

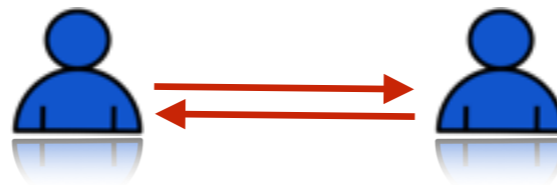
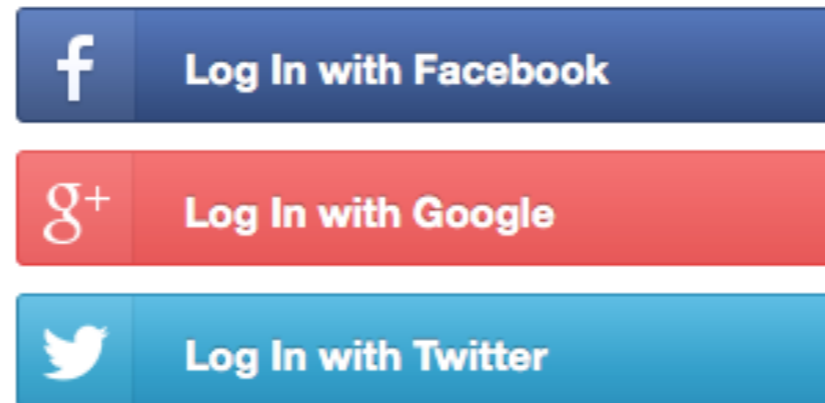
# Social Bootstrapping

## How Pinterest and Last.fm Social Communities Benefit by Borrowing Links from Facebook

.....  
**C. Zhong**<sup>1</sup>, M. Salehi<sup>2</sup>, S. Shah<sup>3</sup>, M. Cobzarenco<sup>4</sup>, N. Sastry<sup>1</sup>, M. Cha<sup>5</sup>

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10 April 2014



# Social Bootstrapping

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# The Dilemma for New Websites: How to construct social network?

- Option 1:
  - Create entirely new social network
- Option 2:
  - Social Bootstrapping

Option 1 shows a traditional login form. It features a yellow input field for 'Email' with a 'Required' label, a second yellow input field for a password (represented by dots), and a 'Log In' button. Below the password field, there is a link for 'Are you a business? Get started here'. At the bottom, there are links for 'Forgot your password?' and 'Sign up now'.

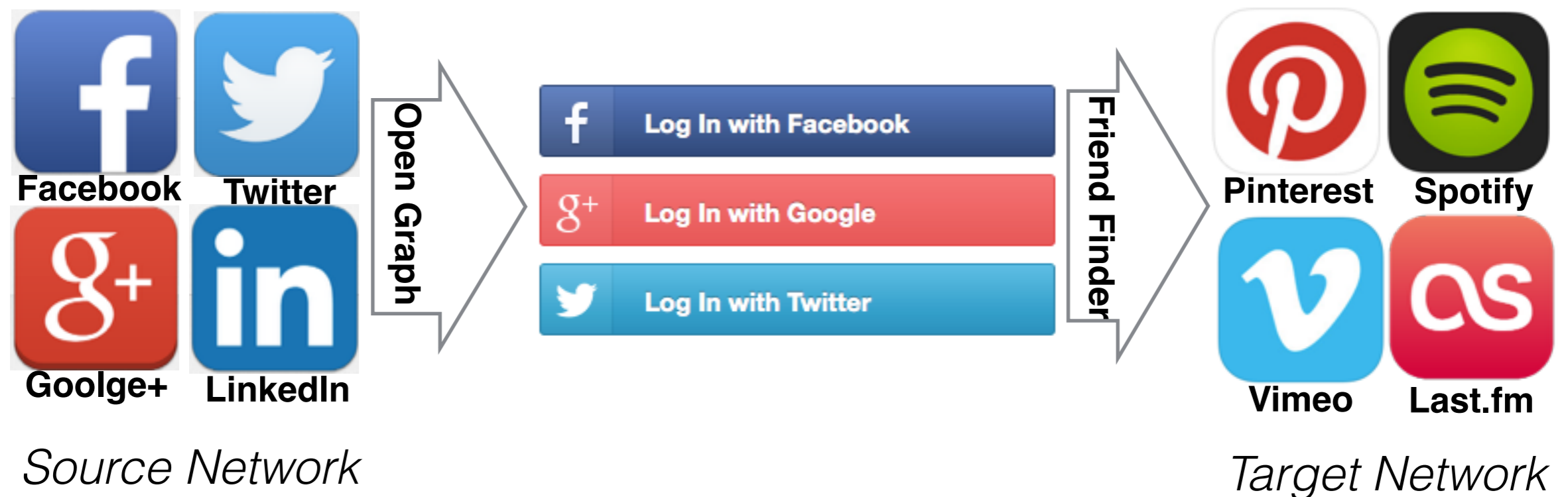
**Option 1**

Option 2 shows social bootstrapping options. It features three buttons: a blue button with the Facebook 'f' logo and 'Log In with Facebook', a red button with the Google+ 'g+' logo and 'Log In with Google', and a light blue button with the Twitter bird logo and 'Log In with Twitter'.

**Option 2**

# Social Bootstrapping

- The process of **copying** links from established social networks (*source network*) onto a third-party website (*target network*).



# Social Bootstrapping in action: Friend Finder in Pinterest

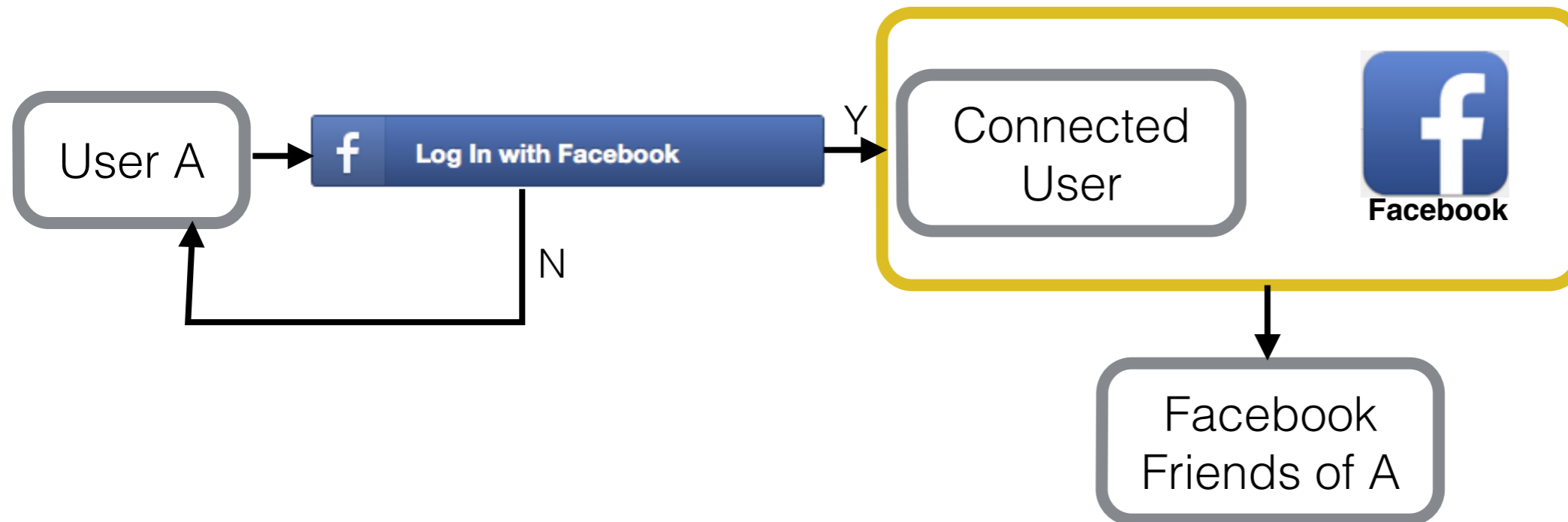
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User A

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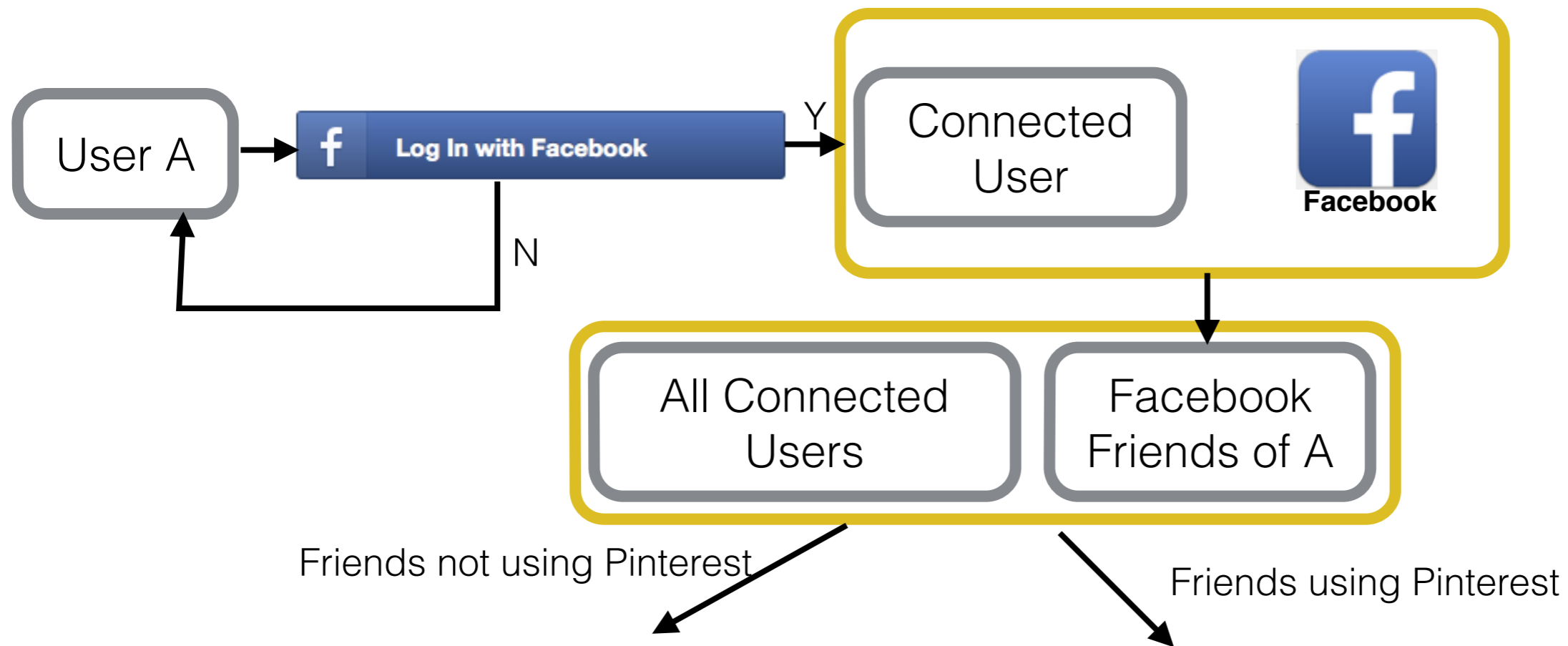


