



# Dynamics of communication

## in a mobile phone social network

- first results

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# Social networks: from friendships to the scale of societies

friendships



groups, communities



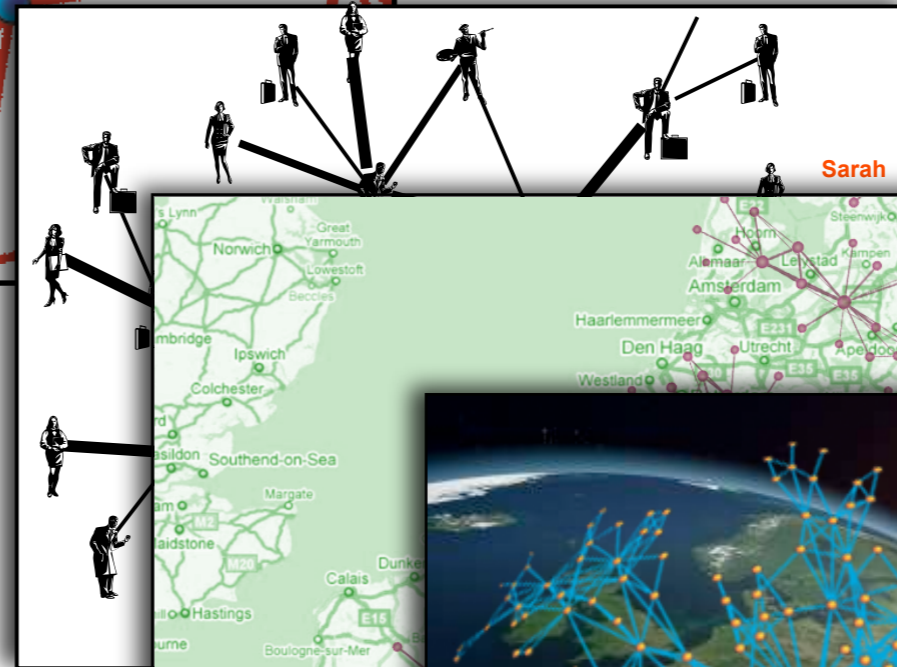
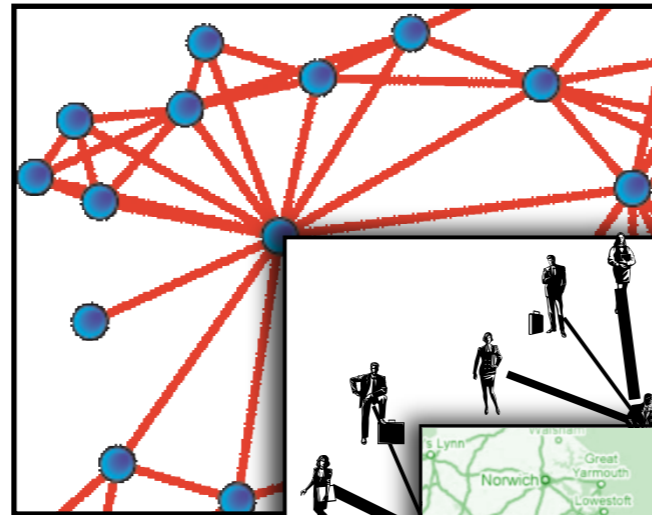
networks of communities



societal-level networks



world-wide networks



Electronic databases

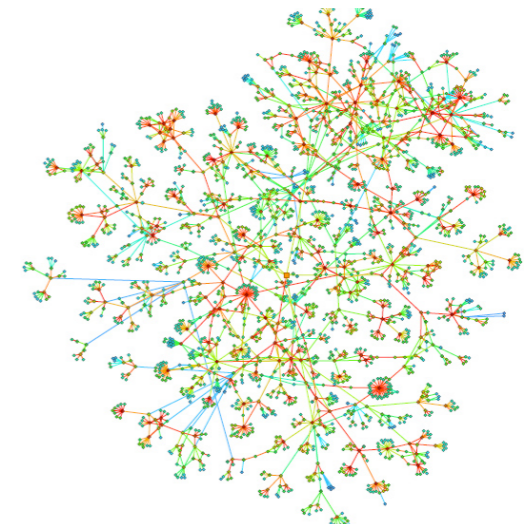
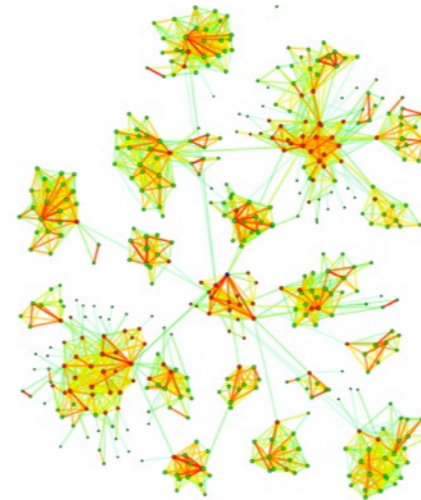
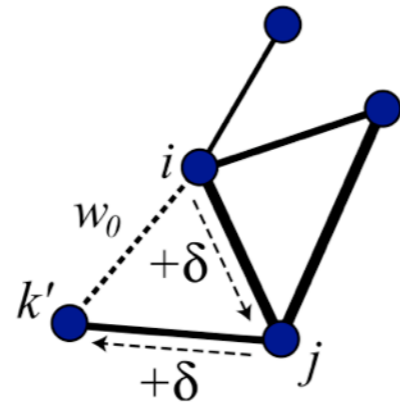
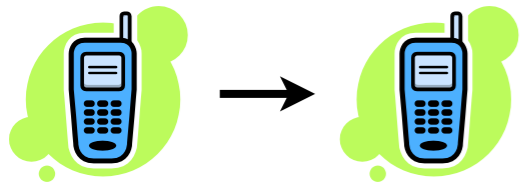
Computer speed

Science of  
complex systems

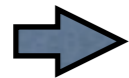
Social sciences

Computational  
social science

# Time scales in social networks



Social  
interaction  
events



Dynamics  
of ties

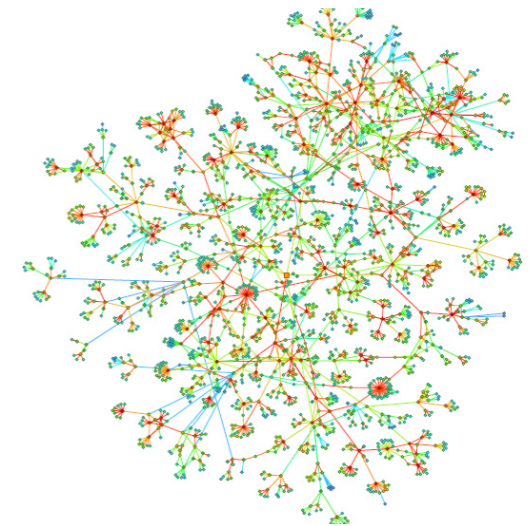
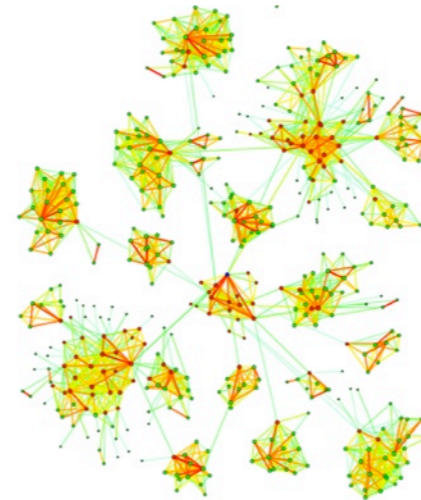
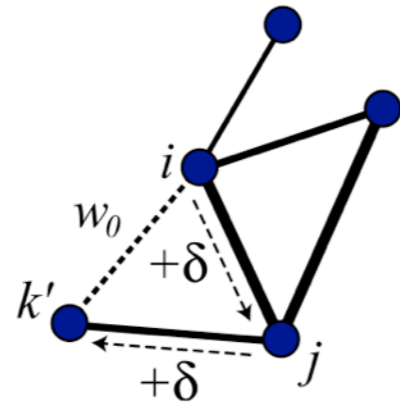
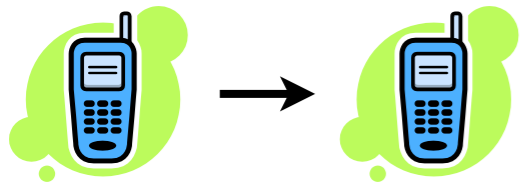


Dynamics  
of groups



Network-level  
dynamics

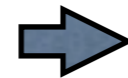
# Time scales in social networks



Social  
interaction  
events



Dynamics  
of ties



Dynamics  
of groups



Network-level  
dynamics

“How does the microscopic translate  
into the macroscopic?”

# New possibilities for research

- **Individual social interaction events**  
**= the “atoms” of human relationships**
- Electronic databases where interactions (calls, emails, etc) are time-stamped allows studying the dynamics of these atoms
- From a macroscopic point of view, how do the dynamics of communication events affect the whole social network?

