

Personal traits analysis as a means to predict Insiders

Miltos Kandias, Vasilis Stavrou

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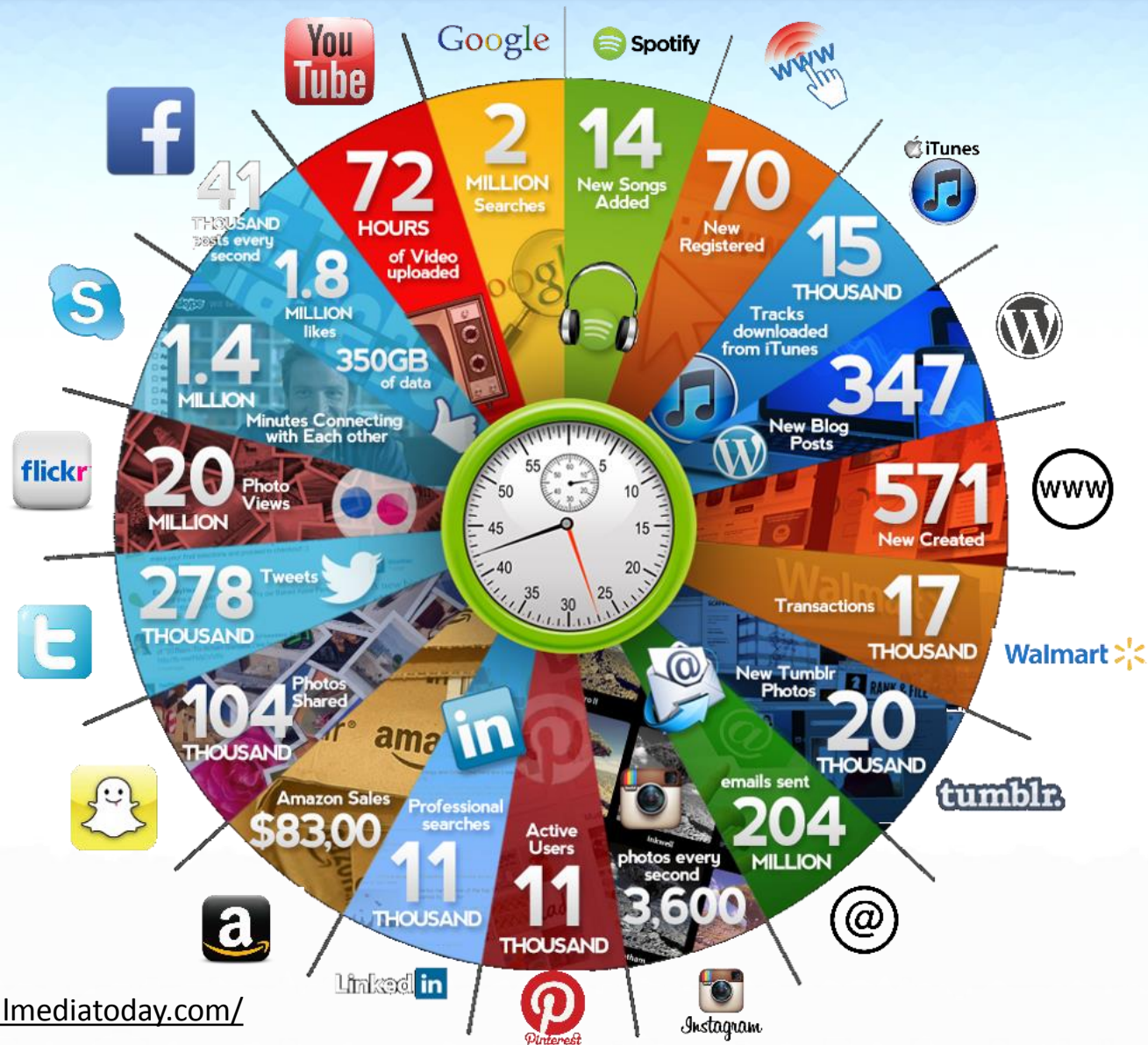
Miltos Kandias, Vasilis Stavrou