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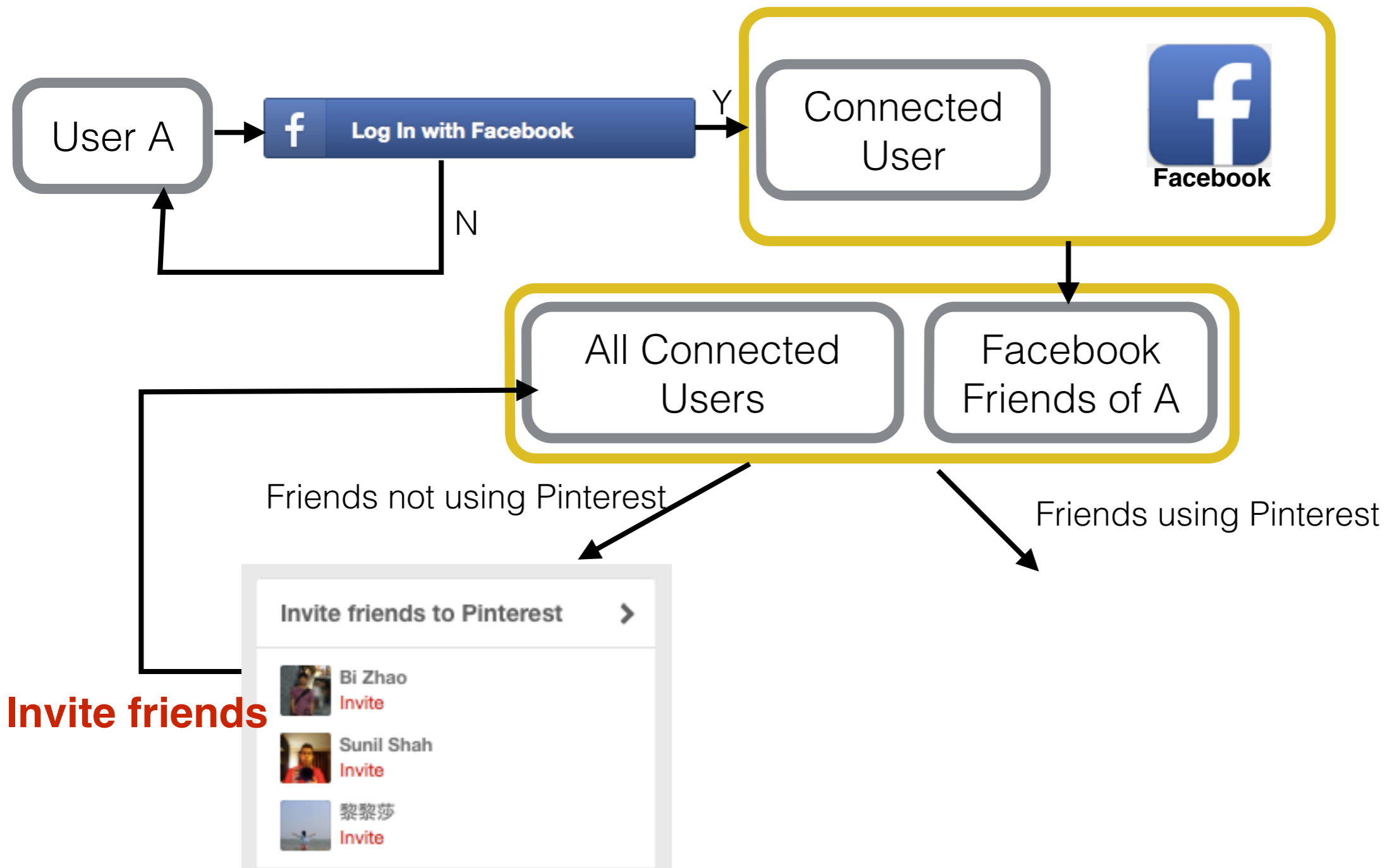




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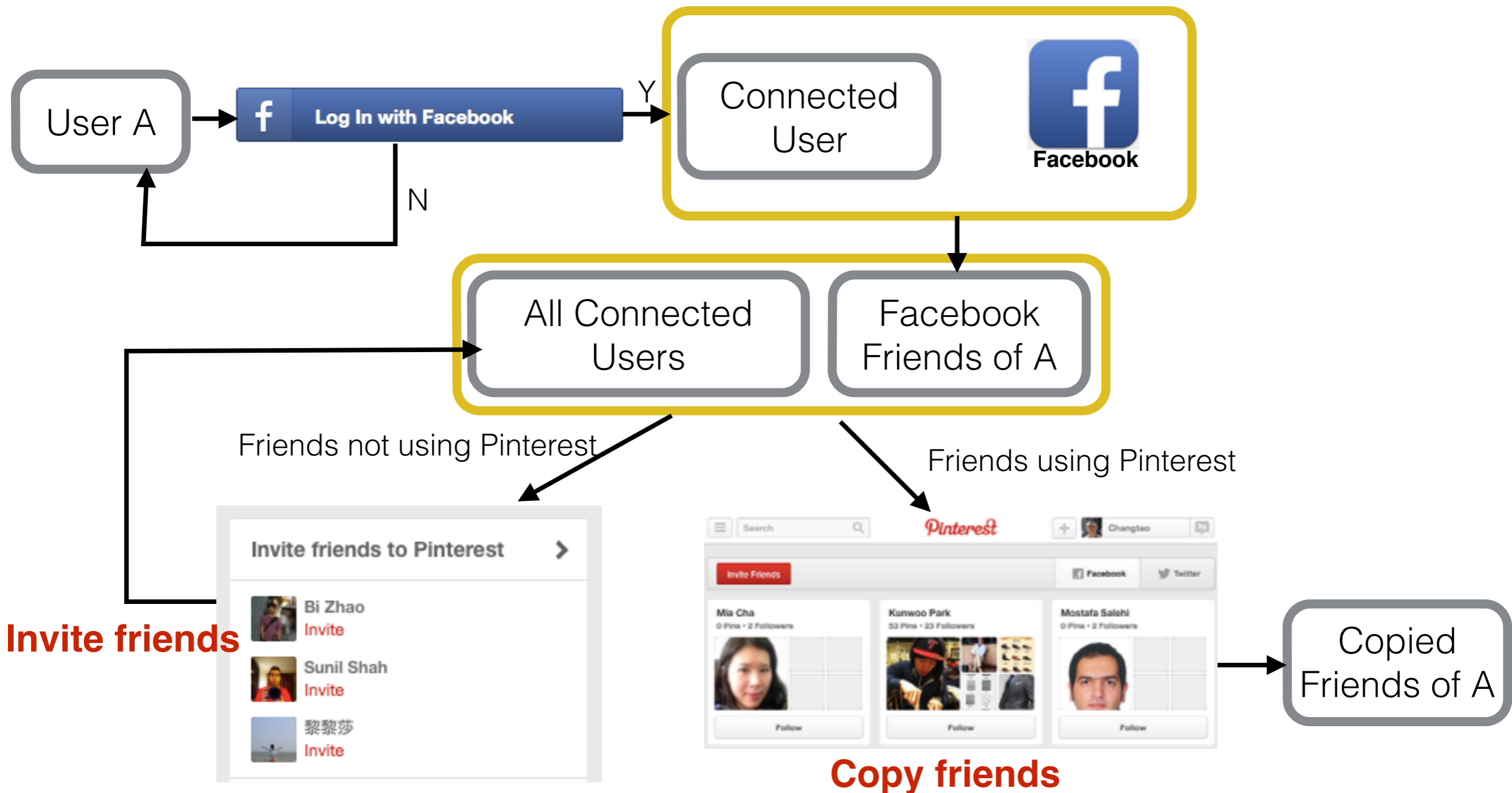


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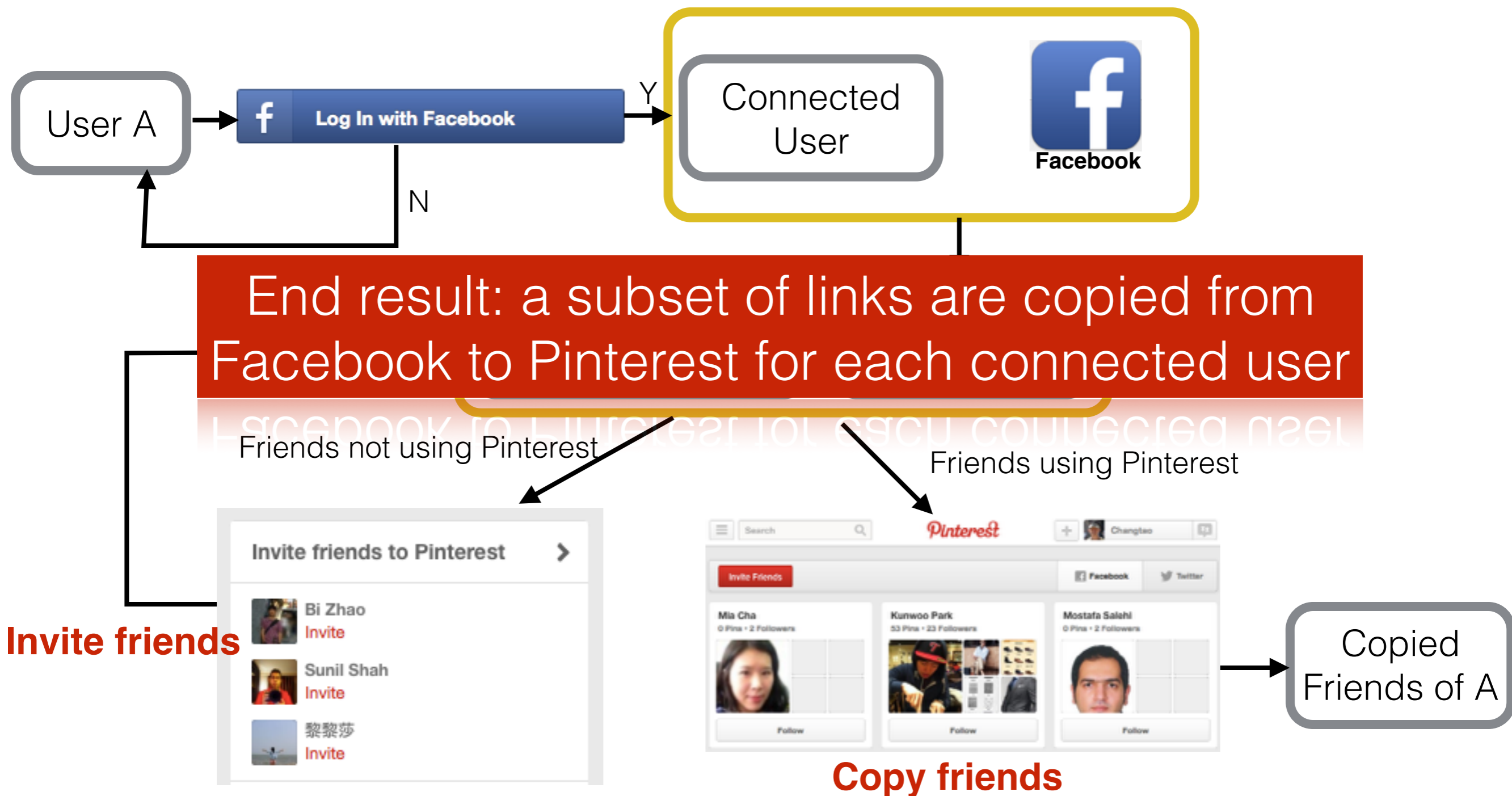


**Invite friends**

# Social Bootstrapping in action: Friend Finder in Pinterest



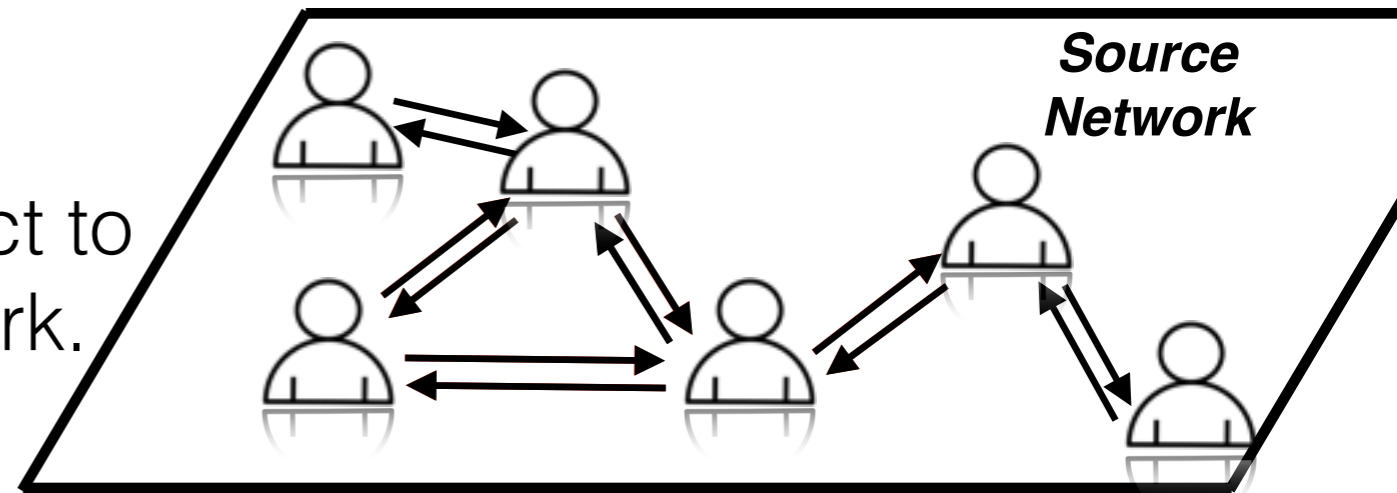
# Social Bootstrapping in action: Friend Finder in Pinterest



# Analytical Model: Link Bootstrapping Sampling

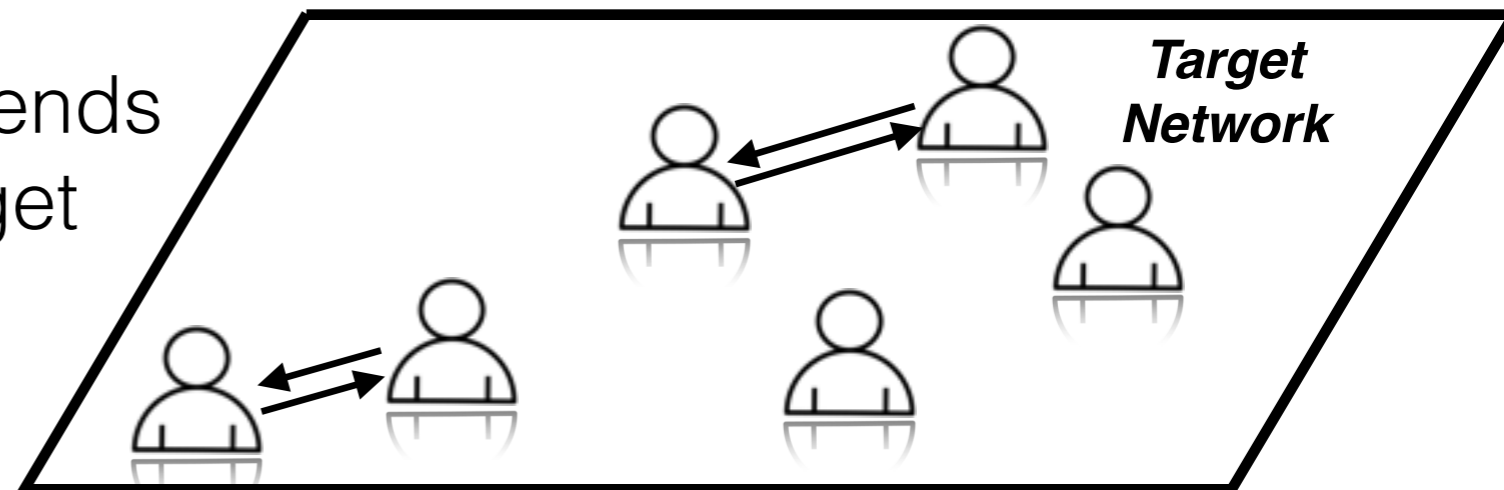
- **Node sampling:**

- Users in target network connect to their accounts in source network.



