## **Advanced Topics**



# Social Spam, Campaigns, Misinformation and Crowdturfing (Not part of Exam)



## Large-Scale Social Systems

Online Social Networking







**Social Media** 







Information sharing communities







**Social Games** 









Locationbased Services









Crowd-based services











## **Key Organizing Principles**

#### Openness:

- Social systems are inherently open to users who generate, share and consume information
- E.g., post a message, upload and watch a video
- Collaboration:
  - Many users organically participate in social systems to engage in collaborative activities
  - E.g., organize for political change, share disaster-related information
- Real-time information propagation:
  - Users, media and organization post information related to hot events in (near)
     real-time
  - E.g., emergency alerts, natural disaster news and sports games
- Crowdsourcing tasks or hiring cheap workers from all over the world:
  - People can hire workers from crowdsourcing sites with paying little money
  - E.g., workers from Amazon Mechanical Turk for labeling data, workers from Fiverr for editing a document



## Challenges and Research Approach

#### These necessary positive aspects may also lead to negative consequences

- Spam of many flavors
  - Comment spam (~90% on websites = 46 billion)
  - Spam tweets (1% = 3 million/day) and Twitter spammers (5% = 25 million)
  - Spam videos (20%)
- Traditional Attacks
  - Phishing, malware and etc
- Campaigns
- Misinformation
- Crowdturfing
- Misuse
  - Crowdsourcing the wrong guy in the Boston bombings at Reddit
- ...



#### **Fake Accounts**

9% on Facebook = 87 million accounts in 2012 [Facebook]





## **Comment Spam**

83 ~ 90% on websites = 46 billion comments [Akismet and Mollom. 2010,
 Kant et al. WSDM 2012]

#### Rosiane

facebook.com/profile.php?id=10000340 6202721 x m.smealen@mail.ru 100.143.232.12

#### Submitted on 2012/07/02 at 09:27

you people may not belivee at all but i can and will tell you that between heaven and earth are things beyond the reach of ordinary man and women, you people do not know what knowledge is and you would not gain any knowledge if its not by some devine revelation is this the book of the devil maybe but it sure as hell is not for ordinary folks like you people to read, you could not handle it any one of you, before you open the book of the devil you better make sure your in a right pad with GOD Jehova.

#### Urvi

facebook.com/profile.php?id=10000340 6194827 x info@sms-vluchtelingen.nl 188 143 232 12

#### Submitted on 2012/07/02 at 02:20

I had a spambot at my potrey site post something regarding the size of her husband. All I can say is Mr. Jeremy must be glad he isn't married to her. Then there's the one with the guy wanting to sell his bridal dresses.

#### best affiliate website

home-businessreviews.com/Turnkey-Affiliate-Websit... x justinjki111558@gmail.com 46.109.196.107

#### Submitted on 2012/06/29 at 04:34

Make \$1,000's Weekly with a Health Internet Business of Your Very Own

Now get a complete fully-operational "Health eBiz" in a box!

This amazing site:

- \* Closes sales automatically for you!
- \* Has a complete electronic sales manager that makes all upsells for you!



## Spam Tweets and Twitter Spammers

#### 1% Spam tweets and 5% Twitter spammers

3 million spam tweets/day and 25 million spam accounts
 [Twitter and TwitSweeper, 2010]



<u>cphtlink</u>: for all those wondering about the twitter trend i do believe **Apple Shampoo** refers to a Blink 182 song.

10 minutes ago from web - Reply - View Tweet



<u>TrevBusiness</u>: <u>#apple</u> shampoo Getting strange calls? Reverse Phone Detective to find out who's bothering you! <u>www.SmallBusinessSolved.com/r/</u>

10 minutes ago from web · Reply · View Tweet



<u>TrevBusiness</u>: #apple shampoo This website to give me great ideas to do on a daily to get the love flowing <a href="https://www.SmallBusinessSolved.com/m/">www.SmallBusinessSolved.com/m/</a>

