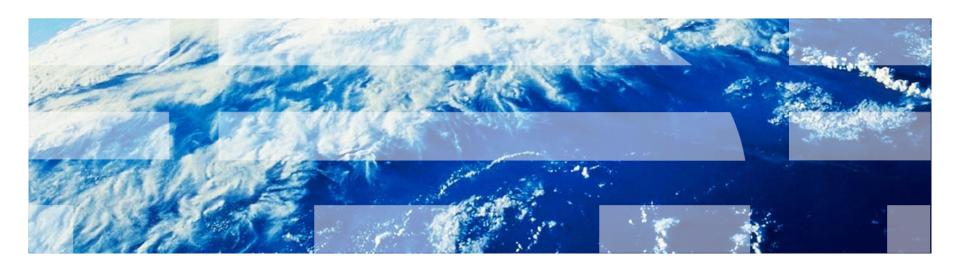


Social Media Sentiment Analysis





Agenda

- What is sentiment analysis?
- Implementation overview
- What did we use?
- Examples:
 - Euro 2012
 - London 2012
 - Mobile World Congress 2013
 - CeBIT 2013
- Summary









What is sentiment analysis



- About 12+ TB of new messages each day
- 25 TB of data in total per day

20 000 000 of tweets x 140 characters = 1 400 000 pages Let's assume 300 pages per book...

... about 4700 books

- In a nutshell, sentiment analysis (opinion mining) involves analyzing comments (feelings, emotions, opinions) left on social portals.
- Sophisticated methods were used to identify and extract subjective information from the material.



Implementation overview

Data gathering phase

Visualization

Parsing the data and loading into the database

Analytic phase

Transformation and normalization



What did we use?

IBM PureData System for Analytics with Map-Reduce

- Data transformation and normalization
- Splitting sentences into words
- Explanation of acronyms
- Removing stop words
- Discovering the language
- Processing queries and analytics

IBM Spss Modeler

- Discovering relationships in the data
- Presentation layer

Revolution R Enterprise

- Analytical computations
- Presentation layer

Tweeter API

Tweeter Streaming and Search API

IBM PureData System for Analytics The Simple Appliance for Serious Analytics

Built-in Expertise

- No indexes or tuning
- Data model agnostic
- Hardware accelerated, fully parallel, optimized, In Database Analytics

Integration by Design

- Server, Storage, Database in one easy to use package
- Automatic parallelization and resource optimization to scale efficiently and economically
- Enterprise-class security and platform management

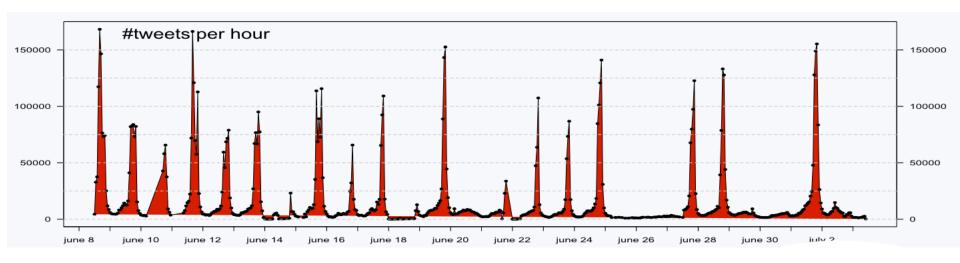
Simplified Experience

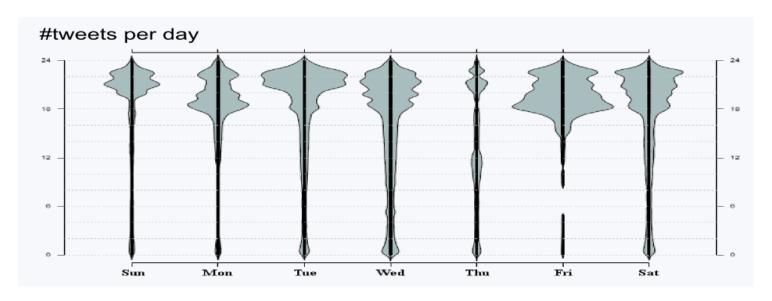
- Up and running in hours
- Minimal up front design and tuning
- Minimal ongoing administration
- Standard interfaces to best of breed Analytics, Business Intelligence, and data integration tools
- Built-in, complex analytical capabilities allow users to derive insight from their data quickly
- Easy connectivity to other Big Data Platform components