- **Link sampling:**

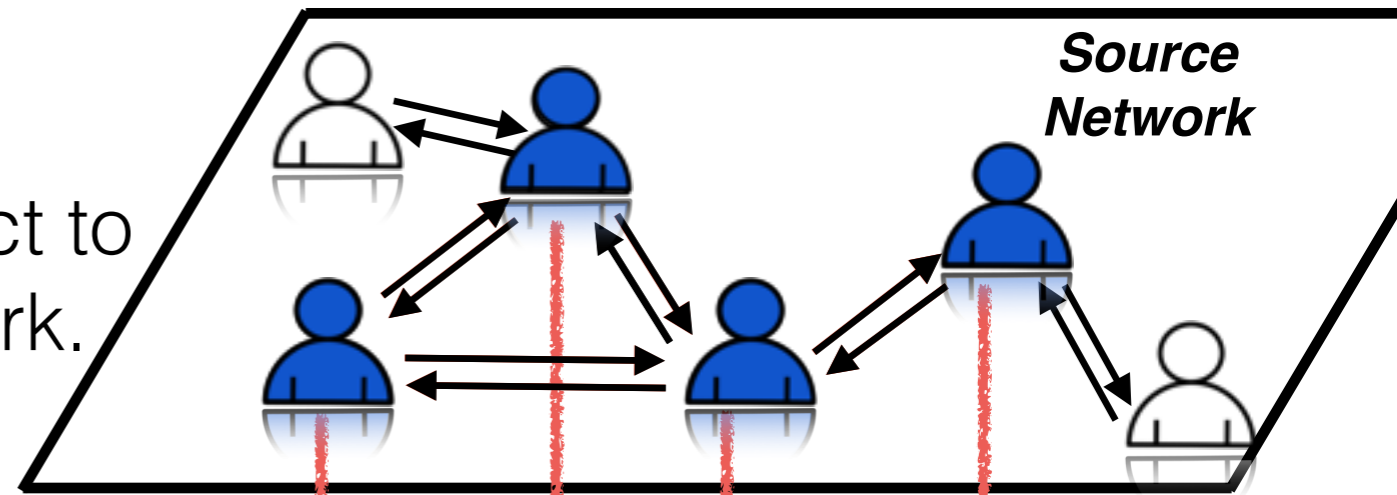
- Connected users import friends from source network to target network.



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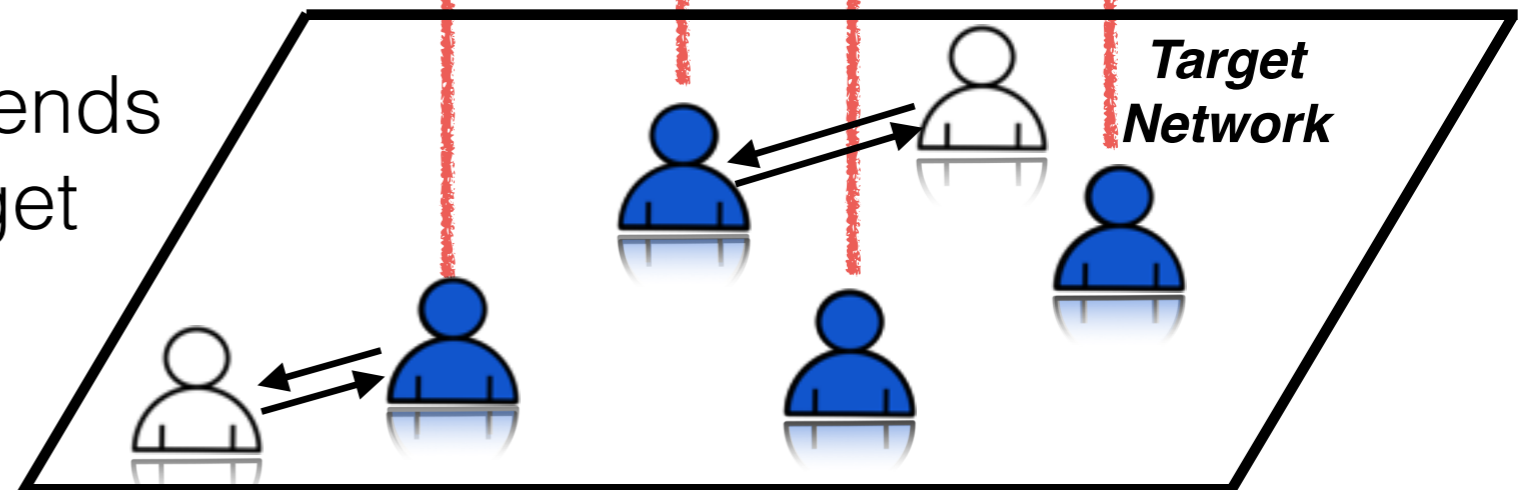
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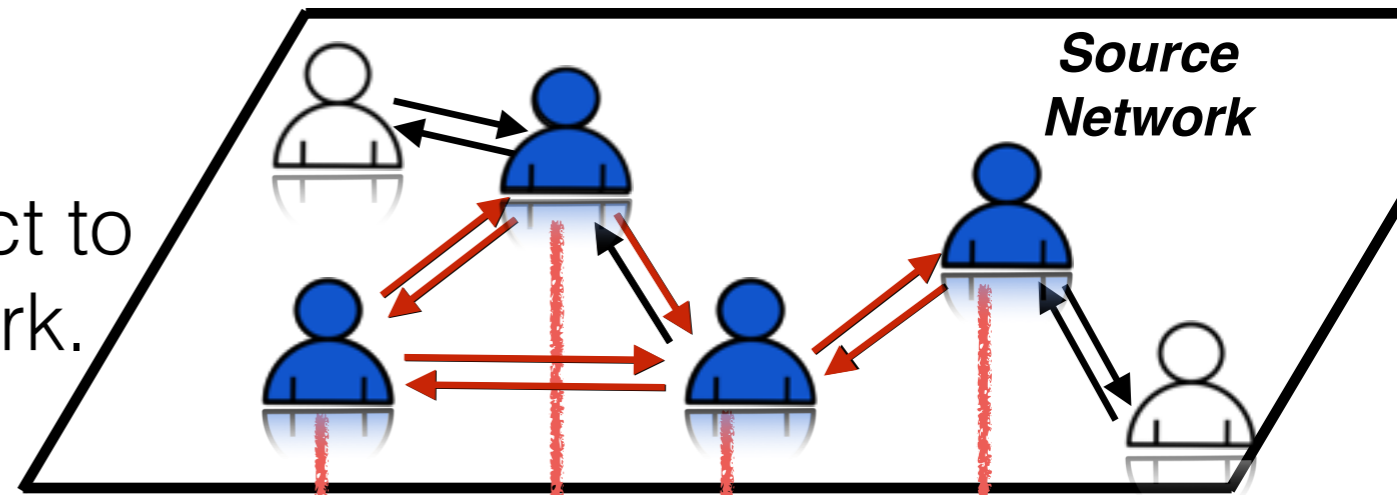
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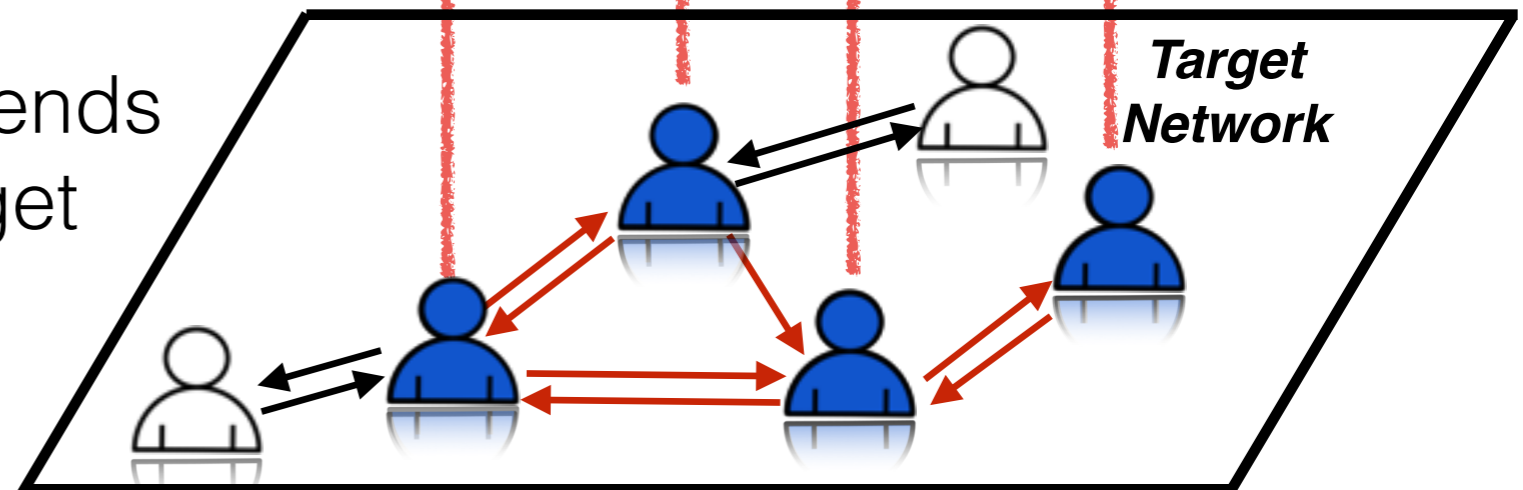
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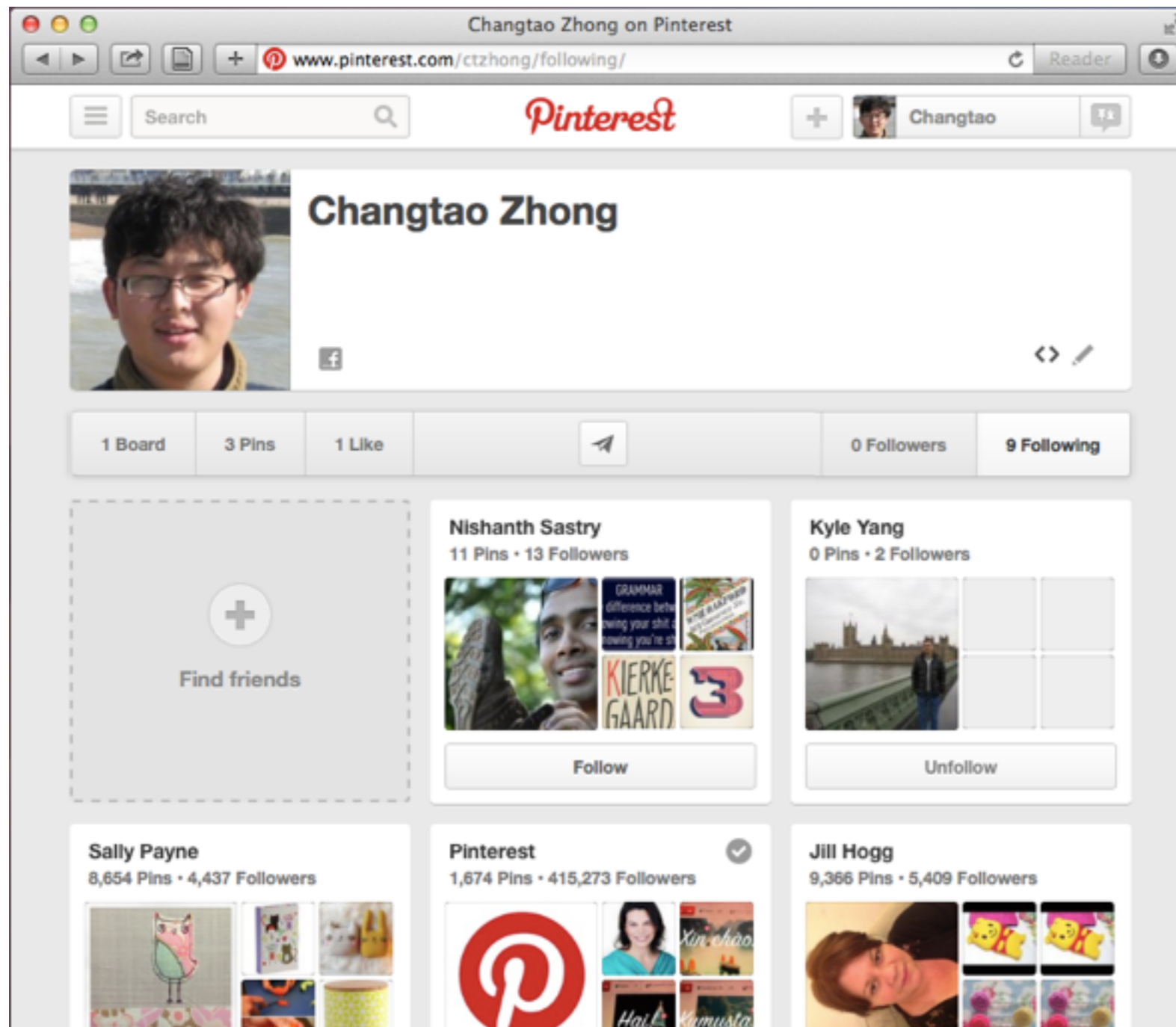
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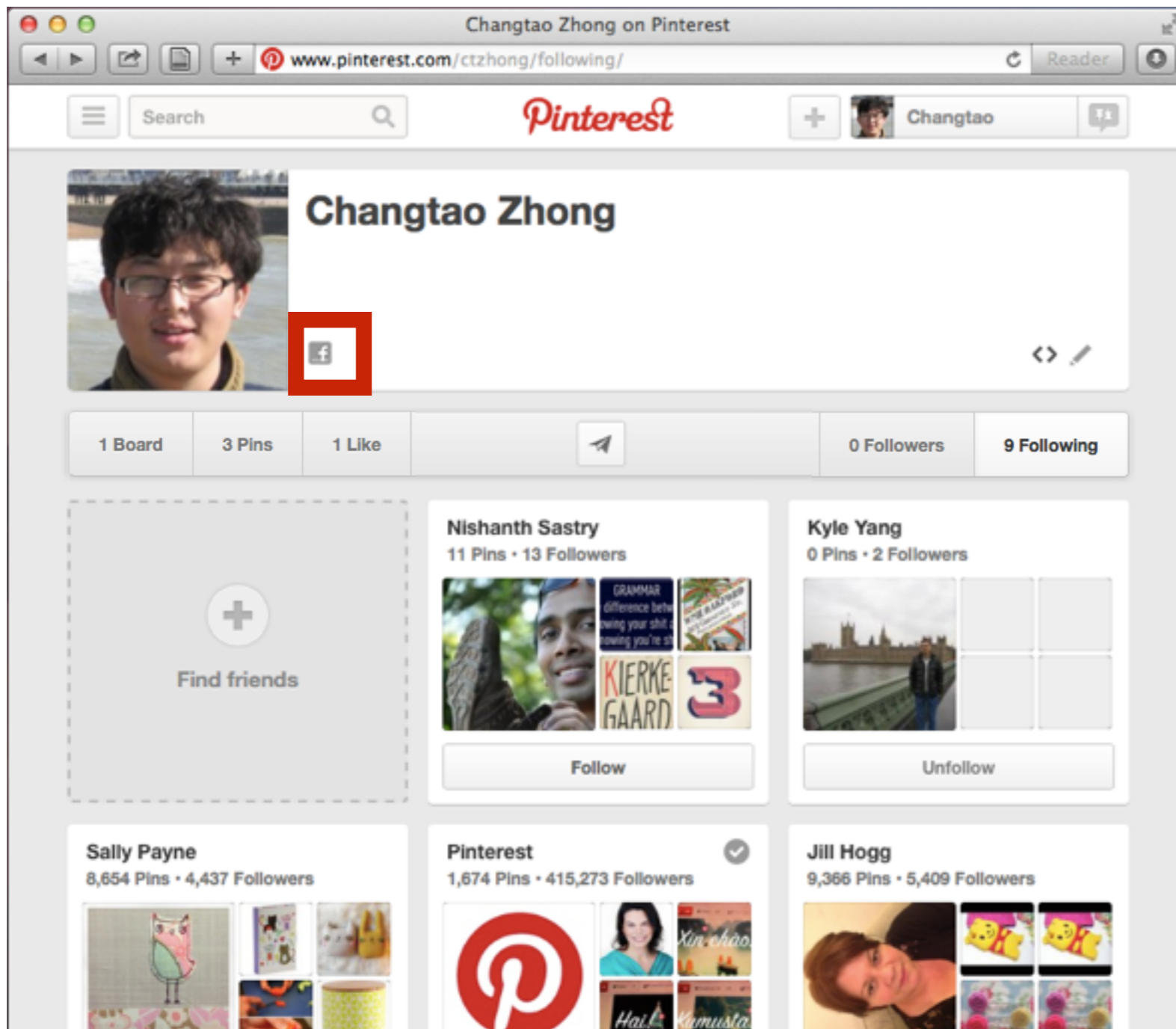