Information Security & Critical Infrastructure Protection (INFOSEC) Lab
Dept. of Informatics, Athens University of Economics & Business

Presentation outline

- Web 2.0 and Online Social Networks dynamics
- Open Source (& Social Media) Intelligence
- The Insider threat
- The **NEREUS** Framework
- Insider threat prediction via Narcissism
- Conclusions

Web 2.0 and Online Social Networks (OSN)



Open Source (& Social Media) Intelligence (OSINT/SOCMINT)



- Open Source Intelligence (OSINT) is produced from publicly available information, which is:
 - collected, exploited and disseminated in a **timely** manner
 - offered to an **appropriate** audience
 - used for the purpose of addressing a specific **intelligence requirement**
- Publicly available information refers to (not only):
 - Traditional media (e.g. television, newspapers, radio, magazines)
 - Web-based communities (e.g. social networking sites, blogs)
 - Public data (e.g. government reports, official data, public hearings)
 - Amateur observation/reporting (e.g. amateur spotters, radio monitors)
- OSINT defined by US Dept. of Defense (Public Law 109-163, Sec. 931, "National Defense Authorization Act for Fiscal Year 2006")
- SOCMINT is produced from Online Social Networks and the Web 2.0

The Insider Threat



NEREUS Framework (Function 1)

Insider threat prediction based on Narcissism

NEREUS Framework

OSN: Twitter



Tools used for the open data analysis

Science

Theory

Informatics

Graph Theory

Content Analysis

Sociology
Psychology

Theory of Planned Behavior

Social Learning Theory

Application: Insider threat detection/prediction, influential users detection, means of communication evaluation, etc.

NEREUS Framework (Function 1)

The framework in a nutshell



Predicting & identifying potential insiders



Researchers' compliance with ethical standards

YES



Legal Expert

YES

Critical infrastructures
National security
Public interest



Twitter Users

Content generation



Twitter

Crawling & storing



Our crawling server



Klout score server

Klout score queries



Klout score api collector

Content Aggregator

Usage intensity valuation

Indegree/outdegree aggregator

Influence valuation



User classification according to categories

Legend

Web 2.0

Medium:

Domain Expert: Psychologist

Twitter



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Category

Influence valuation

Klout score

Usage valuation

Loners

0 - 90

3.55 - 11.07

0 - 500

Individuals

90 - 283

11.07 - 26.0

500 - 4.500

Known users

283 - 1.011

26.0 - 50.0

4.500 - 21.000

Mass Media & Personas

1.011 - 3.604

50.0 - 81.99

21.000 - 56.9000

Ver. 2.11.14, 24.11.2014

NEREUS Framework (Function 1)

Insider threat prediction based on Narcissism



Narcissistic
behavior
detection

Study: Motive, ego/self-image,
entitlement

Means: Usage Intensity,
Influence valuation, Klout score

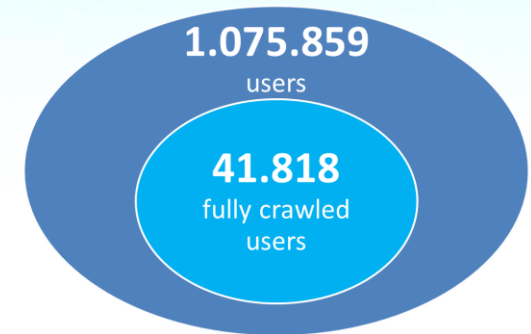
- Individuals tend to transfer offline behavior online.
- Trait of narcissism directly relates to **insider threats**, **OSN popularity** and **influence**.
- Utilize graph theoretic tools to perform analysis.
- Valuation of social media **popularity** and **usage intensity**.
- Twitter data to become open.
- Trait of narcissism relates to delinquent behavior via :
 - sense of entitlement
 - lack of empathy
 - anger and “revenge” syndrome
 - inflated self-image



Dataset description

- Focus on a Greek **Twitter** community:
 - Context sensitive research
 - Utilize ethnological features rooted in locality
 - Extract and analyze results
- Analysis of **content** and measures of **user influence** and **usage intensity**
- User Categories: Follower, Following, Retweeter
- Graph:
 - Each user is a node
 - Every interaction is a directed edge
- 41.818 fully crawled users (personal and statistical data)
 - Name, ID, personal description, URL, language, geolocation, profile state, lists, # of following/followers, tweets, # of favorites, # of mentions, # of retweets

