



Where is  
your  
homework?

Didn't you  
get it? I  
twittered it  
to you!



## New Opportunities for Students



# Properties of **twitter** Network Communications among Teenagers

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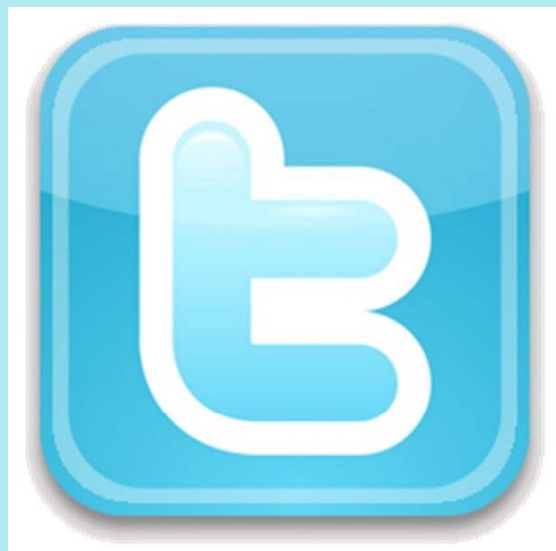
# Introduction

## Overview on Online Social Networks (OSNs)

- Over the past decade, **online social networking sites** (Facebook, Twitter, MySpace, Google+) gained widespread usage.
- This led to scientific study of OSNs as a revolutionary topic within computer science.



<http://www.facebook.com>



<http://www.twitter.com>



<http://www.google.com/+>



# Introduction

## Overview on Online Social Networks (OSNs)

### Before OSNs

-Theoretical studies of  
behavior of hypothetical  
networks

[Easley & Kleinberg 2010]



### Now

-Actual communications  
studied on various scales

[Jiang et al. 2010]

- Multidisciplinary applications in economics, business, advertising, psychology, and sociology



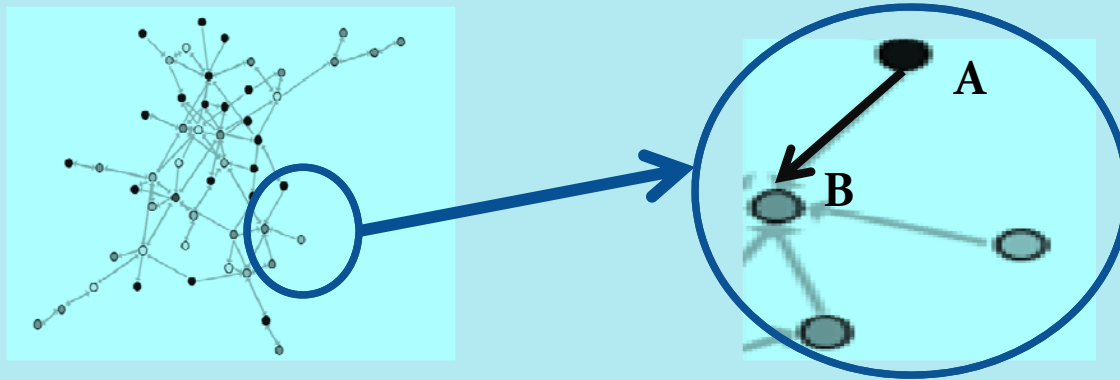
# Introduction-Twitter

- Twitter is an online **microblogging** communication system.
- Offers users the ability to interact with various members in their community.
  - A Twitter community can be defined in many ways;
  - The entire Twitter community, 500 million users, is the **Twittersphere** [Dungan 2012]
- Key terms of Twitter:
  - “**Tweets**”: short messages of 140 characters or less
  - “**Retweet**”: forwarding a tweet
  - “**Followings**”: the accounts a user follows (any accounts in Twittersphere)
  - “**Followers**”: the accounts that follow a certain user (any in Twittersphere)



