On the Evolution of User Interaction in Facebook

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Social network links

- * Lots of applications use social networks:
 - * Countering sybil attacks [SIGCOMM'06, NSDI'09]
 - * Web search [HotNets'06, VLDB'08]
 - Recommendation systems [www'08]



- Close real world friends
- Casual acquaintances
- * Even enemies [CHI'09]









In practice, people rarely delete social links

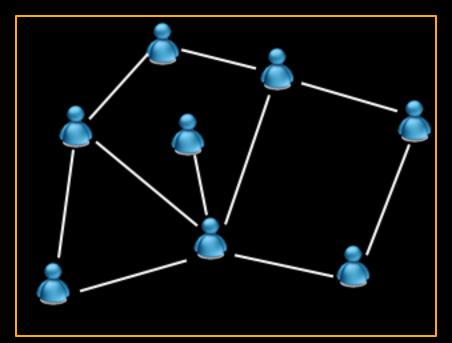
Is the current abstraction of links good enough?

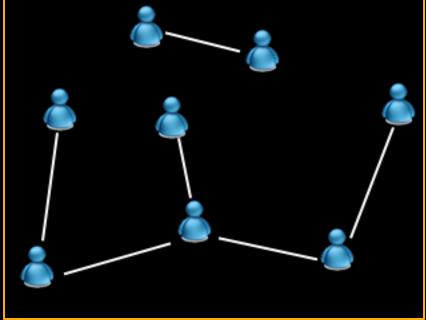
Gauging the strength of social links?

* Idea: Use interaction to differentiate strong and weak links

Social network

Interaction network





Prior studies

Previous studies looked at a static snapshot of interaction network [IMC'08, Eurosys'09]

* Interaction network changes with time

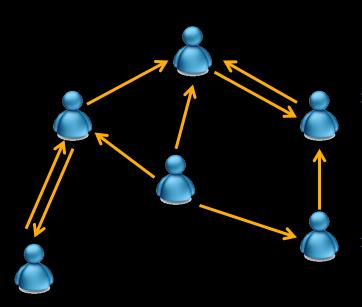
* Understanding dynamics important for applications

This talk

* We characterize the evolution of user interaction

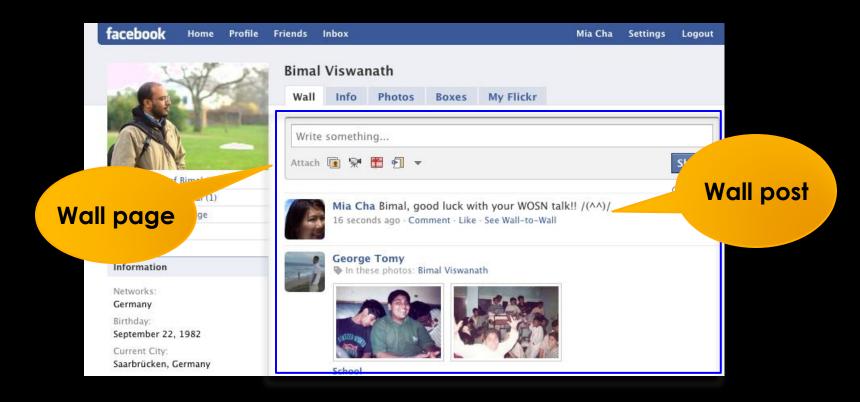
- * Collected data of user interaction in Facebook
- * Studied how pairwise interactions evolve over time
- * Studied how interaction network as a whole evolve over time

Crawling Facebook



- * Facebook reluctant to give out data
 - * Performed crawl of user graph
- Picked known seed user
 - * Crawled all of his friends
 - * Add new users to list
- Continued until all reachable users crawled
- * Crawled Facebook New Orleans regional network
 - * Over 90,000 users, 3M social links
- * We could create many crawling accounts

Collected interaction data



- * Able to download entire wall history
- * 800,000 wall posts
- * Link creation time known from wall page

