

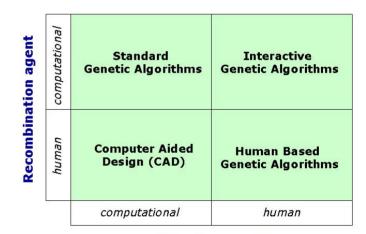
Mining Social Networks in Message Boards

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What're you doing here? 4 Answers

- Gusz Eiben: Have you gone soft?
 - Glad GAs are "hard."
- April 15 is tax deadline.
- Nao Matsumura stuck at Osaka University.
- DISCUS: Distributed innovation & scalable collaboration in uncertain settings.

Four-Quads of HC Interaction



Selection agent

Introduction (1/2)

- Well-planned communication realizes human innovation in communication [Goldberg 2002]
- A social network shows the relationships between individuals in a group or organization where we can observe their social activities.

Ex.)

- Individuals who share a serious problem might all join a discussion on ways to solve the problem.
- Only a few knowledgeable individuals might give information when individuals seek to find out more about specific topics.



Introduction (2/2]

- In this study, we propose
 - a) a method of **social network extraction** from threaded messages,
 - b) "Communication Gap" as an indicator of understanding the state of communication,
 - c) to reveal the characteristics of Communication Gap by analyzing 3,000 social networks, and
 - d) an approach for **re-organizing communication structures** to realize innovative communication, based on the strategy for reducing Communication Gap.

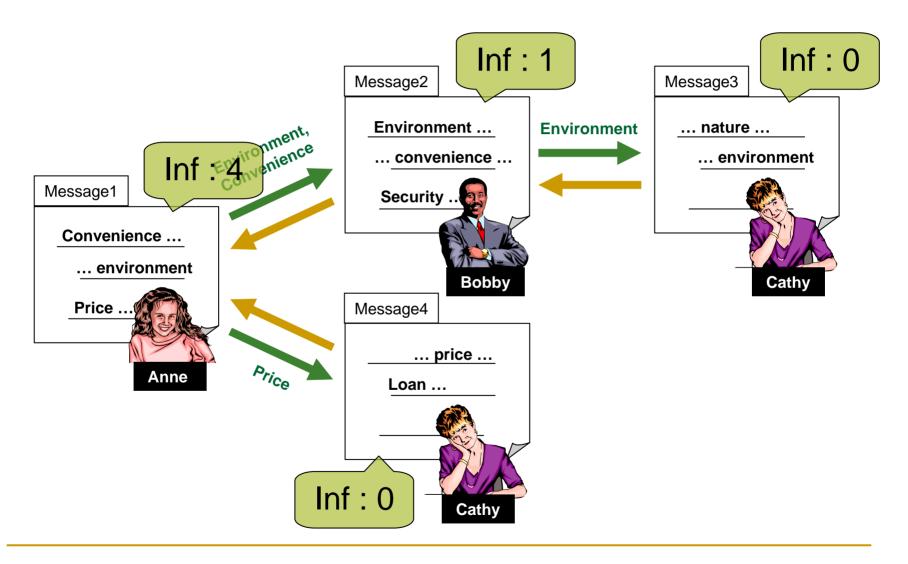
Previous Works

- Network analysis
 - Small world phenomena [Milgram 1967]
 - Social network analysis [Freeman 1973]
 - Information flow within an organization [Scott 1992]
 - Importance of informal networks [Krackhard et al.1993]
 - Collective dynamics of 'small-world' networks [Watts et al. 1998]
 - Dependency Structure Matrix Analysis [Tian-Li et al. 2004]
- Communication analysis
 - Diffusion of Innovation Research [Rogers 1962]
 - GAs & Innovation Research [Goldberg 1983, 2002]
 - Chance Discovery [Ohsawa 2003]
 - Community of practice in E-mail logs [Tyler et al. 2003]

