

# Post-truth society under the lens of Science

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Photo Illustration @21W

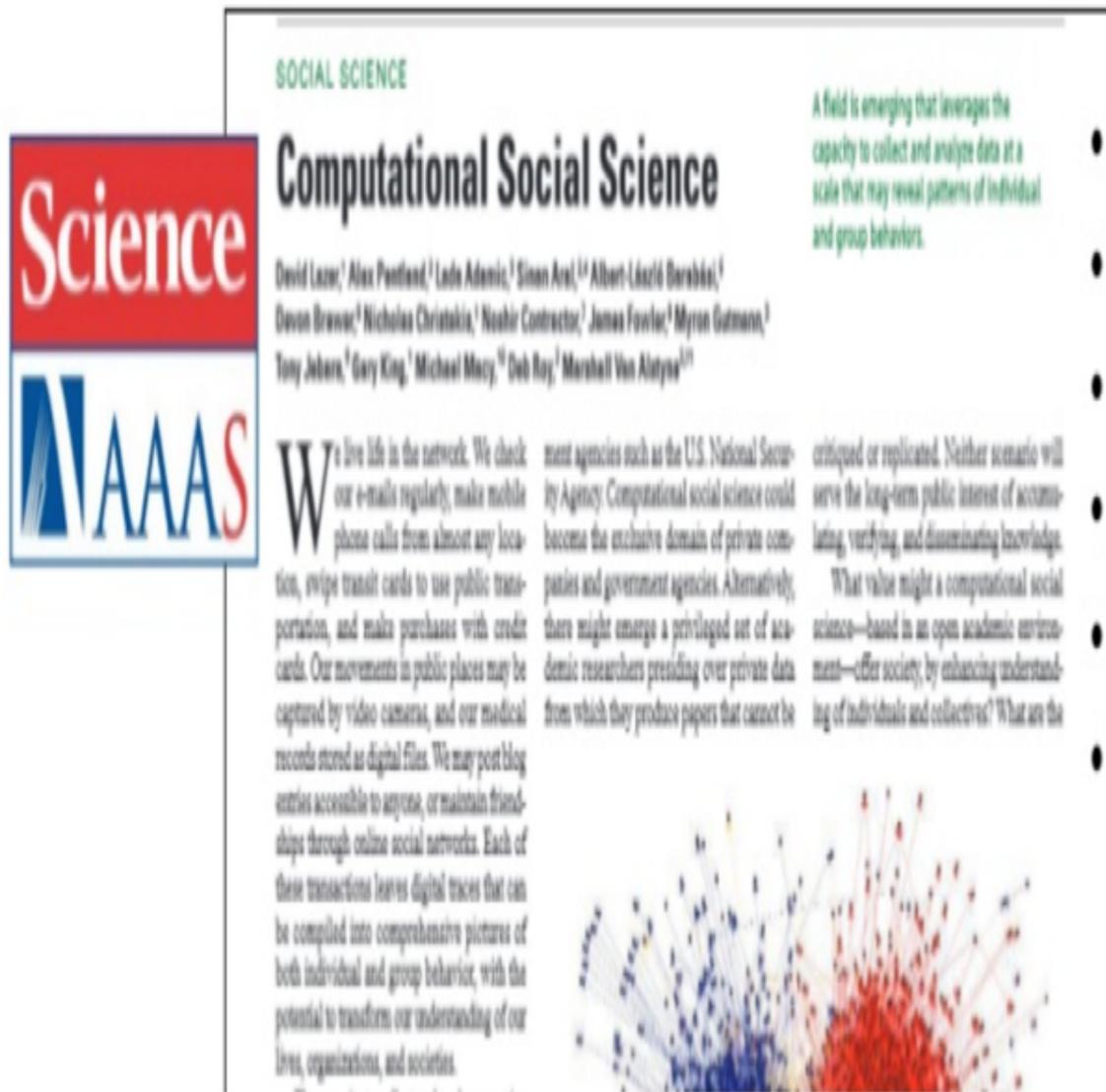
Oxford Dictionaries

# WORD OF THE YEAR

## post-truth

"relating to or denoting circumstances in which objective facts are less influential in shaping public opinion than appeals to emotion and personal belief."

**Computational social science** refers to the academic sub-disciplines concerned with **computational approaches** to the **social sciences**.



Science

MAAS

SOCIAL SCIENCE

### Computational Social Science

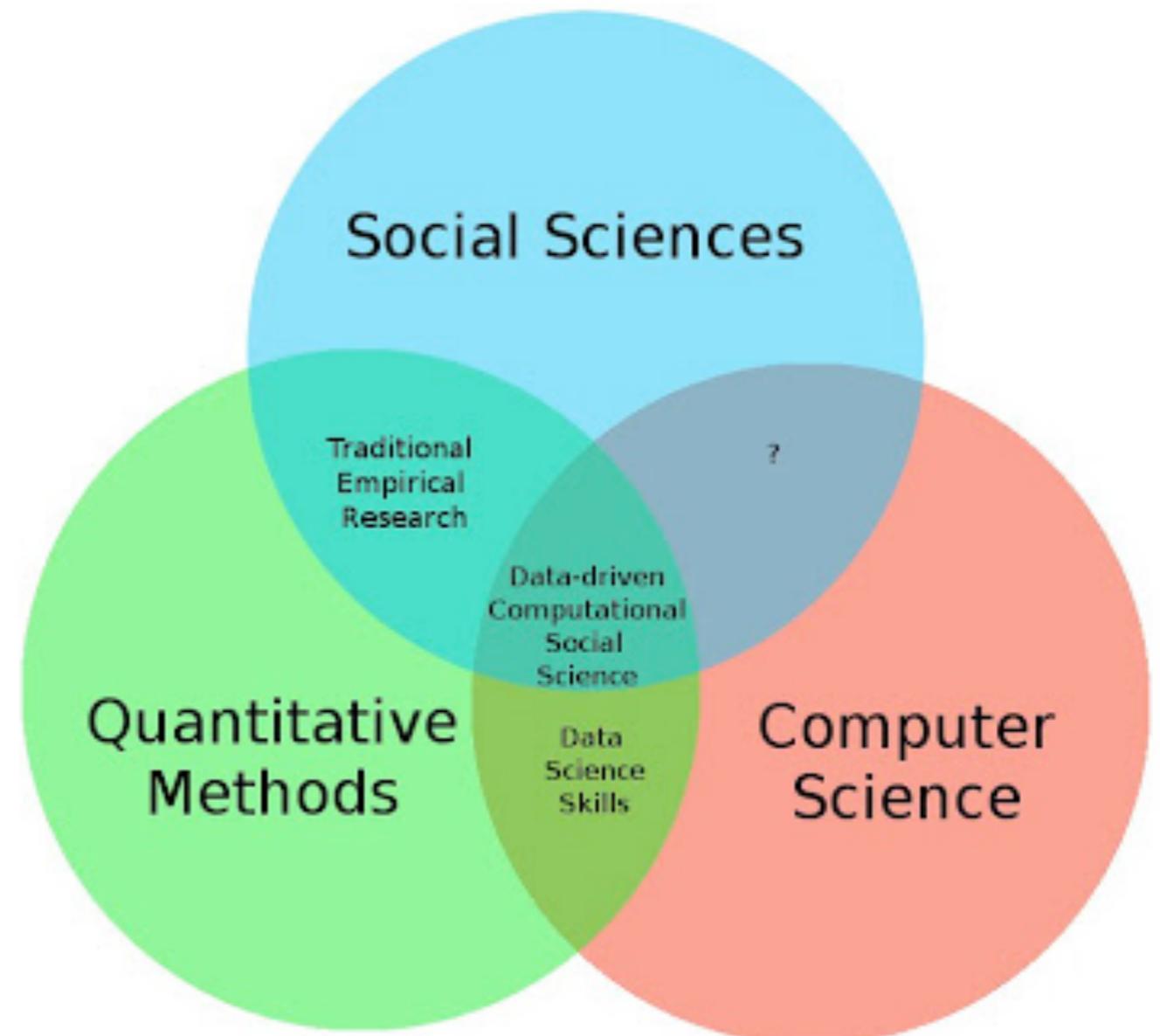
David Lazer,<sup>1</sup> Alex Pentland,<sup>2</sup> Luis Adamic,<sup>3</sup> Simon Aral,<sup>1,4</sup> Albert-László Barabási,<sup>5</sup> Devon Brewer,<sup>6</sup> Nicholas Christakis,<sup>1</sup> Noshir Contractor,<sup>7</sup> James Fowler,<sup>8</sup> Myron Gutmann,<sup>9</sup> Tony Jebara,<sup>4</sup> Gary King,<sup>1</sup> Michael Macy,<sup>10</sup> Deb Roy,<sup>1</sup> Marshall Van Alstyne<sup>11</sup>

**W**e live life in the network. We check our e-mails regularly, make mobile phone calls from almost any location, swipe transit cards to use public transportation, and make purchases with credit cards. Our movements in public places may be captured by video cameras, and our medical records stored as digital files. We may post blog entries accessible to anyone, or maintain friendships through online social networks. Each of these transactions leaves digital traces that can be compiled into comprehensive pictures of both individual and group behavior, with the potential to transform our understanding of our lives, organizations, and societies.

A field is emerging that leverages the capacity to collect and analyze data at a scale that may reveal patterns of individual and group behaviors.

ment agencies such as the U.S. National Security Agency. Computational social science could become the exclusive domain of private companies and government agencies. Alternatively, there might emerge a privileged set of academic researchers presiding over private data from which they produce papers that cannot be critiqued or replicated. Neither scenario will serve the long-term public interest of accumulating, verifying, and disseminating knowledge.

