

NTT Communication Science Laboratories

Supporting Communications in Global Networks

Kevin Duh & 歐陽靖民



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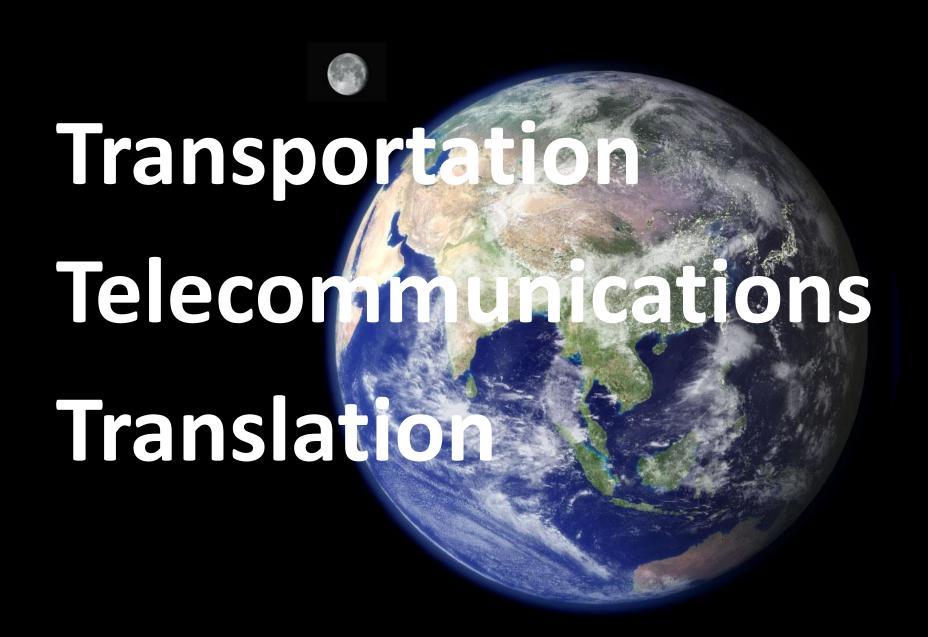
Supporting Communications in Global Networks

Machine Translation

Kevin Duh

6000

Number of Languages in the World 世界中の言語の数



There are 6000 languages in the world.



MACHINE TRANSLATION 機械翻訳



世界には6000の言語があります。



Warren Weaver, American scientist (1894-1978)

When I look at an article in Russian, I say: "This is really written in English, but has been coded in some strange symbols. I will now proceed to decode. [1947]

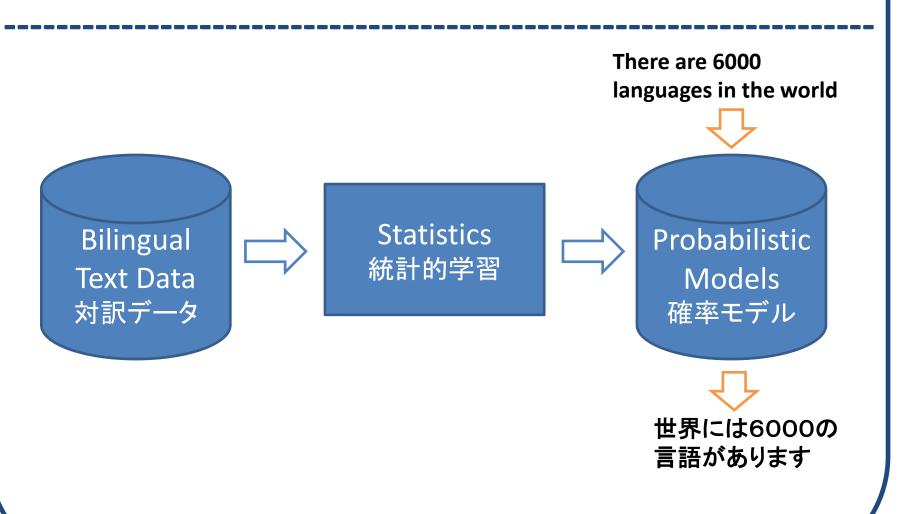
Rule-Based
Machine Translation
(1960—now)