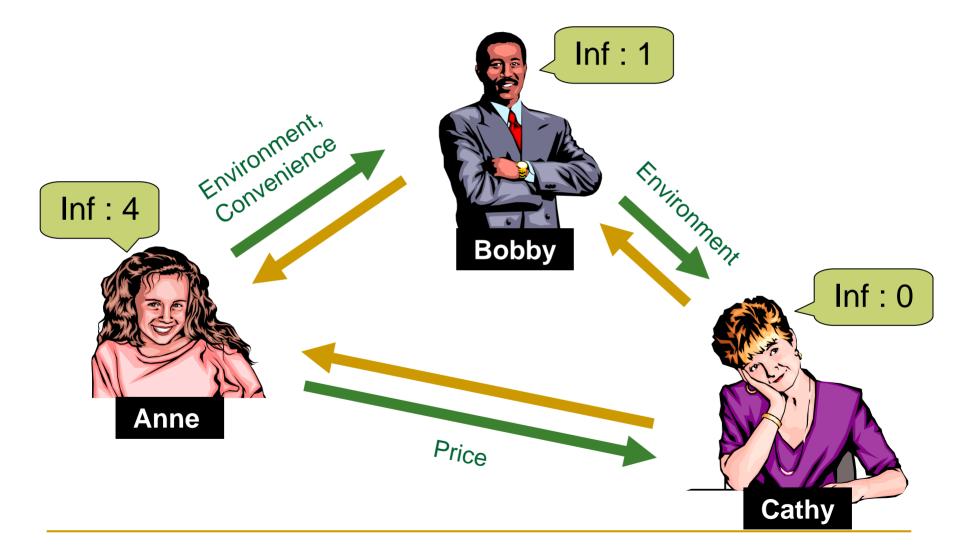
Extraction of Social Networks

- A social network here should be directed and weighted if we consider the flow of influence.
 - The relationship between individuals is not always symmetric because of their activities and social situations [Wallace 1999]
 - Directed and weight links are used when measuring Communication Gap (explained later).
- We apply IDM (Influence Diffusion Model) to extract social networks from threaded messages [Matsumura 02]
 - IDM measures the influence of messages / individuals / terms / ties between individuals by focusing on propagating terms throughout message chains.

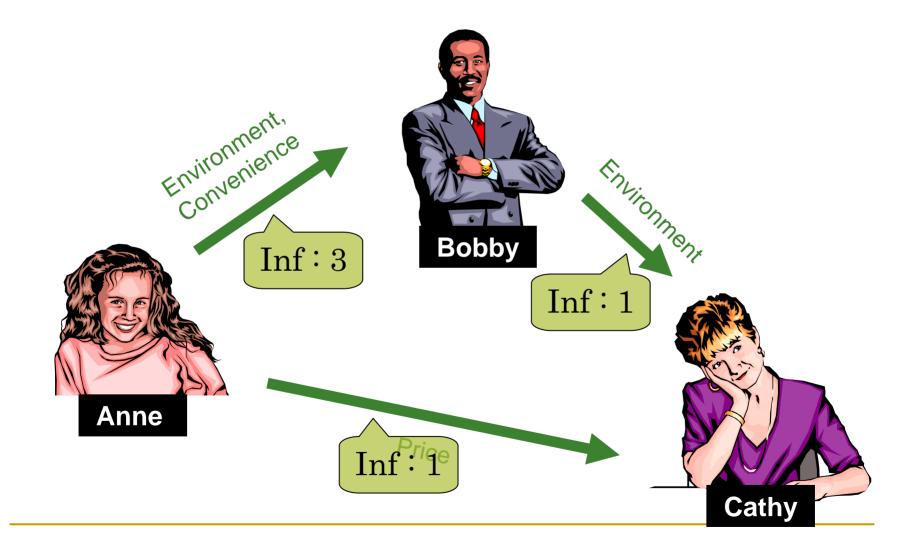
IDM (Influence Diffusion Model)