10 minutes ago from web - Reply - View Tweet



## Spam Videos

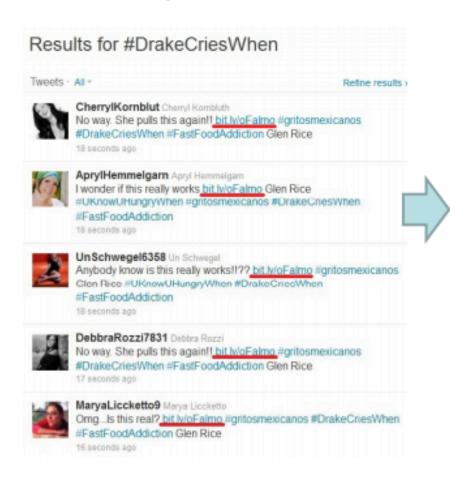
- 183 million U.S. Internet users watched more than 37 billion online videos in Oct 2012. [comScore]
- 20% of online videos are spam [VideoSurf]





## Collective Attention Spam

- Target popular and trendy topics/items
- Feed spam contents once the topics/items become popular







### **Campaigns**

#### Astroturfing

The need to protect the internet from 'astroturfing' grows ever more urgent

The tobacco industry does it, the US Air Force clearly wants to astroturfing - the use of sophisticated software to drown out real people on web forums - is on the rise. How do we stop it?



reading is written by one of these creatures. Photograph: Jeff Blackler Rex Features.

#### Fake review campaign

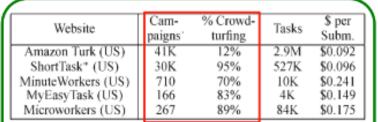
I of I people found the following review helpful: of 2 people found the following review helpful: 常常常常 Like a tape recorder..., December 8, 2004 常常常常 Practically FREE music, December 4, 2004 his review is from: Audio Xtract (CD-ROM) This review is from: Audio Xtract (CD-ROM) I can't believe for \$10 (after rebate) I got a program that gets This software really rocks. I can set the program to record me free unlimited music. I was hoping it did half what was . music all day long and just let it go. I come home and my 3 of 8 people found the following review helpful: of 10 people found the following review helpful: 常常常常 Yes-it really works, December 4, 2004 常常常常 This is even better thus..., December 8, 2004 This review is from: Audio Xtract Pro (CD-ROM) his review is from: Audio Xtract Pro (CD-ROM) See my review for Audio Xtract - this PRO is even better. This Let me tell you, this has to be one of the coolest products even The other day I ungraded to this TOP NOTCH product. is the solution I've been looking for. After buying iTunes, on the market. Record 8 internet radio stations at once, 5 of 5 people found the following review helpful: 5 of 5 people found the following review helpful: TRACK My kids lose it. December 4, 2004 東京京京 For the price you..., December 8, 2004 Disseries is from Pand Aguarium 3D Delune Edition his review is from Pend Aguariam 3D Deluye Edition This was a largain at \$20 - better than the other ones that have This is one of the coolest screensurers I have ever seen, the fish We have this set up on the PC at home and it looks GREAT no above water scenes. My kids get a kick out of the move realistically, the environments look real, and the

東京京京 Waw, internet music! .... December 4, 2004 is review is from Audio Xtract (CD-ROM) looked forever for a way to record internet music. My way took a long time and many steps (frustriaing). Then I found Audio Xtract. With more than 3,000 songs downloaded in ... 2 of 9 people found the following review helpful: 常常常常 Best music just gut ..., December 4, 2004 his review is from: Audio Xtract Pro (CD-RO91) Everyone who loves music needs to get it from Internet ... of 3 people found the following review helpful: REFER Cool, looks great..., December 4, 2004 his review is from Pond Aquarium 3D Delung Edition

The fish and the scenes are really neat. Friends and family ..

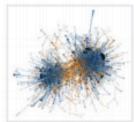
Big John's Profile Cletus' Profile Jake's Profile





Wang et al. WWW 2012

#### Political campaign



#### **Bogus Grass-Roots Politics on** Twitter

Data-mining techniques reveal fake Twitter accounts that give the impression of a vast political movement.