# Our data

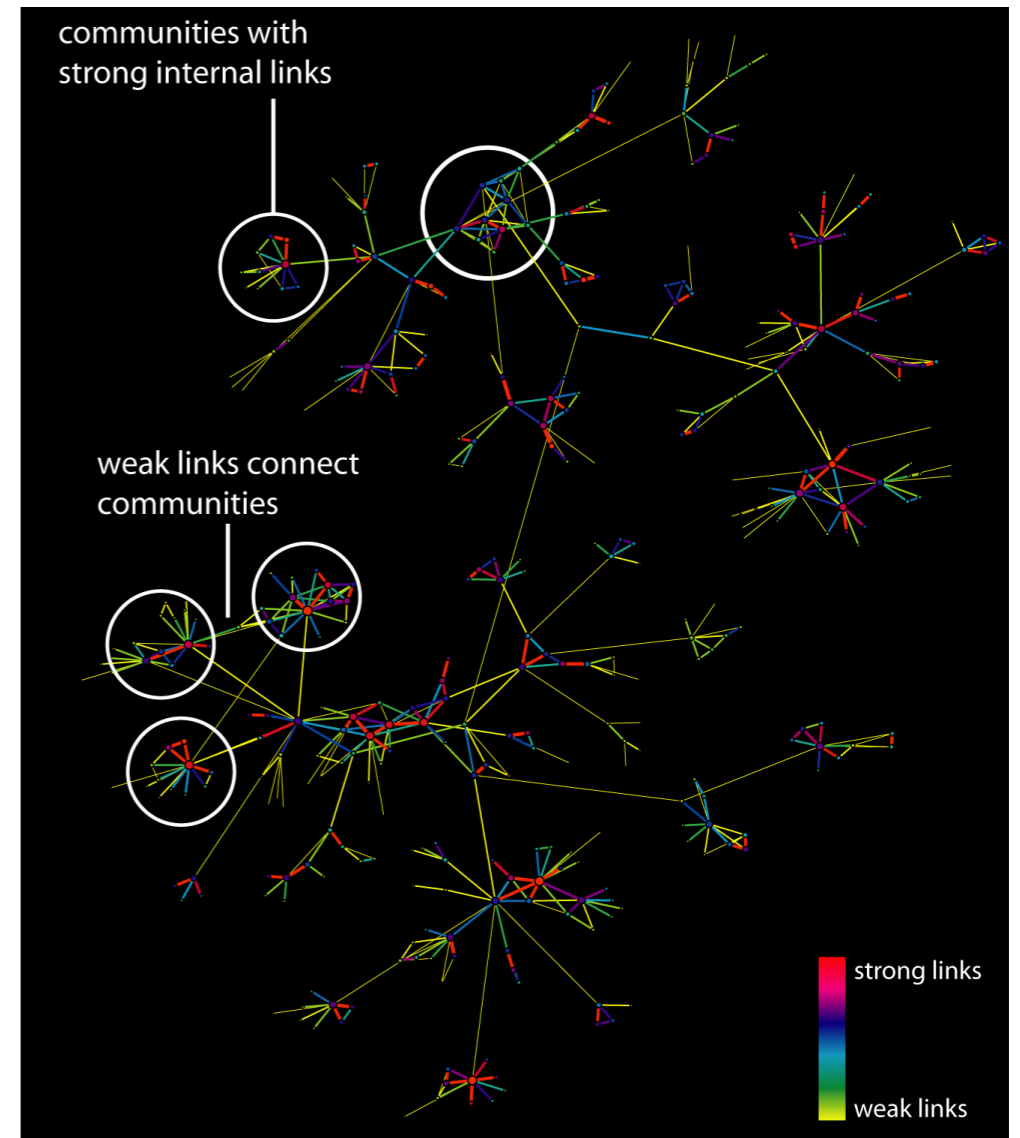
- **Mobile telephone call records of ~7 million individuals**

- Caller/callee, SMS sender/recipient
- Time stamp
- Only customers in the operator's base (market share ~20%)
- **ANONYMIZED**



- **Earlier network observations:**

- Weak links crucial for connectivity
- Strong links associated with dense neighbourhoods (communities)
- This structure slows down information spreading

- Proc. Natl. Acad. Sci (USA) **104**, 7332 (2007), New J. Phys. **9**, 179 (2007)



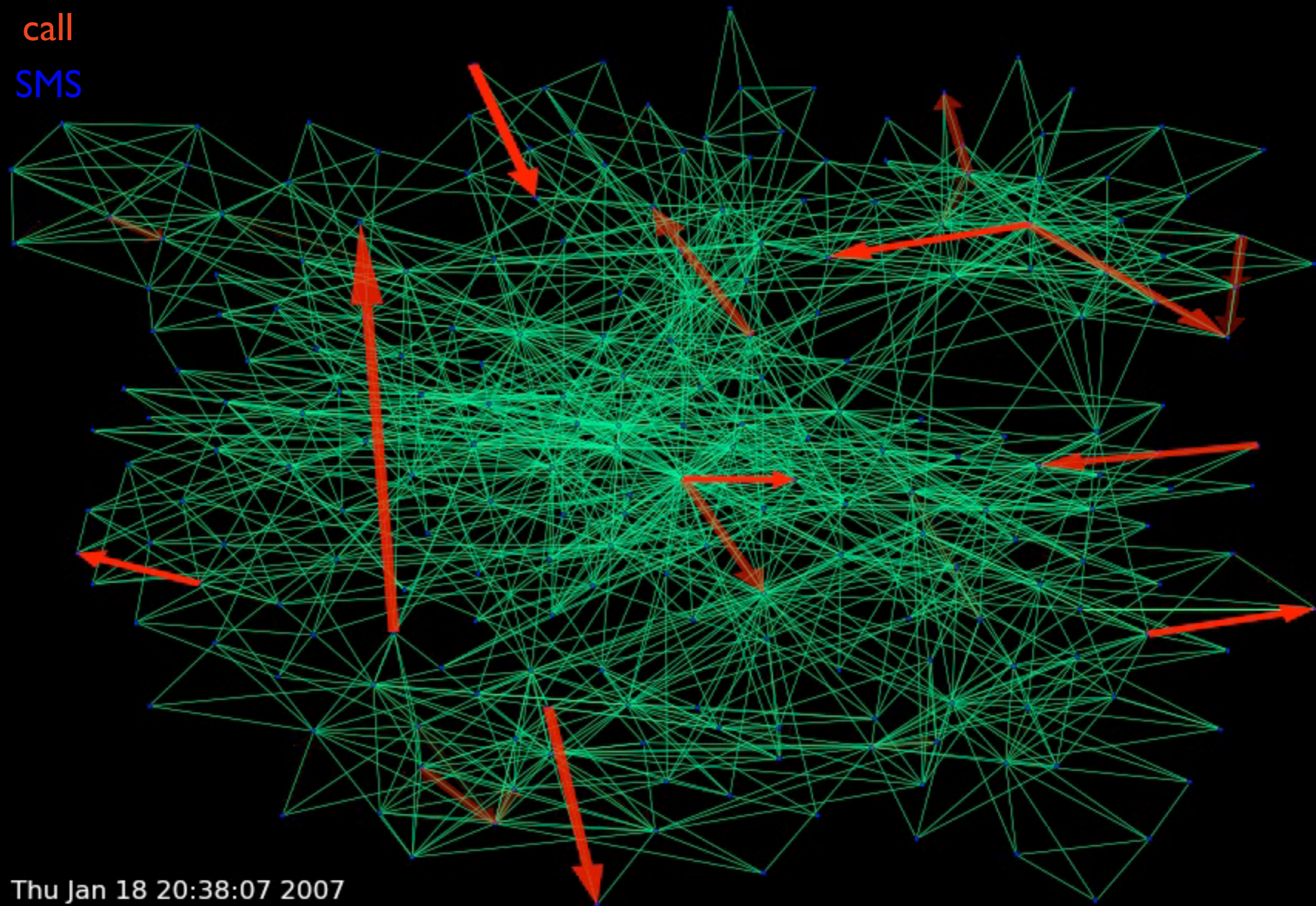
# Calls and text messages within a social group