Influence of Individuals

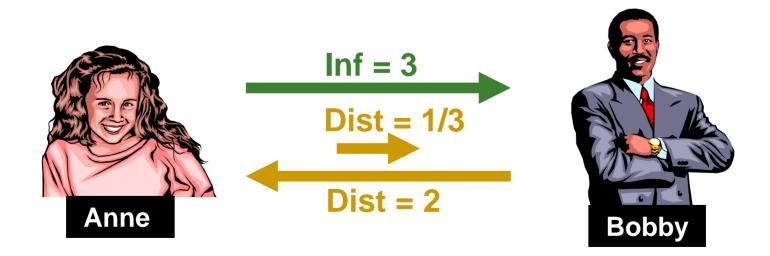


Influence of Ties between Individuals

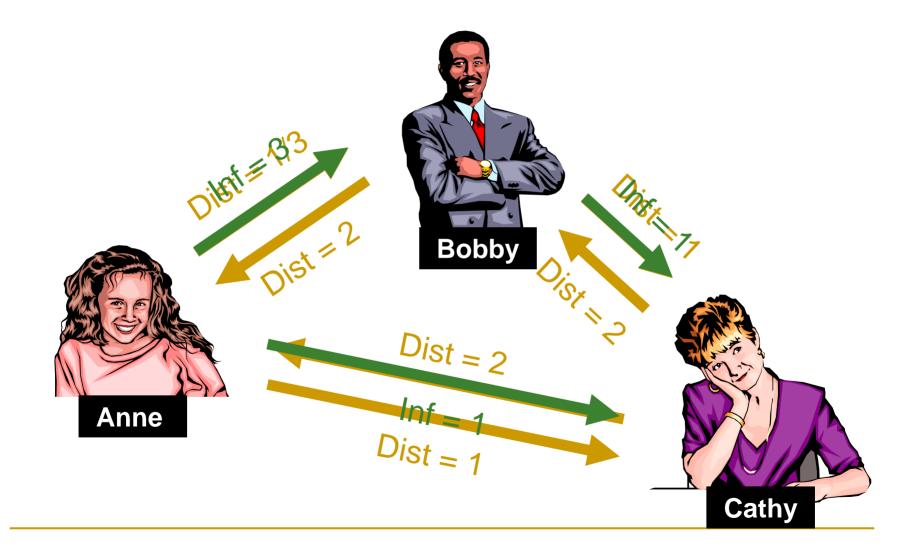


Distance from Influence

- As the influence shows contextual similarity between individuals, the distance could be defined as inversely proportionate to the influence, **Dist = 1 / Inf**.
- If there is no influence, the distance is defined as n-1 (n is the number of individuals) as the case of the weakest relationships.



Directed and Weighted Social Network



Communication Gap

- We measure Communication Gap from a social network to understand how much individuals are isolated in communication.
- Communication Gap is measured by
 - accumulating the differences of the shortest paths between individuals,
 - accumulating the longer/shorter distances of the shortest paths between individuals as a bottleneck hindering communication,
 - accumulating the differences in closeness centralities of individuals,
 - accumulating the closeness centralities of individuals.



Communication Gap Indices

C
 C_{diff}
 G_{diff}
 G_{max}
 G_{min}

$$= \alpha_{1} \sum_{px} c^{in}_{px}$$

$$= \alpha_{2} \sum_{px} |c^{in}_{px} - c^{out}_{px}|$$

$$= \alpha_{3} \sum_{px} \sum_{py} |d_{px,py} - d_{py,px}|$$

$$= \alpha_{4} \sum_{px} \sum_{py} \max(d_{px,py}, d_{py,px})$$

$$= \alpha_{5} \sum_{px} \sum_{py} \min(d_{px,py}, d_{py,px})$$

 $\begin{array}{c} {c^{in}}_{px} \\ {c^{out}}_{px} \\ {d}_{px,py} \\ {\alpha}_{n} \\ {p}_{x}, {p}_{y} \end{array}$

- : Closeness centrality of p_x (inward)
- : Closeness centrality of p_x (outward)
- : The distance from p_x to p_y
- : Normalization coefficient
- : An individual in a social network

Yahoo!JAPAN BBS

Yahoo! JAPAN - Microsoft Internet Explorer

We downloaded 3,000 BBS and extracted 3,000 social networks!

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Communication Gaps in Y!Japan BBS

Yahoo!Japan Categories	C_dist	C_diff	G_diff	G_max	G_min
Family & Home	0.032	0.028	0.032	0.048	0.017
Health & Wellness	0.065	0.065	0.073	0.100	0.029
Arts	0.068	0.070	0.081	0.1.08	0.029
Science	0.072	0.068	0.078	0.110	0.034
Cultures & Community	0.085	0.061	0.071	0.120	0.051
Romance & Relationships	0.081	0.079	0.089	0.125	0.038
Hobbies & Crafts	0.095	0.092	0.106	0.146	0.043
Regional	0.161	0.120	0.142	0.230	0.093
Entertainment	0.151	0.129	0.157	0.228	0.075
Government & Politics	0.217	0.167	0.197	0.313	0.120
Business & Finance	0.241	0.160	0.184	0.331	0.150
Schools & Education	0.253	0.1.61	0.195	0.349	0.158
Recreation & Sports	0.239	0.208	0.253	0.362	0.116
Computers & Internet	0.447	0.221	0.272	0.579	0.315
Current Events	0.455	0.220	0.271	0.588	0.322

