

Managing Online Business Communities

The ROBUST Project

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Business Communities

- Information ecosystems
 - Employees
 - Business Partners, Customers

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Valuable asset

Opportunities

- General Public



Risks

Use Cases

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Lotus Connections

Communities

- Employees
- Working groups
- Interest Groups
- Projects

Business value

- Task relevant information
- Collaboration
- Innovation

Volume

- 4,000 posts/day
- 386,000 employees
- 1.5GB content/day

Employees Intranet



SAP Community Network (SCN)

Communities

- Customers
- Partners
- Suppliers
- Developers

Business value

- Products support
- Services
- Find business partners

Volume

- 6,000 posts/day
- 1,700,000 subscribers
- 16GB log/day

Business Partners Extranet



MeaningMine

Communities

- Social media
- News
- Web fora
- Public communities

Business value

- Topics
- Opinions
- Service for partners

Volume

- 1,400,000 posts/day
- 708,000 web sources
- 45GB content/day

Public Domain Internet













The ROBUST platform

Risk Dashboard and Visualizations



A new Role: the Community Manager



• Definition of risks/opportunities

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- Monitoring
- Interaction with community
- Reaction and countermeasures

 \rightarrow Need for a control center







Community Health: Graphic Equalizer







Community Analysis, User Roles & Risk Management

Determine Risk: Users Leaving the Community







- Users churn = Users leave the community, become inactive
- Questions:
 - Why do users leave the community?
 - Who is leaving the community?
 - Impact?
- Tasks:
 - Detect "Churn"
 - Predict "Churn"
 - Evaluate "Churn"



What is Churn? Activity?











• Churn: churning users influence other users they communicate with



Temporal ordering: Churners that churned subsequent to each other

Frequently, after a slow start, resulting in a cascade of churning

probability to churr

0.6

2 posts

10

number k of churning neighbours



15

20

25

• A role represents the standing, or part, that a user has within a given community

Role \ Dimension	Reciprocity	Initialisation	Persistence	Popularity
Elitist	high: Threads low: Neighbours			low
Joining Conversationalist		low	high	
Popular Initiator		high		high
Supporter	medium	low		medium
Taciturn	low		low	
Ignored				low: No replies



ROBL





Compile Rule Base

Run rules over each user's features and derive the community role composition

Community Composition @ t=k Apply Rules

Based on related work, we associate roles with a collection of feature-to-level mappings e.g. in-degree -> high, out-degree -> high



Behaviour

Ontology

Skeleton

Rule Base

Churn Analysis on Roles

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• Role composition in community



 Development towards an unhealthy role composition!





Community & Content Analysis

Opportunity Detection: Discovering Interesting Contents



IBM Connections

IBM Connections Home Profi	les - Communities - Apps -		Suzanne Livingston Settings	Feedback Help English - Log Out
My Communities Public Commu	unities		E This Community	- Search Q
IBM Collaboration Solution	s Marketing Community		Follow t	his Community Join this Community
IBM Collaboration Solutions Marketing Community	Overview This community is designed to foste Kristen Lauria, VP of Marketing. Tags: collaboration_solutions, ics_mark	er collaboration and ignite innovation. This is your entry p	point to ICS Marketing, led by	Important Bookmarks 2011 ICS Activities Analyst Buzz Collaboration Scoppor
22.00	Events (BETA Widget)	Stream Analysis.doc.	*=	Cross IBM Communications Contacts
Overview	W3C Social Bu 08 - 10 Nov 20 09:00 AM - 05:	Yi Chun Wang created a new bookmark named <u>blueDoodle.</u> a good way to find a meeting time 4 minutes ago	lall - November 9	External Communication Vehicles IBM Social Business Update
Members Events (BETA Widget) Blog	View: All current (2) All (Chris Banes edited the wiki page <u>Welcome</u> in the <u>Young Professional's Community and Social</u> <u>Events</u> wiki. 27 minutes ago	88T	ICS Client References Wiki ICS Geo Contacts ICS Marketing org chart ICS Pipeline Community
Wiki Bookmarks Files	Blog Drive 4Q IBM Lotus KRISTEN LAURIA Tuest	David Jones commented on the Jazz-Connections check-point Meeting Minutes blog entry in the Jazz-Connections Integration 2 hours ago	<u>~=</u>	ICS ThumpBook Community ICS Tiger Team & Competitive Marketing Internal Communication
▼ Tags	Let's make it bigge Sharnette Mitchell 25 Oc	David Rose created a new thread named 2015 Roadmap Q&A / Discussion in the Canada Services Community 6 hours ago	☆0 ₹	Vehicles Lotus Messaging and Collaboration Blog
Find a Tag adoption analysts analytics	Analogies to	 Eitan Shapiro wrote on the board of Mark Smith Hi Mark, here is a feedback activity for the widgets yesterday 	☆0 ¥	Social Business Demand Program Town Hall charts / replays
articles assets ba basf blo blueiq blueiq-ambassadors business business-value capture centennial chro collaboration competition	Twitter!	Visits Il Business JamCamp in an IBM Social Business Visits	s branded bus 🚖1 🍹	Members T
connections connection	View All			