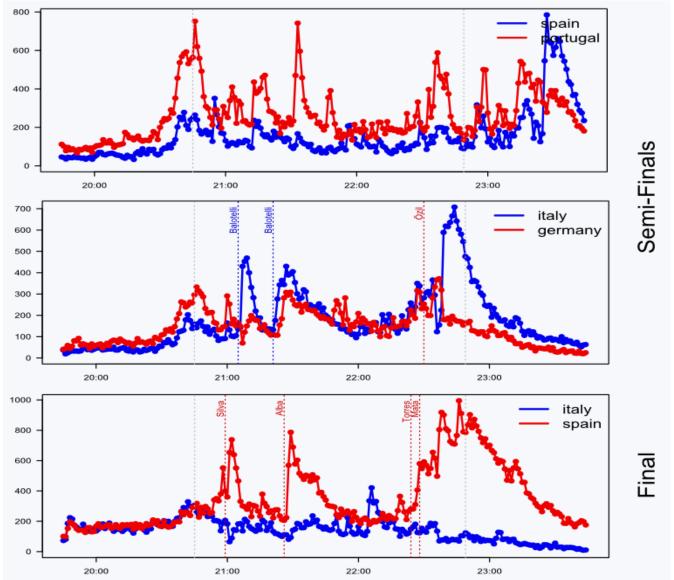
Euro 2012 – posts per hour and per day





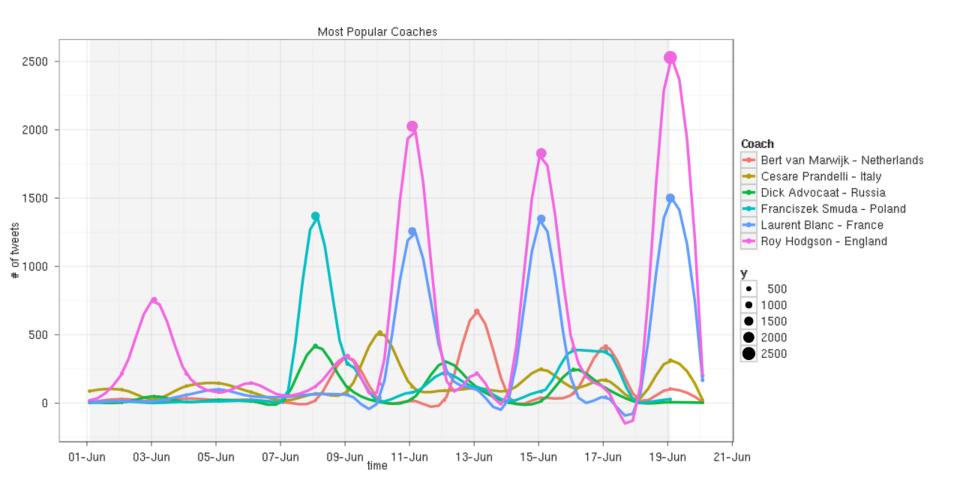


Euro 2012 – semi finals and final sentiment





Euro 2012 – most popular coaches in group phase





Euro 2012 – users predictions of games' scores

	Team 1	Score	Hits	Team 2		Team1 wins / draw / Team 2 win	s Predi	ctions		
	Poland	1-1	11%	Greece 🧯		68.9% / 18.3% / 12.9%	2-1	21%	2-0	21%
	Russia	4-1	1%	Czech		69.8% / 22.2% / 8%	2-1	21%	2-0	20%
	Netherlands	0-1	0%	Denmark 🧲		91.9% / 6.1% / 2%	3-1	24%	2-0	24%
	Germany	1-0	3%	Portugal		77.2% / 15.6% / 7.2%	2-1	29%	3-1	21%
	Spain	1-1	12%	Italy (70.8% / 12.5% / 16.7%	2-0	42%	1-0	21%
	Ireland	1-3	2%	Croatia 🤇		25.8% / 33.9% / 40.3%	1-1	27%	1-2	23%
	France	1-1	18%	England =	Ð	40.9% / 24.3% / 34.8%	1-1	18%	2-1	17%
	Ukraine	2-1	6%	Sweden		16.8% / 28.2% / 55%	1-2	19%	1-1	16%
	Greece	1-2	22%	Czech		21.1% / 32.4% / 46.5%	1-1	23%	1-2	22%
	Poland	1-1	5%	Russia		8.4% / 16% / 75.6%	1-3	25%	1-2	24%