Manual encoding of linguistic knowledge into rules

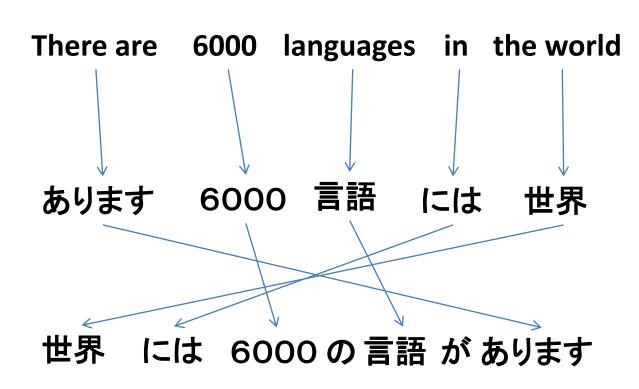
Data-Driven
Machine Translation
(2000—now)

Exploiting Statistics from Large Data

Architecture of Data-Driven Machine Translation



Architecture of Data-Driven Machine Translation



Word Translation
Model

Fluency Model

How to build these models?

Exercise: Let's build one now!





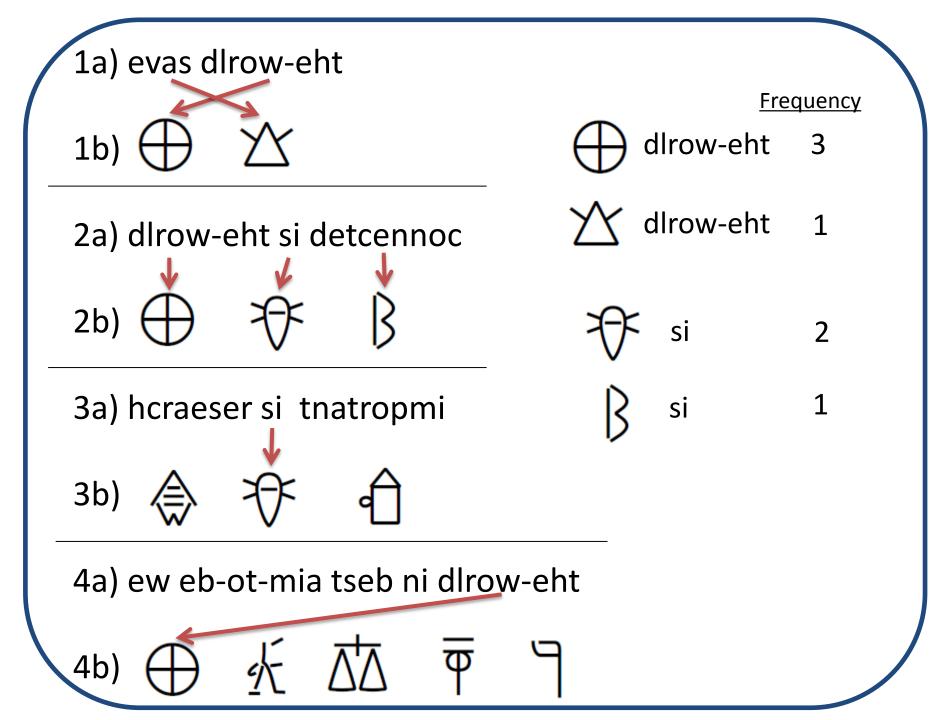
2a) dlrow-eht si detcennoc

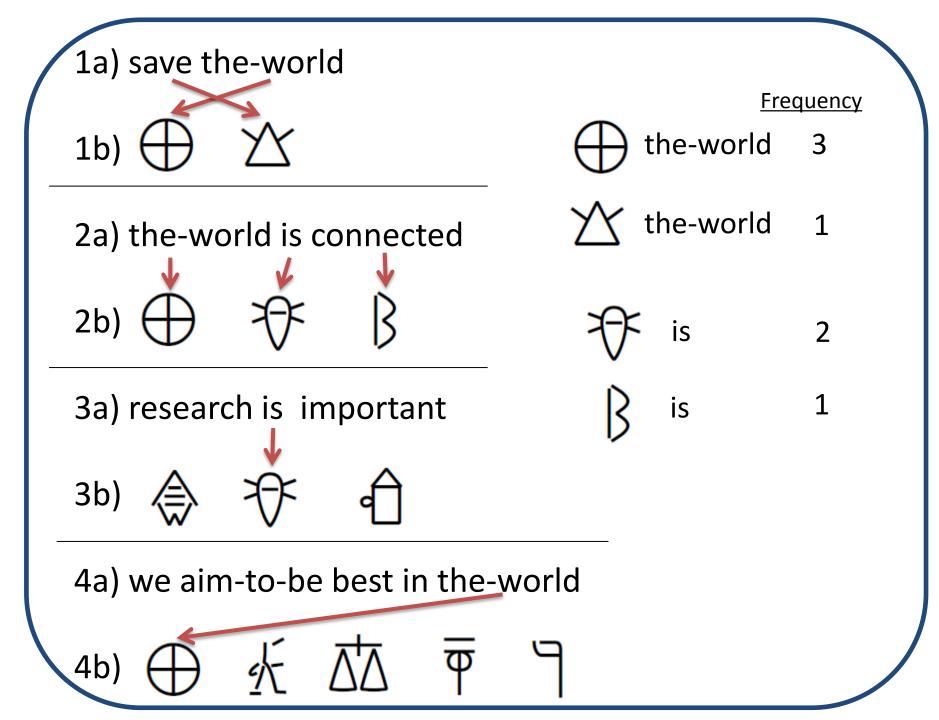


3a) hcraeser si tnatropmi



4a) ew eb-ot-mia tseb ni dlrow-eht





1a) save the-world

Frequency

1b) 世界 を救え

世界 the-world 3

2a) the-world is connected

を救え the-world 1

2b) 世界 は 繋がってる

はis

3a) research is important 繋がってる is 1

3b) 研究 は 大事

4a) we aim-to-be best in the-world

in practice, it's not that easy

Recent Research Efforts

Duh+(2010), "Analysis of Translation Model Adaptation" Duh+(2011), "Bayesian Adaptation of Alignment Matrices"

What if data is insufficient?

Other Data

Other Data Other Data

Bilingual Text Data 対訳データ



Statistics 統計的学習



Probabilistic Models 確率モデル

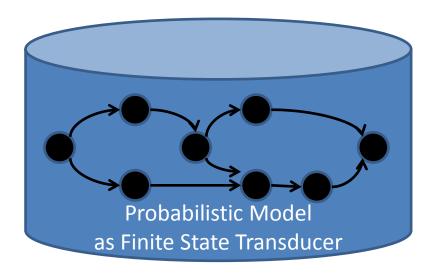
Recent Research Efforts

Visit us @ Posters 5-7 for more info

How to use Japanese-specific knowledge?



Recent Research Efforts



Can we translate faster?

Bilingual Text Data 対訳データ



Statistics 統計的学習



Probabilistic Models 確率モデル

Using technology from Speech Recognition:

Hori+(2007), "Efficient WFST one-pass decoding w/ on-the-fly rescoring"

Killer Application for Translation?

Three General Scenarios









The Future Knowledge Worker

Translation

Technical Articles

Analysis of Translation Model Adaptation in Statistical Machine Translation

**Levis Duk. Lexistins Sudek. Highwo Tushada

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Abstraces:
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zeco of Statistical Machine To seeds on the quality and quar

and plantament of the state of the control of the c

Execution to demand adoptions can be considered facilities on operation theories Theories couldn't and count the evental quantity of data is increased by adding the following the facilities of the considered demand installed, but use of channing inflationarities?) the considered of the considered of the considered on the consistency of the consistency of the consistency and of channing the consistency of the consistency consistency of the consistency of the consistency consistency of the consistency of the consistency that is imperature to analyze the results in one office. Here such is therefore exactly done and where our-of-demand belief in the Consistency of the consistency produced the consistency that the consistency of the consistency the consistency of the consistency that the con the Tabelia

ACCOUNTS AND ACCOU

Breaking News



Social Media





The entire world is your market.