Twitter (Greece, 2012-13)



7.125.561 connections
among them

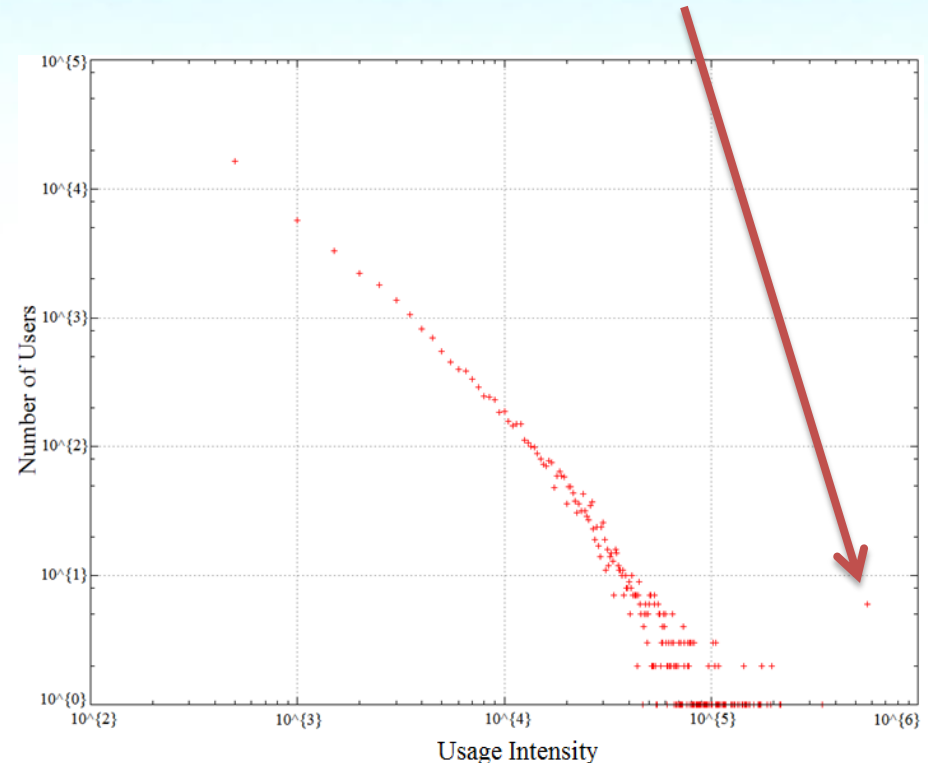


Graph Theoretical approach

- **Strongly connected components:**
 - There exists 1 large component (153.121 nodes connected to each other) and several smaller ones
- **Node Loneliness:**
 - 99% of users connected to someone
- **Small World Phenomenon:**
 - Every user lies <6 hops away from anyone
- **Indegree Distribution:**
 - # of users following each user
 - Average 13.2 followers/user
- **Outdegree Distribution:**
 - # of users each user follows
 - Average 11 followers/user
- **Usage Intensity Distribution:**

Weighted aggregation of {# of followers, # of followings, tweets, retweets, mentions, favorites, lists}

Important cluster of users





Narcissism detection

- Majority of users make limited use of Twitter
 - A lot of “normally” active users and very few “popular” users
 - Users classified into four categories, on the basis of specific metrics (influence valuation, Klout score, usage valuation)
- Above a threshold:
 - User becomes **quite influential/perform intense** medium use
 - User get a “**mass-media & persona**” status