What value might a computational social science—based in an open academic environment—offer society, by enhancing understanding of individuals and collectives? What are the



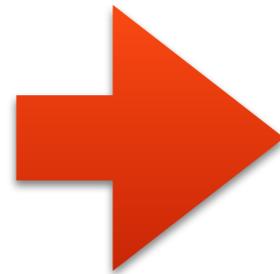
# A SHIFT OF PARADIGM



## **OLD MEDIA**

- Follow the “Ritual of Objectivity”
- Publication patterns are driven by most followed sources (imitation) (Marlow 2005)

**MEDIATED**



## **NEW MEDIA**

- Information production is the work of interconnected actors spanning over organizations, professional identity and geographical location

**DISINTERMEDIATED**

# WHAT ABOUT THE QUALITY OF INFORMATION?

## Conspiracy theories running rampant: How misinformation spreads on Facebook

Researchers studied how people interacted with "trolls" posting false information -- the results are terrifying

SARAH GRAY

Share 387 93 13 20

TOPICS: CONSPIRACY THEORIES, FACEBOOK, POLITICS, TECHNOLOGY, MISINFORMATION, INNOVATION NEWS, TECHNOLOGY NEWS, POLITICS NEWS



From the steady roll of theories on what happened to Malaysian Airlines Flight 370, to Sarah Palin's "death panels" panic, to Donald Trump's birther theories, misinformation spreads like wildfire in the age of Facebook.

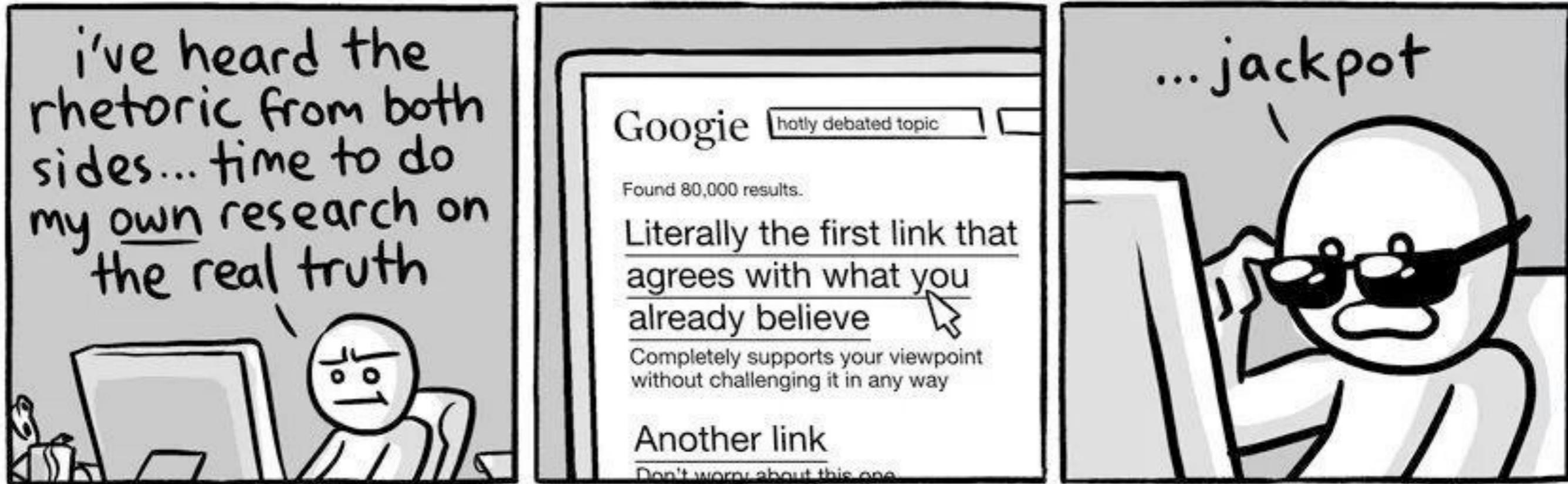
In 2013, professor Walter Quattrociocchi of Northeastern University along with his team studied how more than 1 million Facebook users engaged with political information during the Italian election. During that election a post appeared titled: "Italian Senate voted and accepted (257 in favor and 165 abstentions) a law proposed by Senator Cirenga to provide policy makers with €134 billion Euros to find jobs in the event of electoral defeat."

READ IT ON THE  
INTERNET



# CONFIRMATION BIAS

CHAINSAWSUIT.COM



The cognitive attitude to search for, interpret, favor, and recall information in a way that confirms one's beliefs

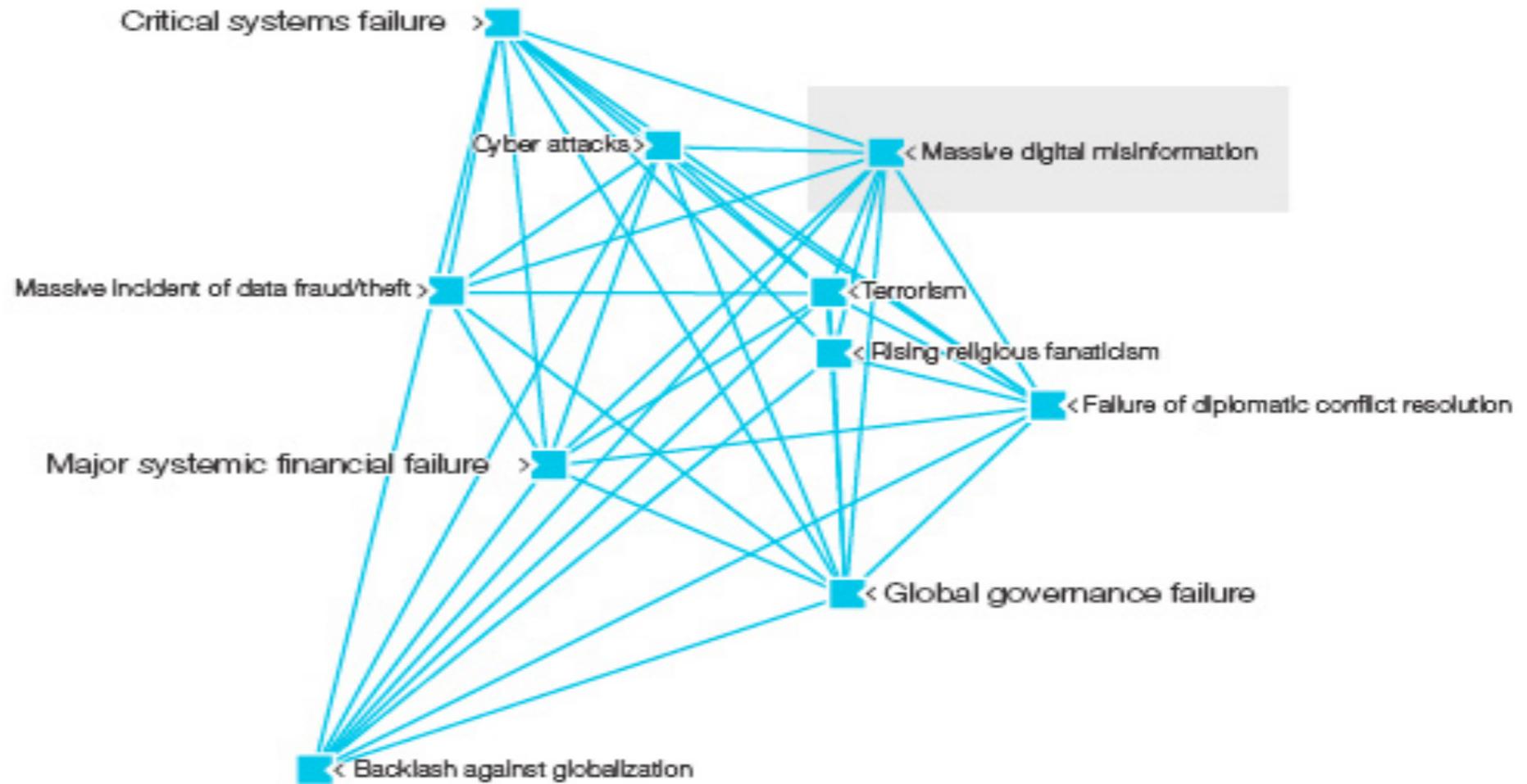
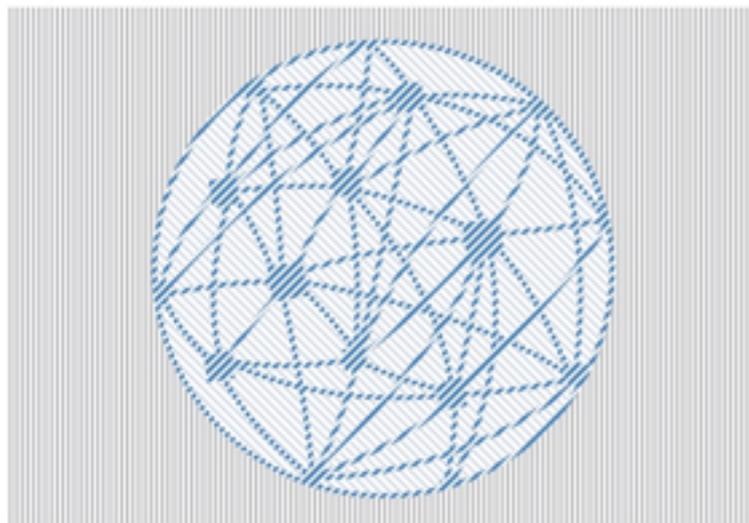
# MISINFORMATION ONLINE