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Steel

Chemicals





Real-time Conversation – now



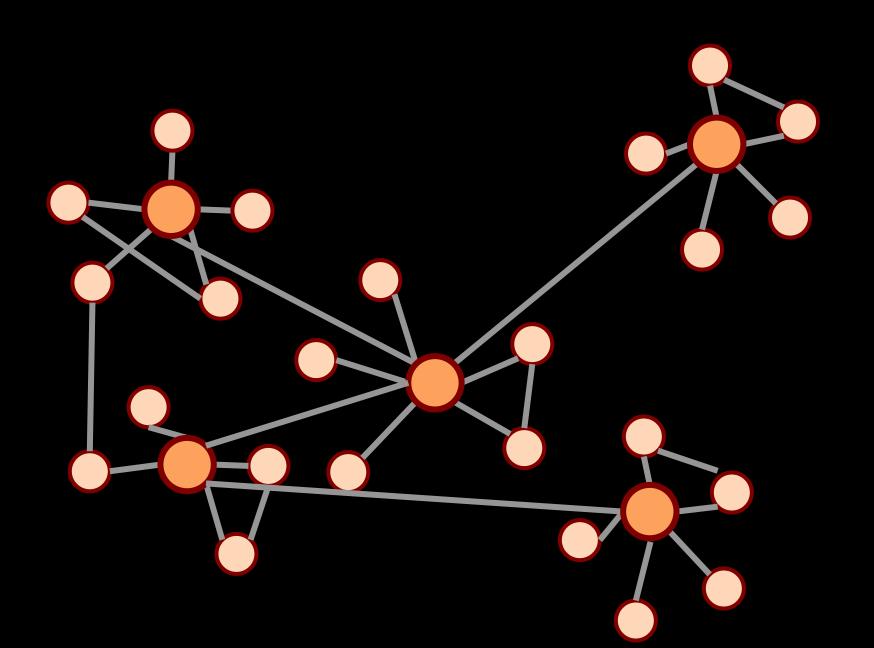
How will you use translation

technology?



あなたなら、

翻訳をどのようなコミュニケーションに使う?





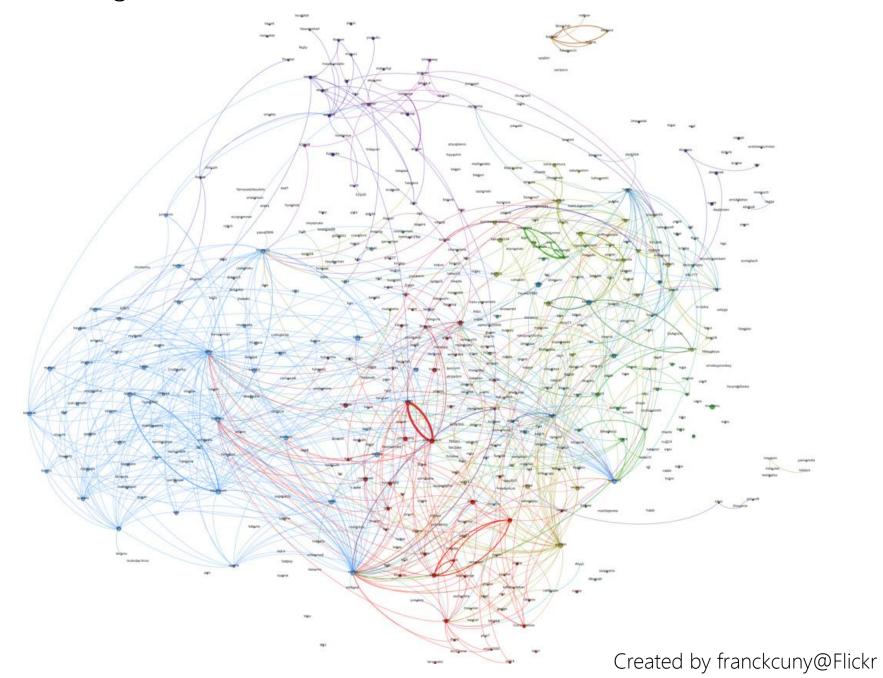
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Supporting Communication in Global Networks Social Network Mining