	Denmark	2-3	0%	Portugal		11.8% / 27% / 61.2%	1-2	21%	1-1	20%
	Netherlands	1-2	22%	Germany		21.9% / 34.7% / 43.4%	1-2	22%	1-1	17%
	Italy	1-1	33%	Croatia 🤇		42.4% / 42.4% / 15.2%	1-1	33%	2-1	21%
182	Spain	4-0	21%	Ireland		87.5% / 4.2% / 8.3%	3-0	46%	4-0	21%
	Ukraine	0-2	25%	France		6.1% / 12.4% / 81.4%	1-2	26%	0-2	25%
	Sweden	2-3	1%	England 🗧	•	3.8% / 15.1% / 81.1%	1-2	25%	0-2	23%
	Czech	1-0	2%	Poland		18.3% / 28.2% / 53.4%	1-2	38%	1-1	21%
	Greece	1-0	1%	Russia		1.9% / 3.9% / 94.2%	0-3	29%	0-2	27%
	Denmark	1-2	16%	Germany		3.9% / 10.3% / 85.8%	0-2	33%	1-2	16%

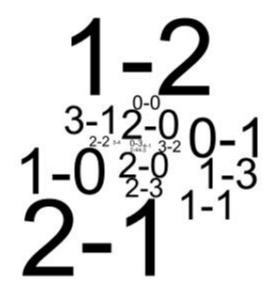


Euro 2012 finals - users' predictions





11







Euro 2012 – most popular topics in host cities

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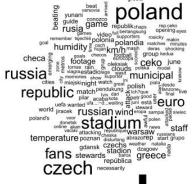


poznan

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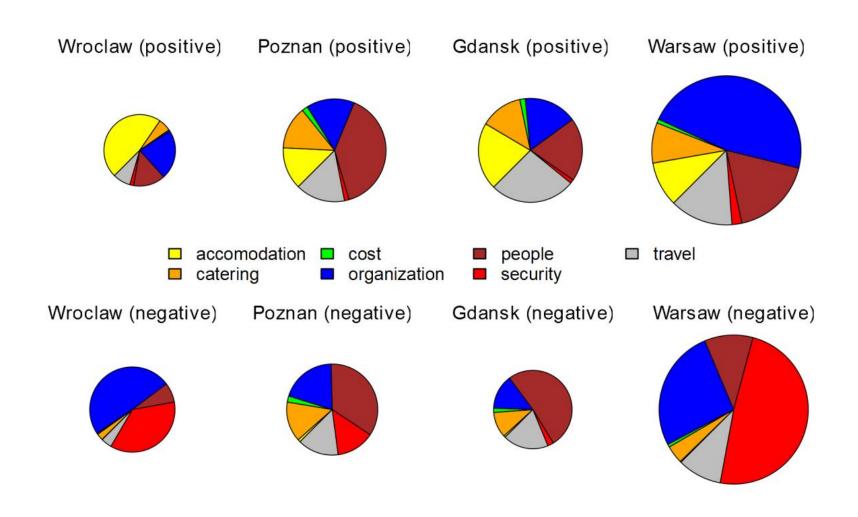
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wroclaw