# Introduction-Twitter

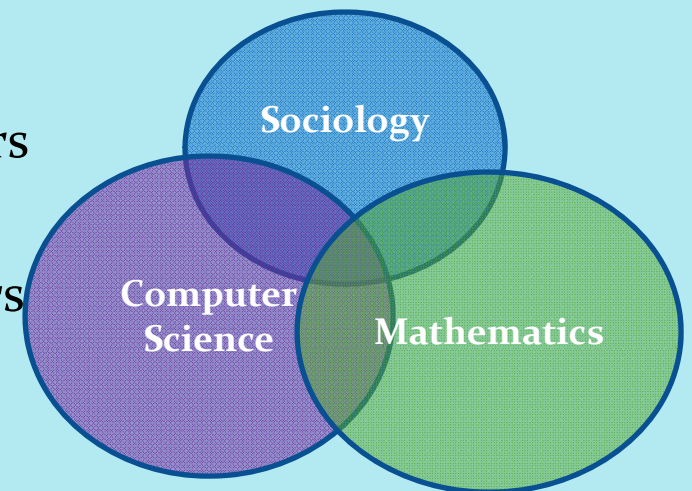
- Unlike other OSNs (Facebook, MySpace), Twitter offers a **directed relationship**; if user A follows B, B does not have to follow A.
- Twitter is an **open public** data site; information can be mined and found by anyone [Kwak et al. 2010, Ye & Wu 2010].
- Twitter has become a popular OSN among teenagers.





# Research Purpose

- Links between computer science, mathematics and sociology
- I study statistical properties of Twitter communications among a subset of closely-related teenager communities
  - Two groups each from distinct school districts of ~200 members each
- I analyze:
  - Characteristics of teenager communities
  - Comparisons with Twittersphere results
  - Tendencies of teenagers to interact with others who are like them
- I find applications in:
  - Identifying personalities of certain members
  - Characteristics of gender
  - Twitter; a news media oriented for teenagers
  - Advertising among teenagers





# Methods and Analysis Techniques

- Data collection methods
  - Codes accessing the data
- Data analysis techniques

From **probability** theory

- **Probability density function (pdf)**
  - *Probability that random member  $X$  has a property with value  $V$*
- **Complementary cumulative distribution function (ccdf)**
  - *Probability that random member  $X$  has a property with value greater than  $V$*

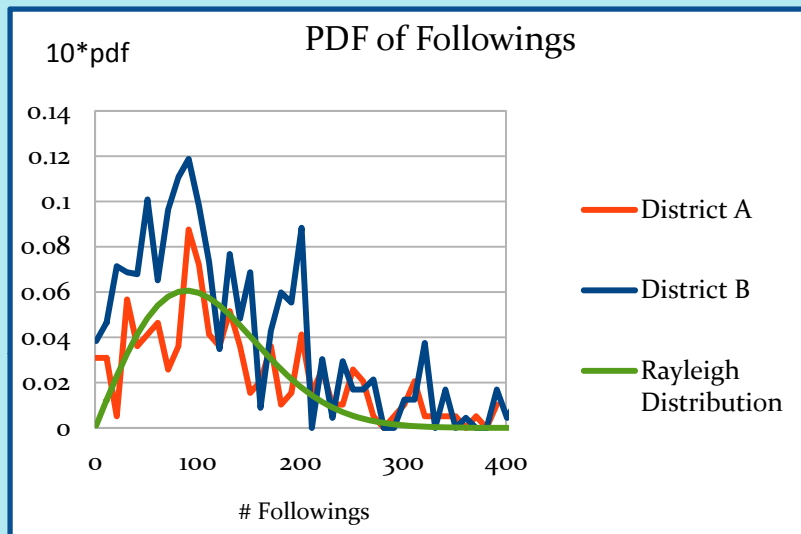
From **graph-network** theory

- Density
- Breadth First Search (BFS) method[Easley & Kleinberg 2010]
- Centrality