歐陽靖民



Japanese Programmers on GitHub



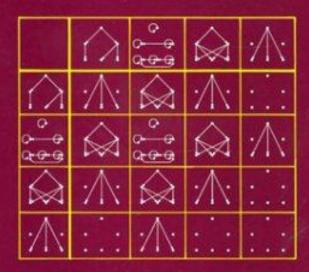
ES |

STRUCTURAL ANALYSIS IN THE SOCIAL SCIENCES

Social Network Analysis

Methods and Applications

Stanley Wasserman and Katherine Faust



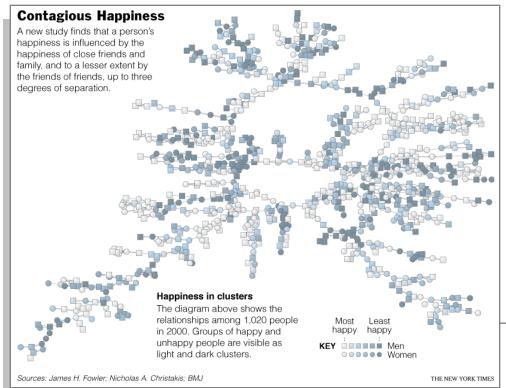
Six Degree of Separation



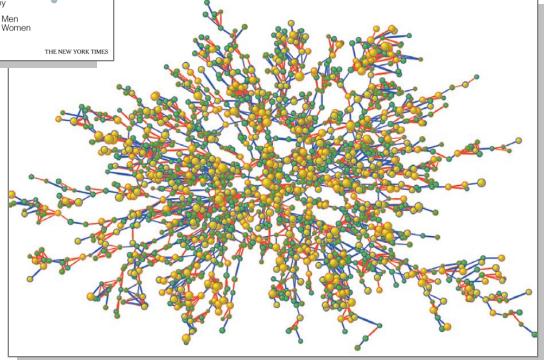
Stanley Milgram
American Social Psychologist
1933-1984



BBC recreating the experiment in 2009 (From Nairobi to Boston)



Happiness and Social Network (Fowler and Christakis, 2008)



Obesity and Social Network (Christakis and Fowler, 2007)

The Age of Online Social Networking





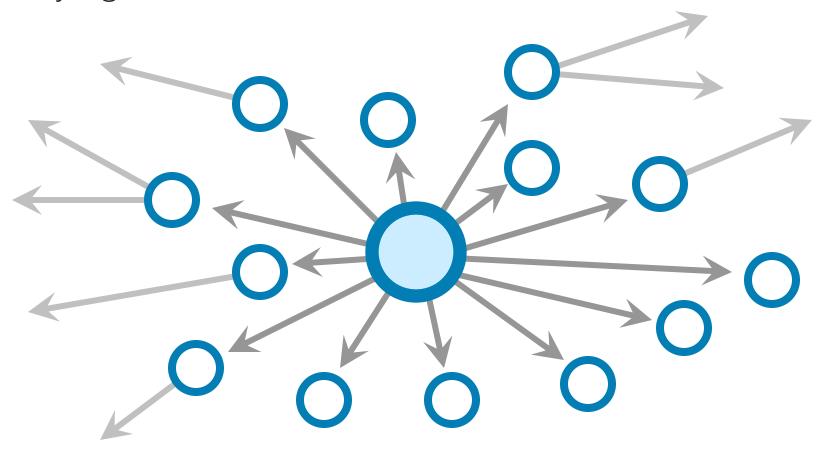
500,000,000 Active Users 30 billion content shared