Insight Report

## Global Risks 2013 Eighth Edition

An Initiative of the Risk Response Network

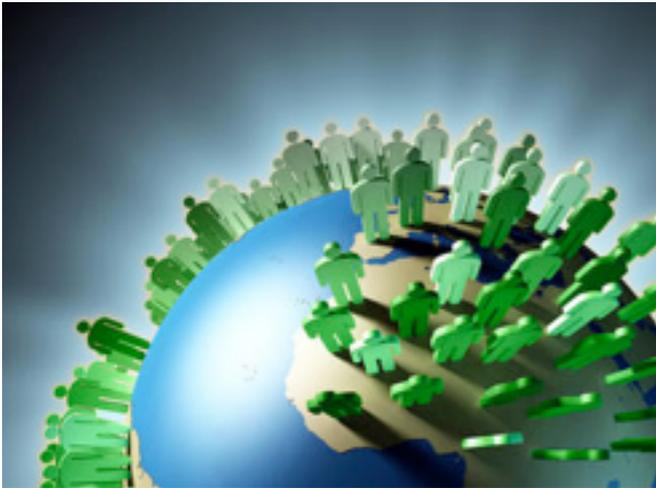


THE WORLD ECONOMIC FORUM HAS POINTED OUT  
**MASSIVE DIGITAL MISINFORMATION**  
AS ONE OF THE MAIN RISKS FOR OUR SOCIETY

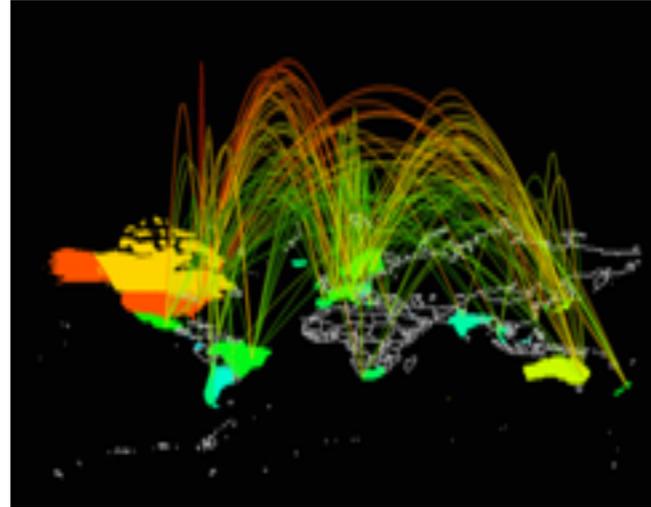
# WHY?

Complexity of the world exploded

## GLOBALIZATION



## INTERCONNECTIVITY



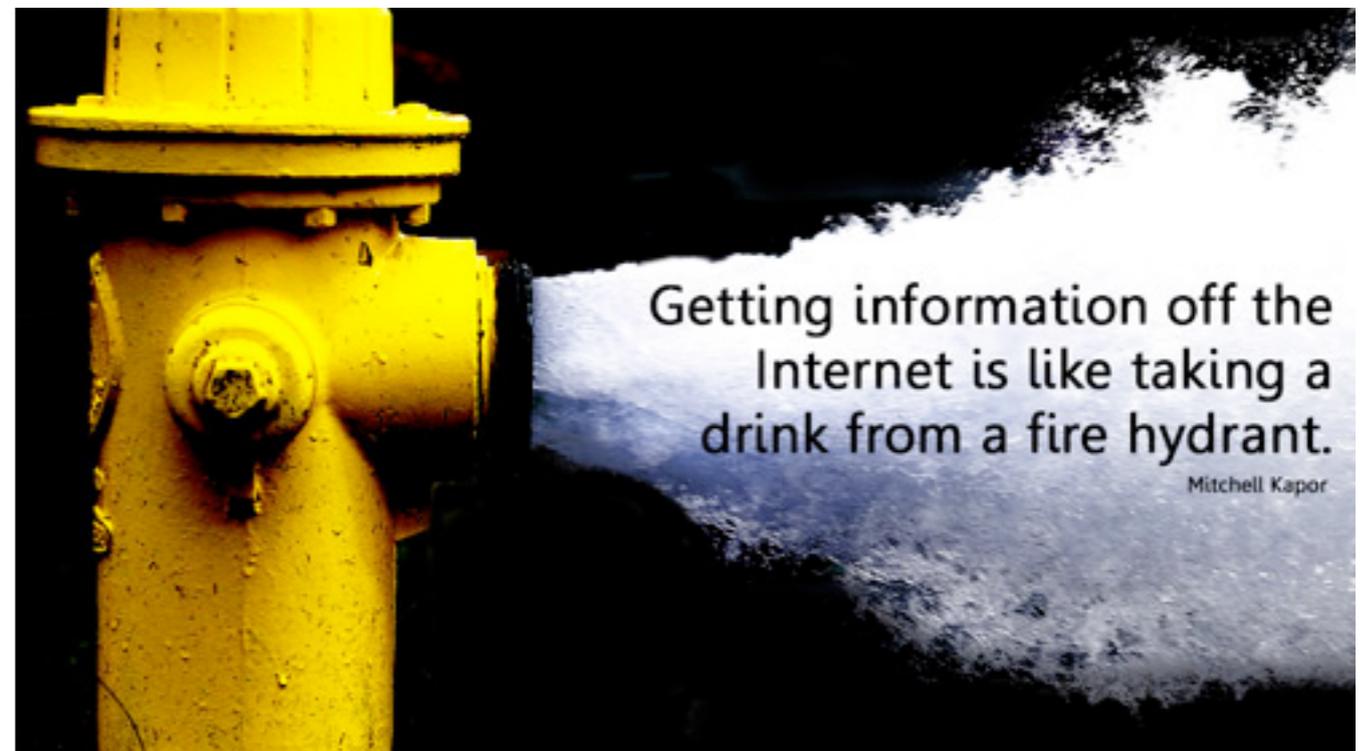
## SCIENTIFIC PROGRESS



## FUNCTIONAL ILLITERACY

Nazione	Persone funzionalmente analfabete (% con età 16-65) 2003-2008 <sup>[7]</sup>
 Italia	47,0
 Messico	43,2
 Stati Uniti	20,0
 Ungheria	17,0
 Svizzera	15,9
 Canada	14,6
 Australia	13,9
 Nuova Zelanda	13,4

## INFORMATION OVERLOAD



# SETTING UP THE (DATA) EXPERIMENT



## Focus:

Understand the role of confirmation bias in the diffusion of (mis)information

## Methodology:

- a) Analyze users' behavior on specific contents **Conspiracy** and **Science** News (cont)
- b) Response to **intentional false claims** (Trolls)
- c) Response to **contrasting information** (Debunking)

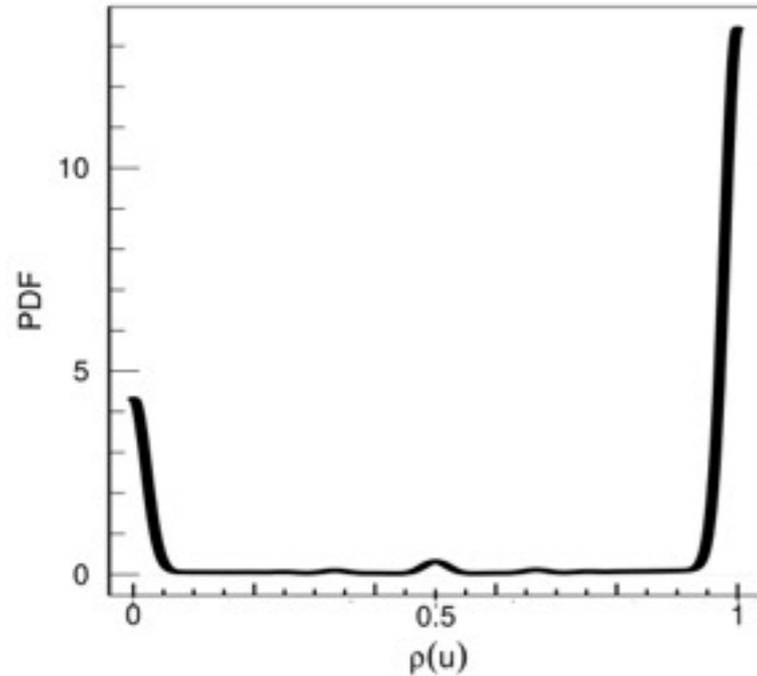
# THE DATASET(s)

**Facebook ITALY** and **USA** from Jan 2010 to Dec 2014

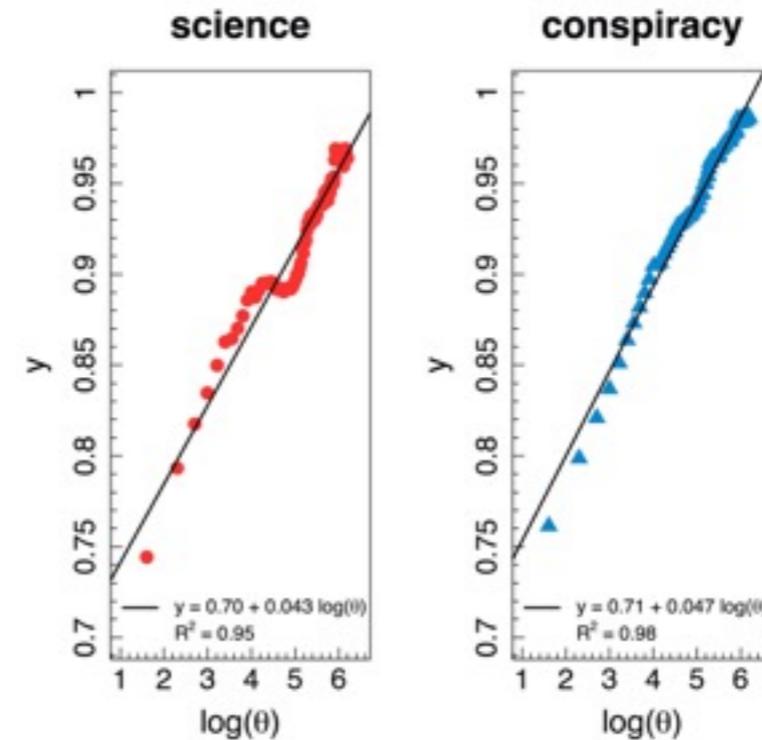
<b>FB ITALY</b>	TOTAL	SCIENCE	CONSPIRACY	<b>TROLL</b>
Pages	73	34	39	<b>2</b>
Posts	271,296	62,705	208,591	<b>4,709</b>
Likes	9,164,781	2,505,399	6,659,382	<b>40,341</b>
Comments	1,017,509	180,918	836,591	<b>58,686</b>
Likers	1,196,404	332,357	864,047	<b>15,209</b>
Commentsers	279,972	53,438	226,534	<b>43,102</b>