TUESDAY, NOVEMBER 2, 2010 BY KURT KLEINER

-31 AMERIC II

How true? This network graph shows the connections between 6.278 accounts that used the hashtag #gop in September and October 2010. Indiana University

techniques to detect the activity.

Researchers have found evidence that political campaigns and special-interest groups are using scores of fake Twitter accounts to create the impression of broad grass-roots political expression. A team at Indiana University used data-mining and network-analysis

"We think this technique must be common," says Filippo Menczer, an associate professor at Indiana University and one of the principal investigators on the project. "Wherever there are lots of eyes looking at screens, spammers will be there; so why not with politics?"



## Adversarial Propaganda

- Create and spread rumors and Misinformation
- Target a product/ government

#### Pentagon Wants a Social Media Propaganda Machine

BY ADAM RAWNSLEY 07.15.11 2:40 PM

Follow @arawnsley



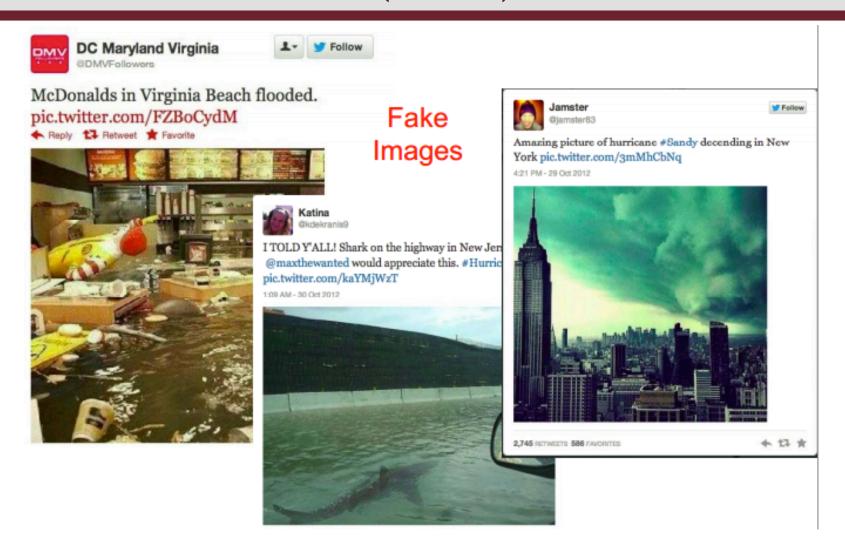


You don't need to have 5,000 friends of Facebook to know that social media can have a notorious mix of rumor, gossip and just plain disinformation. The Pentagon is looking to build a tool to sniff out social media propaganda campaigns and spit some counter-spin right back at it.

[Wired]



## Misinformation (Fake)





#### Crowdturfing (Crowdsourcing + Astroturfing)

- A Multimillion-dollar industry in Chinese crowdsourcing sites
  - 90% crowdturfing tasks [MIT Technology Review]
- 70~95% crowdturfing tasks at several U.S. crowdsourcing sites [Wang et al., WWW 2012]

Employer: Member 968289@

#### Twitter Post: CPP Scam

Work done: 222/<sup>250</sup>

You will earn \$0.60

This task takes less than 30 min to finish

Job ID: 364488d297e8

#### ? What is expected from Workers?

You must have 50 Twitter followers. Make sure you are logged into your Twitter account

- Open your browser and search on Google "college pro painters success"
- Click on any search result that starts with collegepropainters cam. com
- Go to Home Page of the website
- Retweet any article



## **Examples of Crowdturfing**

Vietnamese propaganda spread by 1,000 crowdturfers

#### Vietnam admits deploying bloggers to support government

By Nga Pham BBC News, Hanoi

Vietnamese propaganda officials have admitted deploying people to engage in online discussions and post comments supporting the Communist Party's policies.

The party has also confirmed that it operates a network of nearly 1,000 "public opinion shapers".

They are assigned with the task of spreading the party line.

The tactic is similar to China's model of internet moderators who aim to control news and manipulate opinion.

#### 'Political opportunists'

Hanoi Propaganda and Education Department head Ho
Quang Loi said that the authorities had hired hundreds of
so-called "internet polemists" in the fight against "online
hostile forces".



