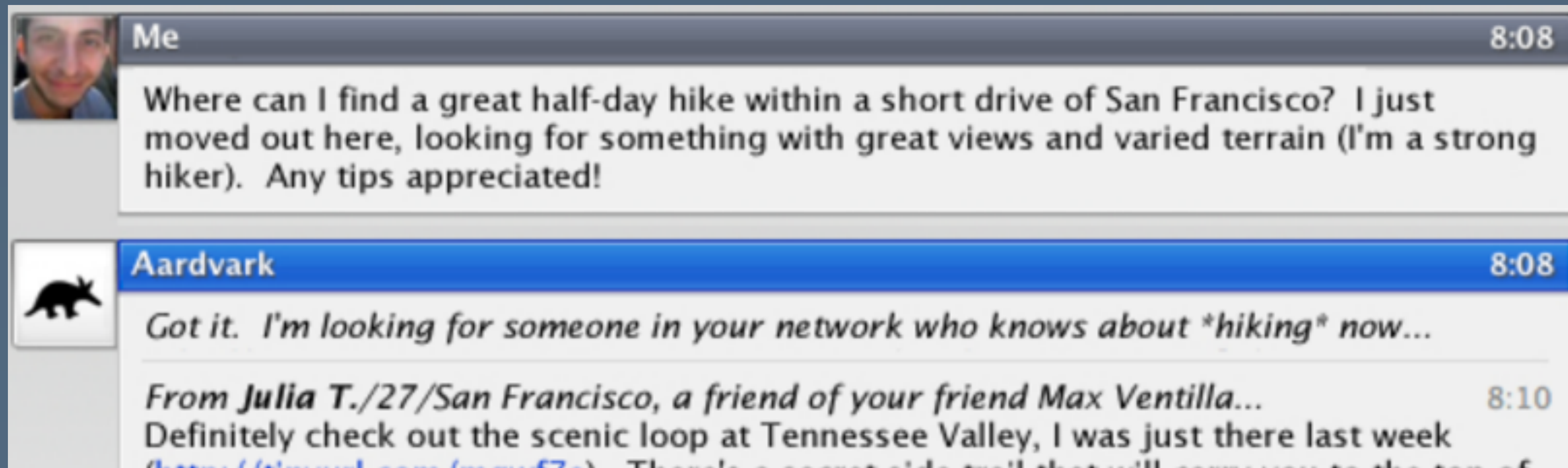
**Request Results:**

Susan Wright (SAW)	Suite 103	x1297	(949) 824-5097	<input type="button" value="Contact"/>
Keri Carpenter (KC)	Remote Anaheim	x1363	(714) 551-7663	<input type="button" value="Contact"/>

# Aardvark: social search engine

[Horowitz and Kamvar, WWW '10]

- Technical challenge: question routing over IM
  - Use a joint model over topical relevance and social distance
- Interesting equilibrium: people were more willing to answer questions than ask them!