<b>FB USA</b>	TOTAL	SCIENCE	CONSPIRACY	<b>DEBUNKING</b>
Pages	478	83	330	<b>66</b>
Posts	679,948	262,815	369,420	<b>47,780</b>
Likes	603,332,826	453,966,494	145,388,117	<b>3,986,922</b>
Comments	30,828,705	22,093,692	8,304,644	<b>429,204</b>
Likers	52,172,855	39,854,663	19,386,131	<b>702,122</b>
Commentsers	9,790,906	7,223,473	3,166,726	<b>118,996</b>

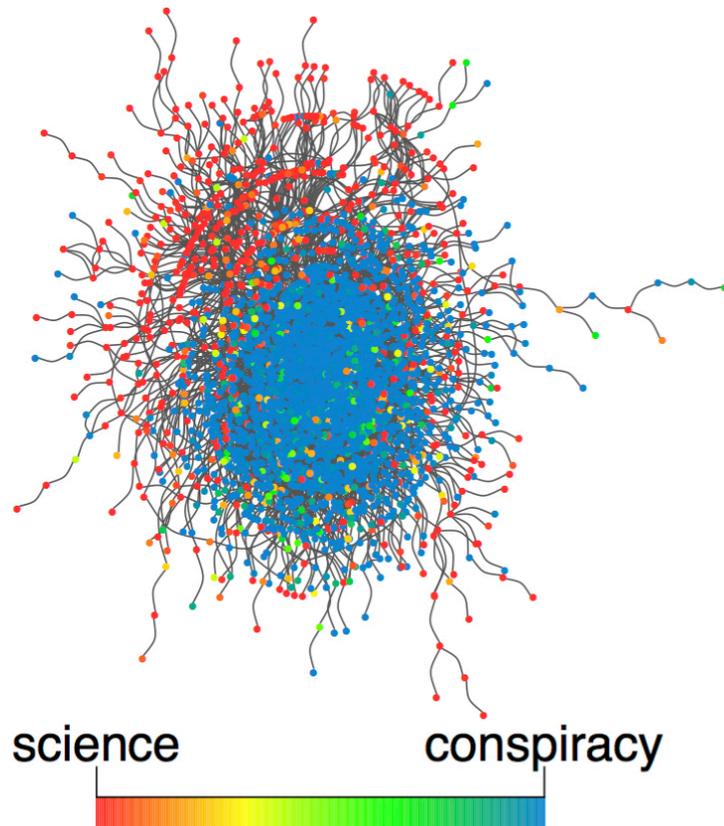
# CONTENT CONSUMPTIONS AND FRIENDS



**Polarization on contents.** Probability density function (PDF) of users' polarization. Notice the strong bimodality of the distribution, with two sharp peaks localized at  $0 < \rho < 0.005$  (science users) and at  $0.95 < \rho < 1$  (conspiracy users).



**Homophily.** Fraction of polarized friends with the same polarization respect to the number of likes  $\log(\theta(u))$  of user  $u$ .



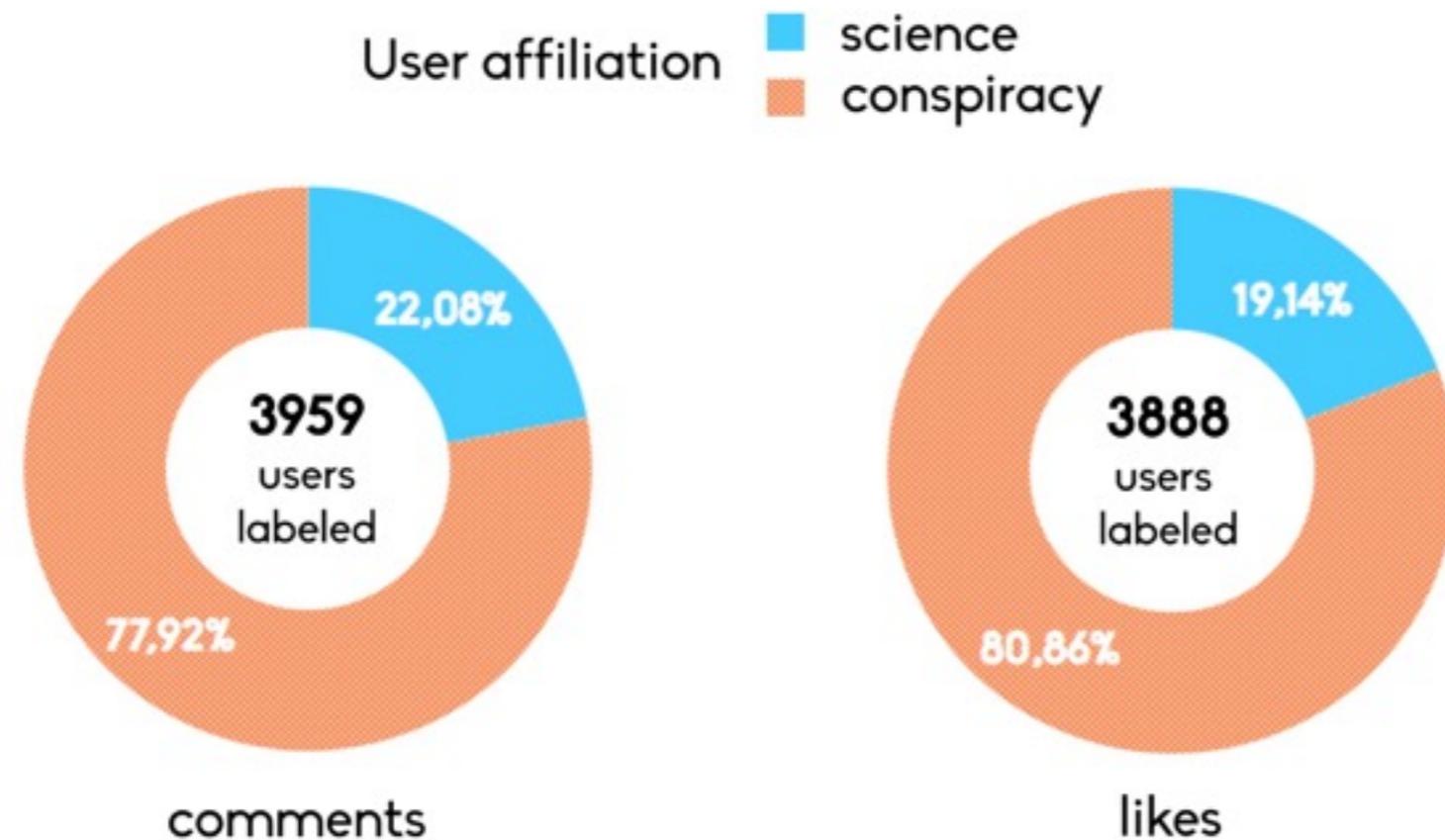
## ECHO-CHAMBERS

- Highly separated activity on the 2 categories
- The more the liking activity the higher the probability to have friends with the same attitude
- The more the activity on the narrative, the more the exposure to it