The bloggers have been hailed for stopping negative online rumours



### Social Spam

- Fake accounts (5 ~ 6 % on Facebook = 42 million)
  - [Facebook. 2012]
- Comment spam (83 ~ 90% on websites = 46 billion)
  - [Akismet and Mollom. 2010, Kant et al. WSDM 2012]
- Spam Tweets (1% = 3 million/day) and Twitter Spammers (5% = 25 million)
  - [Twitter. 2010, TwitSweeper. 2010, Lee et al. SIGIR 2010, Lee et. al ICWSM 2011, Yang et al. WWW 2012]
- Tag spam
  - [Koutrika et al. TWEB 2008, Krause et al. AIRWEB 2008, Neubauer et al. AIRWEB 2009]
- Spam videos
  - [Benevenuto et al. AIRWeb 2008, Benevenuto et al. SIGIR 2009]
- Fake Reviews
  - [Jindal and Bing ICDM 2007, Lim et al. CIKM 2010, Wang et al. TIST 2011, Mukherjee et al. WWW 2012]
- Voting spam
  - Bian et al. AIRWEB 2008, Tran et al. NSDI 2009]
- Wikipedia vandalism
  - [Potthast et al. ECIR 2008, Chin et al. WICOM 2010, Adler et al. CICLing 2011]
- ...



#### How to detect these?



## Blacklisting URLs

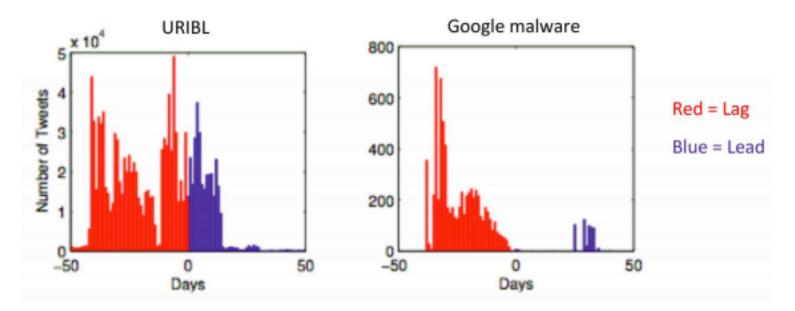
- Crawled URLs from Twitter
  - 25 million URLs crawled
  - 8% of them link to spam pages
- Over 80% of spam URLs were shortened
  - Mask landing site
    - http://bit.ly/aLEmck -> http://i-drugspedia.com/pill/Viagra...
  - Defeat blacklist filtering
    - bit.ly -> short.to -> malware landing page

Grier, C., Thomas, K., Paxson, V., and Zhang, M. @spam: the underground on 140 characters or less. In CCS, 2010.



#### **Blacklist Performance**

- Blacklists are slow to list spam domains
  - 80% of clicks are seen in first day
- Retroactively blacklist





## Comparison to Email Click Through

- Spam Email clickthrough: .003-.006%
  - From Spamalytics, Kanich et al. CCS 2008

- Twitter clickthrough: .13%
  - Collected 245,000 spam URLs
  - Define clickthrough as clicks / reach
  - Reach defined as tweets \* followers



## Social Spam Detection Approaches

- Supervised spam detection approach
  - The most popular approach
  - Require labeled data for training purpose

- Ranking users based on their social graph
- Use crowd wisdom (humans) to identify fake accounts



## Open Research Challenges

- Need for large, accurate, up-to-date data sets
  - APIs
  - Hard crawling
  - Shared datasets
  - Purchasing data (e.g., Gnip)
  - Data grant or know an insider
- Labeling
  - Manual labeling
  - Use crowd wisdom
  - Get labeled data from a social media site
  - Blacklist



## Open Research Challenges

- Integration of multiple techniques for data processing and modeling
  - Big data analysis, machine learning (data mining), information retrieval, visualization, etc
- Interdisciplinary research for analysis
  - computer science, social science, psychology, etc
- Arms race (endless battle)
  - Spammers and malicious users change their behaviors or use new techniques to avoid existing detection approaches
  - Spammers and malicious users move to another site