# Collecting Pinterest Data



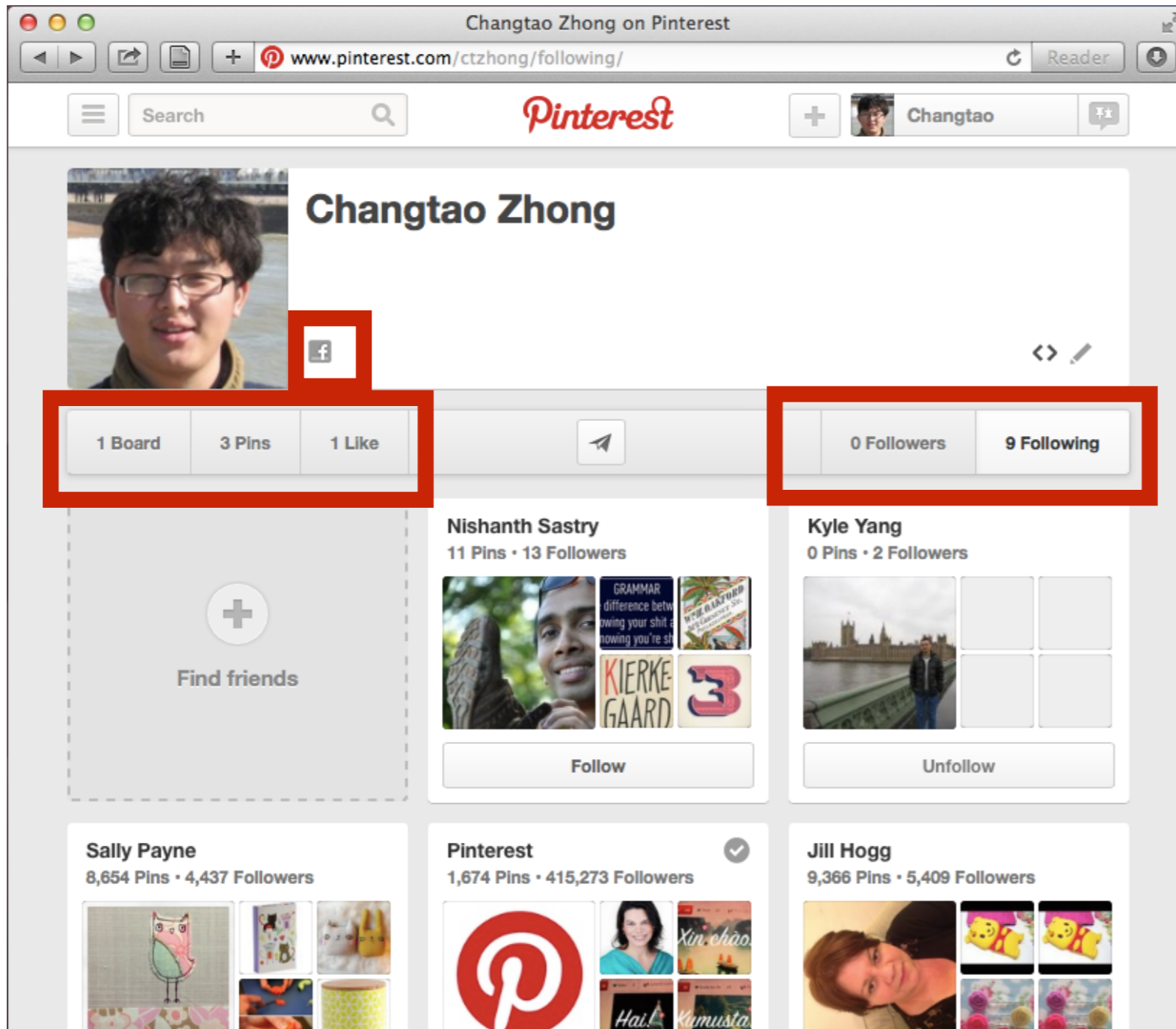


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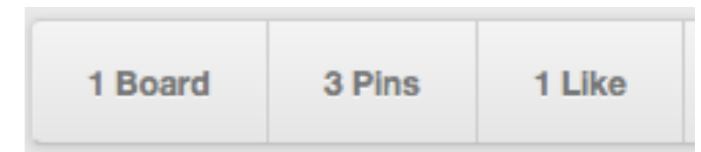


**Facebook handle**

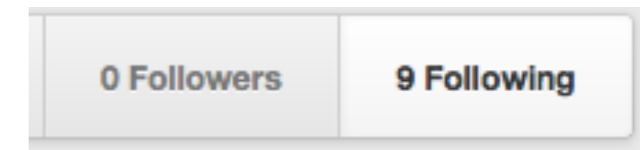
# Collecting Pinterest Data



## Facebook handle

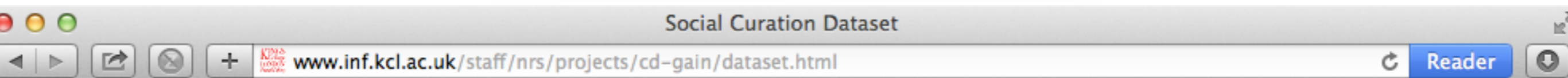


## Activity info



## Social Network

# Pinterest Dataset



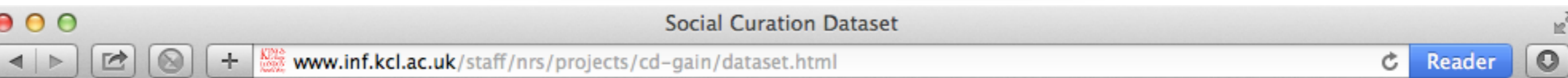
## Datasets

An anonymized version of the Pinterest dataset used in our [WWW14](#) and [ICWSM13](#) papers is being made available to the research community. **If you are interested in using this data, please send us an email at [netsys@kcl-dot-AC-dot-uk](mailto:netsys@kcl-dot-AC-dot-uk) to get the link where you can download the data.** Note that sending the email indicates that you accept our [terms and conditions](#) in the following section. Please indicate which of following parts of the dataset you need in the email.