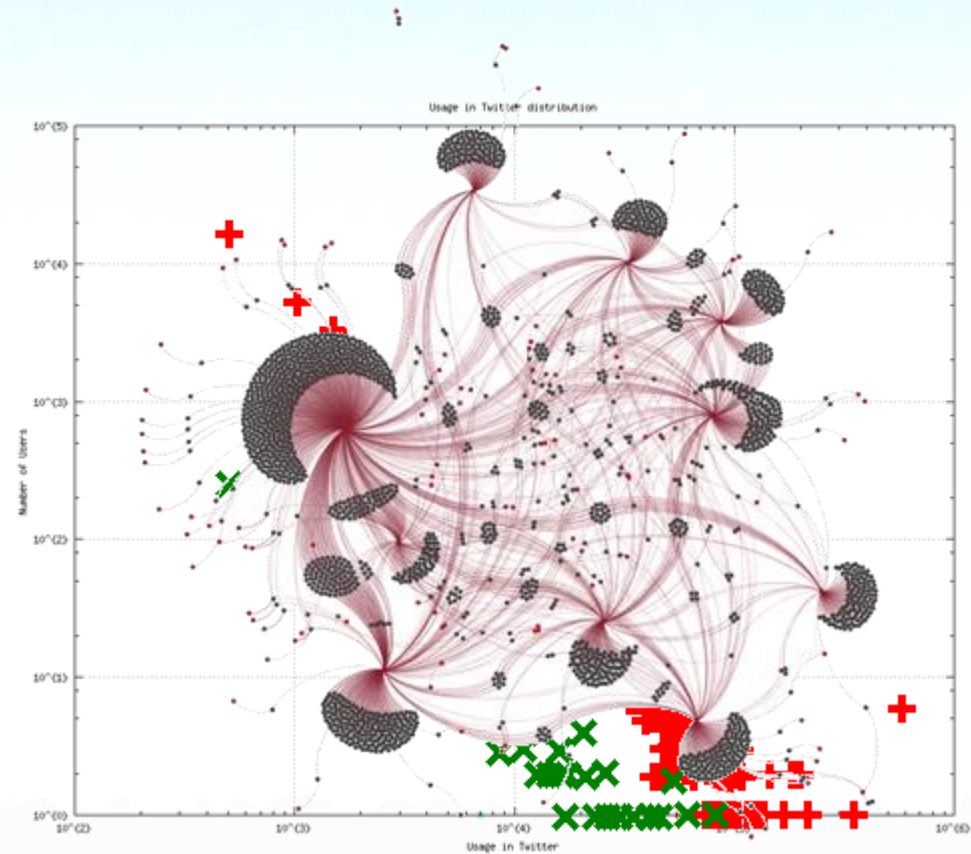
The excessive use of Twitter by persons who are not mass-media or personas could connect to narcissism and identify narcissists, i.e. persons who - inter alia - tend to turn insiders

Category	Influence valuation	Klout score	Usage valuation
Loners	0 - 90	3.55 - 11.07	0 - 500
Individuals	90 - 283	11.07 - 26.0	500 - 4.500
Known users	283 - 1.011	26.0 - 50.0	4.500 - 21.000
Mass Media & Personas	1.011 - 3.604	50.0- 81.99	21.000 - 56.9000

Group dynamics



- Create reliable graphs of interconnection, i.e. visualization of groups of people according to their **relationships** and **common interests**
- Compare deviating usage behavior according to a set of parameters, **maximize efficiency**



NEREUS Framework:

Web 2.0 data exploitation capabilities

- **Insider threat prediction**
 - Applying Shaw and FBI psychosocial indicators (narcissism, anger syndrome, revenge syndrome, etc.)
- **Delinquent behavior prediction**
 - Analysis of psycho-social characteristics (narcissism, anger syndrome, revenge syndrome, etc.)
 - Predisposition analysis (Graph Theory and Content Analysis through Social Learning Theory, etc.)
- **Forensics analysis support**
 - Suspect profiling and analysis (prediction of delinquent behavior, etc.)

Preliminary conclusions

- ✓ Web 2.0 produces vast amounts of **crawable** information and OSINT/SOCMINT can transform it into **intelligence**.
- ✓ OSINT/SOCMINT can assist in detecting **narcissistic behavior, predisposition towards law enforcement, personal stress level variations, etc.**
- ✓ OSINT/SOCMINT can help in **predicting insiders, in predicting delinquent behavior, in supporting law enforcement, in enhancing national defense, etc.**
- ✓ OSINT/SOCMINT intrusive nature dictates **specific** uses for **legitimate** only purposes.

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