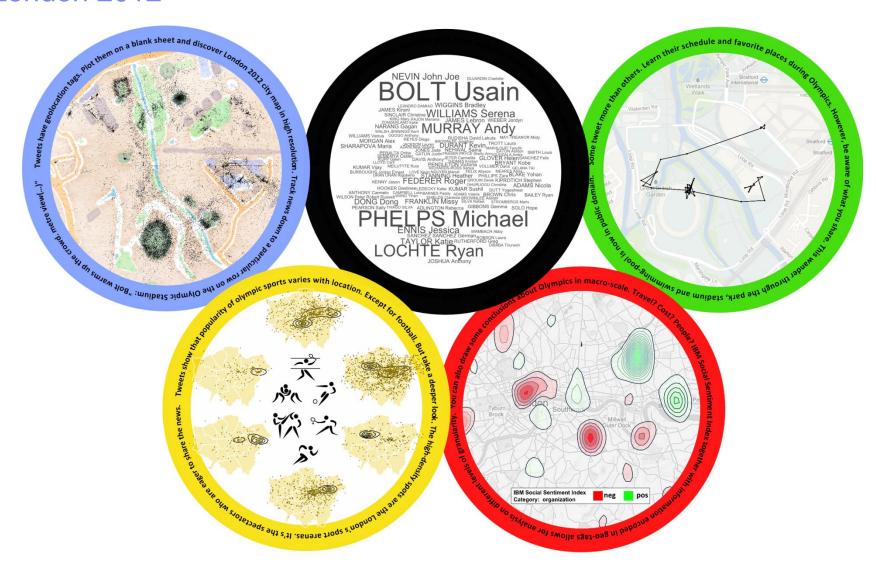


Euro 2012 – opinions about the organisation of the event



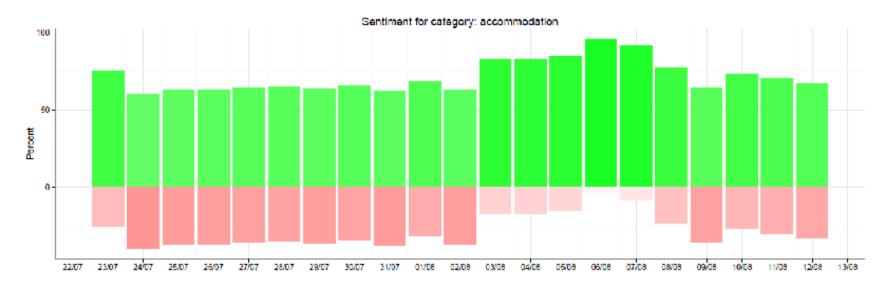


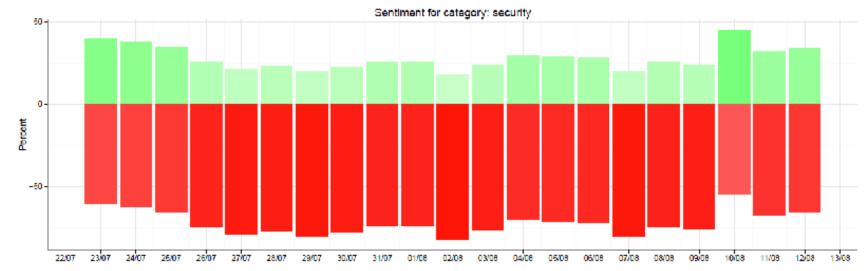
London 2012





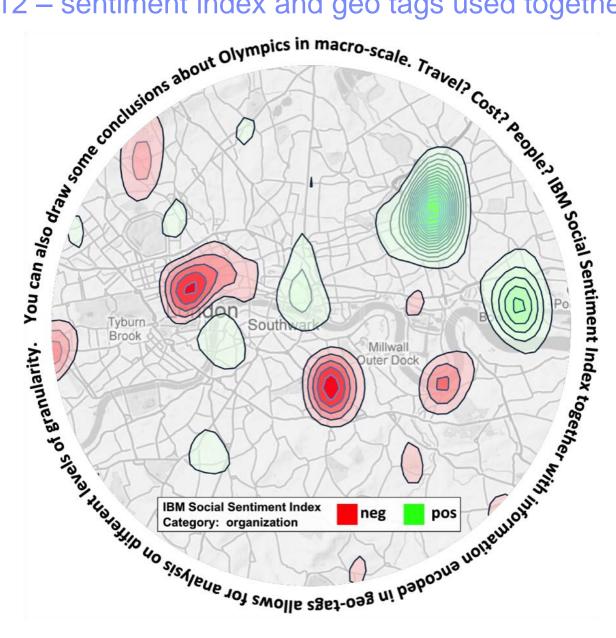
London 2012





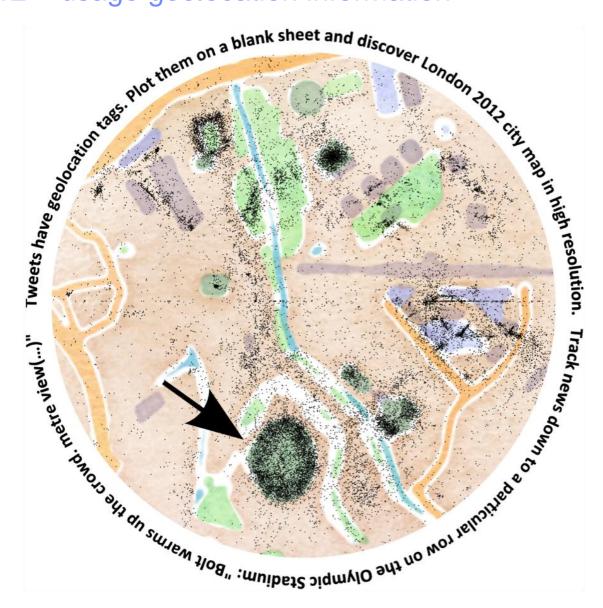