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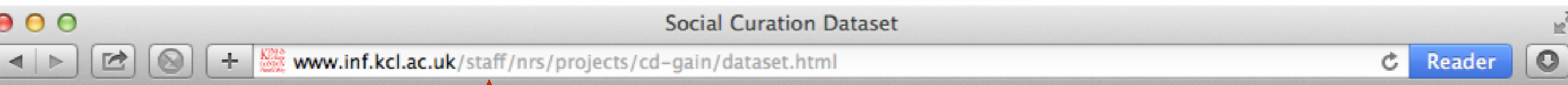


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# Pinterest Dataset



{Social}Curation

HOME

RESEARCH

DATASETS

PAPERS

Dataset

Terms

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# Datasets\*: Pinterest and Last.fm



- Connected users**

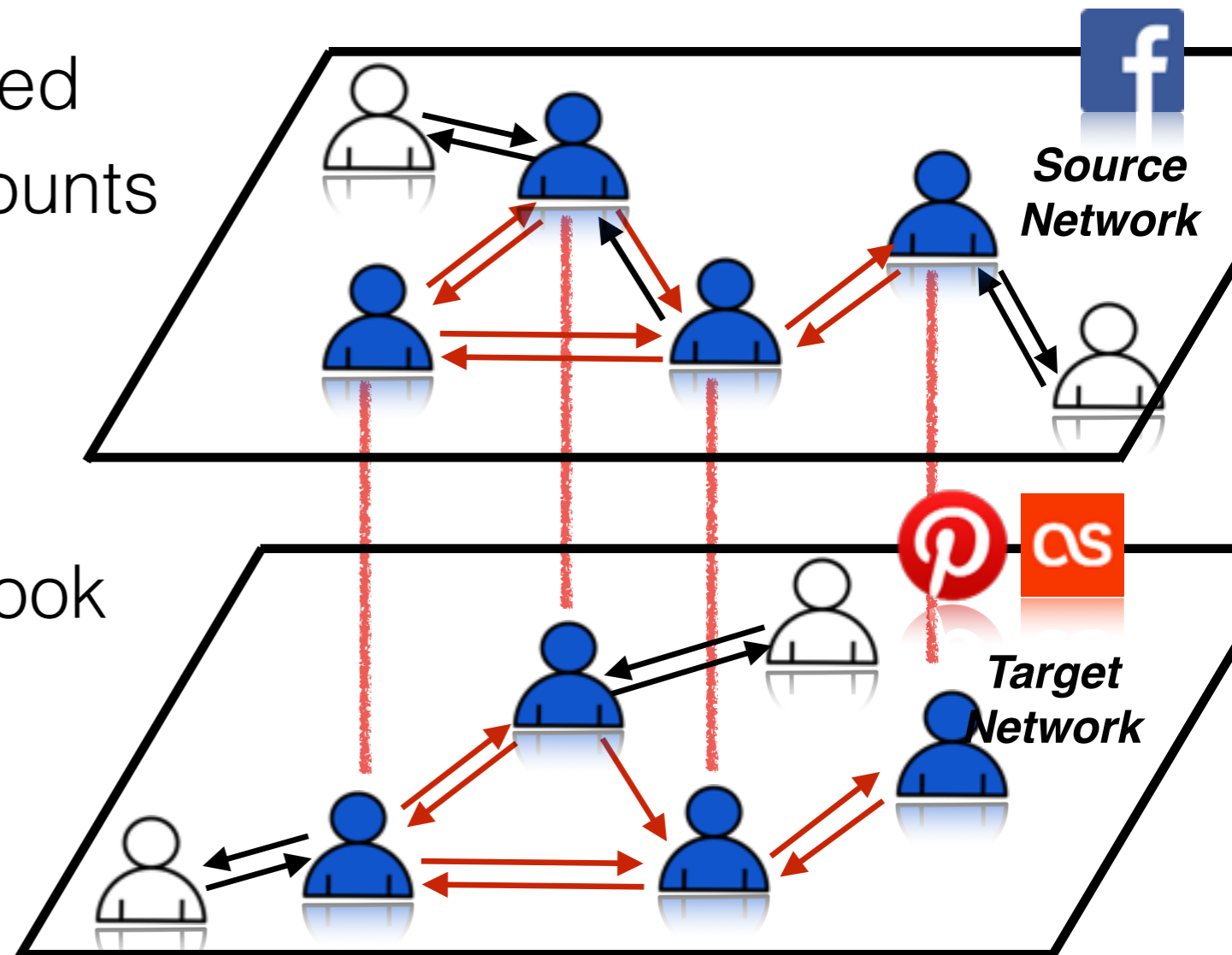
- Users that have connected with their Facebook accounts

 40m / 68m  600k

- Copied links**

- Links copied from Facebook

 1b / 3.8b  2.8m





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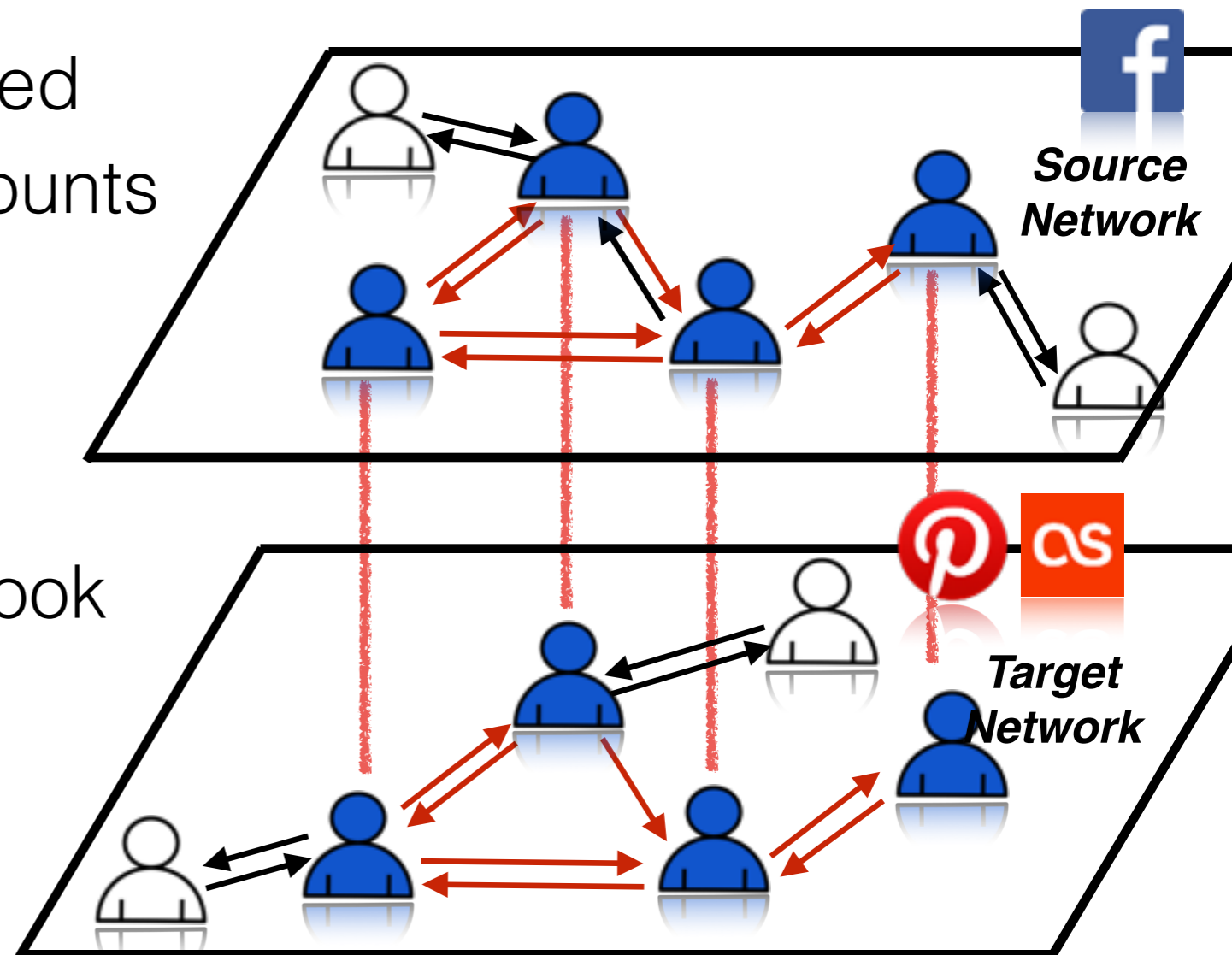
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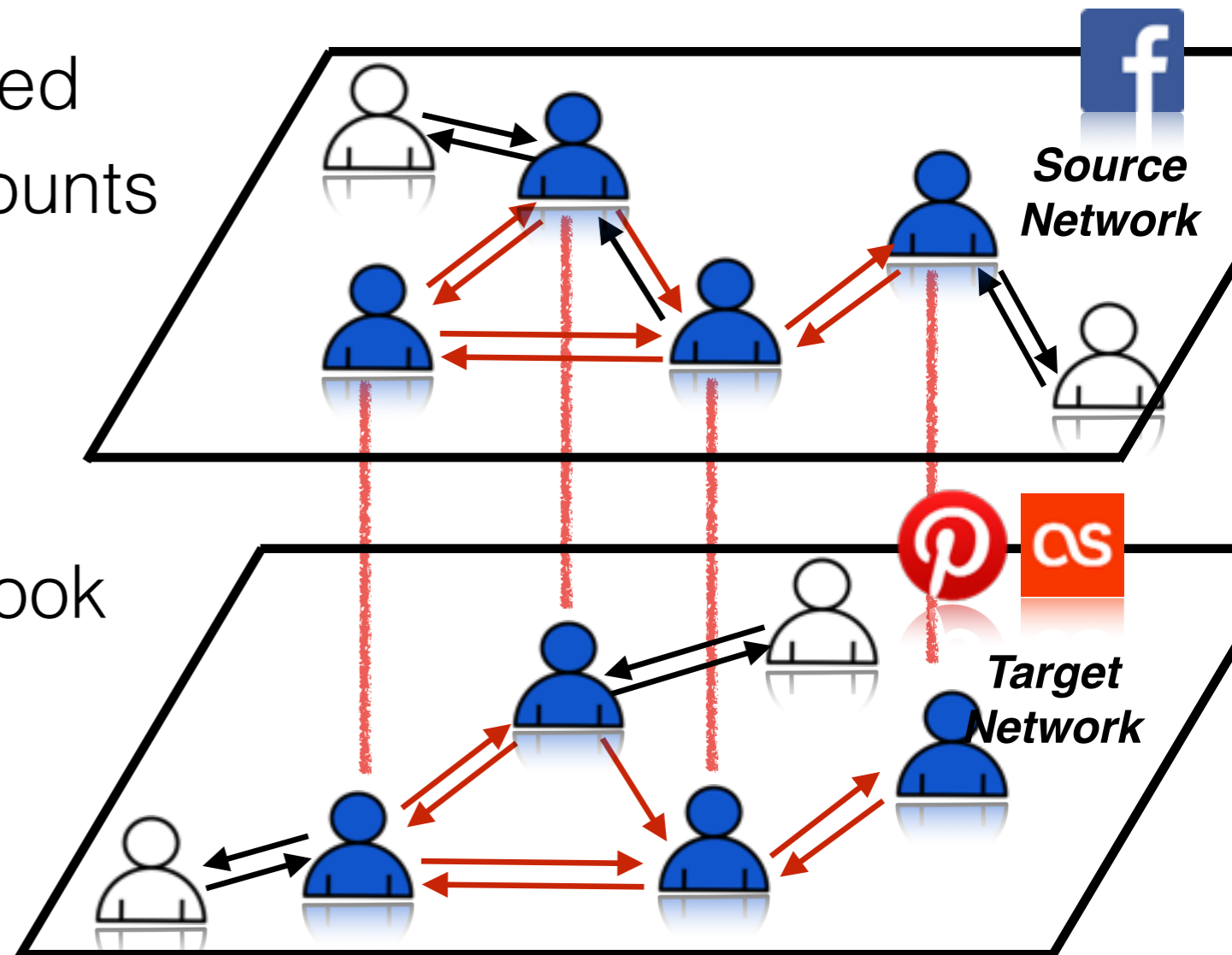
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# Social Bootstrapping has advantages on paper

## ✓ **Can instantly bootstrap from a mature network.**

- Facebook has 10 years of history; Twitter 8 years.<sup>1</sup>

## ✓ **Not “yet another” network fighting for user attention**

- 71% of online adults are now Facebook users<sup>2</sup>

<sup>1</sup>Wikipedia. <http://en.wikipedia.org/wiki/Facebook>, <http://en.wikipedia.org/wiki/Twitter>

<sup>2</sup>Pew Research. <http://www.pewinternet.org/2013/12/30/social-media-update-2013/>

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BUT: Different networks have different purposes.  
Does copying create a good social community  
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# Outline

- *Q: Does copying create a good social community on the target website?*
- **Structural Benefits:** Copying helps users get started with “good” structure with more social interactions
- **“Weaning”:** Beyond Bootstrapping, active and influential users wean from Facebook to create new links natively

# Structural Benefits

Our analyses show that:

- **Reciprocity:** *Copied > Native*
- **Clustering:** *Copied > Native*
- **Connectivity:** *Giant Connected Component appears easily*