200,000,000 Users 65 million tweets per day

Social Network Mining

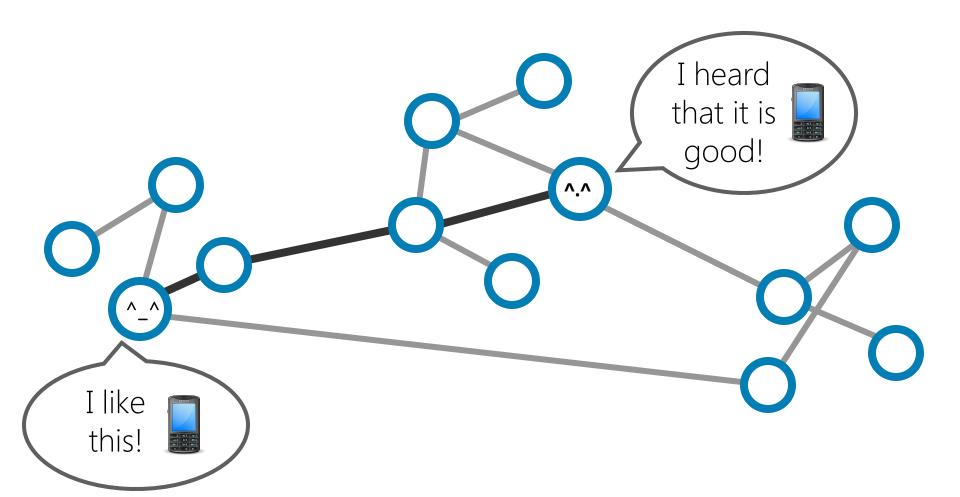
Why social network mining?

Identifying influential users in a network



Why social network mining?

Understanding how information spreads



Why social network mining?

Making Social Recommendations

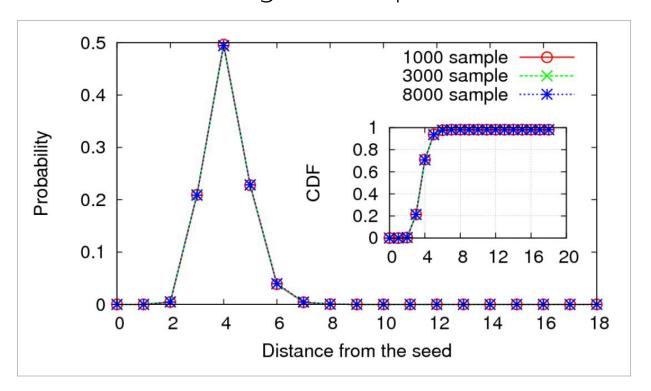


Understanding Social Networks

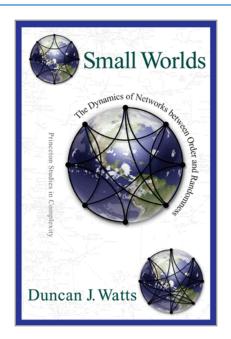
Measuring a Social Network

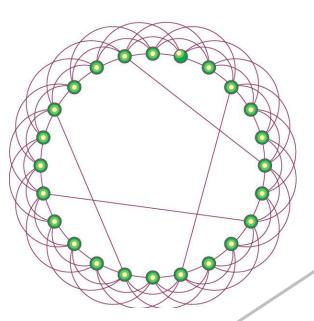
Example: Studying Twitter

Four Degree of Separation in Twitter



Modeling a Social Network



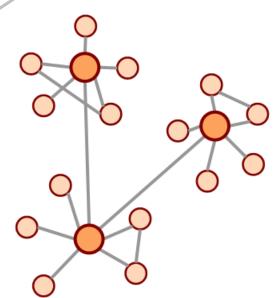


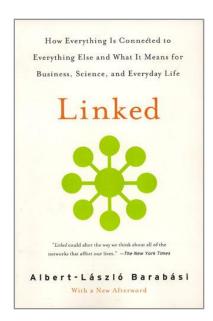
'Exploring complex networks' (Strogatz, 2001)

Scale-free Networks

Small World Networks

'Emergence of scaling in random networks' (Barabási & Albert, 1999)



