

Hello All,

# A Framework ForModeling On-lineCommunication

A Master Thesis in Complex Adaptive Systems.

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#### Research focus

 Model social dynamics based on the data collected from Internet social network

- Where
  - Social dynamics = distribution of authority among members of some group
  - Social network = Internet forum



## Why Internet forums?

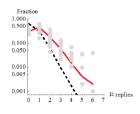
- Natural unobtrusive way of communication
- Anonymous users express opinions freely
- Complex social interaction scenarios
- Have not been studied extensively
- Large data sample
- Great diversity
- Can be parsed automatically



#### The scope



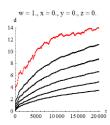
Parse some forum



 Obtain and compare few network statistics



Define the model for authority distribution



Study some of its properties

### Internet forum as a network



#### Forum choice

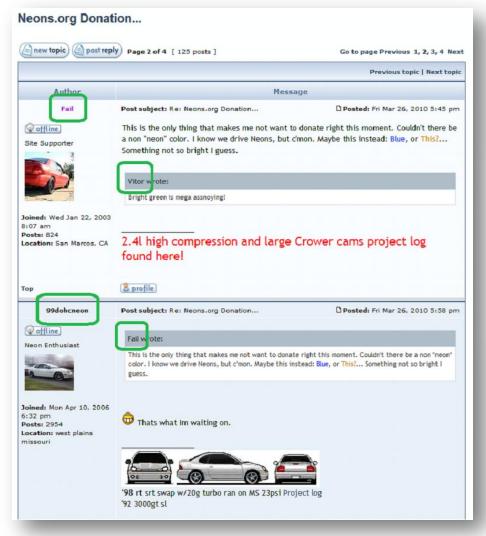
- A Belarusian automotive forum racing.by was picked as a research target because:
  - The author has been an active member since 2008 – quick validation of results



- User base consists of ambitious young men
- The forum is loosely moderated
- Large volume of data
- Result: hot debate, group and hierarchy formation



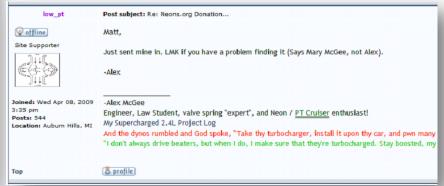
## Extracting data





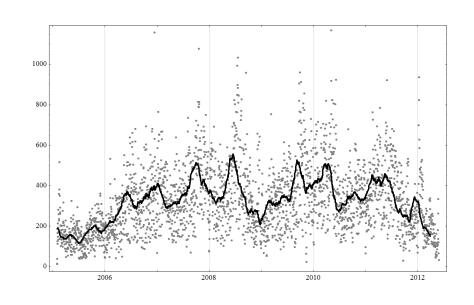
- ← 1. Quote the message
  - 2. Quote user name –
  - 3. Informal ways



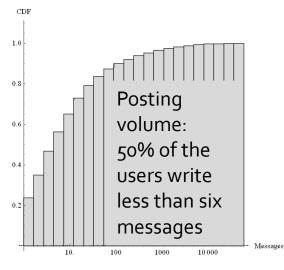


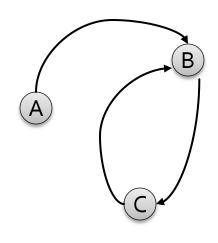
#### Results

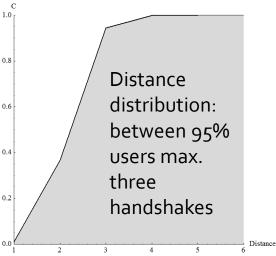
- Accuracy assessment
  - A topic with 250 messages
  - 77% of correct guesses, zero "false positives"
- Feb 2005 Jun 2012
- 861 514 messages
- 19 055 topics
- 3306 users
- ~70 hours (5s delays)