 call  
 SMS



# Calls and text messages within a social group

→ call  
→ SMS

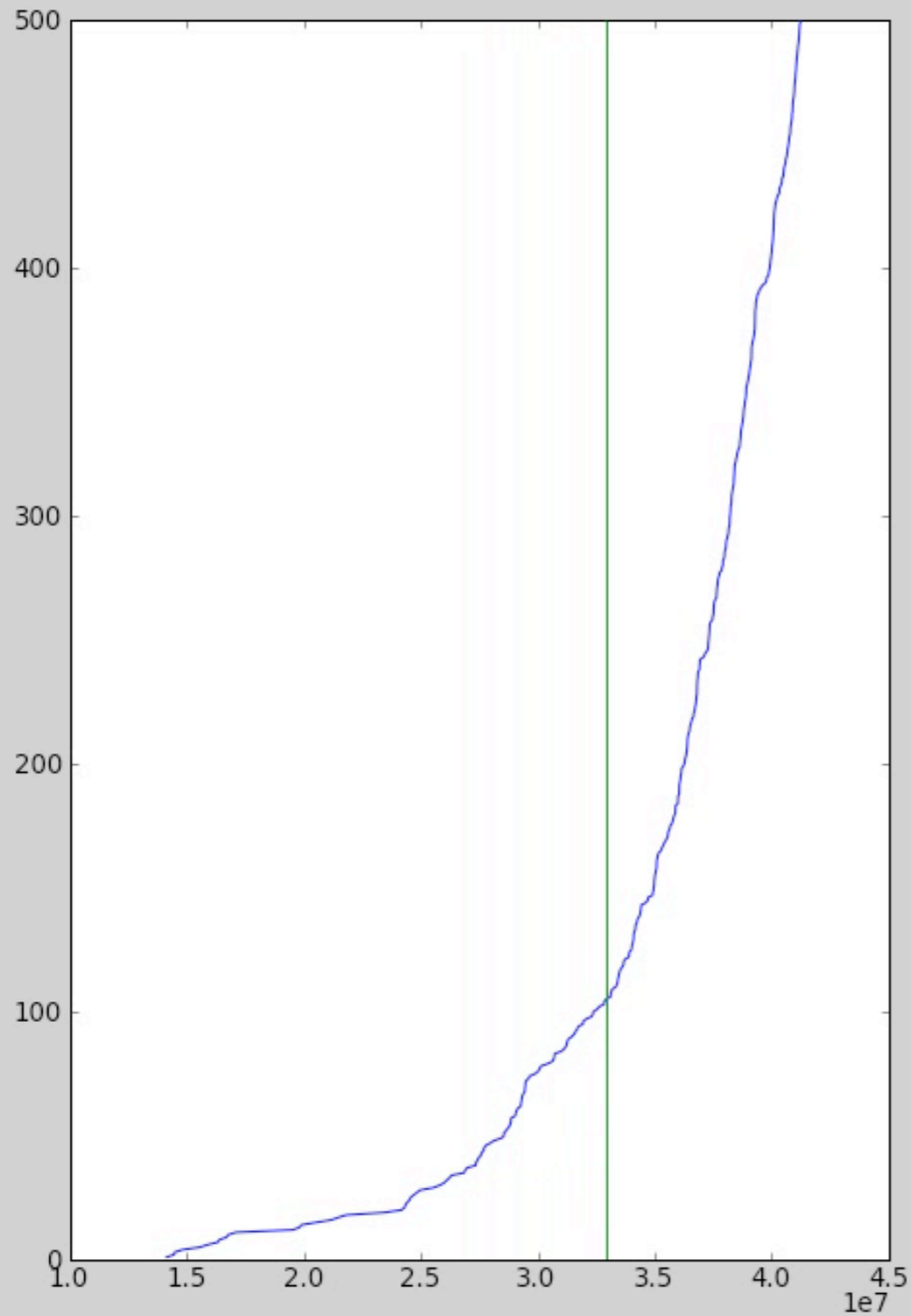


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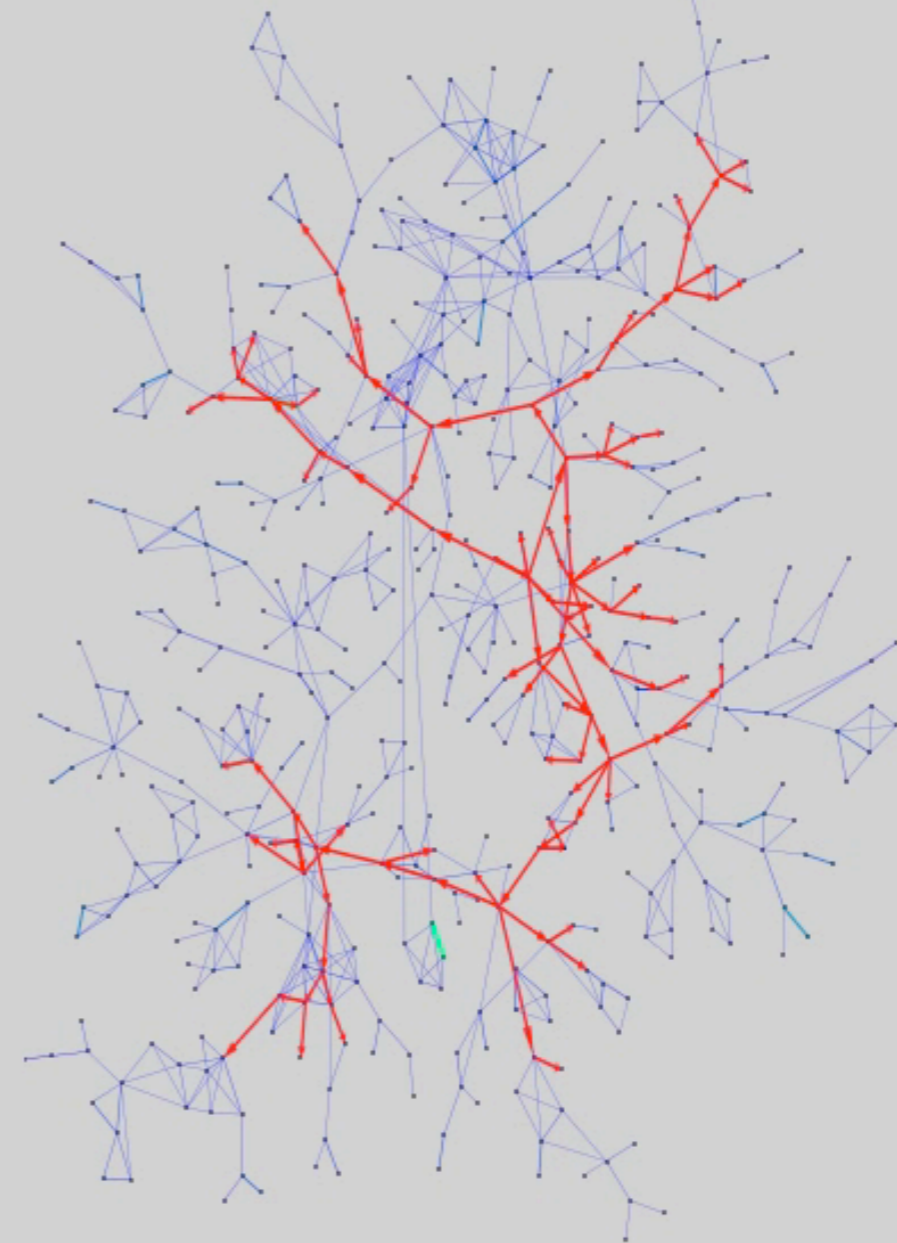
# Simulation: rumour spreading in part of the network

“The rumour” spreads through this part of the network in 4 days

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# Ongoing work: motivation

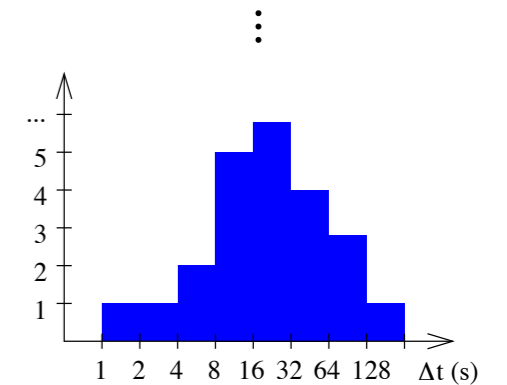
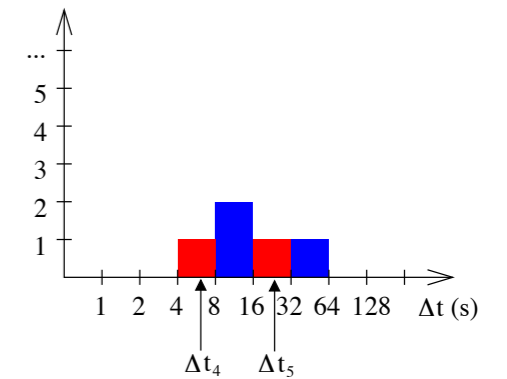
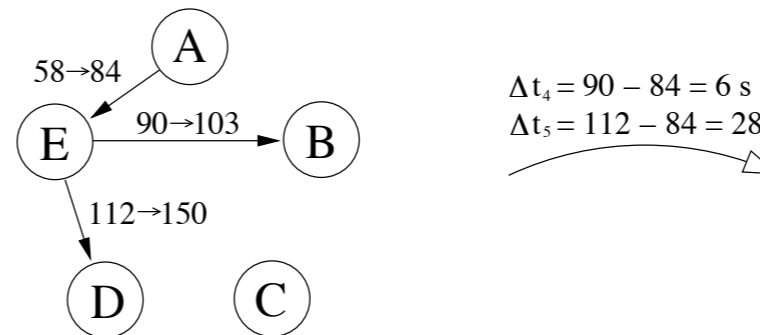
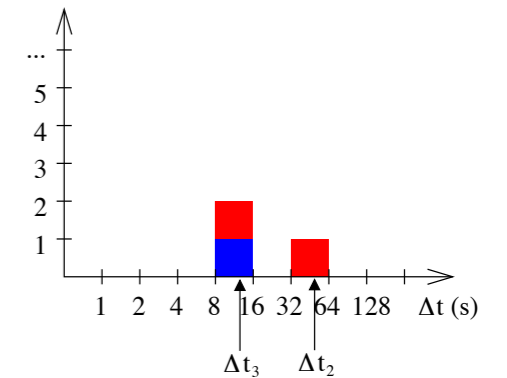
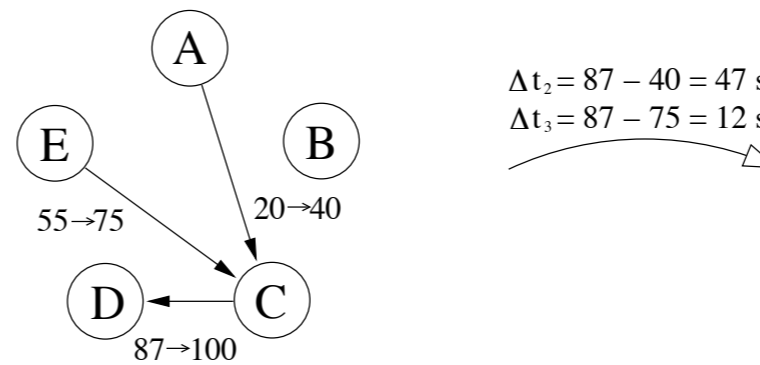
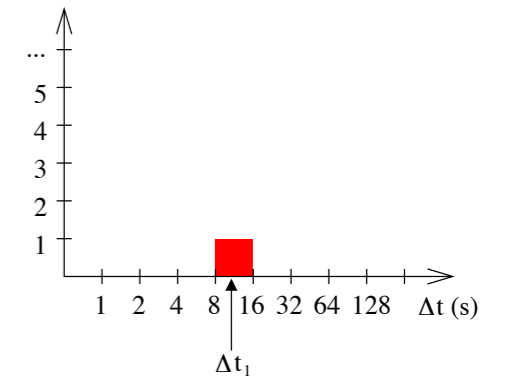
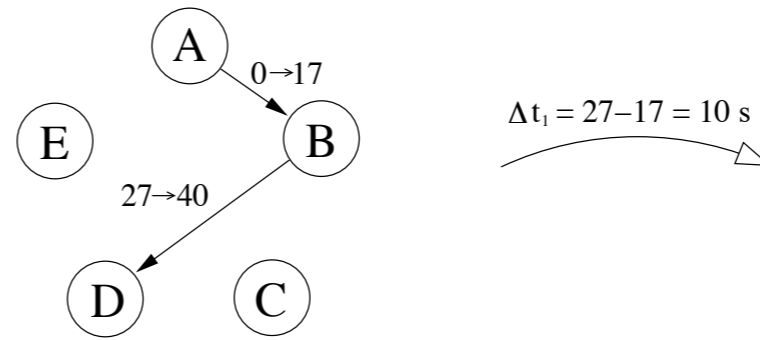
- Focus on dynamics of “social atoms”, i.e. individual calls and text messages
- Detect and characterize short-time-scale patterns and correlations
- Begin with the level of individuals
- Then link observations to group structure and dynamics
- Also link observations to network-scale dynamics