London 2012 – sentiment index and geo tags used together



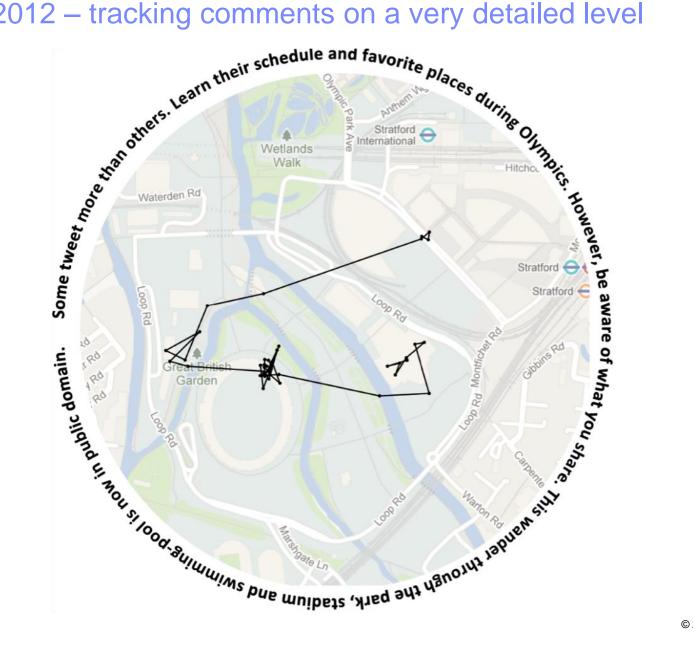


London 2012 – usage geolocation information



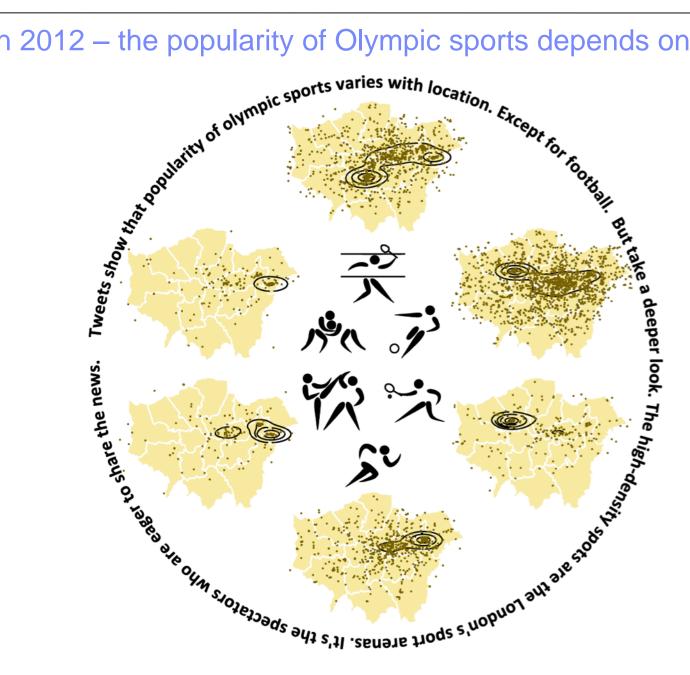


London 2012 – tracking comments on a very detailed level