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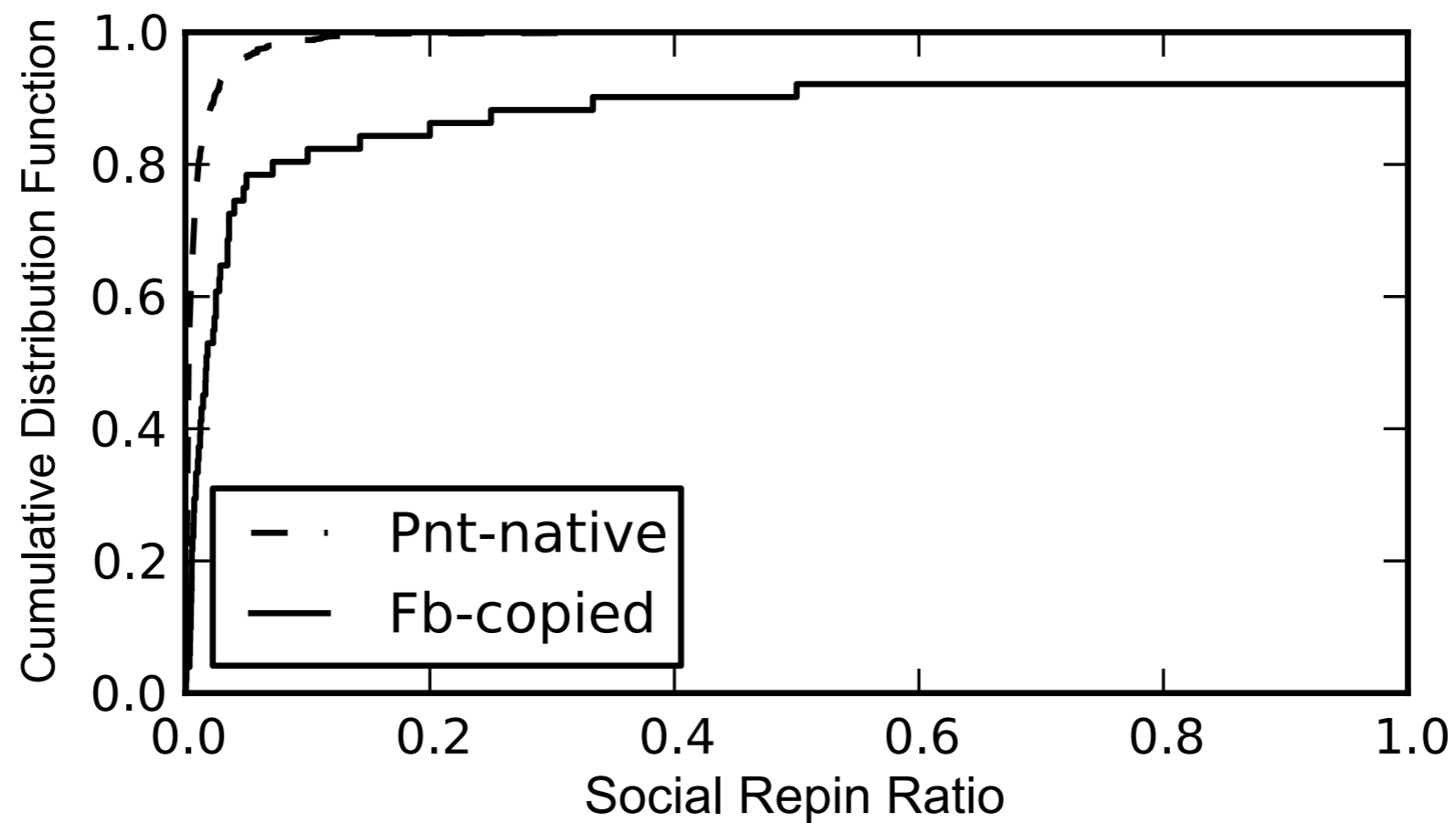
Copying links results in a **stronger** and **denser** social structure.

social structure

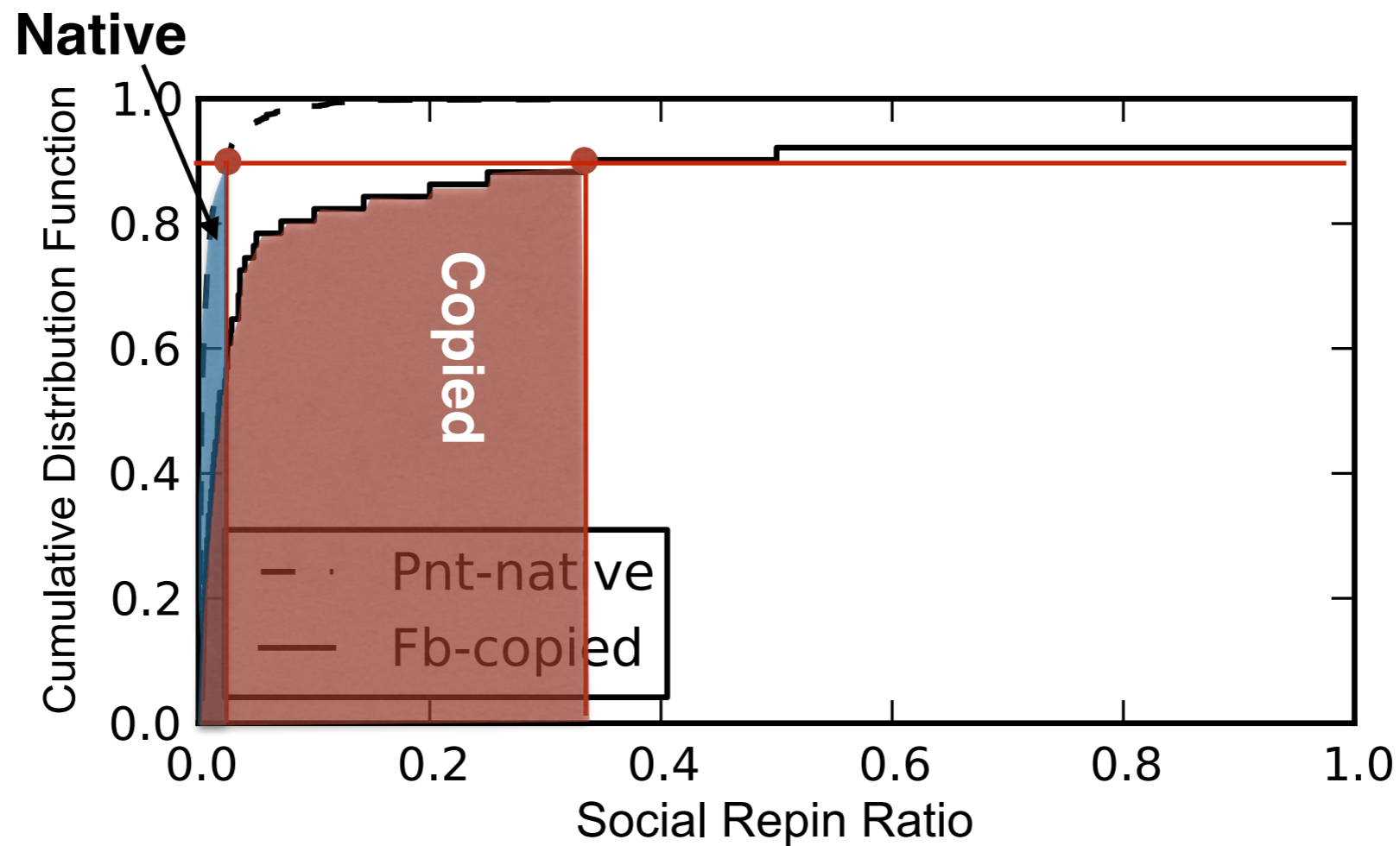
# Structural benefits → Social interaction?

- **Repin** (the most popular activity on Pinterest):
  - Put images published by others into one's own collections.
- **Social Repins**: Repins made by friends.