Q1:

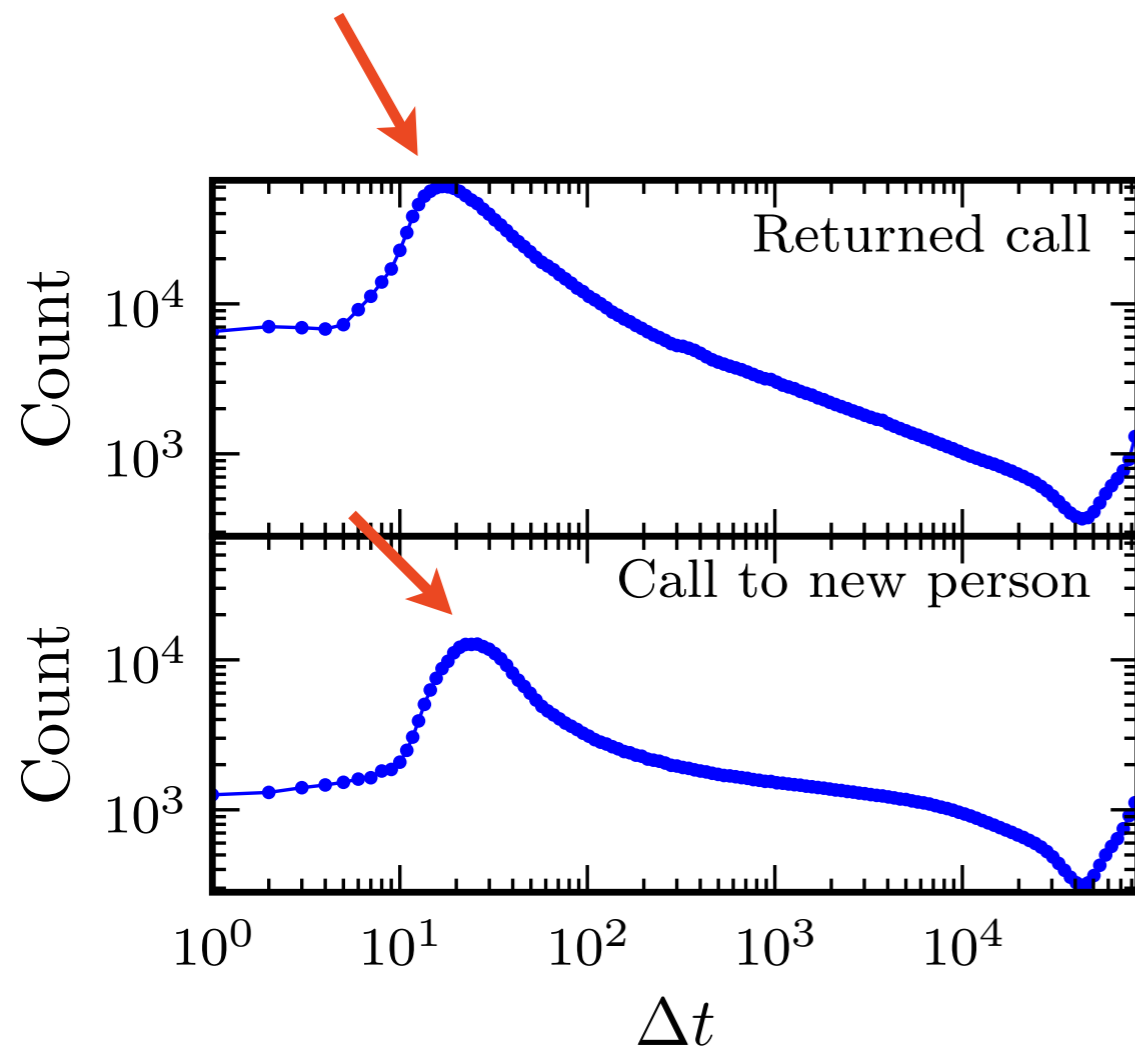
Are the actions of  
individuals related?

# Action triggers

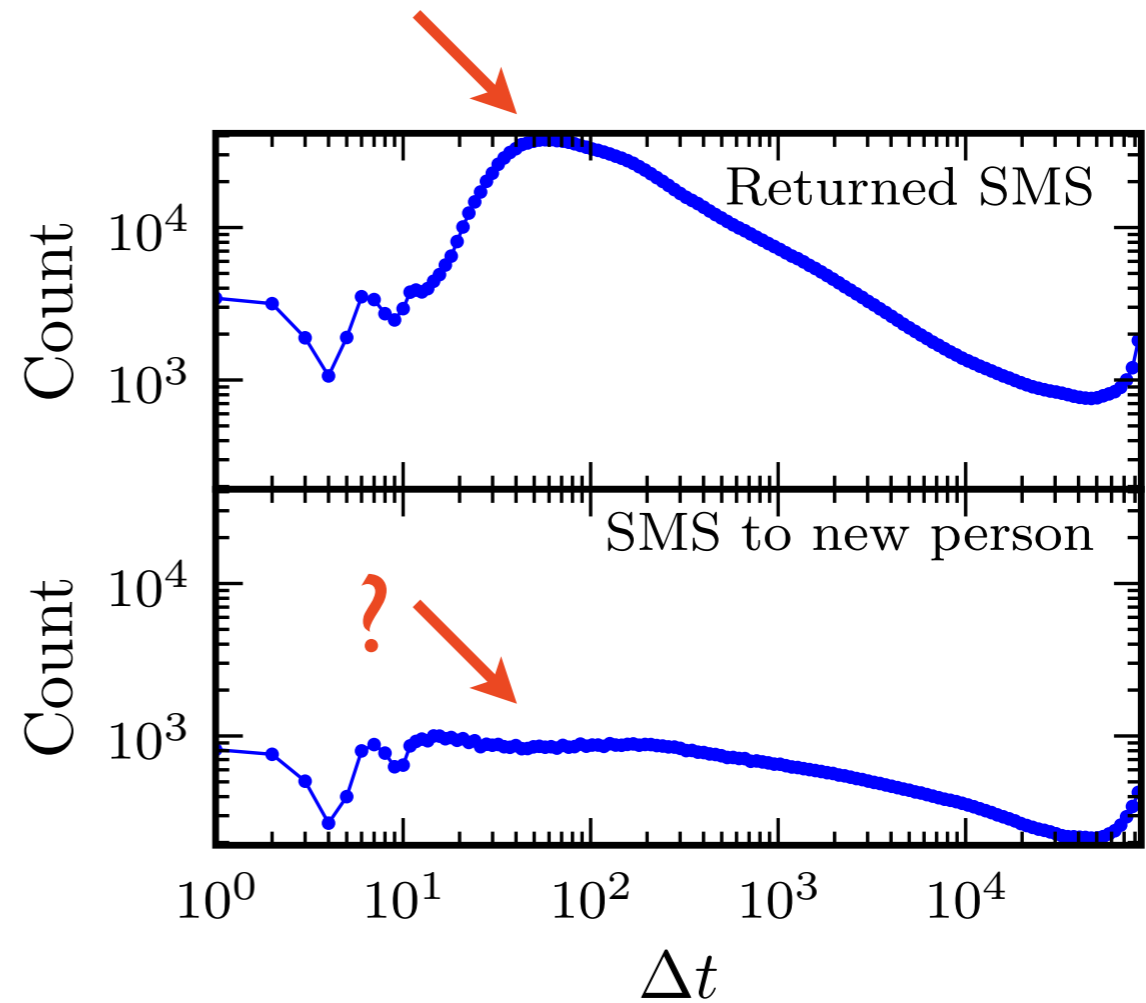
- Motivation: detect “causal” chains of A calling B, who then calls A or C
- Construction:
  - take an outgoing event ( $t=t_2$ ),
  - take earlier incoming event(s) ( $t=t_1$ ),
  - increase event counter at  $\Delta t=t_2-t_1$
- Do this for all outgoing events