### Some "standard" statistics

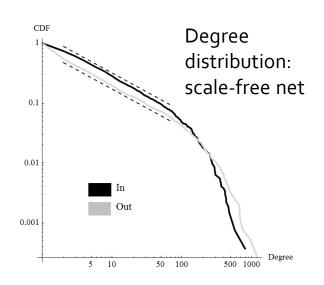


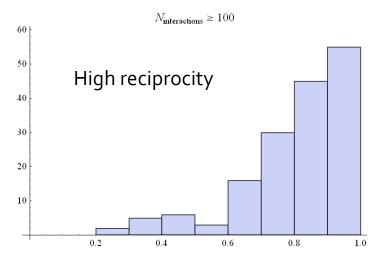




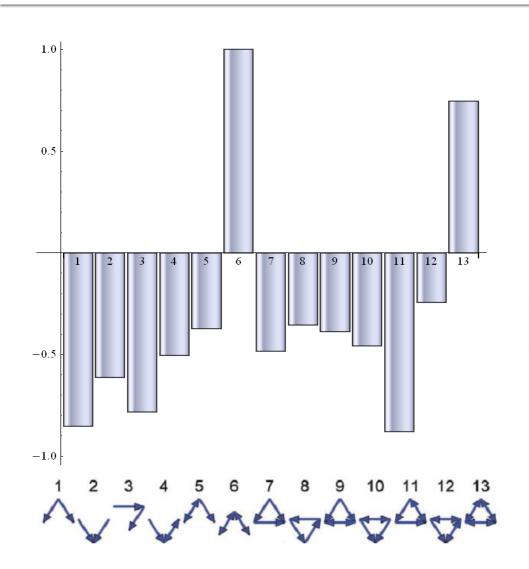


- 2. B > C
- 3. C > B
- 4. B > C

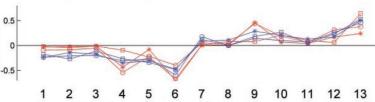




## Triad significance profile (motifs)



Triads with bi-directional links are preferential in relationships graph: reciprocity



Compare to other real-world social networks (blue) and WWW (red): **transitivity** 

## Simulating behavior



## Making decisions

A writes to B. What does he take into account?

- What A wrote to B in the past
- 2. What B wrote to A in the past
- 3. World relations to B
- 4. A's friends relations to B
- 5. A's friends relations to B's friends
- 6. A relations to B's friends
- 7. World relations to B's friends
- B's friends relations to B

"opinion inertia"

"tit for tat"

"group opinion"

"transitive group opinion"

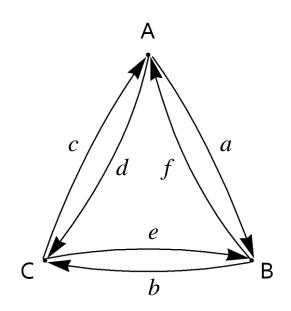


#### **Definitions**

- Thread a sequence of event triples: (from, to, emotion)
- Emotion one of the three: positive / support (+1), neutral (o), negative / insult (-1)
- Authority some measure of respect for each pair of users
  - 1. A > B: 1
  - 2. B > C: 0
  - 3. C > B: -1
  - 4. B > C: -1

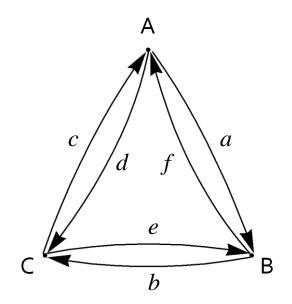
## **Analytical model**

- Communication stability can small changes in replies lead to dramatic differences in longterm authority distribution (butterfly effect)?
- The model (users A, B and C):
  - One "round" each user writes to everybody else once
  - $(a, b, c, d, e, f)_{t+1} = S((a, b, c, d, e, f)_t)$ S - reply strategy
  - Emotions are real (vs. integer)