#### **Useful Tools**

- Machine learning
  - Weka: <a href="http://www.cs.waikato.ac.nz/ml/weka/">http://www.cs.waikato.ac.nz/ml/weka/</a>
  - scikit-learn: <a href="http://scikit-learn.org/stable/">http://scikit-learn.org/stable/</a>
  - LingPipe (linguistic analysis): <a href="http://alias-i.com/lingpipe/">http://alias-i.com/lingpipe/</a>
- Visualization
  - Matplotlib: <a href="http://matplotlib.org/">http://matplotlib.org/</a>
  - Gephi: <a href="https://gephi.org/">https://gephi.org/</a>
  - Graphviz: <a href="http://www.graphviz.org/">http://www.graphviz.org/</a>



#### **Useful Tools**

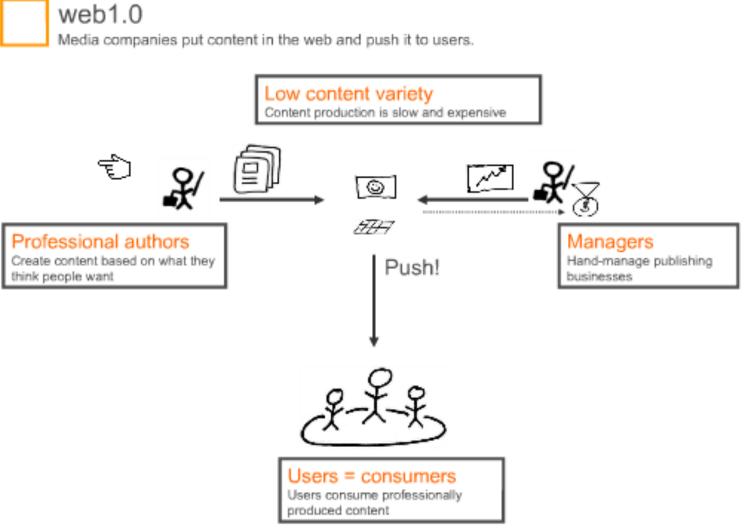
- Big data analysis and visualization
  - Hadoop (MapReduce): <a href="http://hadoop.apache.org/">http://hadoop.apache.org/</a>
  - Pig: <a href="https://piq.apache.org/">https://piq.apache.org/</a>
  - Hive: <a href="https://hive.apache.org/">https://hive.apache.org/</a>
  - Cascalog: <a href="http://cascalog.org/">http://cascalog.org/</a>
  - Giraph: <a href="https://giraph.apache.org/">https://giraph.apache.org/</a>
- Scalable machine learning
  - Mahout: https://mahout.apache.org/
- Large scale stream processing
  - Storm: <a href="http://storm.incubator.apache.org/">http://storm.incubator.apache.org/</a>
  - Summingbird: <a href="https://github.com/twitter/summingbird">https://github.com/twitter/summingbird</a>



## Web 3.0



#### Web 1.0



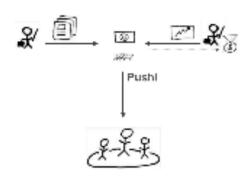


#### Web 1.0



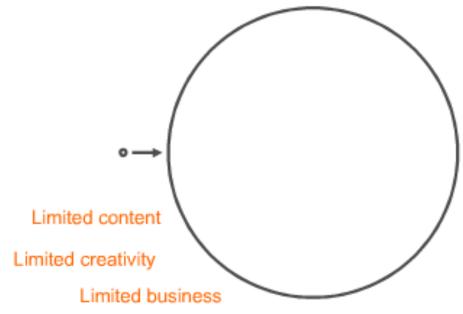
web1.0

This old media model ignored the new possibbilities of the internet.



#### Problems

10,000 editors serve 500,000,000 internet users





#### Web 2.0



web2.0

New platforms allow users to generate content themselves

#### User generated content

Blogs, videos, photos, music etc.

#### High content variety

dramatically increases, while technical quality goes down.



## ኟୃୡୄ୷

#### Authoring platforms

enable everyone to publish!