# Action triggers: results

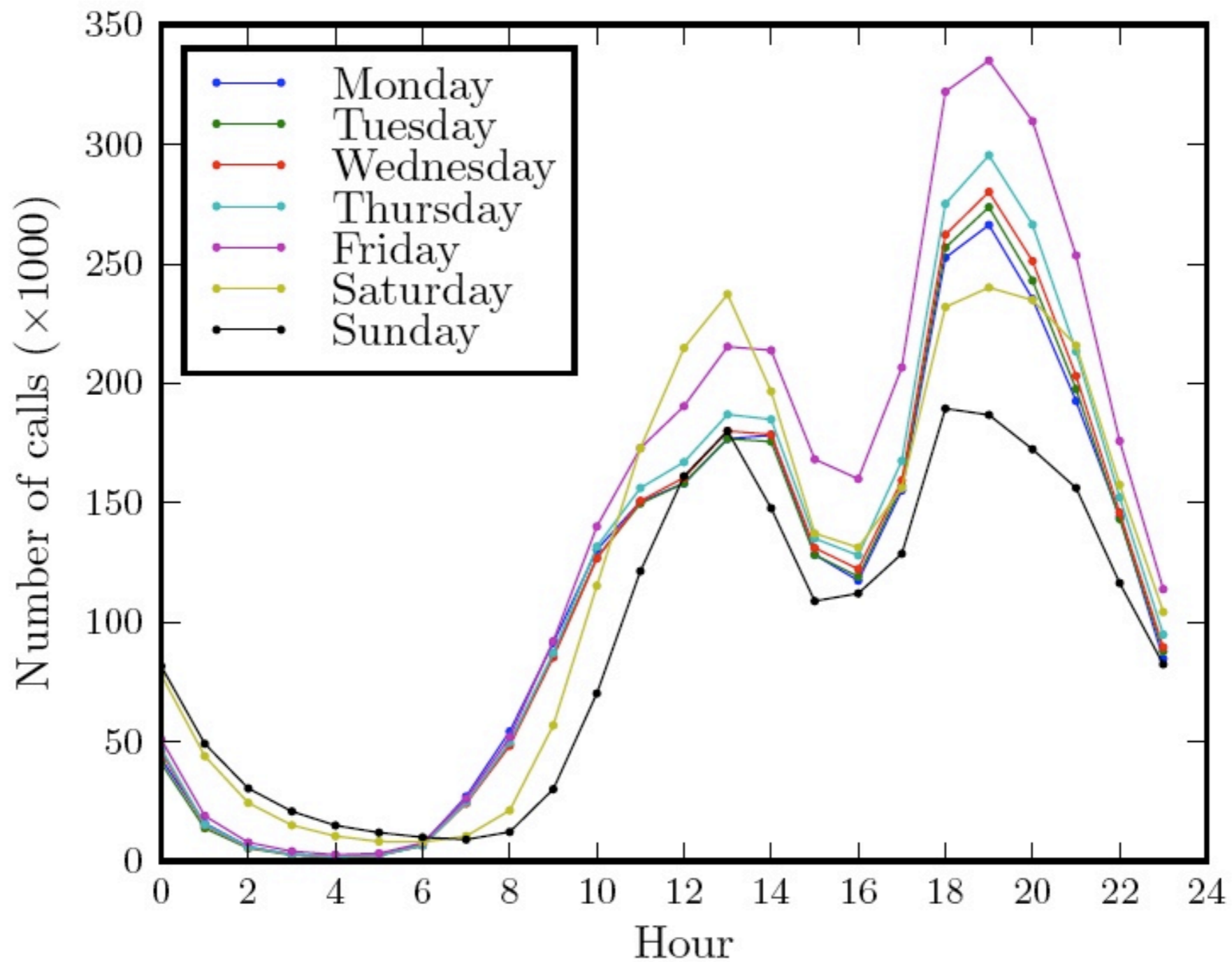


Calls trigger calls,  
peak  $\sim 20 - 30$  seconds



Txt msgs mainly trigger  
returned msgs

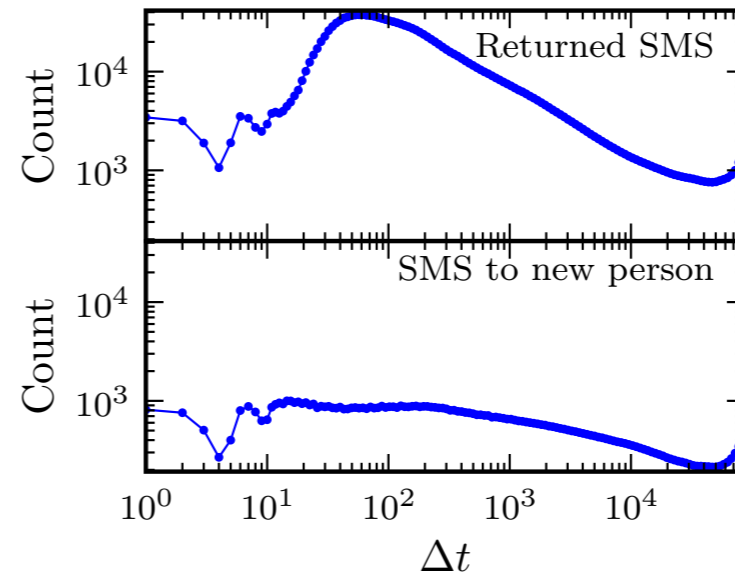
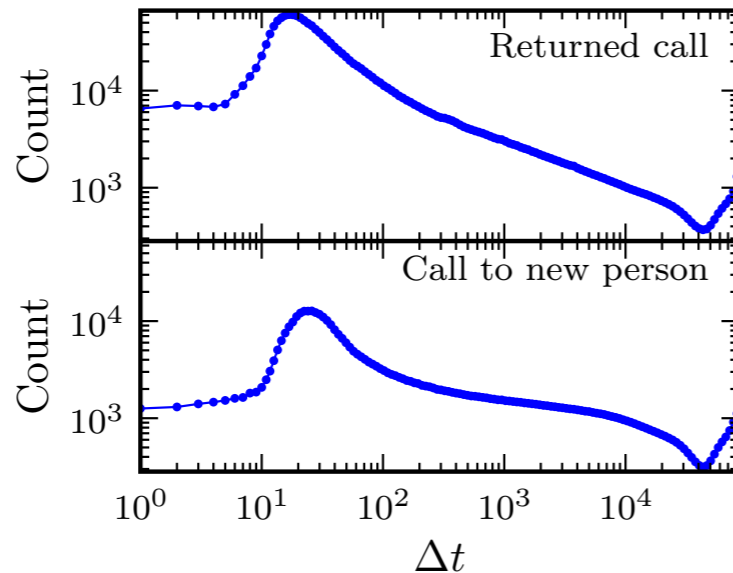
# Daily variations: a possible cause?



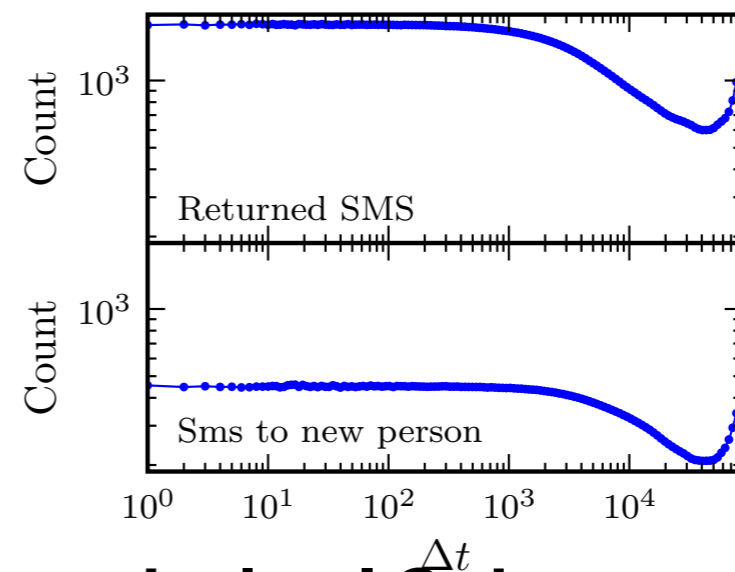
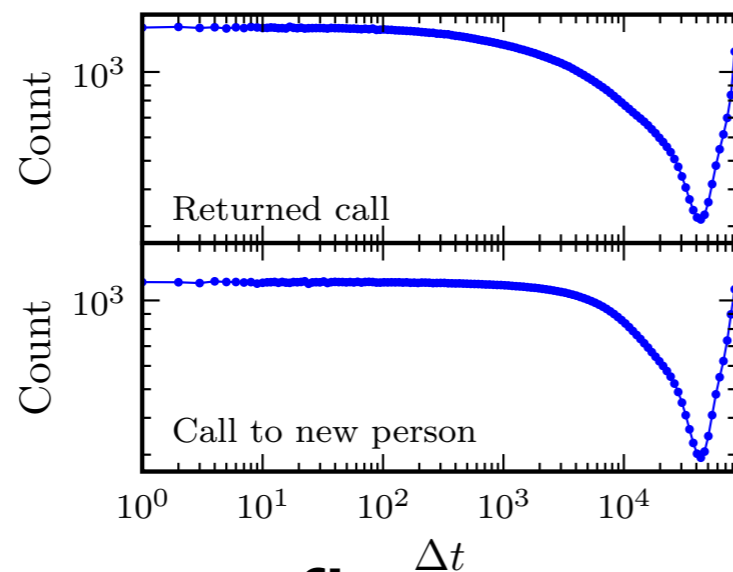


# Action triggers: reference

Actual



Reference:  
days  
randomized,  
times kept



References flat except for daily 12-hour-cycle  
so daily patterns are not the cause.

# Further observations

- There is a statistically significant number of patterns involving many phone users: A calls B calls C calls A etc
- One can view these patterns (ABCA etc) as evidence of information being processed and transmitted in the network
- Such patterns have very important effects on HOW information flows through the network
- ...details to be published later...

Q1:

Are the actions of individuals  
related?

