Natural experiments in online social network assembly

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Assembling thefacebook: using heterogeneity to understand online social network assembly

Abigail Z. Jacobs, Sam Way, Johan Ugander, Aaron Clauset Proc. ACM WebSci 2015

online social networks







online social networks

Defunct



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online social networks != (offline) social networks

Community composition Ordering effects Context Competition within & between systems Natural limits on growth Arrival (product adoption)

online social network assembly

Community composition Ordering effects Context Competition within & between systems Natural limits on growth Arrival (product adoption)

online social network assembly

Endogenous & exogenous online, offline, social, behavioral, cultural, structural & design-based mechanisms

What does assembly look like?

What does assembly look like? Why is it hard to measure?

What does assembly look like? Why is it hard to measure? What processes are actually at play, supposing we could observe them?

social search vs. social browsing

Lampe et al. (2006)

What does assembly look like? Why is it hard to measure?

What processes are actually at play, supposing we could observe them?

offline & online present & historical implicit: endogenous & exogenous



"Classes are being skipped. Work is being ignored. Students are spending hours in front of the computer in utter fascination. Thefacebook.com craze has swept through campus."

-- The Stanford Daily, 03/05/2004



What Is thefacebook.com?

Thefacebook.com is an expanding online directory that connects students, alumni, faculty and staff through social networks at colleges and universities. This online directory allows for user connections on the basis of friendship, courses and social networks (including intra and inter-school networks), and has a built-in messaging system.

User Profile

Each thefacebook.com user maintains and updates a profile that includes:

1. Contact Information

2. Personal Information

relationship status and procurement, political views, clubs, jobs and favorite music, books, movies and quote

3. Course Information

the site has a built-in database of school courses and concentrations and automatically builds a user's class schedule

4. Picture

Additionally, the facebook.com automatically adds to each user profile links to school news articles that refer to the user, the last user away-message in the AIM system and the last user access location (the site has a built-in database of school dormitories and halls).



Our Audience – The College Addiction

There are 15 million college students in the United States. With an estimated purchasing power that exceeds \$85 billion, college students have money in their pockets for your services and products. This year they will spend \$21 billion on restaurants and food, \$9 billion on automobiles, \$5 billion on clothes, \$4 billion on phones and \$46 billion on other amenities. College students are also active job seekers.

User Base Demographics*

Total Users	70, 000*								
Ivy-League	55%								
Other Schools	45%								
Students	87%								
Alumni	11%								
Faculty and Staff	2%								
Men	48%								
Women	52%								
Age 18 to 24	92%								

Site Usage*

Daily Unique Users Monthly Unique Users Daily Traffic in Pageviews Monthly Traffic in Pageviews

65% 95% 3 million* 90 million*

Usage Growth Rate

The growth rate of the total number of users is increasing, with the addition of 10,000 thefacebook.com members in the first week of April, 2004.

The percentage of daily unique users has slightly increased through time.

The monthly traffic in pageviews has grown through time in proportion to the growth rate of the user base.

> "I have a new addiction. It is powerful. It is disturbing. It is thefacebook.com."

-- The Daily Pennsylvanian, 03/25/04

*Based on March 2004 Monthly Statistics *Based on April 19, 2004

Our Schools – The Expansion

Thefacebook.com was launched on February 4, 2004 at Harvard University. As of April 19, 2004, the expansion of thefacebook.com network has yielded the following member schools:

Ivy-League

Launch Date

February 4, 2004 February 24, 2004 March 1, 2004 March 7, 2004 March 7, 2004 March 14, 2004 April 4, 2004 April 4, 2004 Harvard University Columbia University Yale University Dartmouth University Cornell University University of Pennsylvania Brown University Princeton University

Name

The Expansion Plan

The mission of thefacebook.com is to expand to include most of the schools in the United States. By September 1, 2004, thefacebook.com network will have more than 200 member schools.