#### Web2.0 managers

are hand-managing the platforms



#### Professional authors

can still publish, but are competing with - everyone!



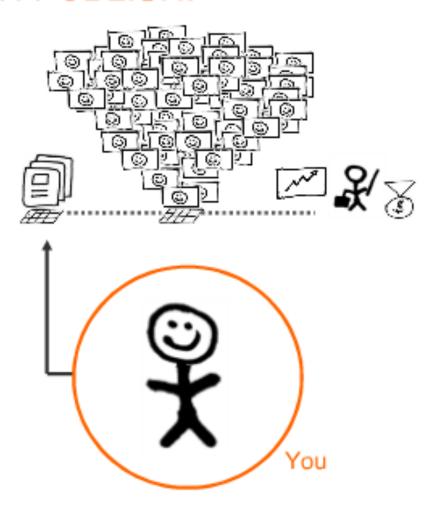


users generate content



### Web 2.0

## YOU CAN PUBLISH!





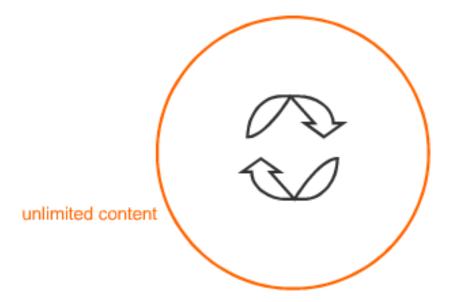
### Web 2.0



web1.0

#### User generated content

We all serve each other





Basically, web 2.0 is a social change. The technical part of the web hasn't changed very much.



## But, web 3.0 will be driven by technological changes.



# Web 3.0 - the semantic web - is about the meaning of data.



## Suppose, I am a stamp collector...



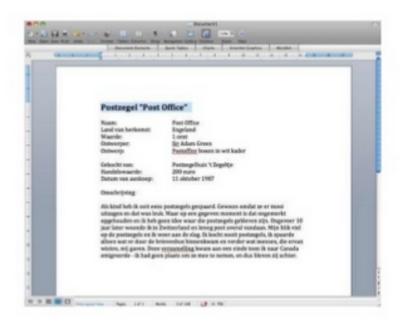


## Over the years I've collected a lot of stamps.





### About every stamp, I made a document





## That's a lot of documents







### How will I find that specific stamp?



?





#### Ah, of course!









### This is the web we have today: a huge collection of documents





# The words of all those documents are indexed. We can search for keywords.





## Now, suppose I search for all red stamps...





### What do I get?



Red stamps
Stamps from Cambodia (Khmer
Rouge)
Stamps from the Red Sea
Stamps from the 140 th anniversary of
the Red Cross
Stamps with red dragons



Not very intelligent, but how can a computer know what I mean?



Answer: when we structurally describe that a stamp is a stamp and red is a color.



Describing data in a structured way can best be done in a database.

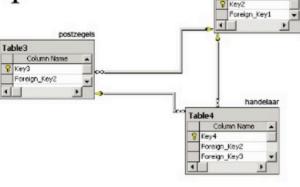


A database with stamps

A database with countries

A database with colours

A database with stamp traders



land van herkomst

Column Name

ontwerper

Table2



Web 3.0 creates a big collection of databases which can be connected on demand.



Agreements are made on the structure of data and the way data is described. Where the data is located is irrelevant. Linking data is the power of web 3.0.



So, "I want all the red stamps, designed in Europe, but used in the U.S.A., between 1980 and 1990" is a question that will get a better answer with web 3.0.



This definition of web 3.0 is a 'narrow' definition. Like web 2.0, web 3.0 stands for a range of developments.



#### A broader definition of web 3.0:

A fast broadband connection to the internet, always and everywhere .

Open source techniques and free data (Data as a Service)

Open identities

Software as a Service (e.g. Google docs)



#### References

- 1. http://www2014.kr/asset/slide/Social+Spam,+Campaigns,
- +Misinformation+and+Crowdturfing-www2014-tutorial.pdf
- 4. http://www.slideshare.net/freekbijl/web-30-explained-with-a-stamp? from=ss\_embed