*Yes, incoming calls/texts trigger  
outgoing calls/texts in very short  
time*

**Q2:**

**Are social ties balanced  
in terms of communication?**

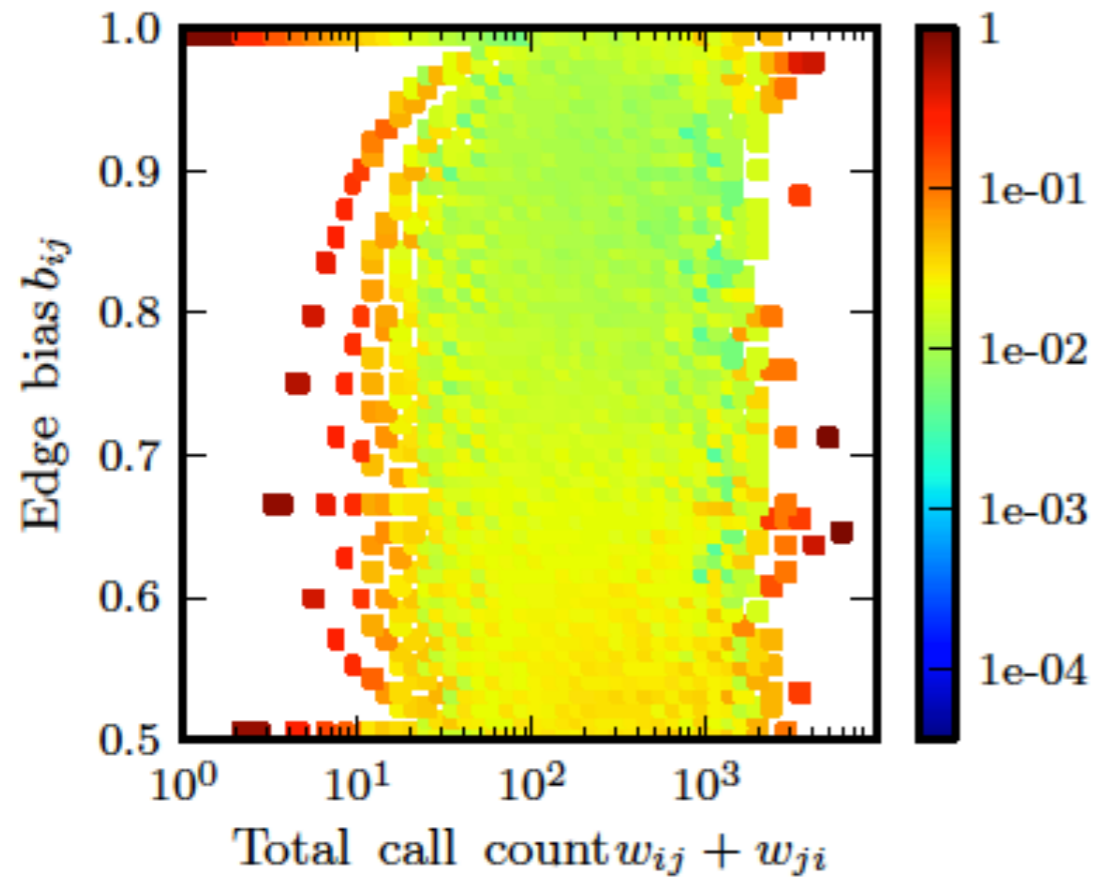
# Reciprocity of ties

- In a social relationship, who initiates communication?
- Does one party call the other more frequently than the other?
- Define  $w_{ij}$  as the # of calls from  $i$  to  $j$ , and  $w_{ji}$  as the # of calls from  $j$  to  $i$
- The *bias* of a tie can be written as

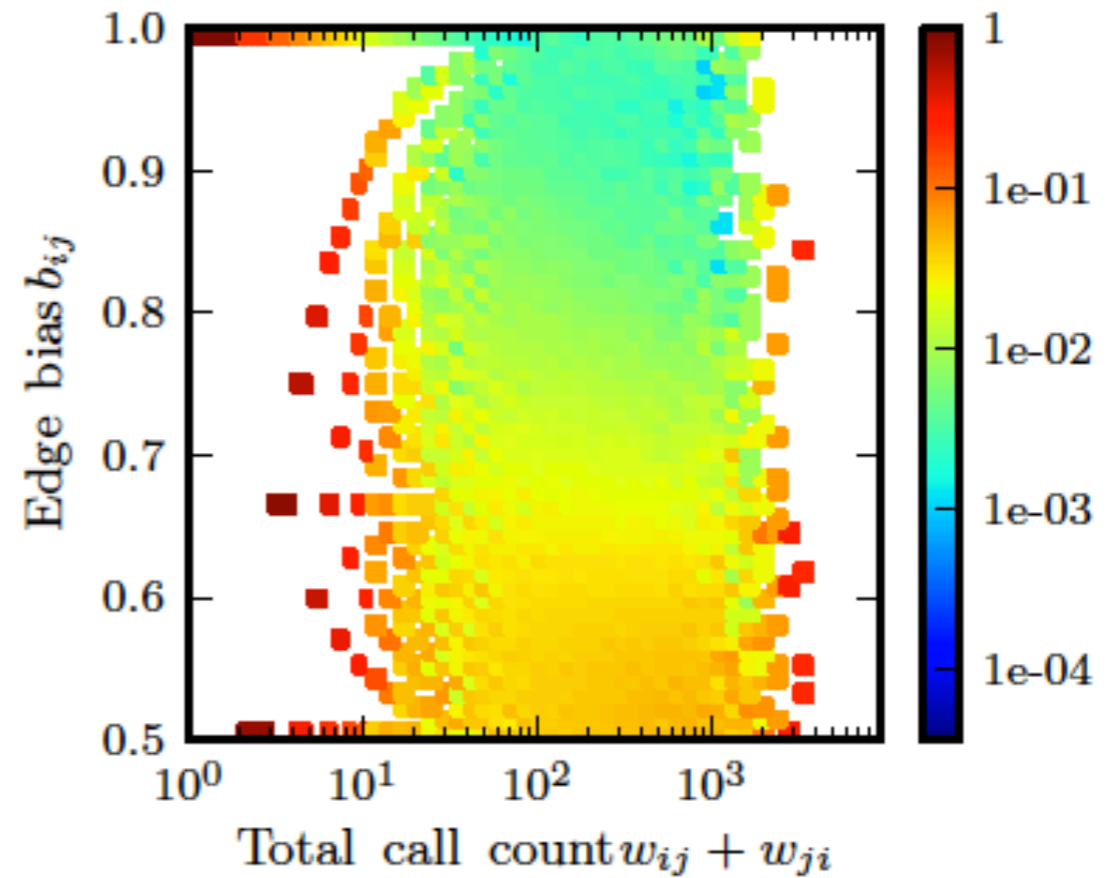
$$b_{ij} = \frac{w_{ij}}{w_{ij} + w_{ji}}$$

[Reciprocity of mobile phone calls](#), L. Kovanen, J. Saramäki, and K. Kaski, *Dynamics of Socio-Economic Systems*, in press (2010), arXiv:1002.0763