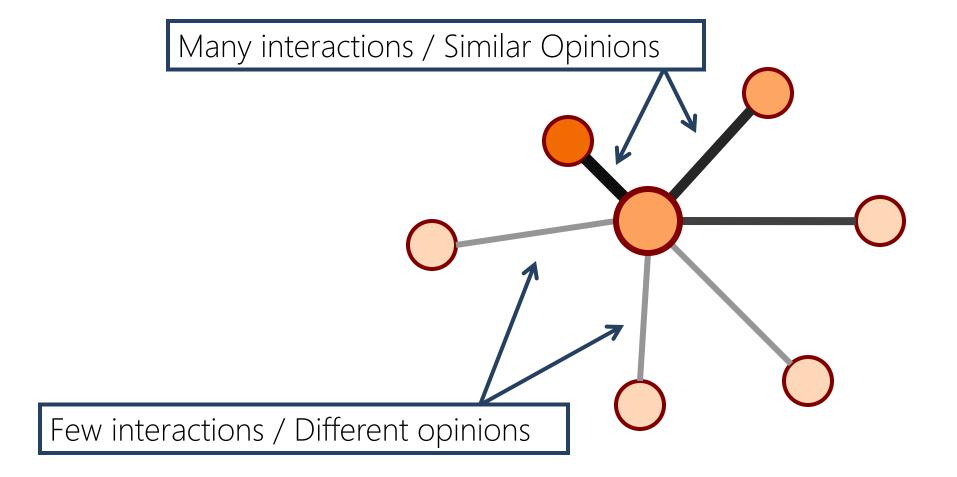


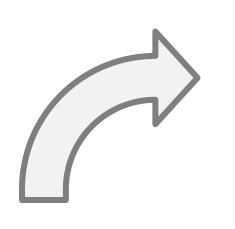
Supporting Users in Social Networks

Social Information Overloading

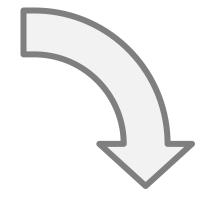
Supporting Users in Social Networks

Learning the relations among people





Users participating in the social network



New algorithms for supporting the social network



Measuring and Modelling the social network

Our Research

Research Question

How trust relations shape user opinions?

How trust can be used to predict user opinions?

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Game Consoles, Computer Games Xhox 360 PS3 Wii

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ELECTRONICS



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Good To The Last Drop

Cuisinart Brew Central DCC-1200 12-Cup Coffee Maker

Reviewed by newtownbeans POPULAR AUTHOR - Top 1000

Author's rating: ***

The Cuisinart Brew Central Coffeemaker, Model DCC-1200 is a solidly built and efficient electric coffee maker that brews really fresh and aromatic coffee. It is a bit larger than most coffee makers, measuring approx. 14x8x8 inches and it is available in ... Read the full review

Compare prices for Cuisinart Brew Central DCC-1200 12-Cup Coffee Maker





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Epinions Most Helpful Reviews



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Good To The Last Drop

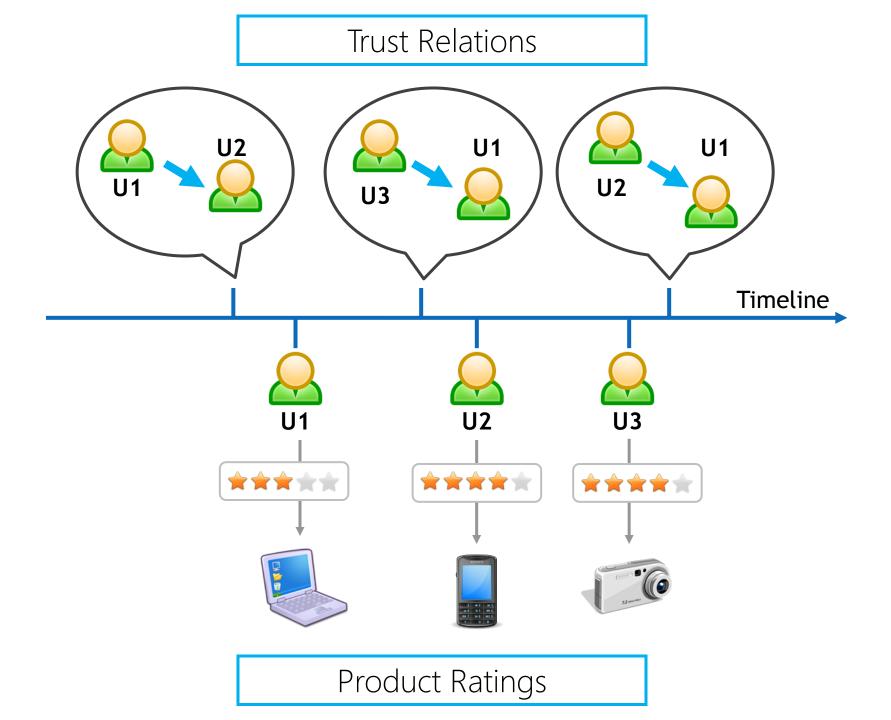
Cuisinart Brew Central DCC-1200 12-Cup Coffee Maker