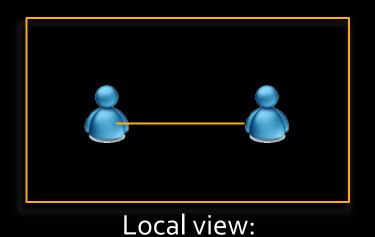
Data collection challenges

- * Could not capture all the users' interaction
 - * Only 76% profiles publicly visible

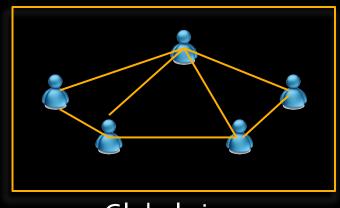
- * Only crawled the giant connected component
 - * Represents ~52% of users in New Orleans network

- * Users can interact in other ways also
 - * Messages, photo sharing, applications, chat

Rest of the talk



Evolution of pairwise interactions

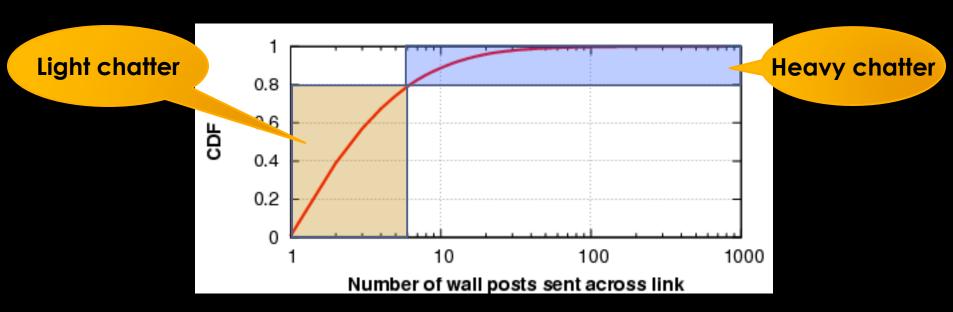


Global view:

Evolution of interaction network over time

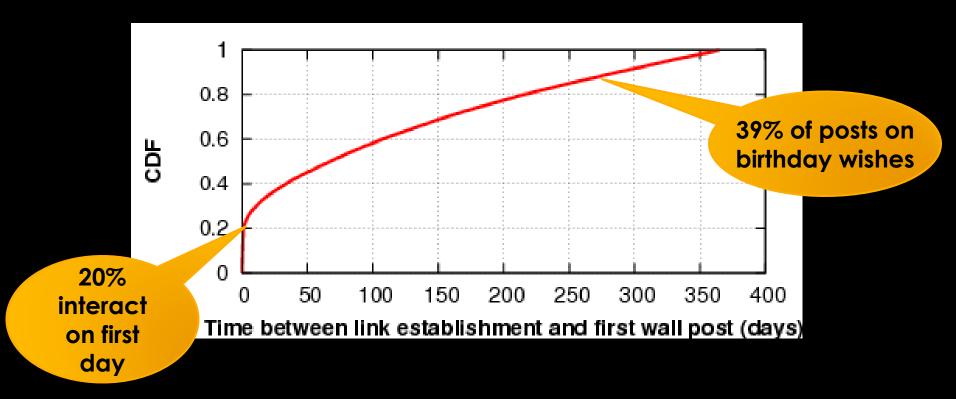
Frequency of interaction

- * Only 23.7% of the social links exhibit interaction
- * Focus on the 1st year of interaction for each pair
- * Wall posting distribution among users skewed
 - * 80% of pairs exchange no more than 5 posts



Light chatter patterns

- * What caused low level of interaction?
 - * Did link creation trigger interaction?