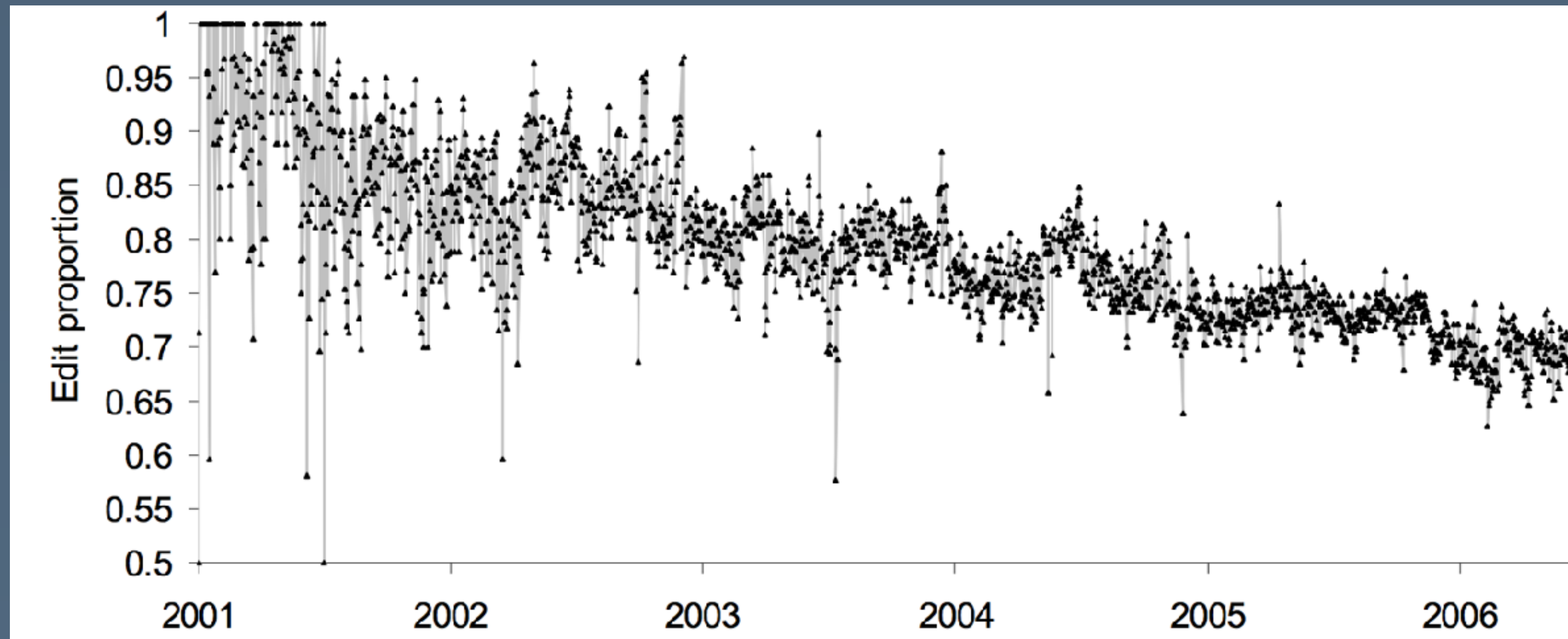




# Leadership and collective action

# Recall: conflict and coordination

- What happens to collaboration costs as Wikipedia grows?  
[Kittur, Suh, Pendleton, and Chi, CHI '07]



Amount of direct work on articles goes down, and activity on coordination pages goes up

# What makes a leader?

- Reader-to-leader framework  
[Preece and Shneiderman, AIS Trans. HCI '09]
  - Readers > Contributors > Collaborators > Leaders
  - Goal: guide users into each new stage
  - See also: Legitimate peripheral participation  
[Lave and Wenger '91]
- Leaders are born, not made  
[Panciera, Halfaker, Terveen, GROUP '09]
  - Power editors on Wikipedia do more work than others, even from their first day on Wikipedia

# One-sided gatekeeping

[Keegan and Gergle, CSCW '10]

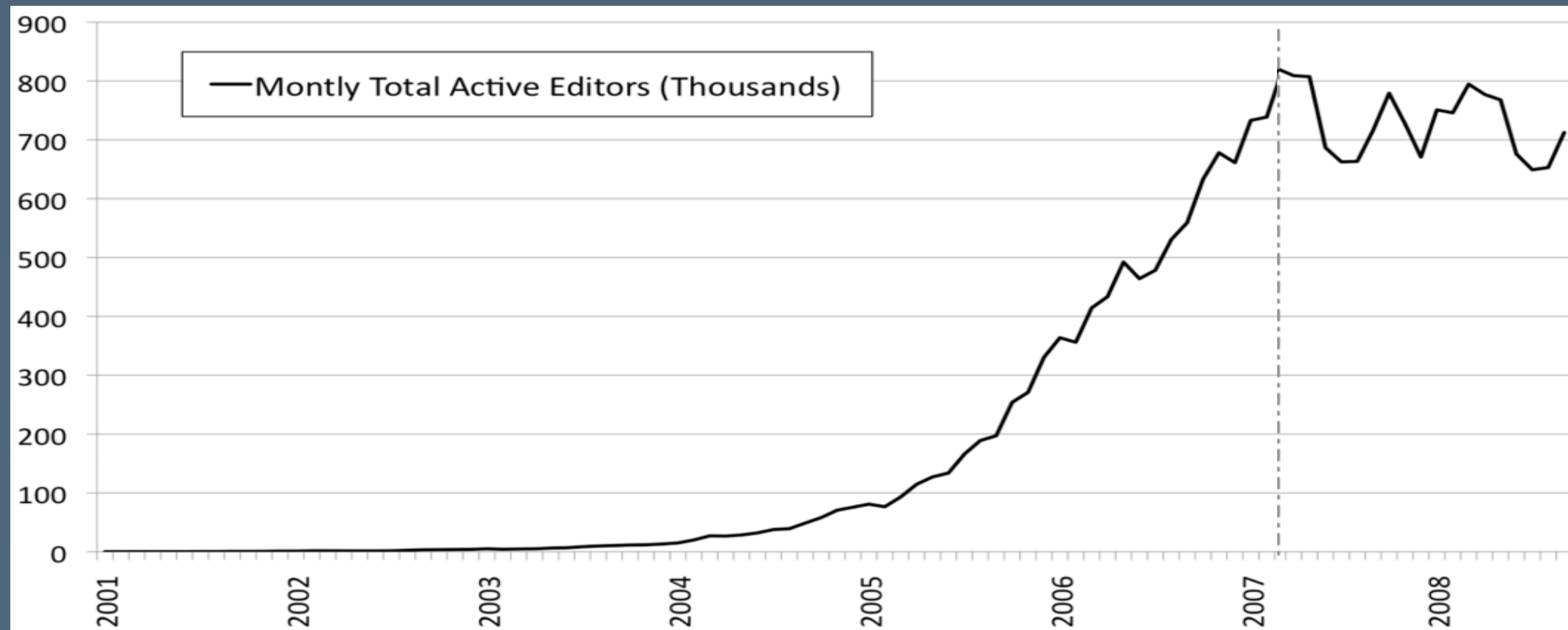
- How powerful are leaders in open communities like Wikipedia?
- Method
  - Data mine nominations for breaking news articles on the Wikipedia homepage
  - Stories were nominated and voted on by elite, middle-class, and newbie editors
- Result: “one-sided gatekeeping”
  - Elite editors could block nominations, but had no ability to get their nominations approved