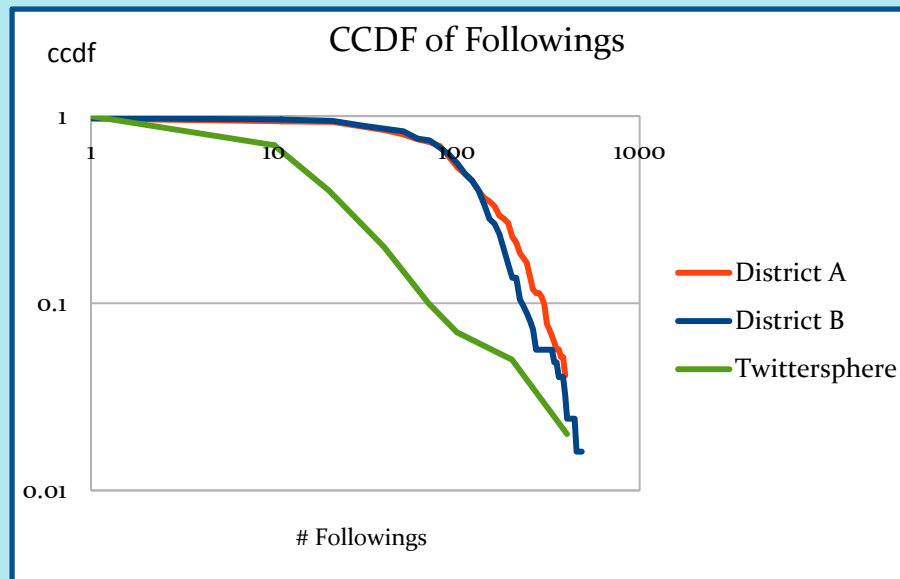


# Results

## Distribution of Followings



- Similar trends
- Followings pdf- **fluctuations** from classical Rayleigh curve
- Peaks at: 25, 45, 95, 135, 205 followings
- Dips at: 70, 125, 185, 220 followings
- Reflects groups of followings at certain sizes.



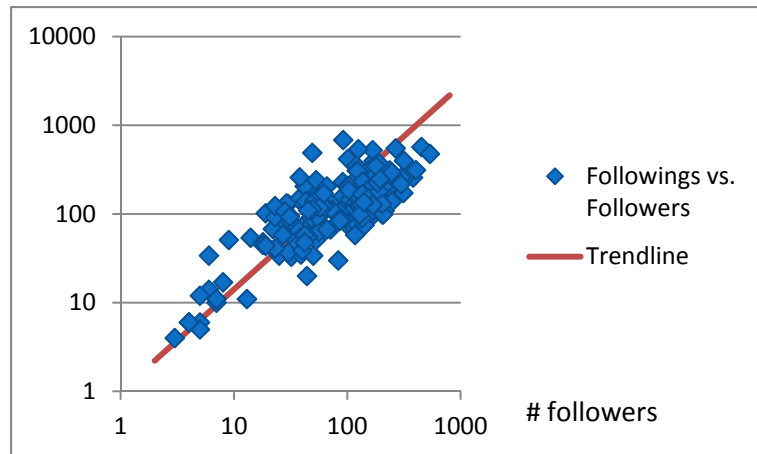
- Similar ccdf that differs from Twittersphere results [Kwak et al. 2010]
- A random teenager follows more users than a general population user.
- Results in a higher density of teenager networks and lower degrees of separation

# Results



## Correlation of Followers and Followings

# followings    Followings vs Followers



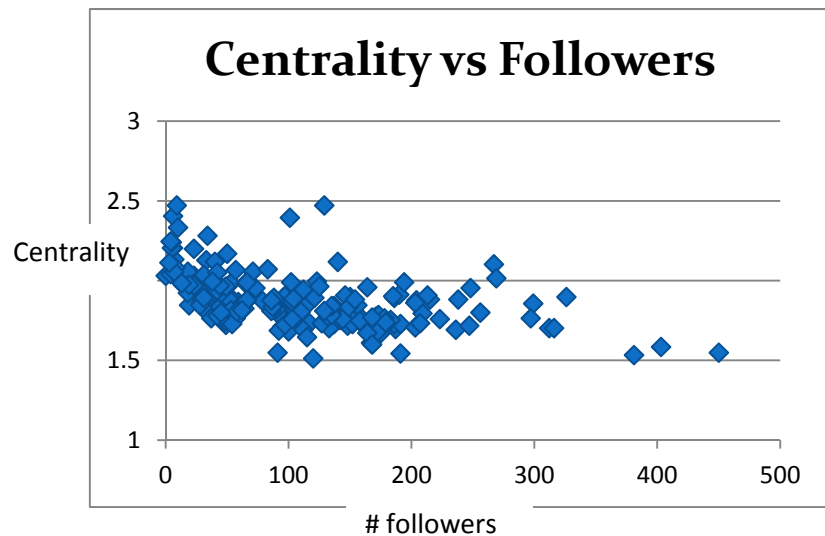
- # followers ( $fr$ ) correlates with # followings ( $fg$ )
- Trend line:  $fg \sim fr^{1.15}$  (power law)
- Favorites =  $.32(\text{Tweets})^{.95}$
- Active users tweet more often and also favorite more tweets