Three Types of Communication

*****HIERARCHICAL CLUSTER ANALYSIS*****

Dendrogram using Average Linkage (Between Groups)

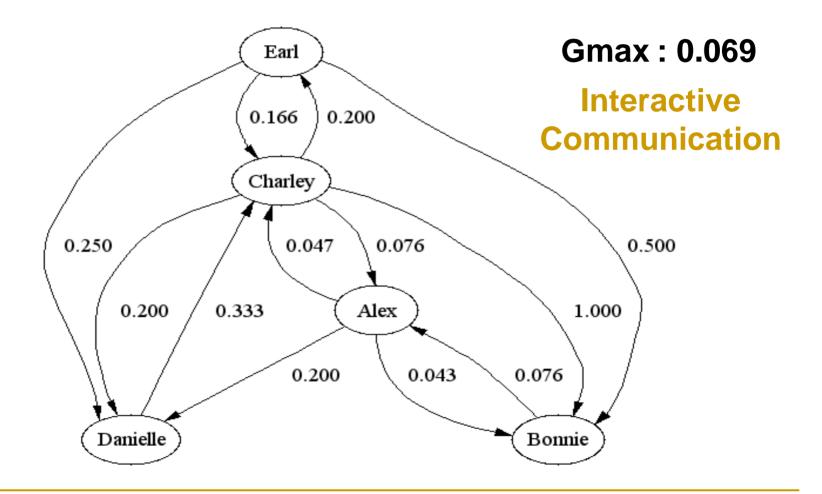
Rescaled Distance Cluster Combine

C A S E Label	Num	0 5 ++	10	15	20 +	25 +
Arts Science Health & Wellness Cultures & Community Romance & Relationsh Hobbies & Crafts Family & Home	3 4 5 6 7					
Regional Entertainment Business & Finance Schools & Education Government & Politic Recreation & Sports Computers & Internet Current Events	8 9 11 12 10 13 14 15					

Three Types of Communication

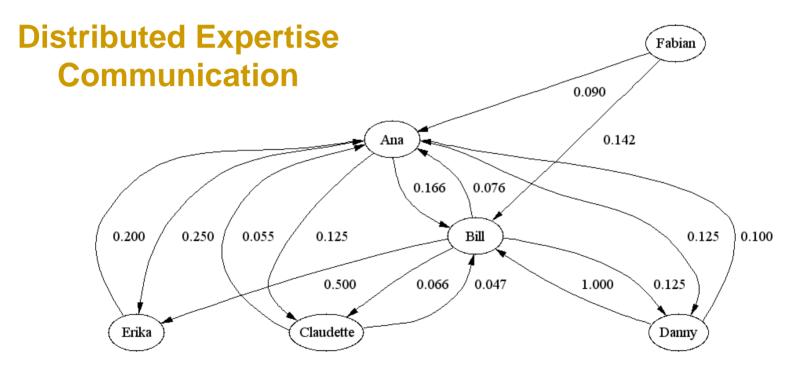
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Computers & Internet	$b^{0.447}$	$-m^{0.221}$	0.272	0.579	0.315
Current Events		OUHTFR	псано	0.588	0.322

Case 1: "Cell Phone and Women"

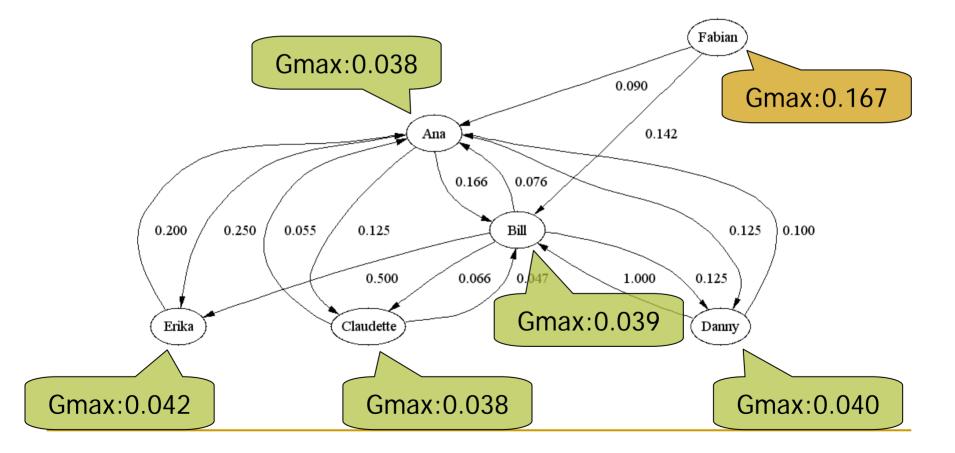


Case 2: "Purchase of a House"