Retweets

WeST



Retweets





mstrohm Markus Strohmaier 13 by tgottron RT @katenieder: "She's an influencer because she's a filter." nouveau definition of influence. Nice!



dret Erik Wilde 13 by tgottron

#www2011 flashback: the #websci11 program looks like the the next large batch of twitter papers. http://is.gd/Oi9Byy #twitter≠web 5 Apr



munmun10 Munmun De Choudhury 13 by tgottron "Puppy power laws!" http://messymatters.com/2011/03/31/powerlaws/ /via @jakehofman How about one for lolcats? =D 5 Apr



zmarty Ovidiu Dan 13 by tgottron Our work, "Predicting Popular Messages in Twitter", won the Best Poster Award at #www2011 - http://bit.ly/i4hBKH



dbworld_DBWorld Updates 13 by tgottron ESSIR 2011 - European Summer School in Information Retrieval --2011-03-31 - ESSIR 2011 - European Summer... http://tumblr.com/xqx1u48eaq 21 Mar



xeeliz Elizabeth Churchill 13 by tgottron Emotions on Twitter - Women express more joy and sadness on Twitter, men express more anger and frustration - Kivran-Swaine #cscw2011

22 Mar



thetarro Salvatore Scellato 13 by tgottron our paper "Measuring User Activity on an Online Location-based Social Network" to appear at #NetSciCom is now online!

- Retweet indicates quality
 - "of interest for others"

• Idea:

3

- Learn to predict retweets!

Likelihood of retweet as metric for Interestingness

WeST People and Knowledge Networks Aim: Prediction of probability of retweet

Logistic regression:

$$f(z) = \frac{1}{1 + e^{-z}}$$

$$\mathbf{Z} = \mathbf{W}_0 + \mathbf{W}_1 \mathbf{X}_1 + \mathbf{W}_2 \mathbf{X}_2 + \ldots + \mathbf{W}_n \mathbf{X}_n$$

Model parameters w_i learned on training data

Dataset	Users	Tweets	Retweets
Choudhury	118,506	9,998,756	7.89%
Choudhury (extended)	277,666	29,000,000	8.64%
Petrovic	4,050,944	21,477,484	8.46%



Logistic Regression: Weights



Feature	Dimensions	Weight
Constant	(intercept)	-5.45
	Direct message	-147.89
Maccago foaturo	Username	146.82
wiessage leature	Hashtag	42.27
	URL	249.09
	Valence	-26.88
Sentiment	Arousal	33.97
	Dominance	19.56
Emoticons	Positive	-21.8
	Negative	9.94
Evelomation	Positive	13.66
	Negative	8.72
Dunctuation	<u>!</u>	-16.85
	?	23.67
Terms	Odds	19.79



Торіс	Weight	
social media market post site web tool traffic network	27.54	
follow thank twitter welcome hello check nice cool people	16.08	
credit money market business rate economy home	15.25	
christmas shop tree xmas present today wrap finish		
home work hour long wait airport week flight head	-14.43	
twitter update facebook account page set squidoo check		
cold snow warm today degree weather winter morning		
night sleep work morning time bed feel tired home	-75.19	



Naveed et al. CIKM 2011

• Top-k interesting tweets for "beer"