# Copied links richer in social repins

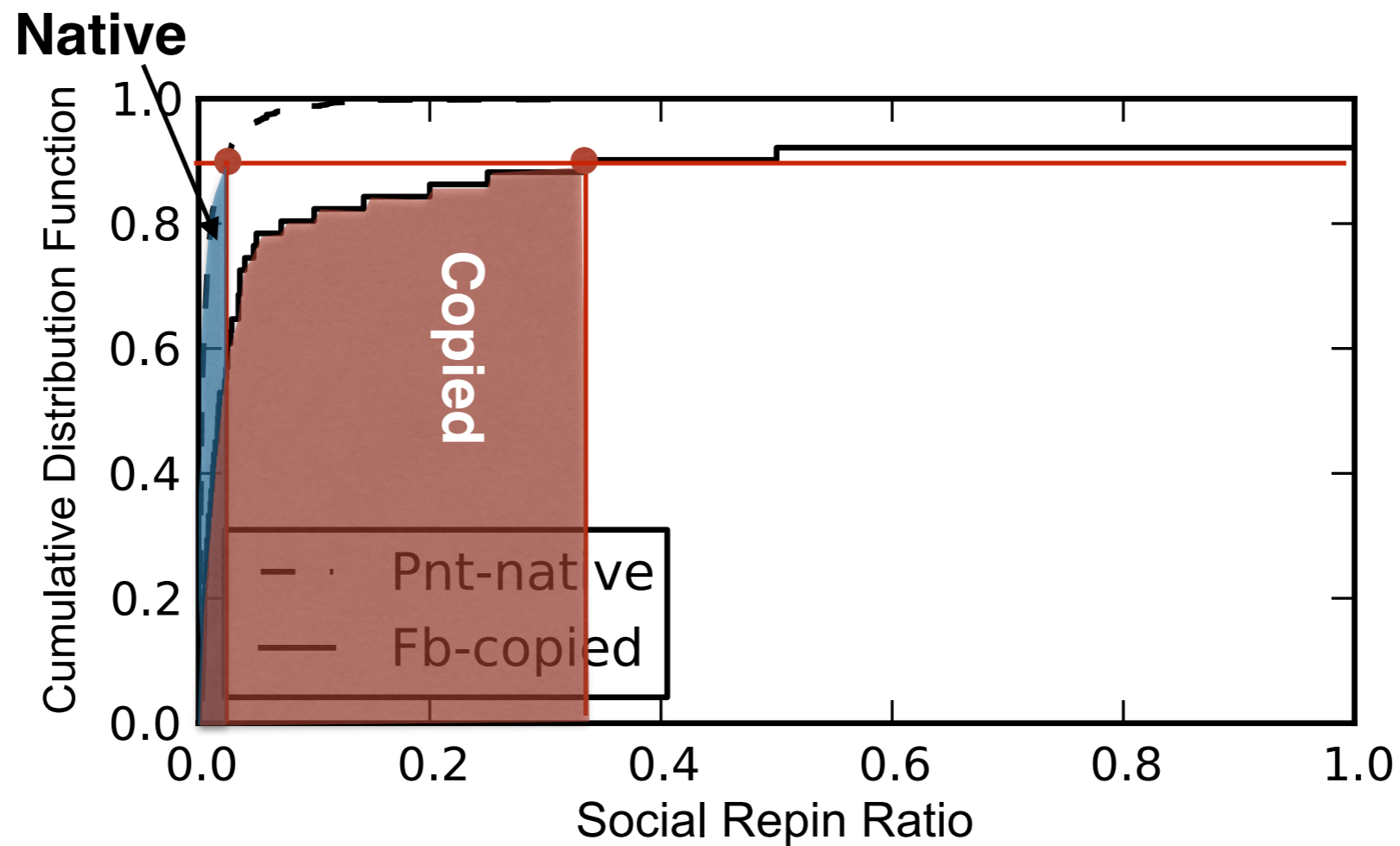


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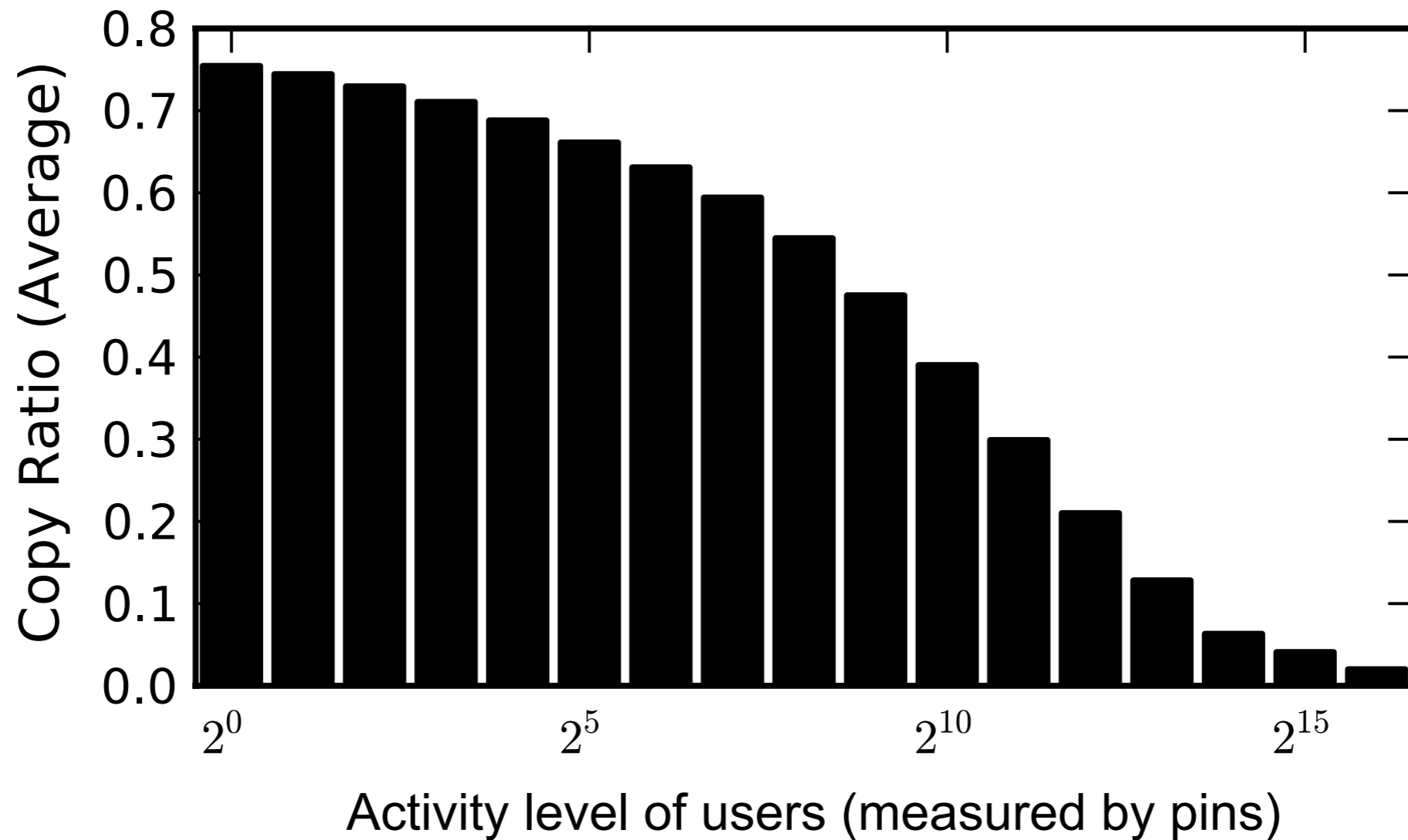


Copying creates networks which is **good** for social interaction

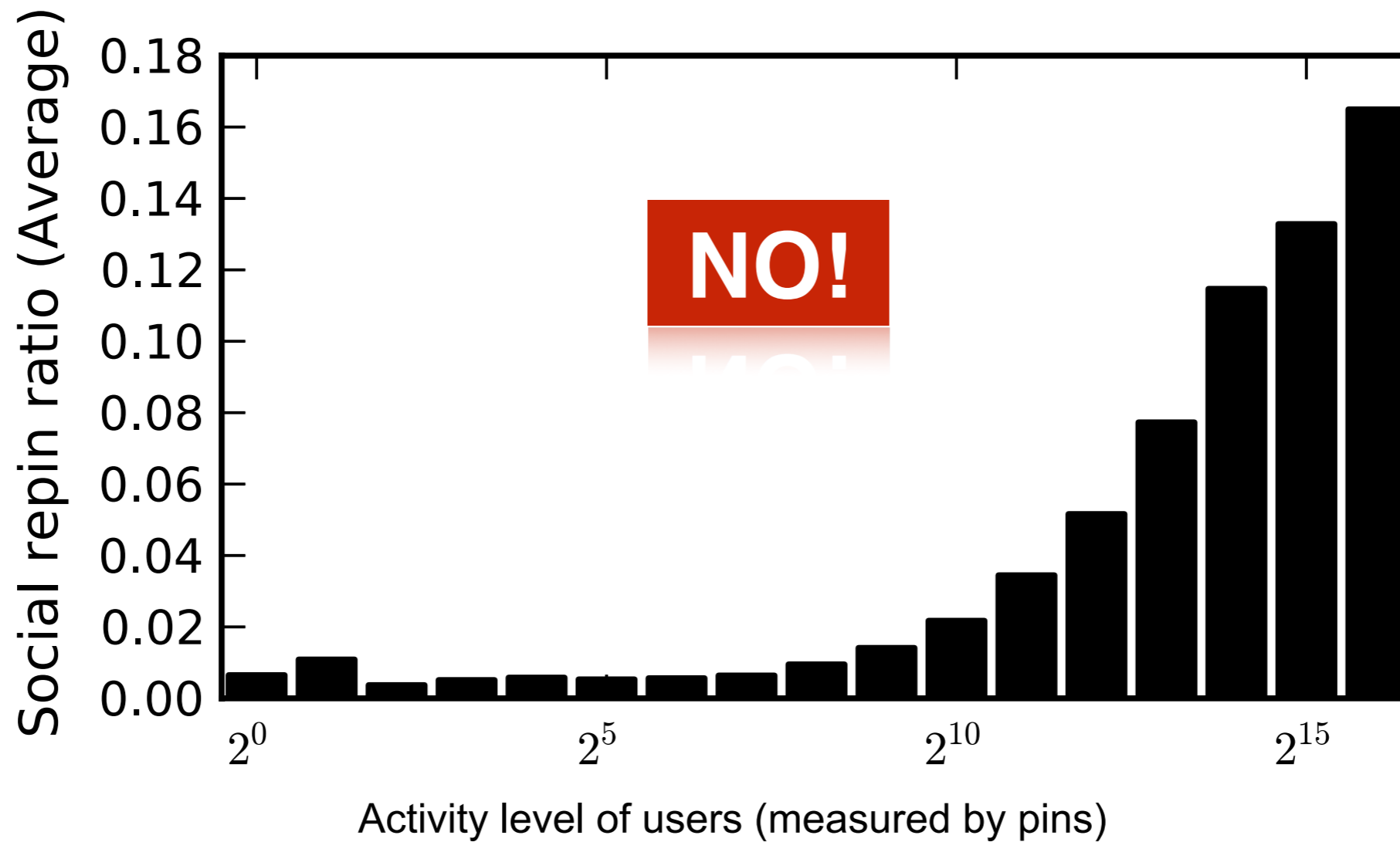
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# Active/influential users copy less



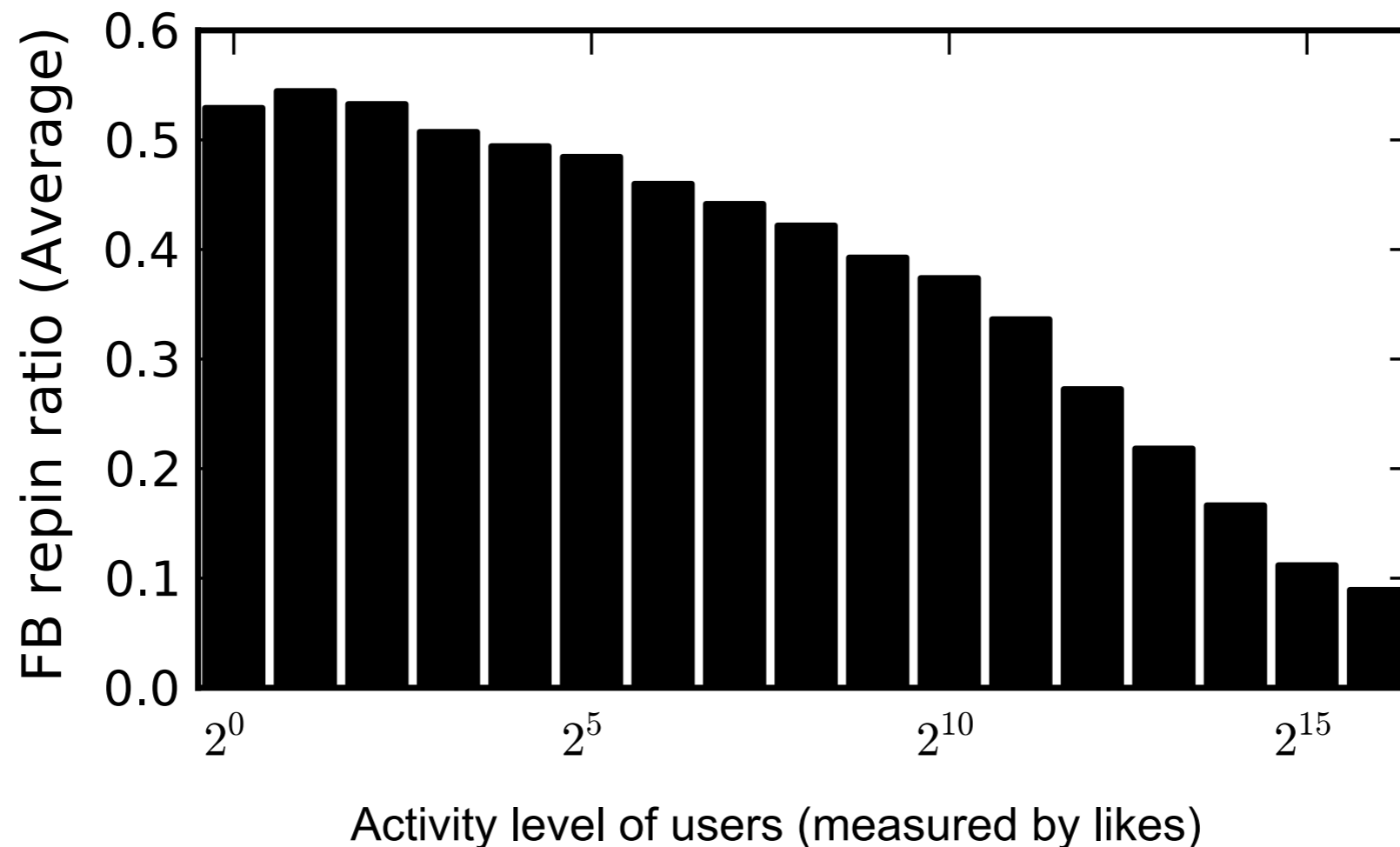
# Are active users less social?



# Weaning from Facebook

Repins of Facebook friends

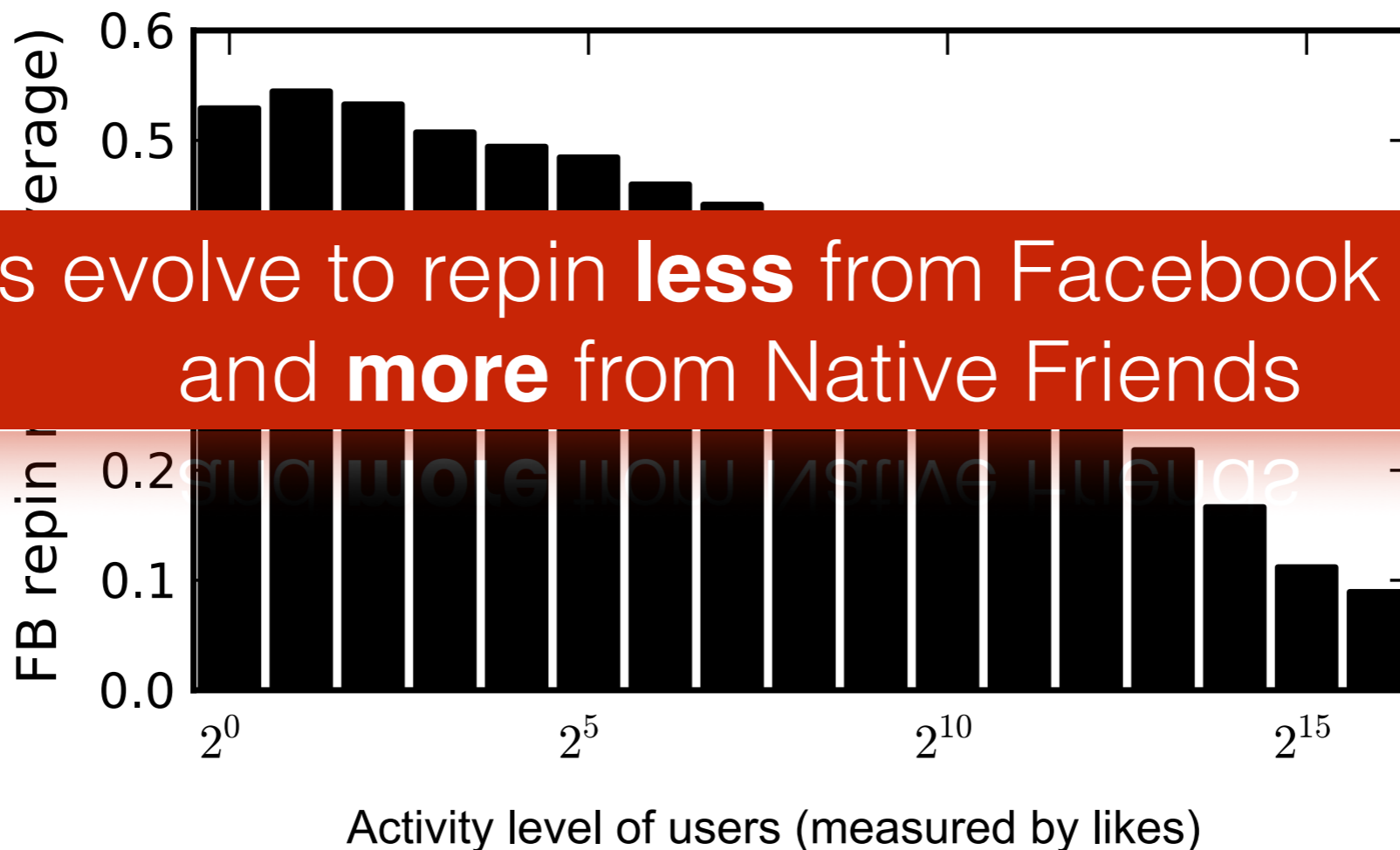
$$\text{FB Repin Ratio} = \frac{\text{Repins of Facebook friends}}{\text{Repins of Facebook and Native friends}}$$