Other Schools

February 26, 2004 March 14, 2004 March 21, 2004 April 4, 2004 April 4, 2004 April 11, 2004 April 11, 2004 April 11, 2004 April 19, 2004 April 19, 2004 April 19, 2004

Launch Date

Name

Stanford University MIT New York University Boston University UC Berkeley Duke University Georgetown University University of Virginia Tufts University Boston College Northeastern University University of Illinois



http://thefacebook.com

BROWSE HISTORY

http://thefacebook.com

Saved 5,568 times between February 12, 2004 and January 27, 2015.

PLEASE DONATE TODAY. Your generosity preserves knowledge for future generations. Thank you.



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	Image: state stat								
Email:	Welcome to Thefacebook!								
Password:	[Welcome to Thefacebook]								
register	Thefacebook is an online directory that connects people through social networks at college								
	We have opened up Thefacebook for popular consumption at Harvard, Columbia , Stanford, Yale, Cornell, Dartmouth, UPenn, MIT , and now BU and NYU .								
	Your facebook is limited to your own college or university.								
	 You can use Thefacebook to: Search for people at your school Find out who is in your classes Look up your friends' friends See a visualization of your social network 								
	To get started, click below to register. If you have already registered, you can log in.								
	Register Login								

about contact faq terms privacy a Mark Zuckerberg production Thefacebook © 2004



online social network data

- Facebook100
 - 100 U.S. university networks
 - Users = 1,208,316
 - Undirected friendships = 93,969,074
 - Annotated user data:
 - Gender
 - Status (faculty/undergraduate/etc.)
 - Year of graduation
 - High school
 - Major
 - Dorm

augmented data

- Introduced:
 - Start dates
 - Graduation dates
 - Introduction of Facebook to campuses
- Estimated full-time undergraduate enrollment
 - National Center for Education Statistics, Institute of Education Sciences, U.S. Department of Education
- Within-sample surveys circa 2005 snapshot
 - demographics, social capital, self esteem and friending strategies {Ellison, Lampe, Steinfield}(2006,2007)
 - privacy, profile information & sharing Acquisti and Gross (2006)
 - social grooming & who doesn't join Facebook Tufekci (2008)
 - Facebook friending habits online & offline Mayer and Puller (2008)

population heterogeneity in age, size mean geodesic up, clustering down



heterogeneity in size, age, adoption



natural experiments in network assembly

- Facebook100
 - Observed in single snapshot, early Sept 2005
 - Facebook expanded to these first 100 networks during February-September 2004



natural experiments in network assembly

- Facebook100
 - Observed in single snapshot, early Sept 2005
 - Facebook expanded to these first 100 networks during February-September 2004
- 1. Networks are of different vintages
- 2. Expansion spanned the end of the 2003-2004 school year [present/historical]
- 3. Beginning of 2005 school year spanned the snapshot of the data [offline/online]

natural experiments in network assembly

- Facebook100
 - Observed in single snapshot, early Sept 2005
 - Facebook expanded to these first 100 networks during February-September 2004



adoption tracks with time on campus



++ time on campus

younger shared geography, present interactions -- time on campus older

historical interactions

networks matured towards similar end states



class of 2009 natural experiment



classes with more time on campus had higher adoption



++ time on campus

-- time on campus



degree distributions & social strategies change with more time on campus





degree distributions & social strategies change with more time on campus



Unique timing & historical context of Facebook's emergence created useful heterogeneities Unique timing & historical context of Facebook's emergence created useful heterogeneities

Heterogeneities (*population*, treatment) can reveal underlying social **processes**

takeaways

- Context matters
- Assembly questions abound
 - Network maturity vs. growth, densification; Shortest paths follow Backstrom et al. (2012)
 N>1
- Natural experiments reveal heterogeneities in online/offline, present/historical processes
 - Social browsing (before shared environment) vs. social search (after)
 - Shared physical environment increases adoption
 - Networks mature at different rates towards similar end states



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