Rang	Username	Tweet
1	BeeracrossTX	UK beer mag declares "the end of beer writing." @StanHieronymus says not so in the US. http://bit.ly/424HRQ #beer
2	narmmusic	beer summit @bspward @jhinderaker no one had billy beer? heehee #narm - beer summit @bspward @jhinde http://tinyurl.com/n29oxj
3	beeriety	Go green and turn those empty beer bottles into recycled beer glasses! http://bit.ly/2src7F #beer #recycle (via: @td333)
4	hblackmon	Great Divide beer dinner @ Porter Beer Bar on 8/19 - \$45 for 3 courses + beer pairings. http://trunc.it/172wt
5	nycraftbeer	Interesting Concept-Beer Petitions.com launches&hopes 2help craft beer drinkers enjoy beer they want @their fave pubs. http://bit.ly/11gJQN
6	carichardson	Beer Cheddar Soup: Dish number two in my famed beer dinner series is Beer Cheddar Soup. I hadn't had too http://bit.ly/1diDdF
7	BeerBrewing	New York City Beer Events - Beer Tasting - New York Beer Festivals - New York Craft Beer http://is.gd/39kXj #beer
8	delphiforums	Love beer? Our member is trying to build up a new beer drinker's forum. Grab a #beer and join us: http://tr.im/pD1n
9	Jamie_Mason	#Baltimore Beer Week continues w/ a beer brkfst, beer pioneers luncheon, drink & donate event, beer tastings & more. http://ping.fm/VyTwg
10	carichardson	Seattle and Beer: I went to Seattle last weekend. It was my friend's stag - he likes beer - we drank beer http://tinyurl.com/cpb4n9



LiveTweet

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http://livetweet.west.uni-koblenz.de/



Che Alhadi et al. TREC 2011, ECIR 2012

EC Project 257859

Tomorrow I am going to ...



... play tennis

- ... play golf
- ... do some gardening
- ... spread wisdom
- ... go to a Justin Bieber concert

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... win the lottery





Community Simulation

Risk Mitigation: Simulating Effects of Policy Changes



Policies



- Governance of Communities
 - Def.: Steering and coordinating actions of community members
- Implementation:
 - Direct intervention of community owner
 - Functionality of the community platform
- Mitigation of risks:
 - Change platform functionality
 - Impact?



Governance by Policy Change



- Users generate content
- Users search content
- Users consume content
- Users interact with content
 - Rate content
 - Reply to content
- Where can a (platform) policy have effects?



Policy impacts on user behaviour





- Part of Community: forum activity
- Goal: Steer user activity to specific forums

- User model parameters:
 - Activity rate for creating threads
 - Activity rate for creating replies
 - Preferences for activity in specific forums
- Community Model
 - Varied restrictions for thread creation
- Observed Metrics
 - Response time on threads



Simulation based on observed parameters **ROBUST**





- Users search content
 - Presentation \rightarrow Ranking threads in content views

- Recency
- Social Closeness
- Topical closeness
- Popularity
- Observation: Influence which questions are answered
- Users generate content
 - Restrict number of questions asked per forum
 - Users turn to other questions
 - Observation: Response time in some fora reduced





Backend Technologies

Indexing Distributed Semantic Graphs



- Examples
 - Male persons who have a public profile document
 - Computing science papers authored by social scientists
 - American actors who are also politicians and are married to a model.
- Maybe specific databases available:
 - Person search engines
 - Bibliographic databases
 - Movie database

How to integrate?



Linked Data



Semantic Web Technology to

- 1. Provide structured data on the web
- 2. Link data across data sources





The LOD Cloud















Schema Index Overview



How it works ...



SELECT ?x
FROM ...
WHERE {
 ?x rdfs:type foaf:Person .
 ?x rdfs:type pim:Male .
 ?x foaf:maker ?y .
 ?y rdfs:type
 foaf:PersonalProfileDocument .
}





How it works ...





Building the Index from a Stream

Stream of data (coming from a LD crawler)





Does it work good?



Winner BTC 2011

Comparison of stream based vs. Gold standard Schema on 11 M triple data set







Managing Business Communities

Lessons learned





- Business communities vary with regard to
 - Interaction
 - Interests
 - Type of conversation
- Novel analysis techniques needed:
 - Integration of different data sources
 - Simulation of policy changes
 - Value of users
- Concrete needs confirmed by project external companies looking for such technology



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Thank You!