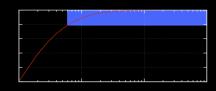


80% of pairs post first message evenly over the year

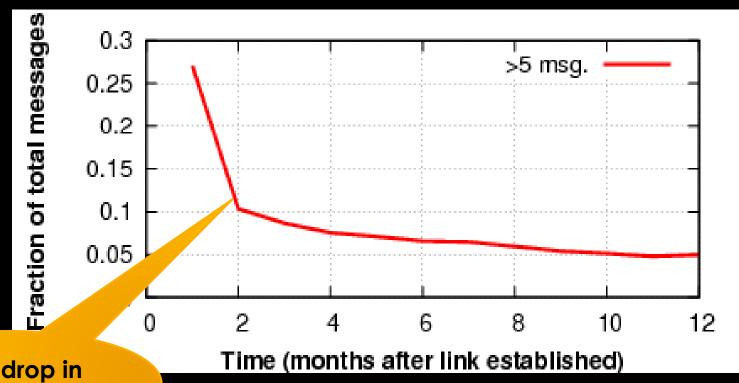
Implications of light chatters

- * Likely users who are acquainted with each other, though not close friends
- * Large fraction of such links to be considered while building applications
 - * E.g. Maybe not good for recommendation systems
- * OSN site features could cause interaction
 - * E.g. Birthday reminders

Heavy chatter patterns

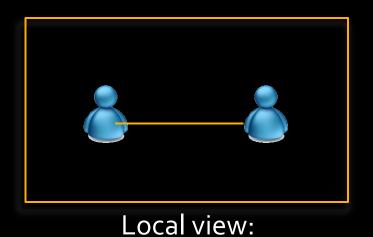


* How does the rate of interaction evolve?

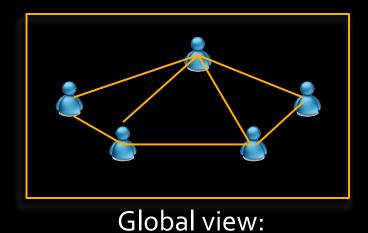


Sharp drop in interaction after 1 month

Rest of the talk



Evolution of pairwise interactions



Evolution of interaction network over time

Evolution of interaction network

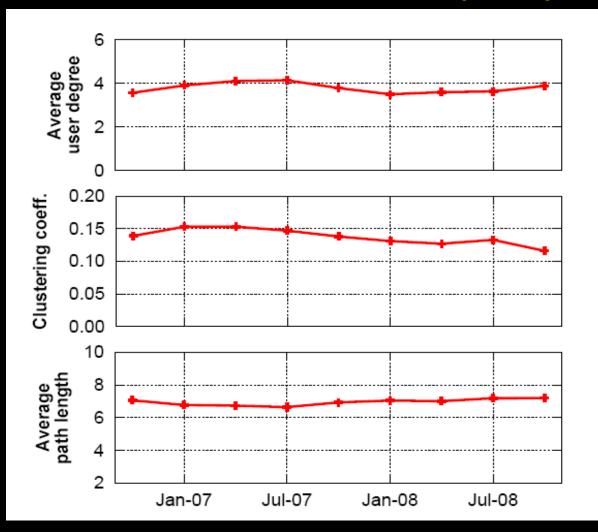
- * Constructed multiple snapshots of interaction network
 - * 30, 60, 90, and 180 days intervals

* We compare network properties of successive snapshots

Churn in the interaction network

- * Examine network at 3 months intervals
- * What fraction of links are not present in the next snapshot?
 - *55% [Min = 22%, Max = 61%]
- * What fraction of links were not present in previous snapshot?
 - * 27% [Min = 19%, Max = 31%]
- * In contrast, social network links hardly deleted

Evolution of structural properties



Summary

- * Many applications are built using social networks
 - * But social links mean many things
- * Idea: Use interaction to differentiate links
 - * Previous studies only looked at static snapshots
- * Examined both local and global properties of network
 - * Many links backed by very little interaction
 - Interaction network changes dramatically
 - * But, graph properties remarkably stable

Questions?

Data sets available at:

http://socialnetworks.mpi-sws.org