**Viral Misinformation: The Role of Homophily and Polarization**  
webSci@WWW (Bessi *et al.* 2015)

**Homophily and Polarization in the age of misinformation**  
EPJ Special Topics (Bessi *et al.* to appear)

# RESPONSE TO 4,709 INTENTIONAL FALSE CLAIMS (TROLLS)



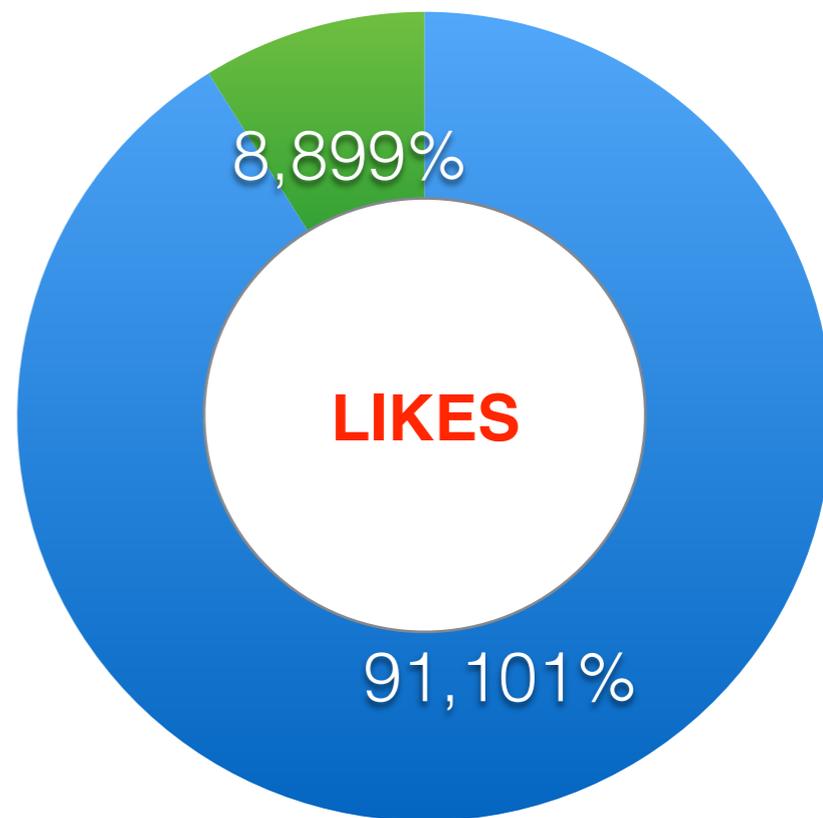
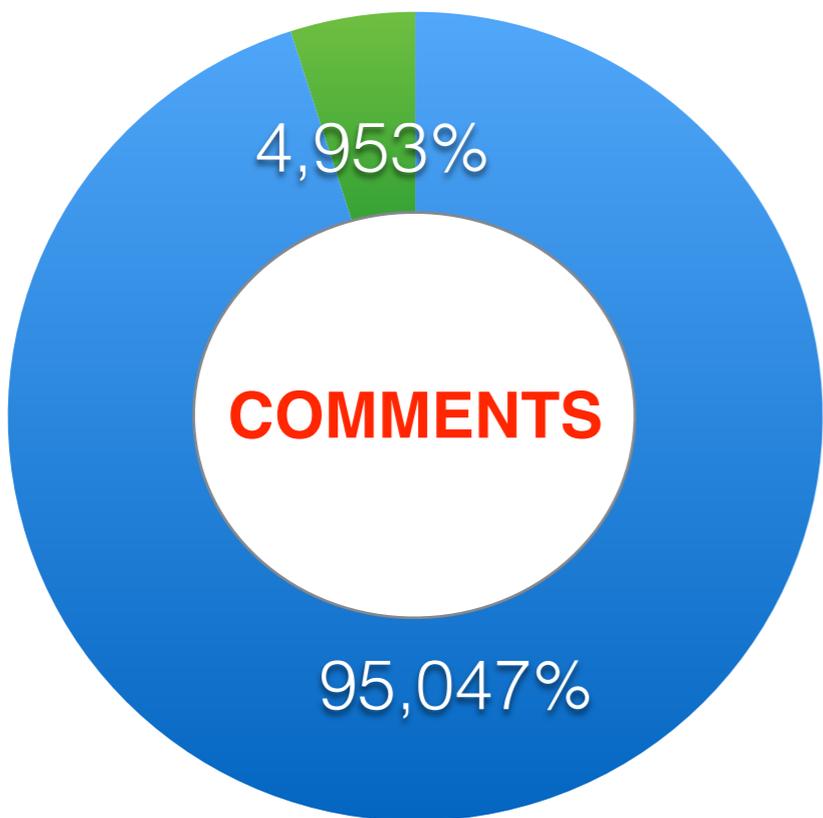
## Polarized users on false information.

Percentage of likes and comments on intentional false information posted by a satirical page from polarized users of the two categories.

# RESPONSE TO **47,780** DEBUNKING POSTS (1)

● Science      ● Conspiracy

● Science      ● Conspiracy



Debunking information are ignored by users in the conspiracy echo-chamber (out of 9,790,906 polarized conspiracy users only 5, 831 interact )

# The spreading of misinformation online

Michela Del Vicario<sup>a</sup>, Alessandro Bessi<sup>b</sup>, Fabiana Zollo<sup>a</sup>, Fabio Petroni<sup>c</sup>, Antonio Scala<sup>a,d</sup>, Guido Caldarelli<sup>a,d</sup>, H. Eugene Stanley<sup>e</sup>, and Walter Quattrociocchi<sup>a,1</sup>

<sup>a</sup>Laboratory of Computational Social Science, Networks Department, IMT Alti Studi Lucca, 55100 Lucca, Italy; <sup>b</sup>IUSS Institute for Advanced Study, 27100 Pavia, Italy; <sup>c</sup>Sapienza University, 00185 Rome, Italy; <sup>d</sup>ISC-CNR Uos "Sapienza," 00185 Rome, Italy; and <sup>e</sup>Boston University, Boston, MA 02115

Edited by Matjaz Perc, University of Maribor, Maribor, Slovenia, and accepted by the Editorial Board December 4, 2015 (received for review September 1, 2015)

The wide availability of user-provided content in online social media facilitates the aggregation of people around common interests, worldviews, and narratives. However, the World Wide Web (WWW) also allows for the rapid dissemination of unsubstantiated rumors and conspiracy theories that often elicit rapid, large, but naive social responses such as the recent case of Jade Helm 15—where a simple military exercise turned out to be perceived as the beginning of a new civil war in the United States. In this work, we address the determinants governing misinformation spreading through a thorough quantitative analysis. In particular, we focus on how Facebook users consume information related to two distinct narratives: scientific and conspiracy news. We find that, although consumers of scientific and conspiracy stories present similar consumption patterns with respect to content, cascade dynamics differ. Selective exposure to content is the primary driver of content diffusion and generates the formation of homogeneous clusters, i.e., “echo chambers.” Indeed, homogeneity appears to be the primary driver for the diffusion of contents and each echo chamber has its own cascade dynamics. Finally, we introduce a data-driven percolation model mimicking rumor spreading and we show that homogeneity and polarization are the main determinants for predicting cascades’ size.

misinformation | virality | Facebook | rumor spreading | cascades

The massive diffusion of sociotechnical systems and micro-blogging platforms on the World Wide Web (WWW) creates a

the main difference between the two is content verifiability. The generators of scientific information and their data, methods, and outcomes are readily identifiable and available. The origins of conspiracy theories are often unknown and their content is strongly disengaged from mainstream society and sharply divergent from recommended practices (22), e.g., the belief that vaccines cause autism.

Massive digital misinformation is becoming pervasive in online social media to the extent that it has been listed by the World Economic Forum (WEF) as one of the main threats to our society (23). To counteract this trend, algorithmic-driven solutions have been proposed (24–29), e.g., Google (30) is developing a trustworthiness score to rank the results of queries. Similarly, Facebook has proposed a community-driven approach where users can flag false content to correct the newsfeed algorithm. This issue is controversial, however, because it raises fears that the free circulation of content may be threatened and that the proposed algorithms may not be accurate or effective (10, 11, 31). Often conspiracists will denounce attempts to debunk false information as acts of misinformation.

Whether a claim (either substantiated or not) is accepted by an individual is strongly influenced by social norms and by the claim’s coherence with the individual’s belief system—i.e., confirmation bias (32, 33). Many mechanisms animate the flow of false information that generates false beliefs in an individual, which, once adopted, are rarely corrected (34–37).