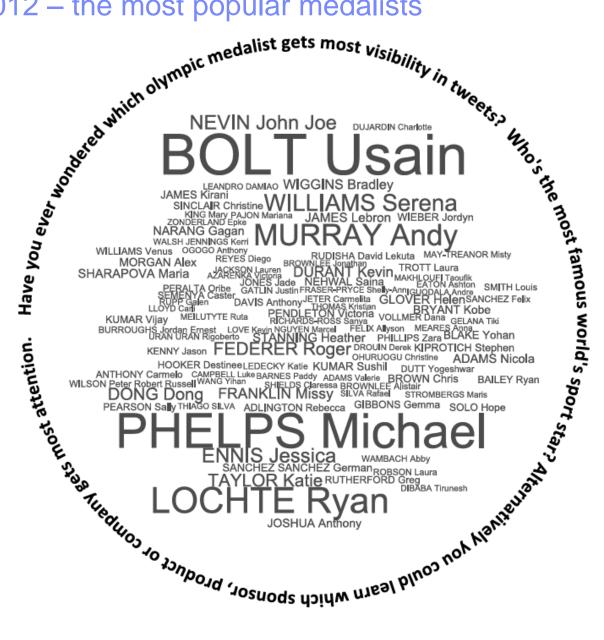




London 2012 – the popularity of Olympic sports depends on location



London 2012 – the most popular medalists

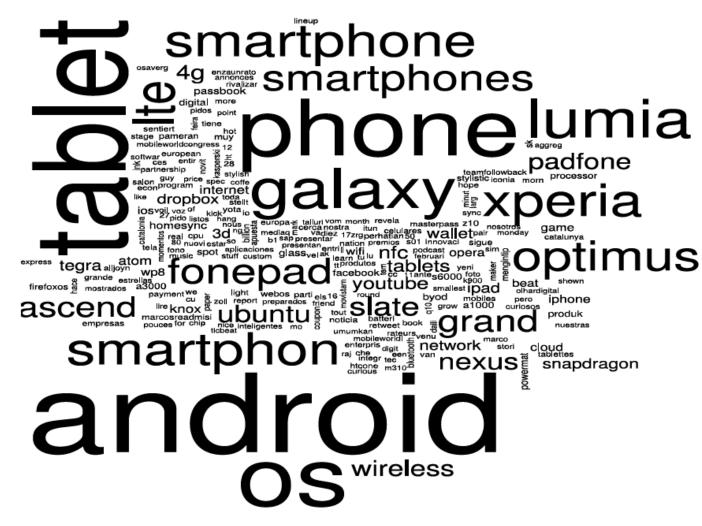






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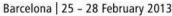
Main topics