# No place to participate

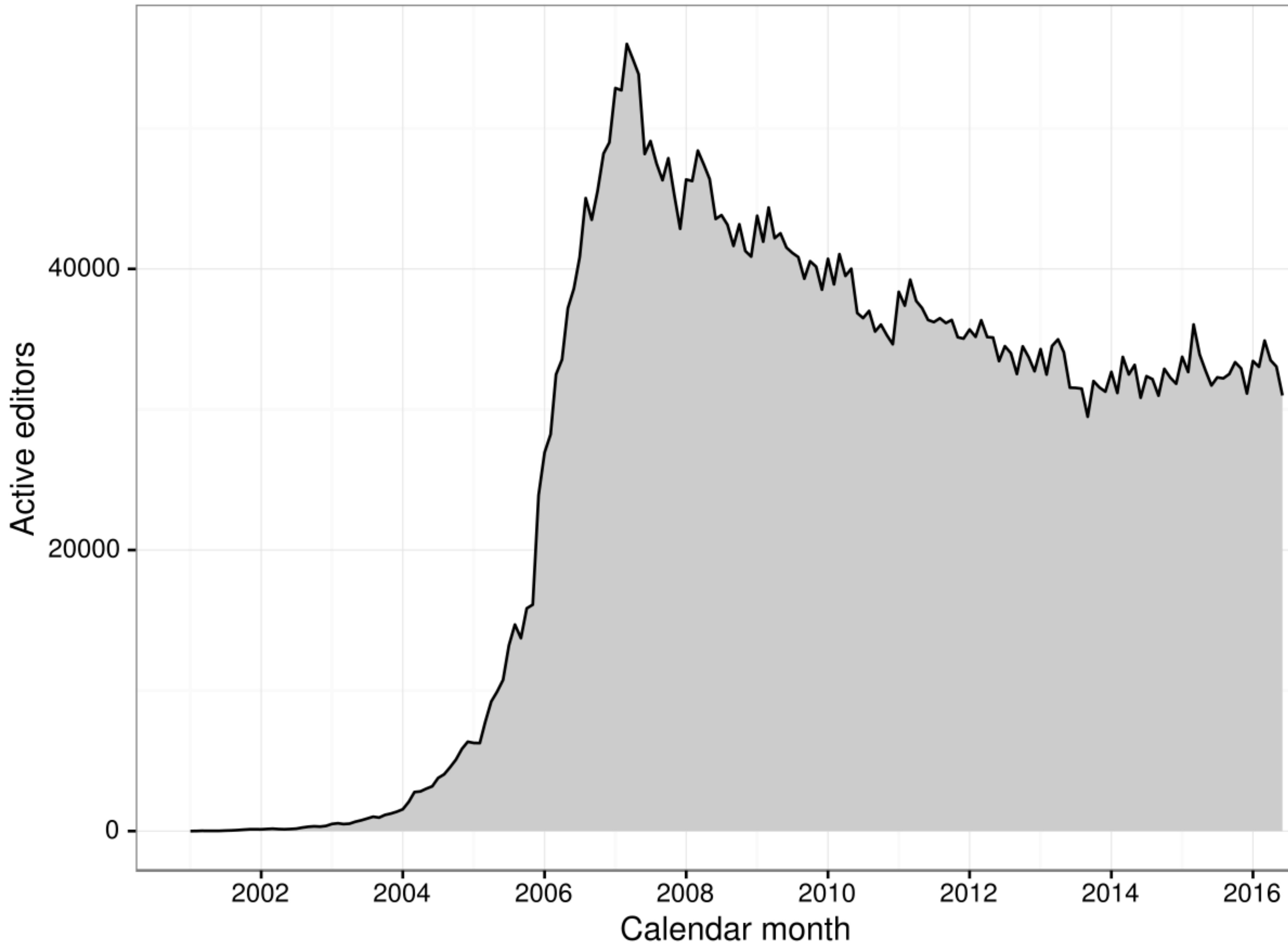
[Suh et al., WikiSym '09]

- Can fit Wikipedia's curve to a ecological population model with a fixed resource limitation



# More decline

[Halfaker et al.,  
American  
Behavioral  
Scientist '13]  
and  
[Wikimedia]



# Skills for social computing research

- Skills for understanding and designing social computing systems are complementary
- Understanding: computational social science methods and theory
  - Social psychology, sociology, data mining
- Designing: core challenge is designing for emergent behavior