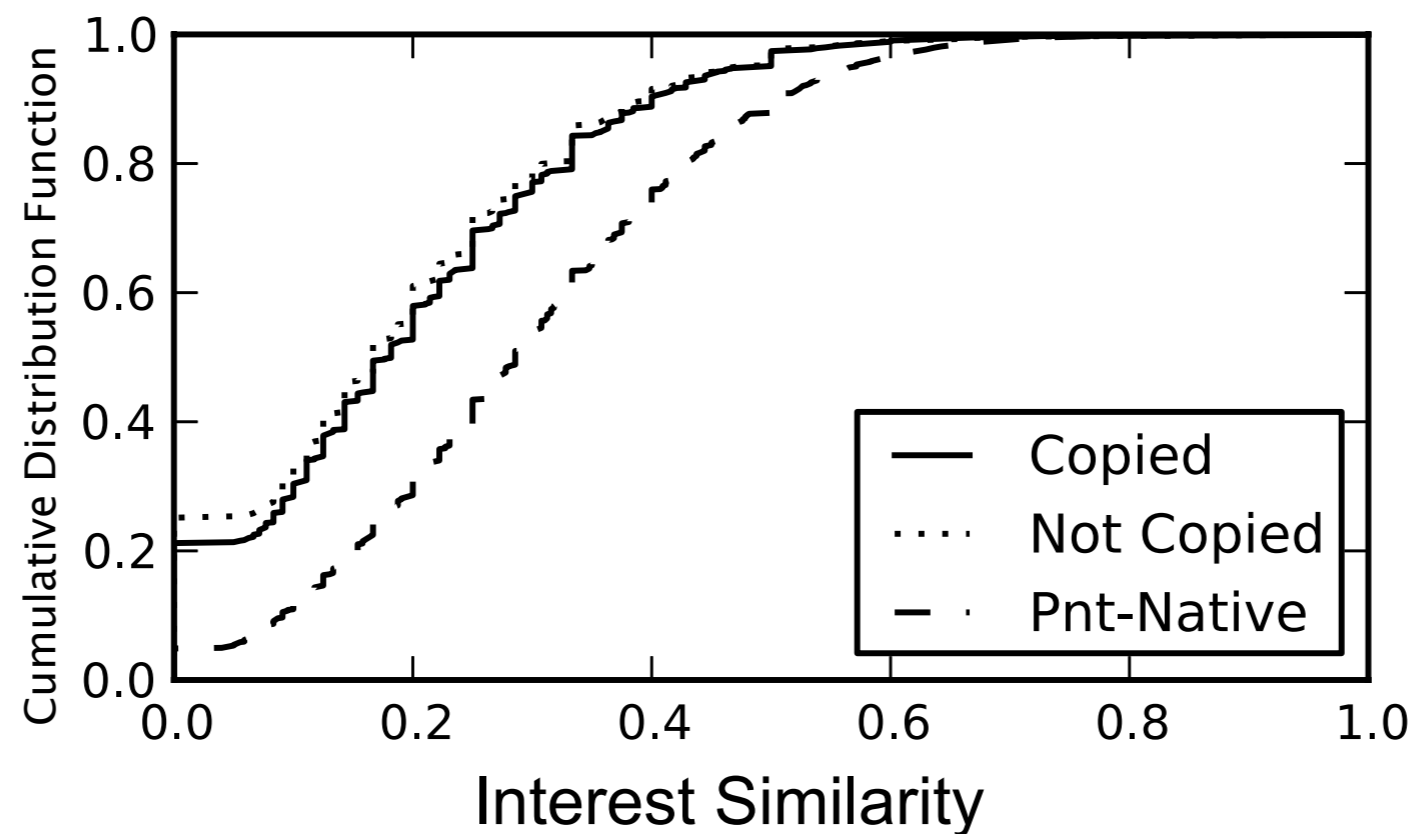
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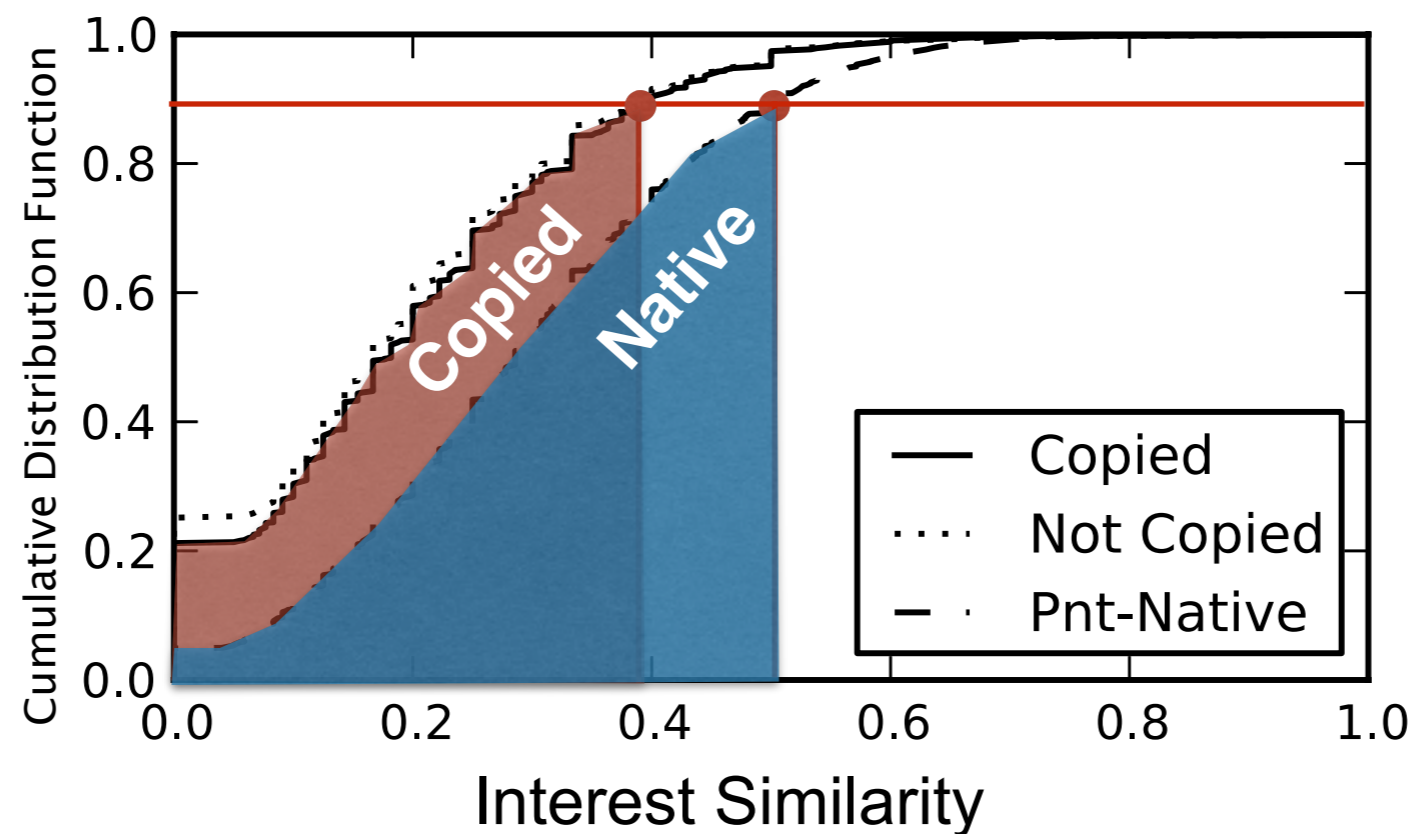
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# Why do active/influential users wean from copied to native friends?

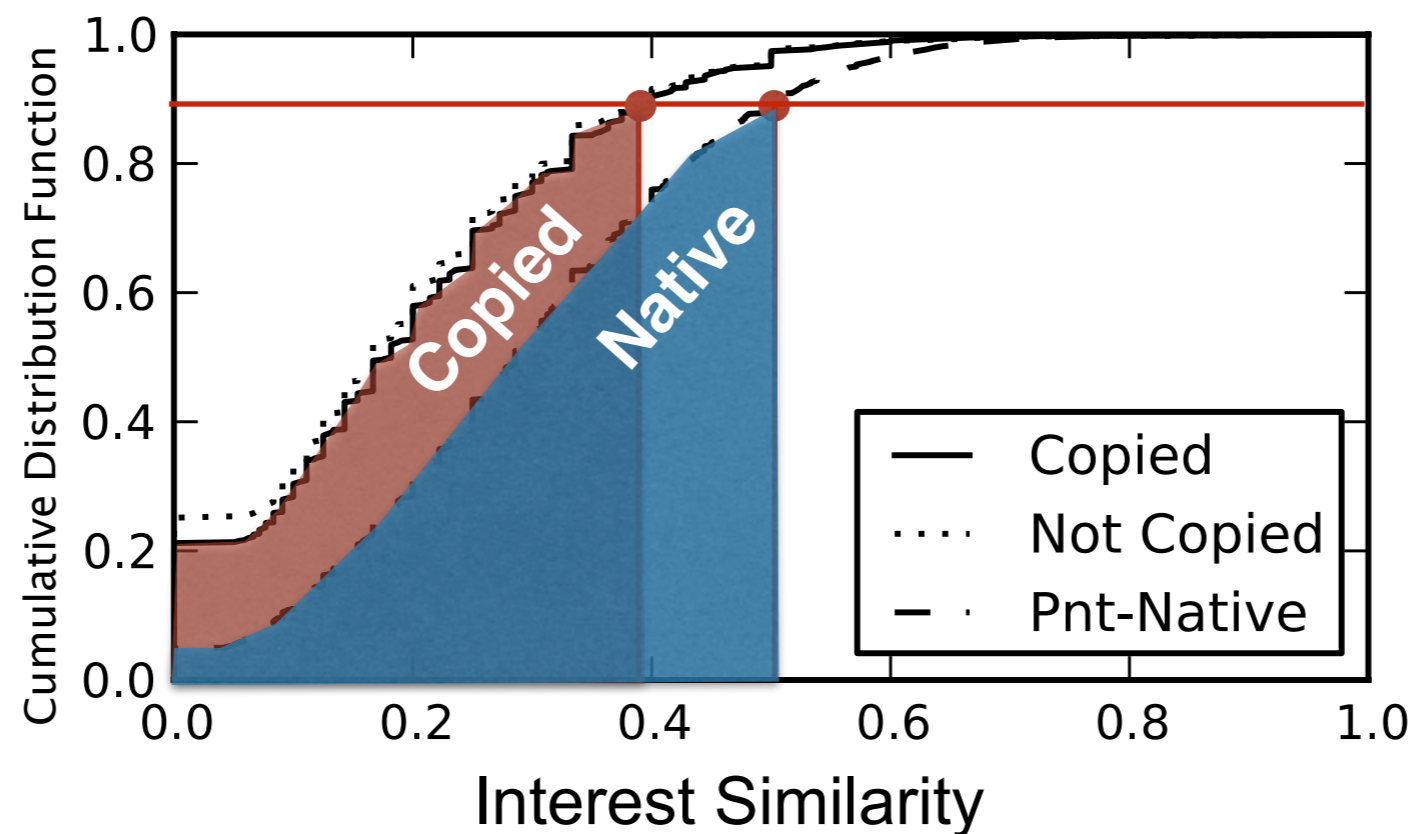


# Why do active/influential users wean from copied to native friends?





# Why do active/influential users wean from copied to native friends?



Because **native friends match their interests more** than friends copied from Facebook

usru uenqz cobied now facebook

# Answers

*Q: Does social bootstrapping by copying links from Facebook create a good social community on the target website?*

- Copying is **useful to initiate social interaction**
- Taking a long-term view, **active/influential users tend to move away** from copied social links and build social relationships natively.

# Answers

*Q: Does social bootstrapping by copying links from Facebook create a good social community on the target website?*

- Copying is **useful to initiate social interaction**
- Taking a long-term view, **active/influential users tend to move away** from copied social links and build social relationships natively.

**Copying and building links natively are both equally important to the success of target website.**

# Thank you!

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