# RESEARCH IMPACT



More



The Intersect

## What was fake on the Internet this week: Why this is the final column

A 128 Save for Later Reading List



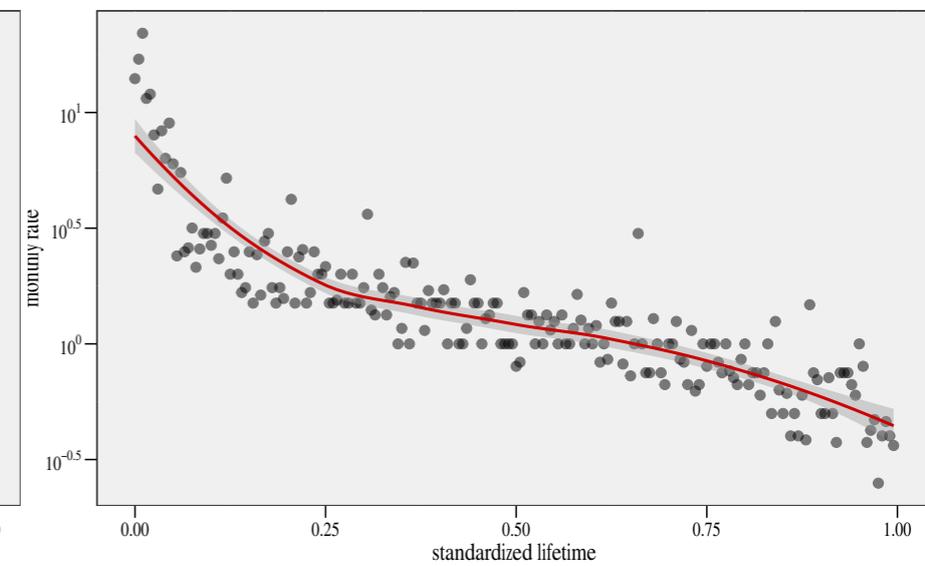
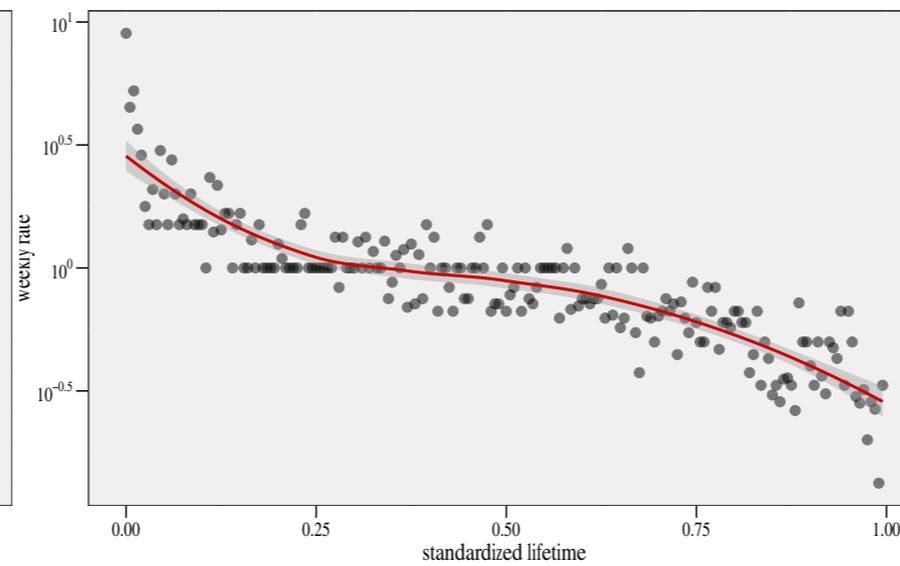
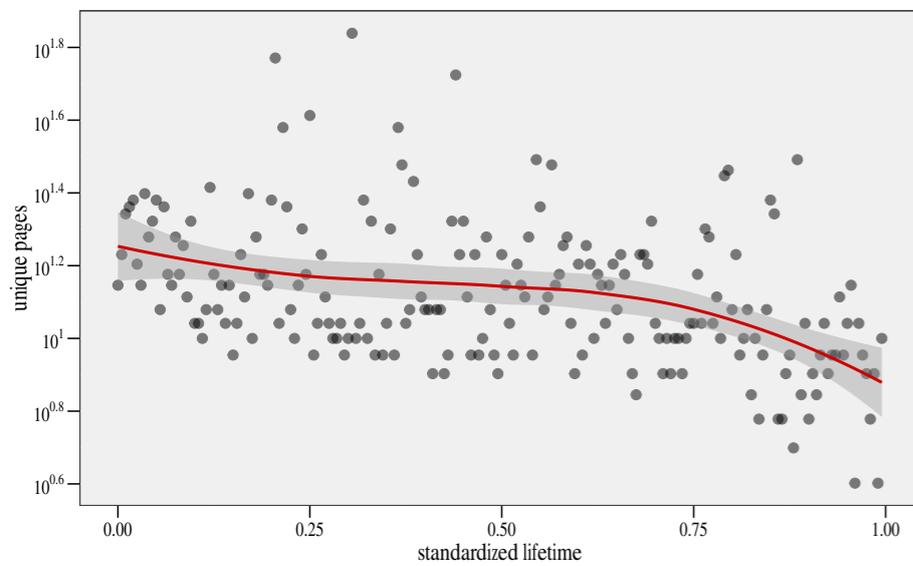
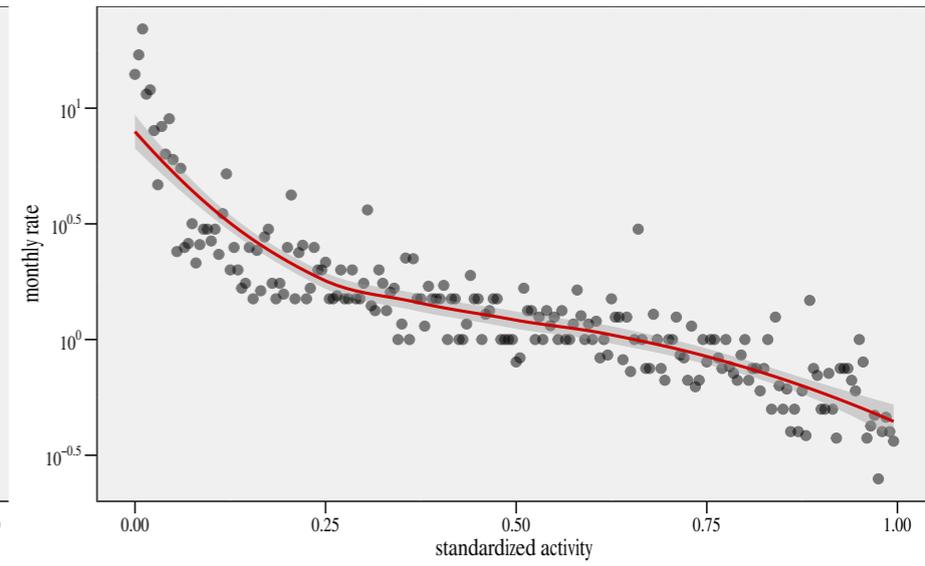
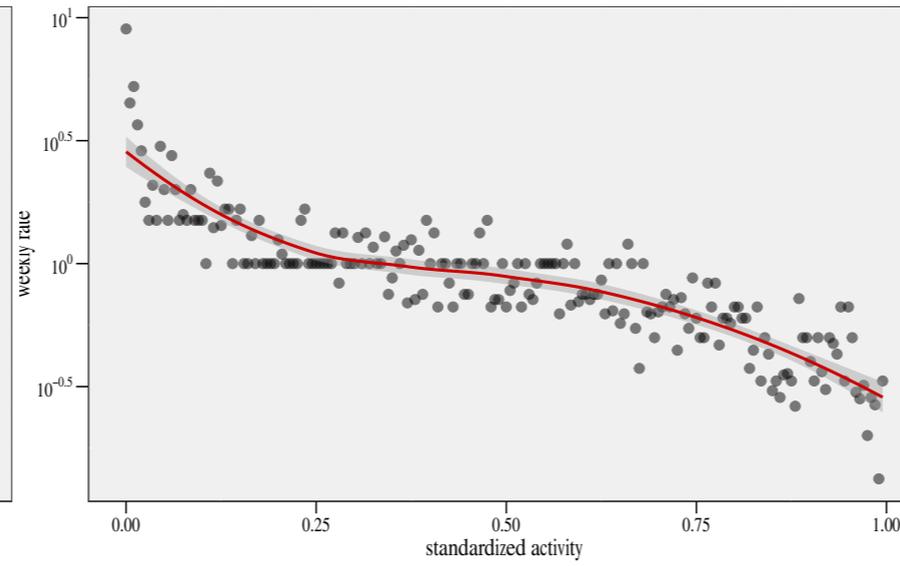
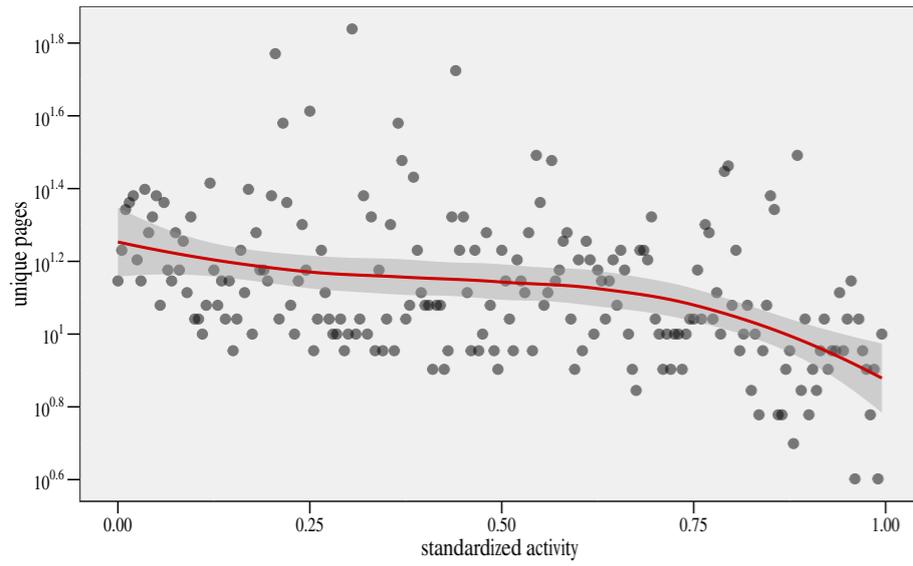
# The anatomy of news consumption on Facebook

A.L. Schimdt, A. Bessi, F. Zollo, M. Del Vicario, A. Scala, G. Caldarelli, H. Gene Stanley, W. Quattrociocchi  
*accepted at PNAS*