# Reciprocity of ties: bias



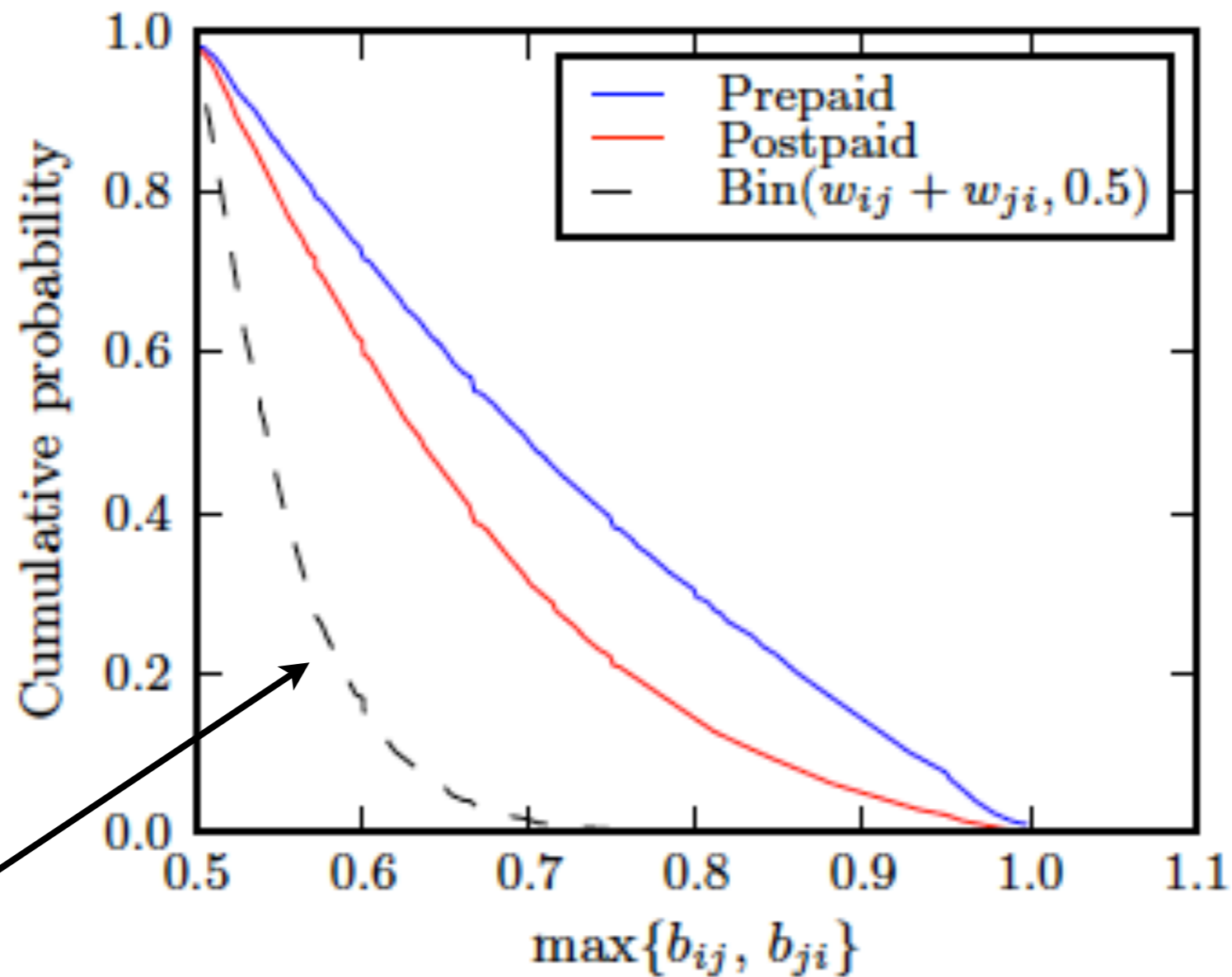
(a) Prepaid



(b) Postpaid

significant number of “uneven” ties  
with large bias values

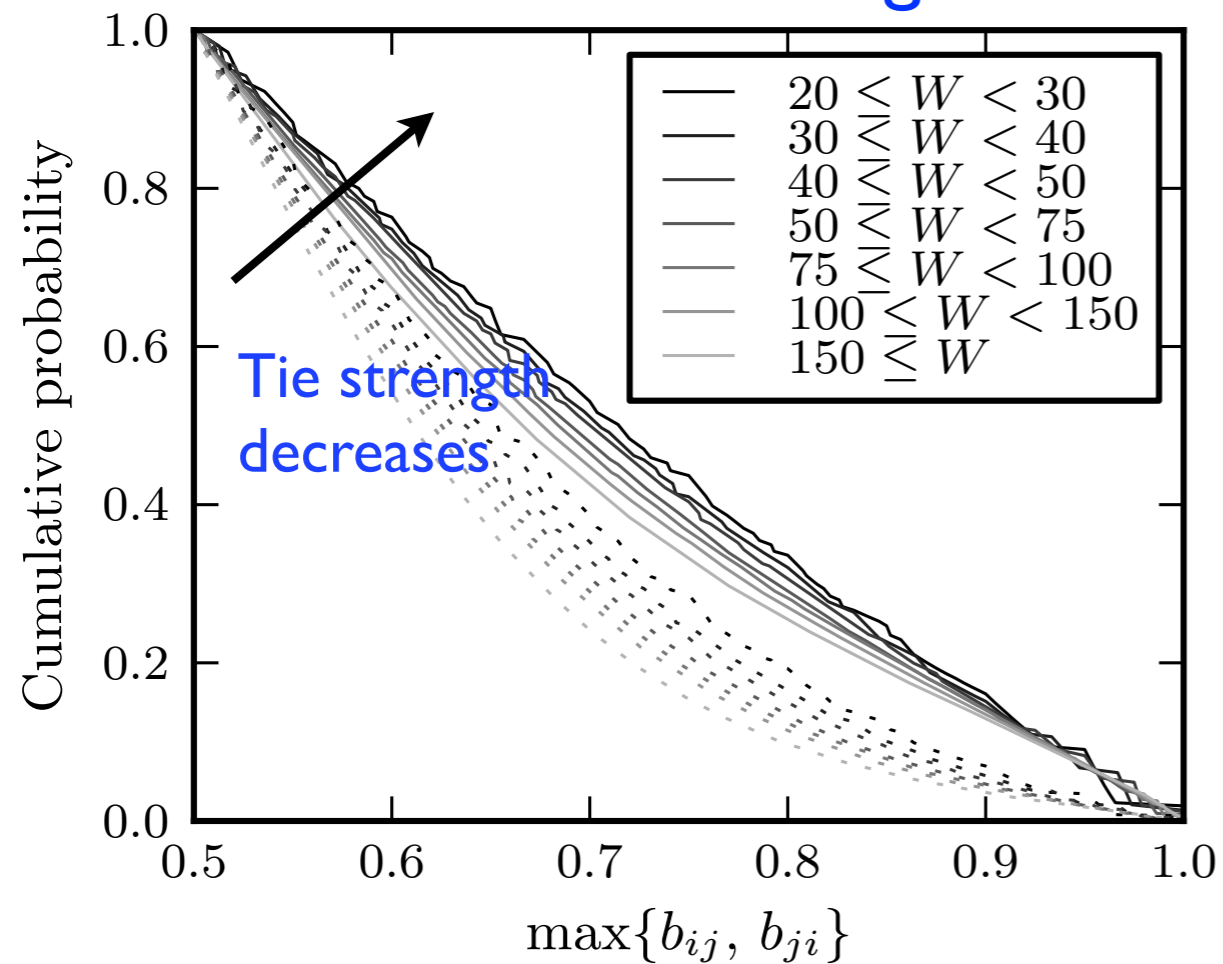
# Bias vs random chance



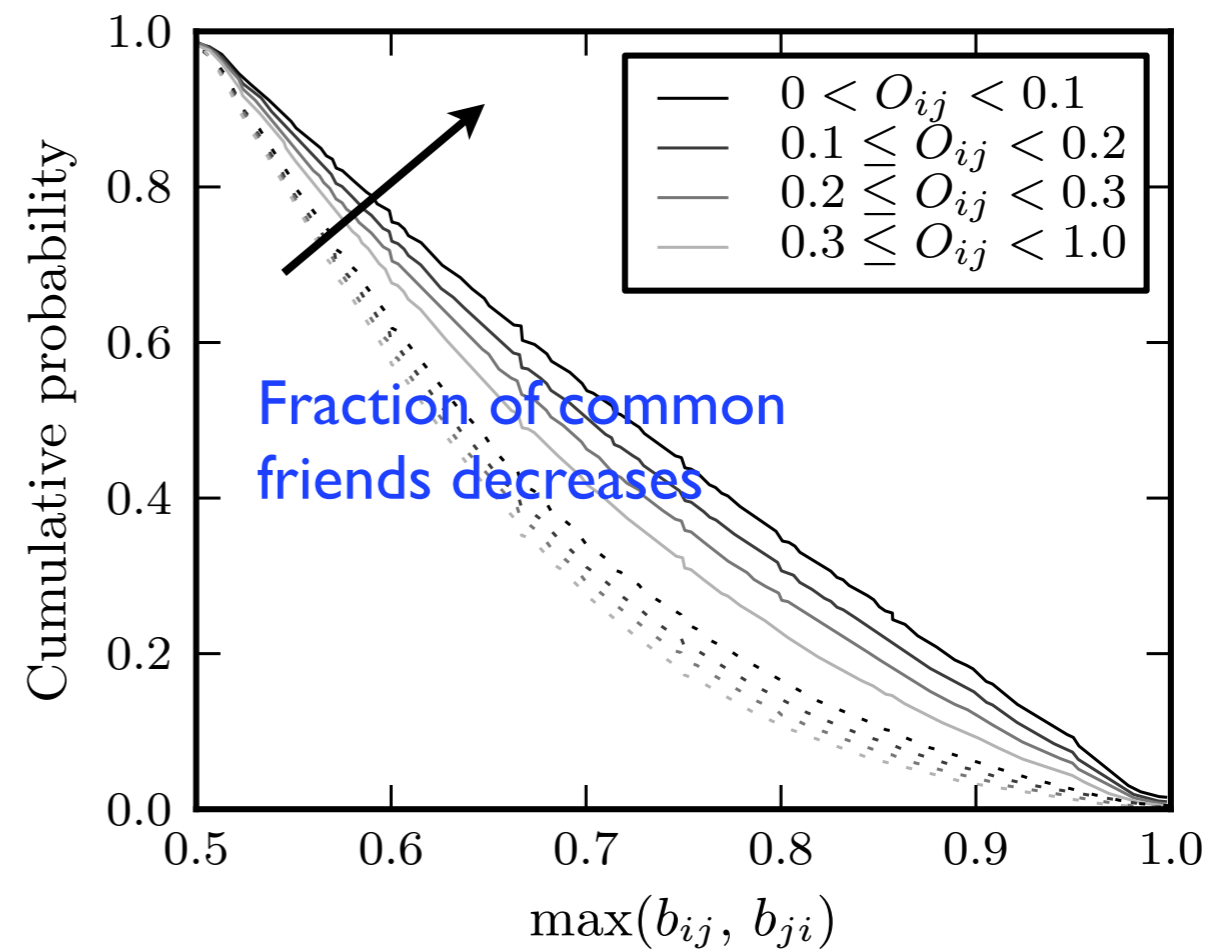
This line corresponds to people randomly initiating calls