# Results

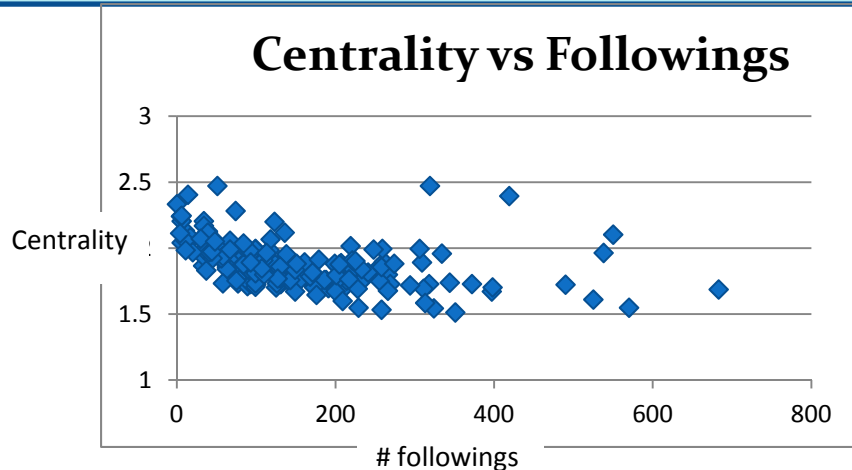
## Centrality and Personality

**Centrality vs Followers**



- In general communities: centrality ranges 1 - large #'s
- Theoretical centrality for this group: ranges 1 - 193.
- Actual centrality: ranges 1.5 - 2.5

**Centrality vs Followings**

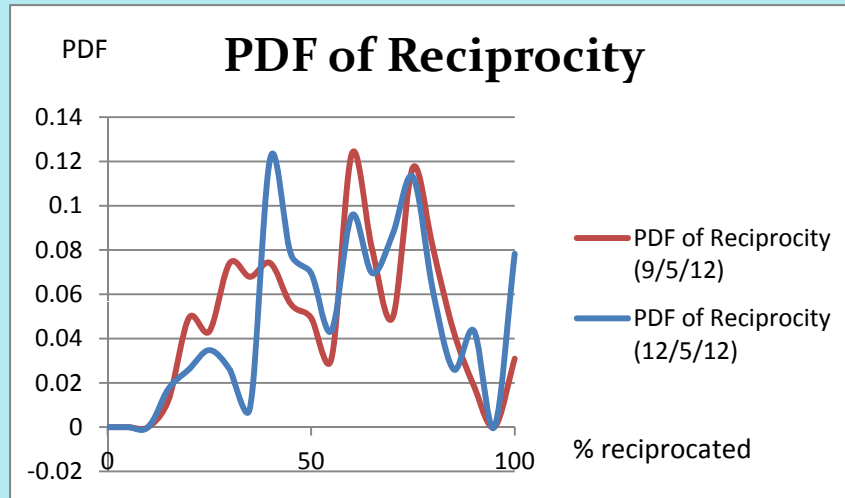


- Centrality is directly related with # followers and # followings.
- A large number of both followers and followings hints at an **extrovert** personality [Adali et al. 2012].