376 Million of Facebook Users (Jan 2010- Dec 2015)



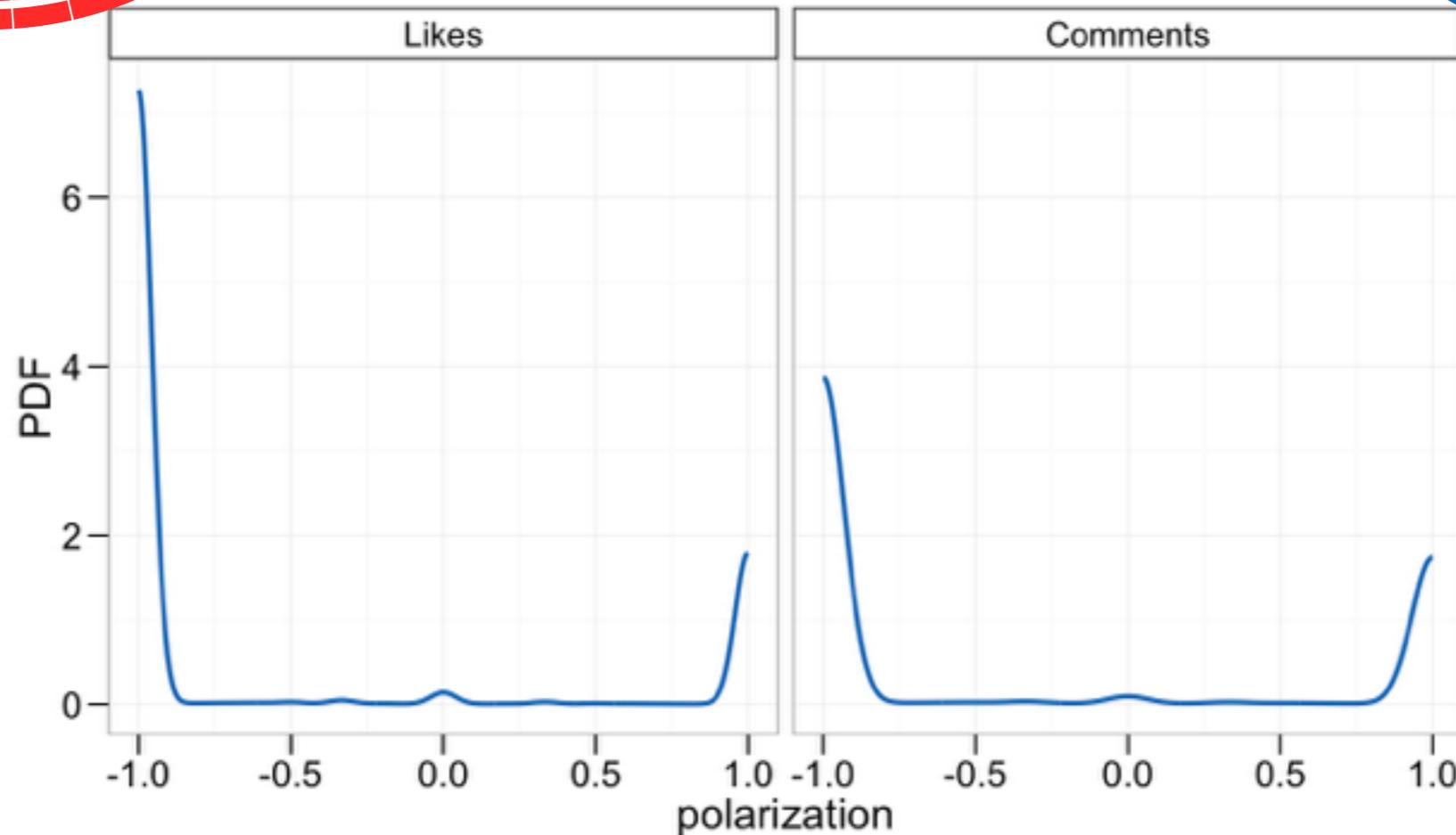
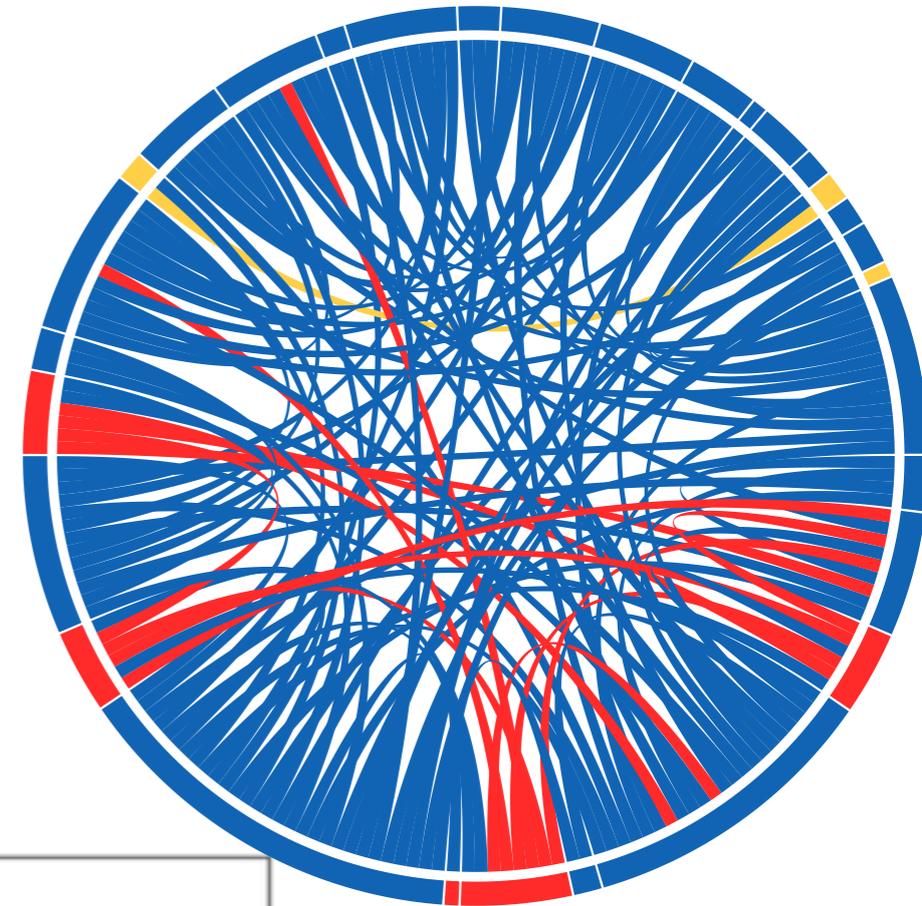
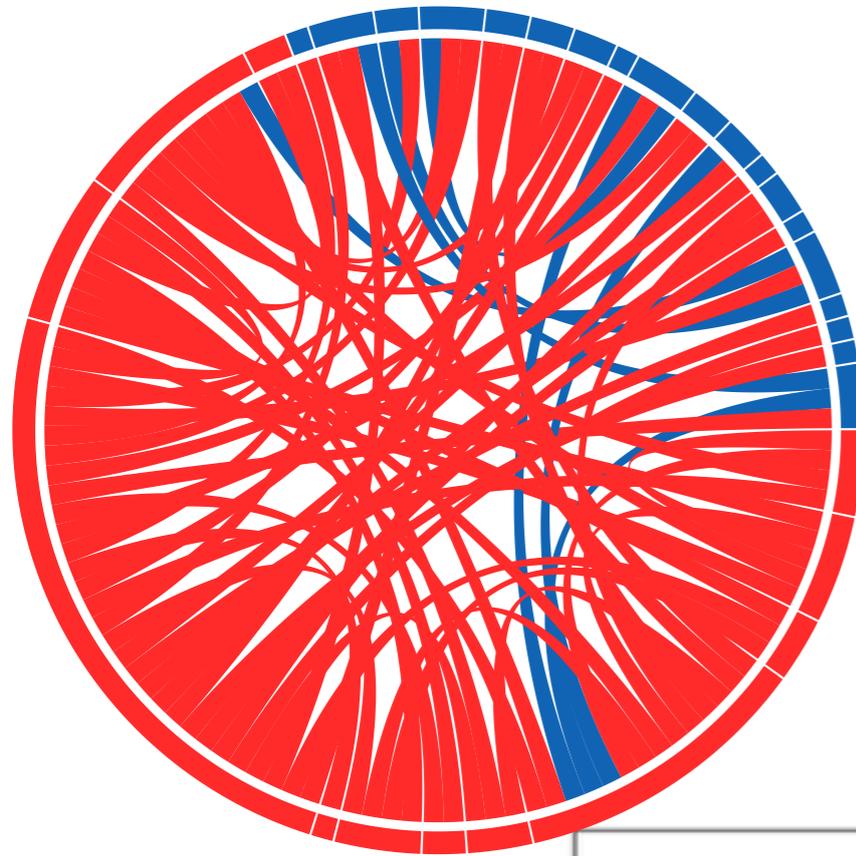
# Users tend to focus on a limited set of information sources