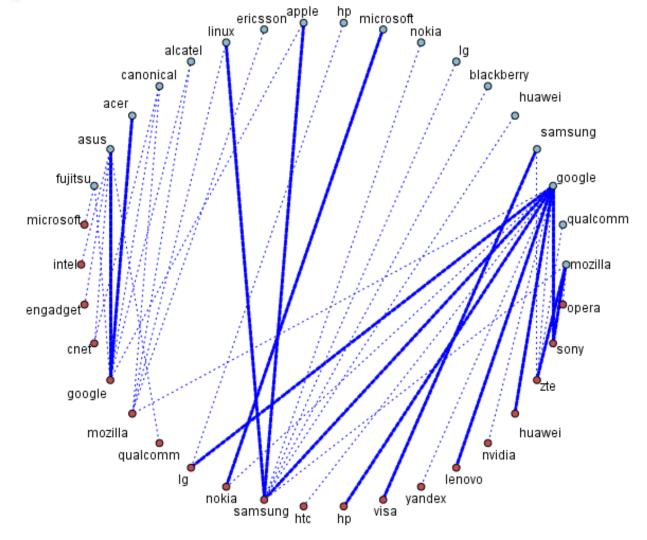






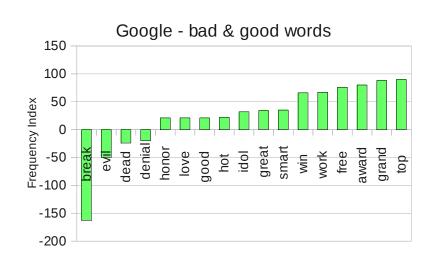
Pair of companies mentioned in a single comment