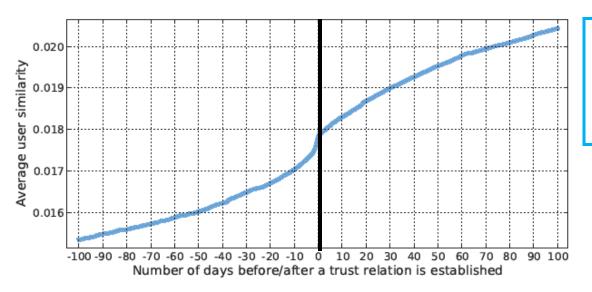
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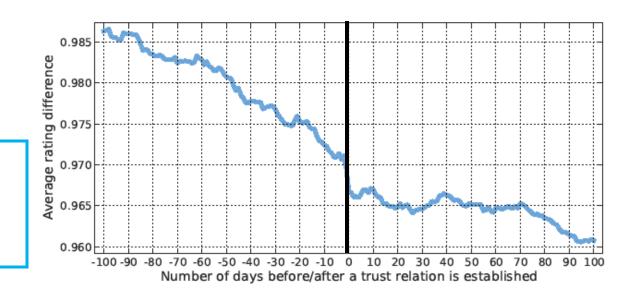
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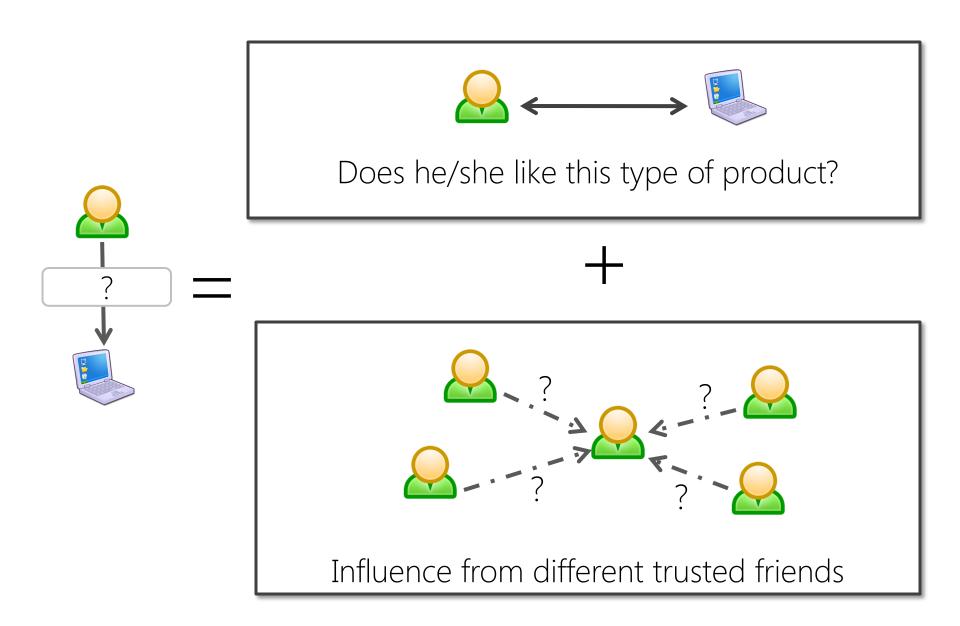


Similarity between users increases before and after trust

Difference in ratings **decreases** before and after trust



Estimating strength of relations + Predicting user ratings



Summary

Supporting Communication in Global Networks