# Bias vs tie strength and common friends

bias vs tie strength



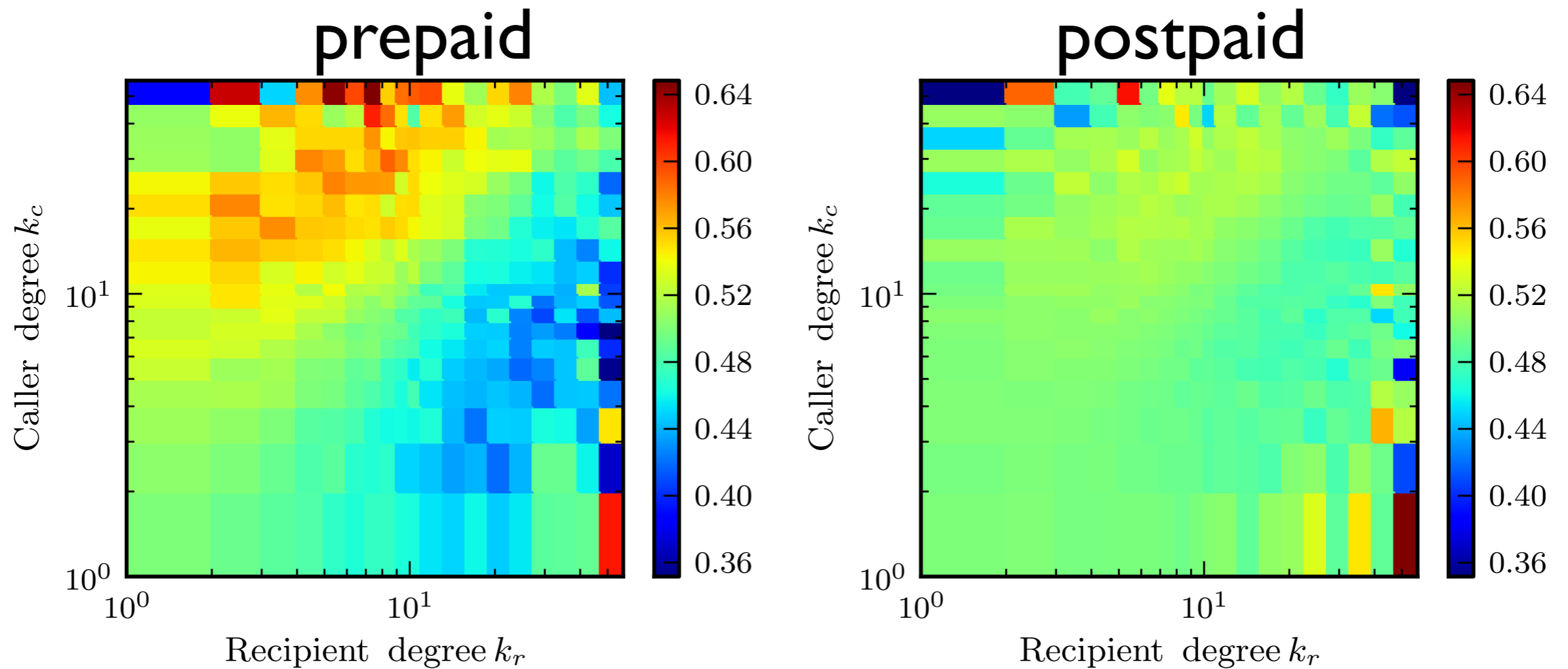
bias vs common friends



The stronger a tie and the more common friends there are, the less biased the tie is



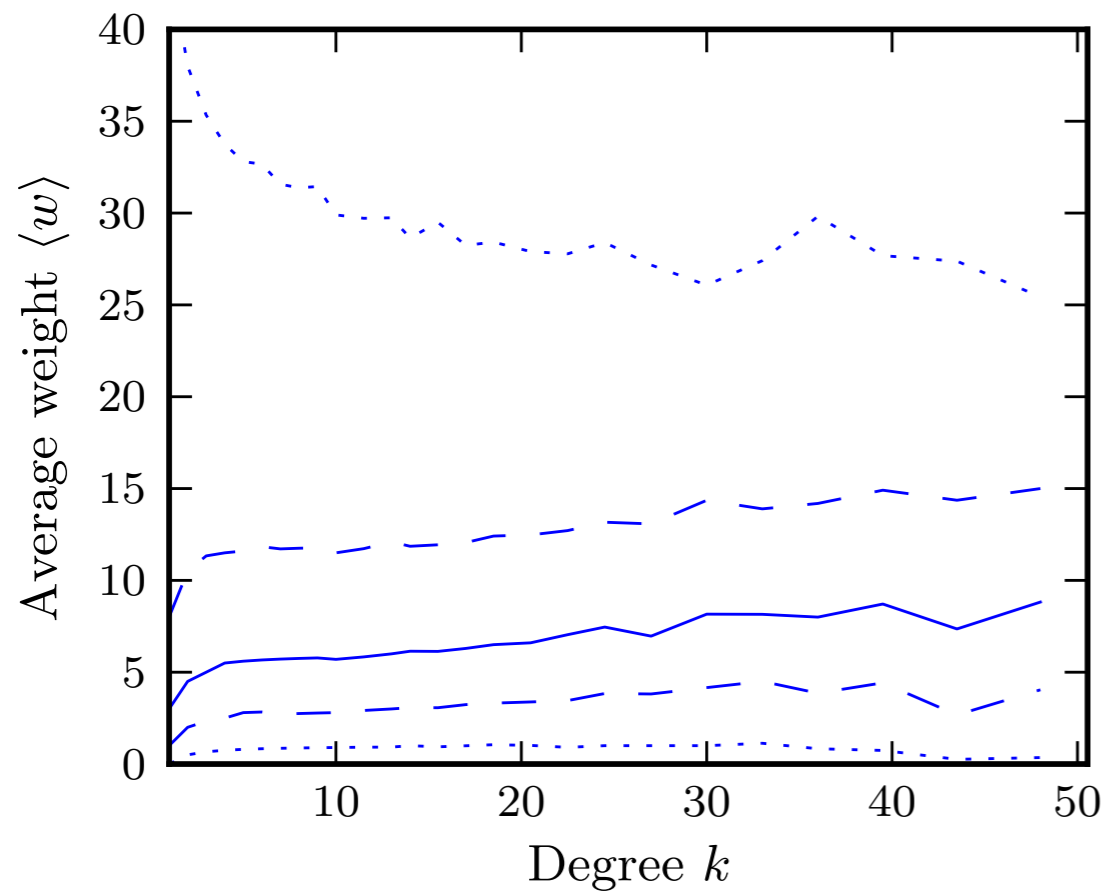
# Bias vs # of acquaintances



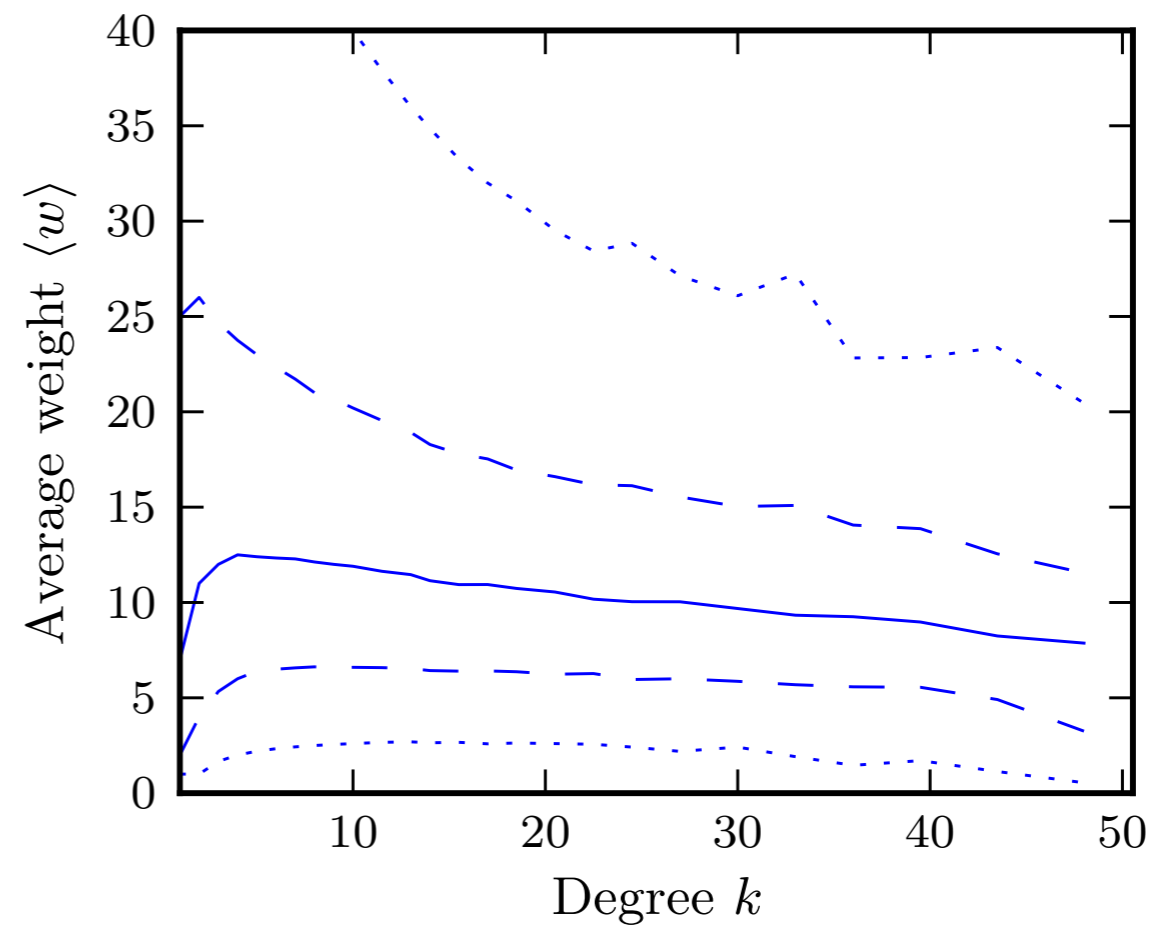
The party who has more acquaintances  
tends to initiate communication

# Tie strengths vs number of acquaintances

## prepaid



## postpaid



Q2:

Are social ties balanced  
in terms of communication?

*No, one calls more often than the  
other. The one who calls more  
often has in general more  
acquaintances.*

# Conclusion

- Investigating the dynamics of individual “social atoms”, in this case calls and text messages, is a promising direction
- Our first results: i) clear evidence of communication triggering communication, ii) “biased” relationships
- Topics to be studied:
  - Patterns involving several participants; effect on information transmission
  - From temporal patterns of “atoms” to network level
  - “Roles” of individuals: “group leader”, “connector”, etc