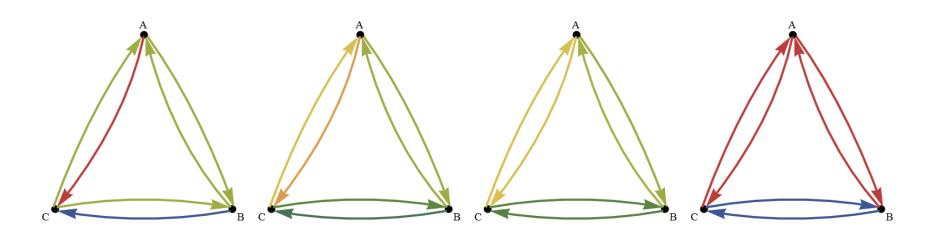
## Strategies

- Reply the same as before
  - $(a, b, c, d, e, f)_{t+1} = (a, b, c, d, e, f)_t$
- Tit for tat
  - $(a, b, c, d, e, f)_{t+1} = (f, e, d, c, b, a)_t$
- Group opinion
  - $(a, b, c, d, e, f)_{t+1} = (e, d, f, b, a, c)_t$
- Transitive group opinion
  - $(a, b, c, d, e, f)_{t+1} =$   $(e, d, f, b, a, c)_t \times (d, f, e, a, c, b)_t =$  $(e d, d f, f e, b a, a c, c b)_t$
- Final, weighted with (w, x, y, z):



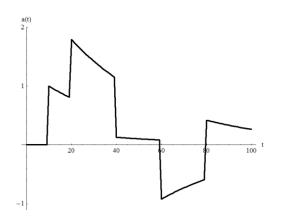
$$\begin{pmatrix} a \\ b \\ c \\ d \\ e \\ f \end{pmatrix}_{t+1} = \begin{pmatrix} a w + f x + e (y + d z) \\ b w + e x + d (y + f z) \\ c w + d x + f (y + e z) \\ d w + c x + b (y + a z) \\ e w + b x + a (y + c z) \\ f w + a x + c (y + b z) \end{pmatrix}_{t}$$

#### Results



- Stationary points: 6-dimensional non-linear system, numerical solutions only
- Fully reciprocal case: (a, b, c) = (f, e, d)Solutions: (0, 0, 0), (1, 1, 1), (-1, -1, 1), (-1, 1, -1), (1, -1, -1)"Common enemy", but no "love triangle"

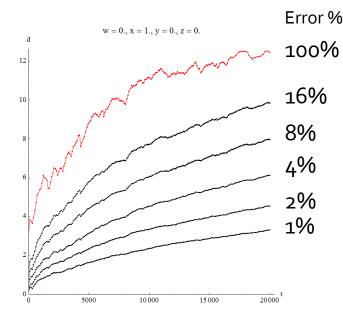
#### Simulation

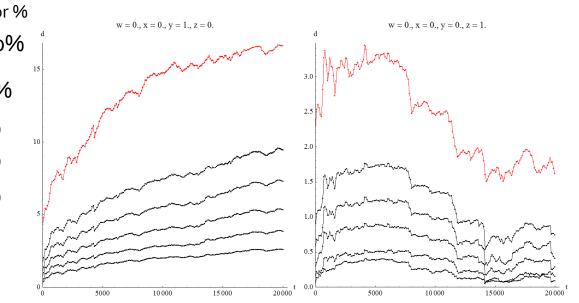


Real sequence, random initial emotional data (2 months, 20K msg)

Authority-based strategies (2 months simulated)