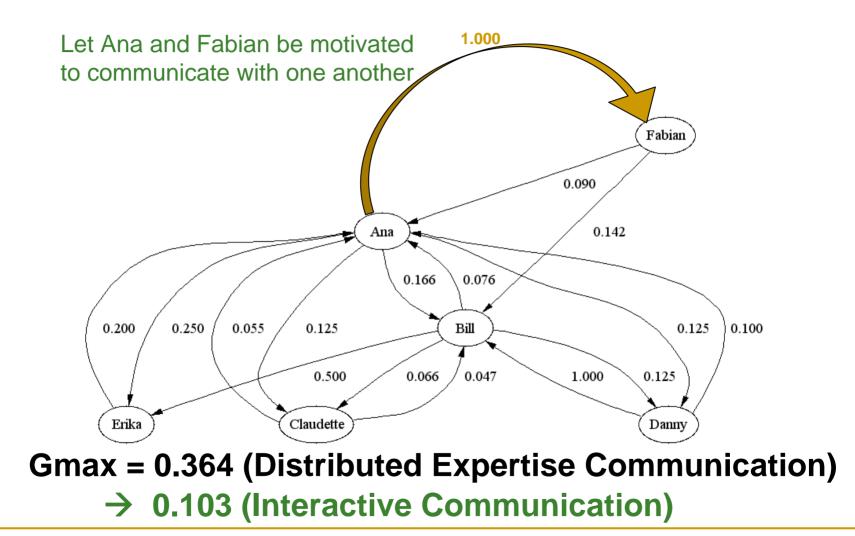
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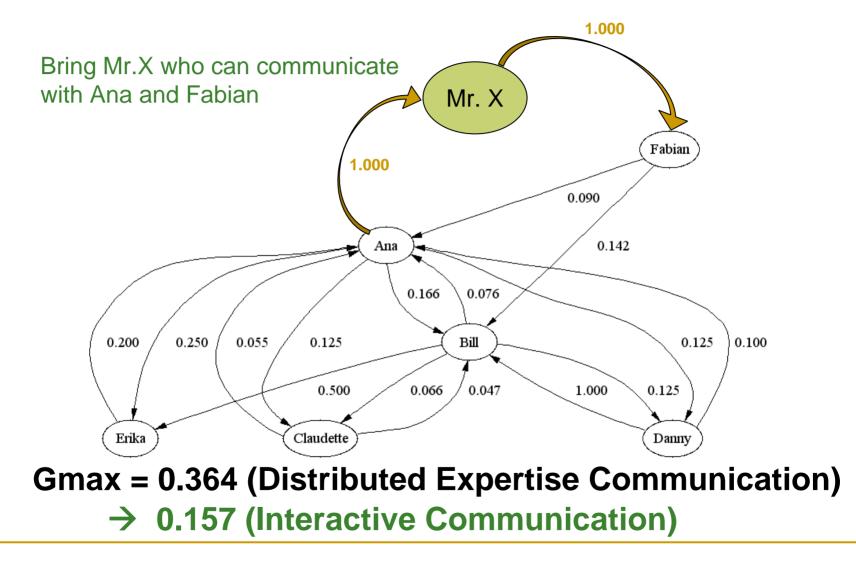
Communication Gaps of Individuals



Remedy 1



Remedy 2



Conclusion and Future Direction

- We have proposed a method to re-organize communication structures for innovative communication based on Communication Gap in a social network.
- IDM has already implemented on DISCUS (Distributed Innovation and Scalable Collaboration in Uncertain Settings) platform developed at IlliGAL and ALG/NCSA.
- As a future direction, we will apply Communication Gap methodology on DISCUS platform to re-organize the communication structures and accelerate the emergence of human innovation.