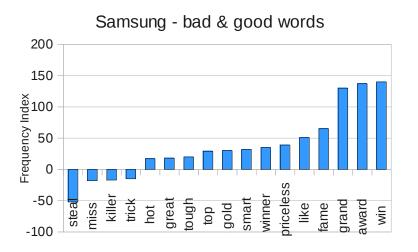




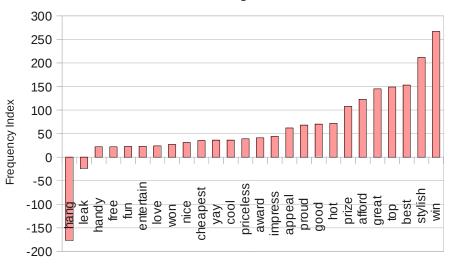


MWC 2013 – what people say about the most popular companies





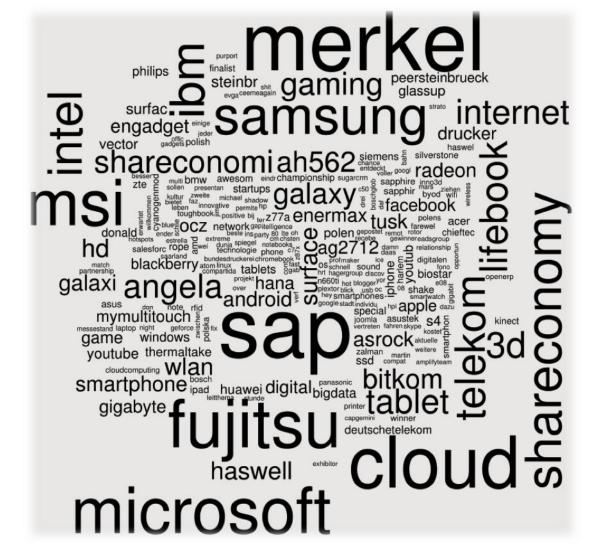
Nokia - bad & good words







Most popular topics

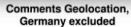


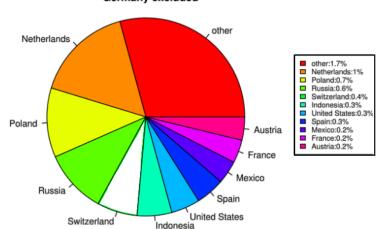


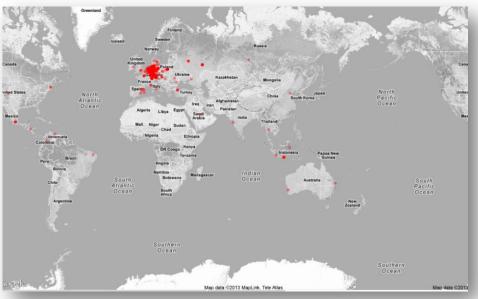
© 2013 IBM Corporation

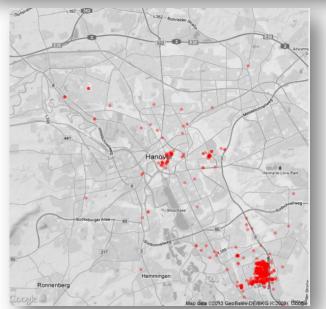
CeBIT 2013 – sources of comments







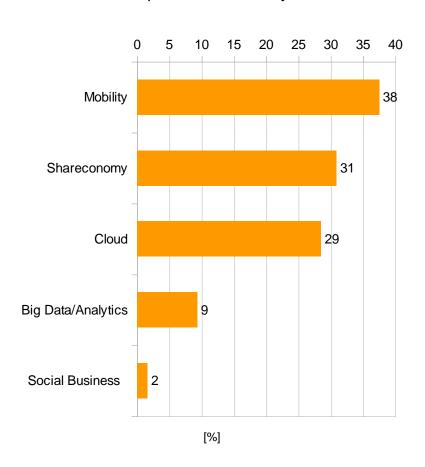




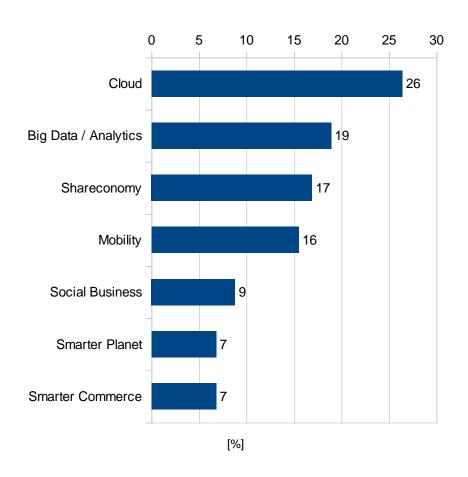


CeBIT 2013 – the popularity of top trends in technology





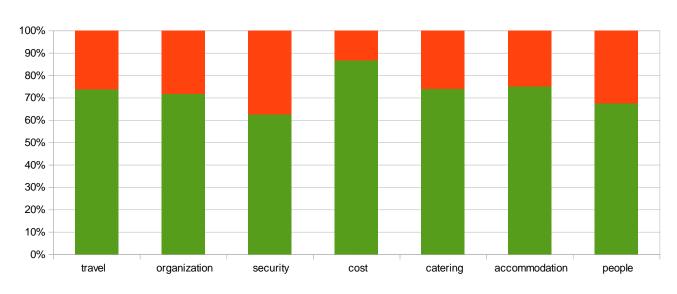
Top Trends Polularity (IBM only)



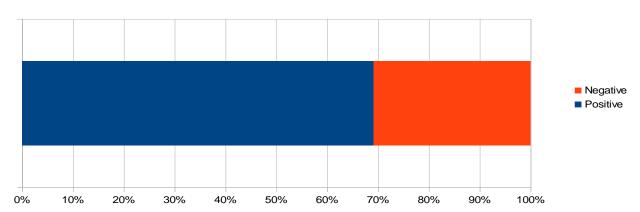


CeBIT 2013 – sentiment in categories

Sentiment in Categories



Overal Satisfaction Factor





Sentiment analysis allows to...

- Measure customers' reactions after a product lunch
- Analyze what people hear and say about a company or a product
- Answer the questions: Which features of a product are mostly commented on? What are the pros and cons?
- Track the activities of the competition. What do they say and do to gain customers? What do people think about the competitors?
- Measure the success of advertising campaigns





Thank you!

tomasz.stradomski@pl.ibm.com