# Results



## Temporal Reciprocity

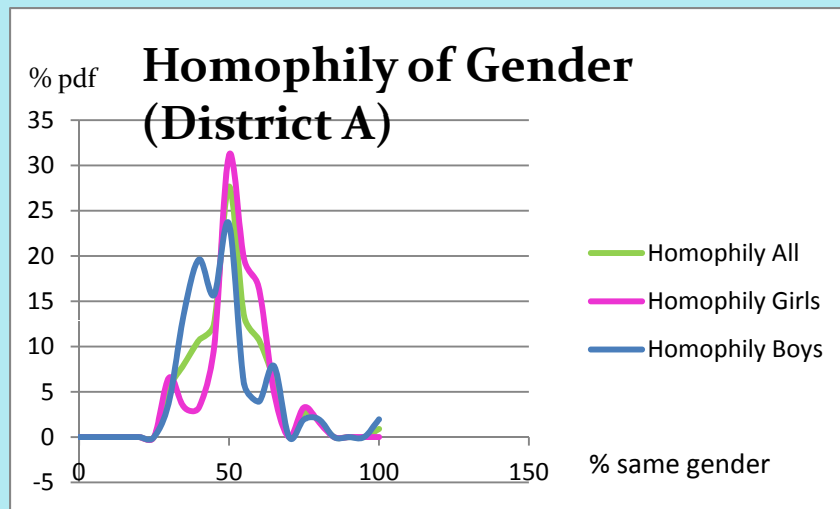


- **Reciprocity** occurs when user A follows B and B follows A back.
  - Earlier date: before school started;  
later date: middle of school year
  - Later date reflects shift towards higher end of pdf
  - Represents higher % reciprocity
  - Expected temporal quality
- 
- Large amounts of reciprocated friendships hints at actual friendships
  - ~67% of general Twittersphere have no reciprocated friendships, [Kwak et al. 2010]

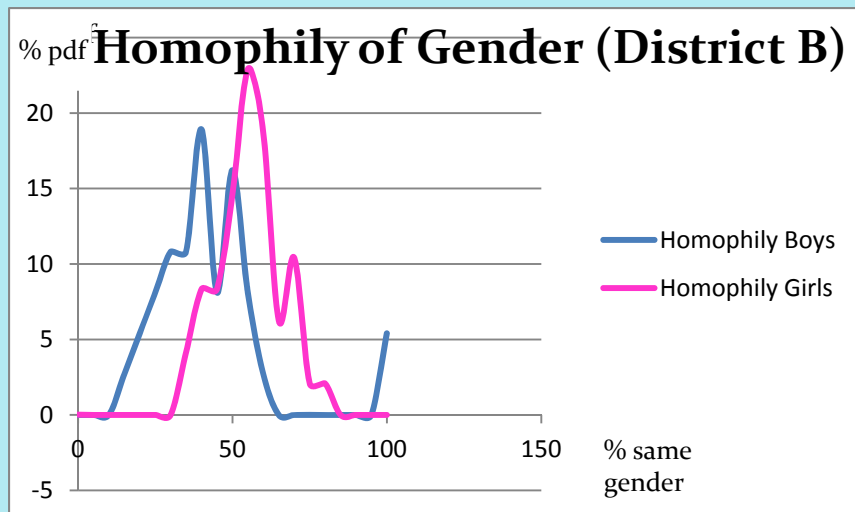
# Results



## Homophily of Gender



- **Homophily**: people who are alike will become friends
- Equal number of girls and boys studied
- Girls follow slightly more % other girls than boys follow % other boys.
- Shown by shift of pink towards higher end and blue spread more evenly.

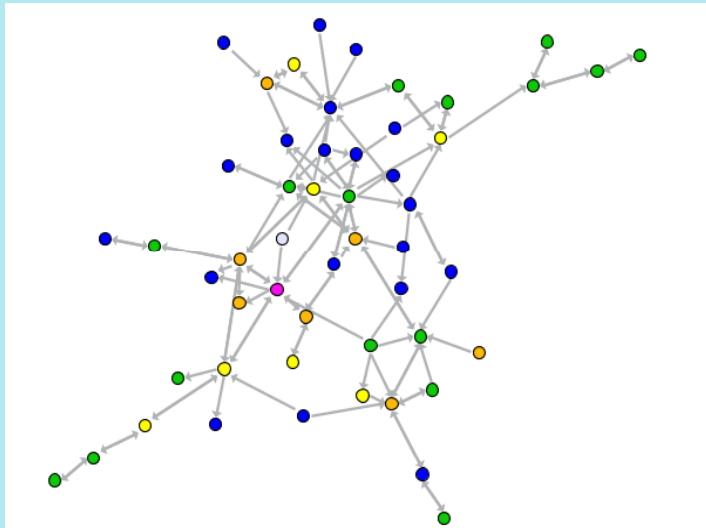


- Homophily of gender in followers is ~52%.
- Links to sociology which shows that girls are more cliquey than boys at teenager level [Ennett & Bauman 2000]
- No such general results exist.

# Results



## Homophily in # followers



- 1-50
- 51-100
- 101-150
- 151-200
- 201-250
- 251-300

- **Close friendship**: a directed friendship where user A “mentions” B
- Density of close friendship graph:  $\sim 1\%$ ; density of all followers:  $\sim 17\%$ .
- Results from people talking to some of their followers only.
- This NWB graph shows close friendships of a small random sample.
- Graph is color-coded based on # followers.
- People with similar # followers communicate.
- **Triadic closure**: if user A is friends with B and C, then B and C are also friends.