d(t) – Euclidean norm of the difference in authority matrices





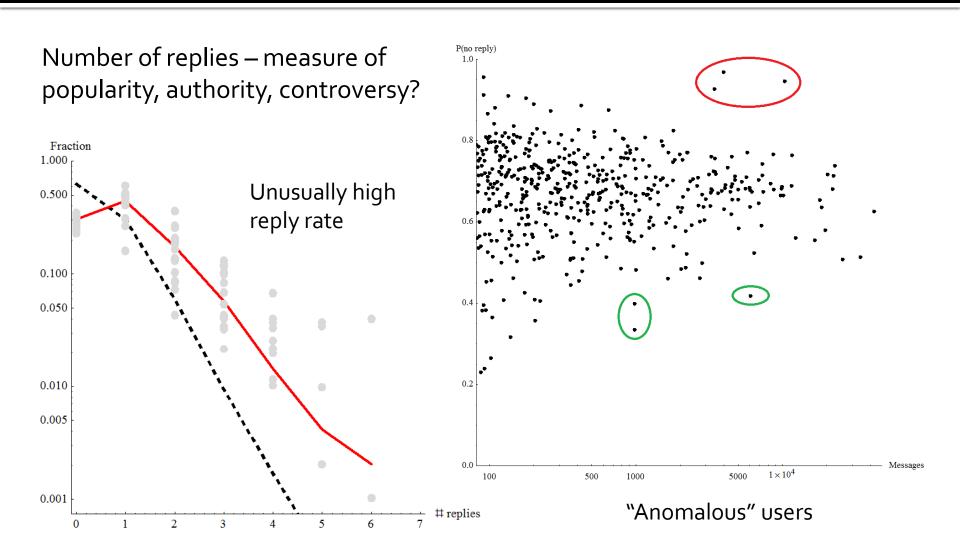
#### Ideas for further research

- Automate emotion recognition
  - Keywords-based might be enough
  - Use "zero reply ratio" instead
- Compare different phpBB forums
- Use GA to solve inverse problem obtain strategy weights
- Investigate anomalies
- Model the sequence

#### Conclusions

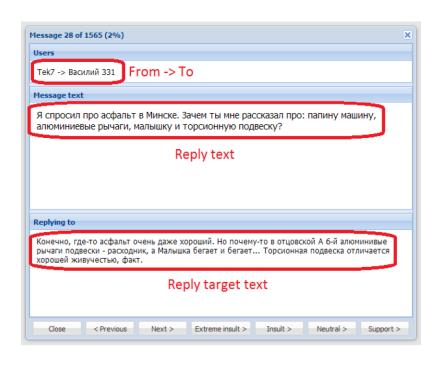
- Parsed the forum, estimated parsing and emotion recognition accuracy
  - 77% and 75% respectively
- Obtained some descriptive statistics, including unusual triad significance profile
  - Reciprocity is more important than transitivity
- Designed a simple analytical model and studied its stationary points
  - 6D / 3D map, "common enemy" state is stable
- Created a computational model (simulation) and studied its behavior
  - No butterfly effect observed
  - "Transitive group opinion" strategy damps the "errors"

## Extra: messages with no replies

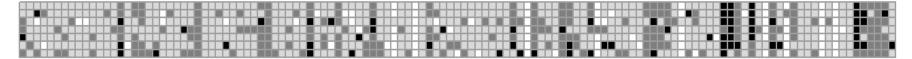


#### Extra: emotion recognition accuracy

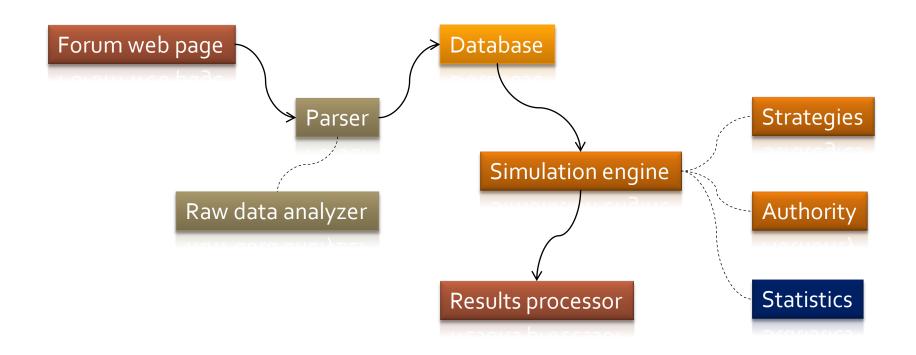
Implemented a web application for rating posts in a thread



- Seven "experts"
- 2 \* 125 messages
- ~25% difference
- => Low predictive power of the model



## Extra: implementation details



- Java SE 1.6 / Apache HTTP Client / Oracle XE / Mathematica 8
- 55 classes, 162 Kb of Java code, 27 Mathematica notebooks
- 1.3 Gb database, 70 hours of parsing, 120 hours of simulations

## Thank you

#### Questions?

#### **Credits**

Opponent: Alireza Jamali

Supervisor: Vilhelm Verendel

Examiner: Dr. Kristian Lindgren