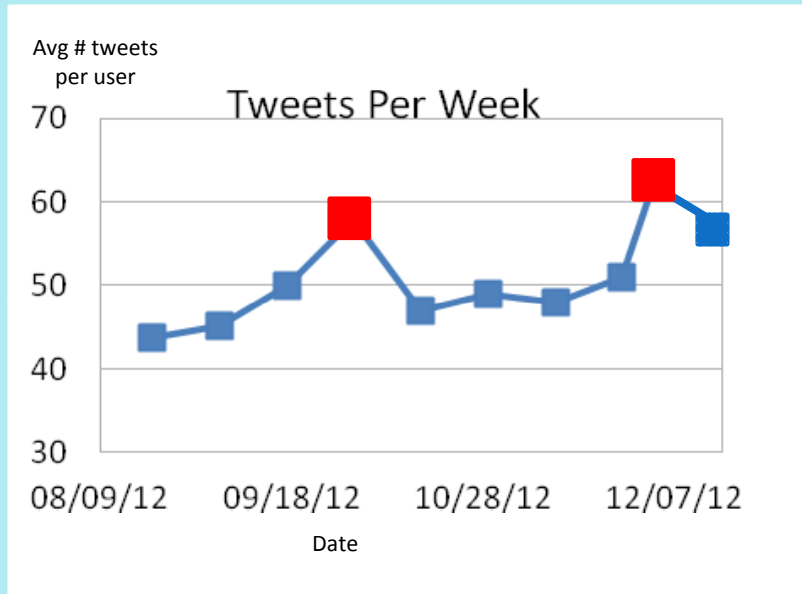
# Results



## Additional Observed Trends

- Degree of separation (dos):
  - # of steps that separates members in the network
  - Within these dense, closely-related communities, dos  $\sim 2$
  - Within a tweet and retweet most of community receives a message
  - General dos in Twittersphere  $\sim 4$  [Kwak et al 2010]
- Privacy setting
  - 12% teenagers studied use privacy setting
  - 61% of which were female
  - Only  $\sim 6\%$  private accounts in the Twittersphere [Moore 2009]
  - Reflects cautiousness of teenagers, especially among females
- $\sim 50\%$  of a teenager's followers attends school with him

# News Media



- Two peaks in number of tweets per week
  - 1) Week of presidential debate and school dance
    - Debate: ~270 tweets
    - Dance: ~600 tweets
  - 2) Tragic event involving local teenagers
    - ~90% of tweets during that day



# Conclusions



- Unique teenager properties:
  - Community followings pdf show fluctuations
  - More # followings than # followers
  - Large % reciprocated relationships (real friendships)
  - Central members: many followers and extroverts
  - Females: slightly more friendly with other females
  - Teenager networks: formed based on school district (dense)
  - Teenagers are more cautious than other users

# Applications



- Specific **personality traits** and influence on community
  - Done by analyzing centrality in community (extrovert)
  - In terms of school, this also relates to degrees of popularity
- Differences between **cautiousness** of males and females
  - Increase probability of inferring gender
  - Can be used for advertising
  - Future work: try to distinguish more accurately between males and females

# Applications



- Determine whether social bullying or harassment is occurring
- Information **flows quickly** through Twitter
  - Especially in teenager setting because of high density (dos ~2)
  - Can be used to spread information/news to community
  - Rumor can be traced back to the member who started it.
- Teenagers use Twitter as **social media**
  - Pertinent [teenagers] news travels quickly
  - I.e. in recent, local tragic events, Twitter was used as a media, to transfer information
  - Teenagers, alone, outreached to famous athletes by trending tweets on Twitter
  - Shows strength, power, and support of teenager community through use of Twitter

# Future Work



- Future work includes:

- Studying properties of more specific actual communications between members of the community (i.e. repeated words, topics of interest)
- Finding distinguishable characteristics between males and females
- Tracing retweet trees to further understand mechanisms of information spread
- Determining subgroups within the tightly connected communities with homophily
- Conduct comparisons with additional teenager communities to further solidify the trends found.



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Thank you for your attention!