# Brexit on Facebook

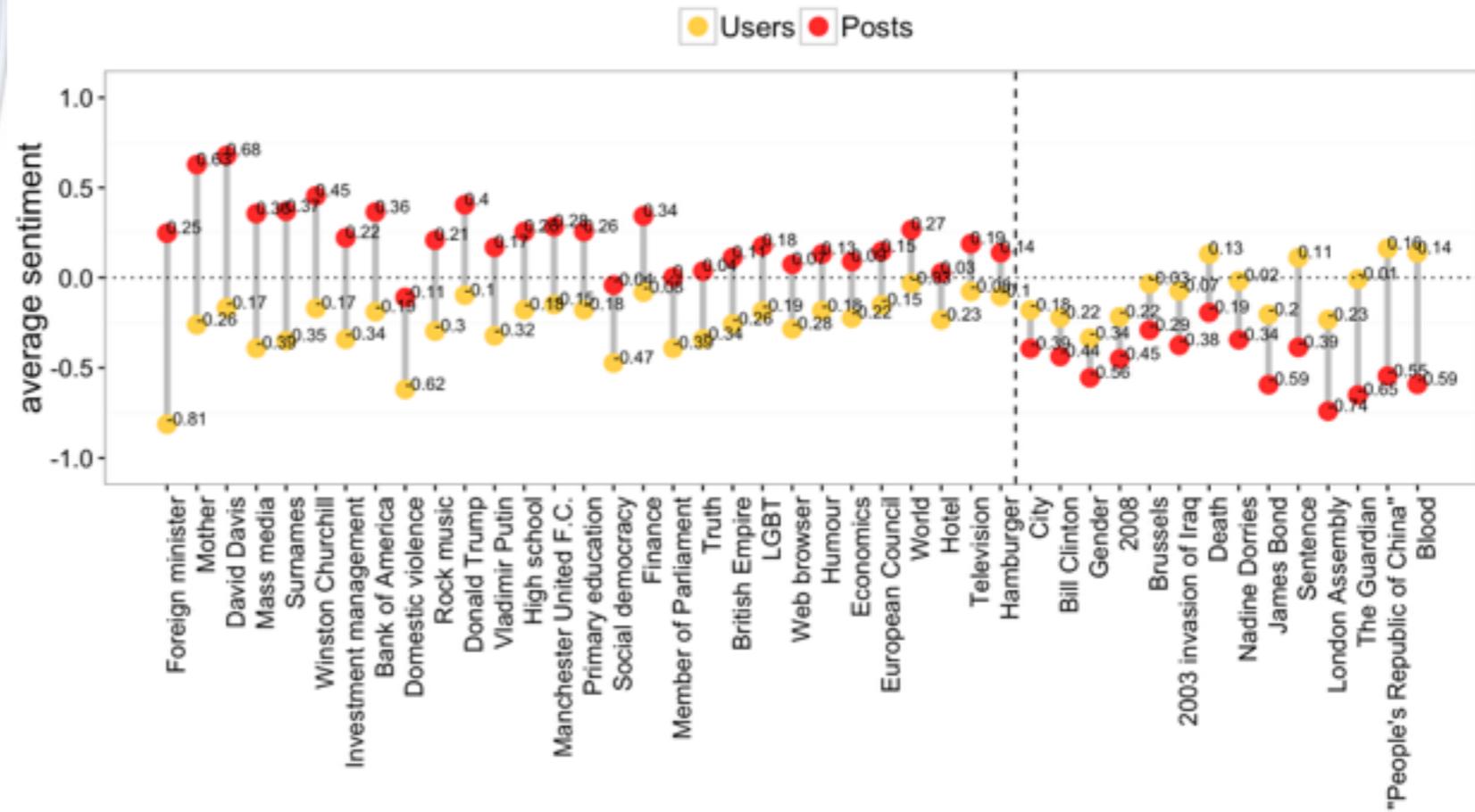
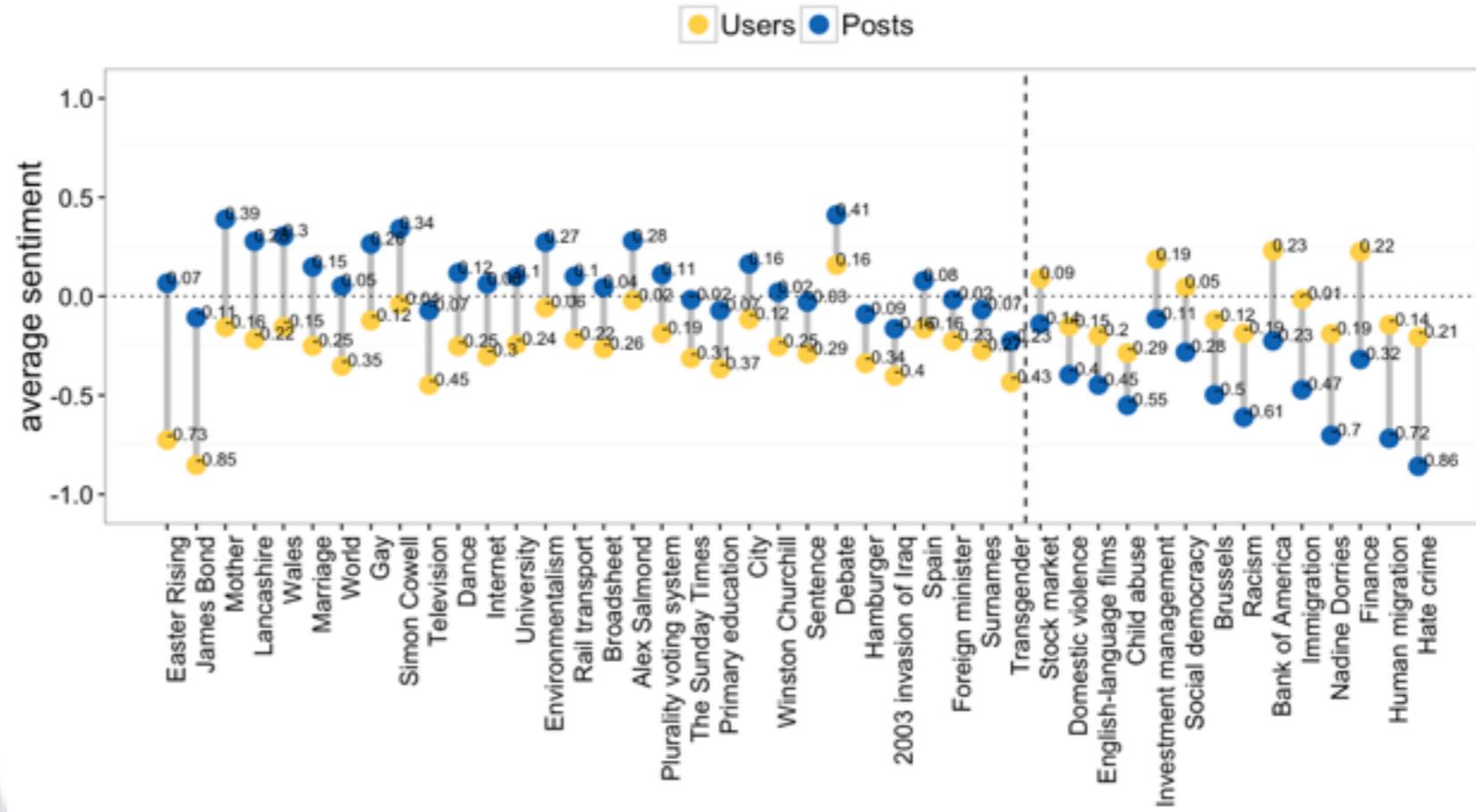
## Community Structure

Backbone of the projections on pages of the users likes (left) and comments (right).



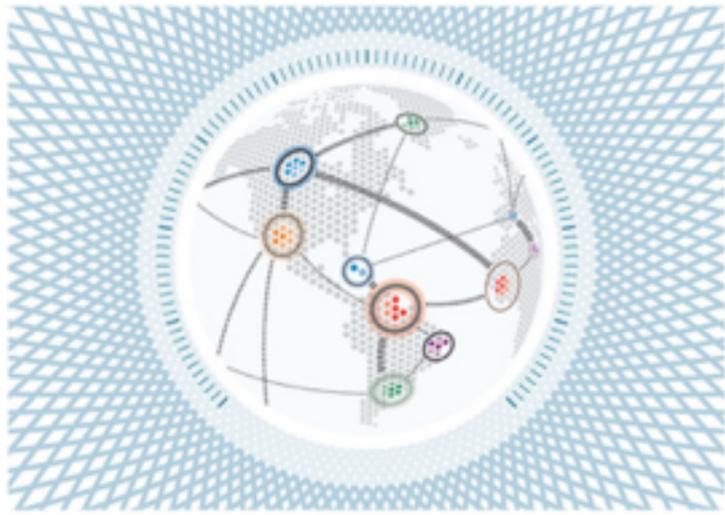
**Polarization:** Distribution of Users likes and comments on the 2 communities

# Perception inside the echo chamber

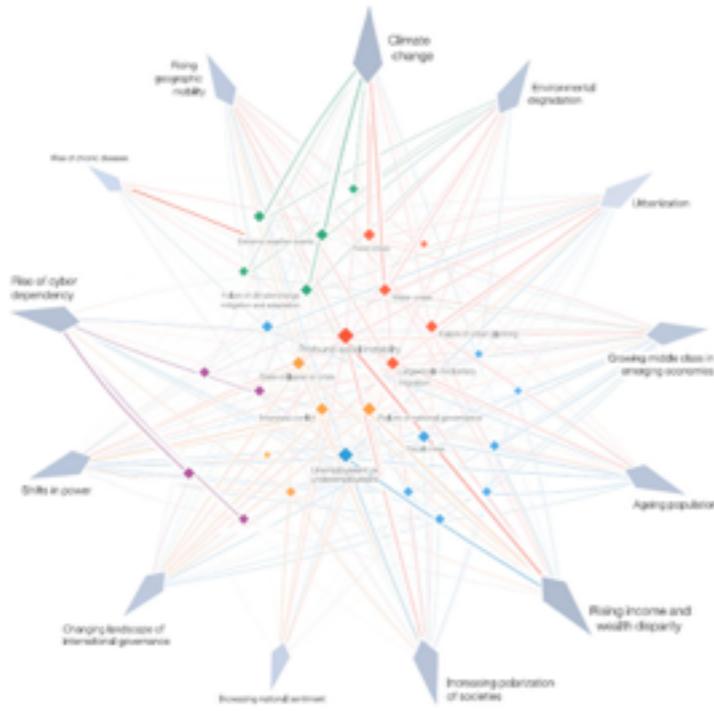


Insight Report

# The Global Risks Report 2016 11th Edition



## The Risks-Trends Interconnection Map 2016



Global Agenda > Digital > Risk and Resilience > Social Media

# How does misinformation spread online?



Image: A man poses with his iPad tablet as he sits in a bar, in this photo illustration taken in Rome September 20, 2012. REUTERS/Tony Gentile

### Written by

Walter Quattrocchi, Head of the Laboratory of Computational Social Science, IMT Lucca in Italy

### Published

Thursday 14 January 2016

In the run up to the 2013 Italian elections, a social media post exposing the corruption of parliament went viral. Italian politicians were quietly certain that, win or lose, they would be financially secure by taking money from the taxpayer. Parliament had quietly passed a special welfare bill specially designed to protect policy-makers by ensuring them an incredible unemployment package should they lose their seat in the upcoming election. The bill, proposed by Senator

# THE BOOK

Walter Quattrociochi, Antonella Vicini

## MISINFORMATION

Guida alla società dell'informazione e della credulità

pp. 176, € 23,00

cod. 666.9 (V)

Collana: NEO

ISBN 9788891742254

Previsto in libreria: 5 ottobre 2016 – SN 13



**Potenziale di vendita:** 

**Argomento:** Attualità / Comunicazione e media

**Livello:** Saggi, scenari, interventi

**Promozione:** Digital e social media marketing. Interviste. Recensioni.

**Il World Economic Forum ha inserito la disinformazione digitale (casuale o costruita ad arte) nella lista dei 'rischi globali': capace di avere risvolti politici, geopolitici e, perfino, terroristici.**

**I social network sono il terreno di coltura e di diffusione perfetta del virus della disinformazione, con conseguenze che vanno ben al di là del recinto del mondo digitale. Perché?**

**Questo libro offre una panoramica sui meccanismi sociali e cognitivi di un fenomeno che ormai è sotto gli occhi di tutti, anche di quelli meno attenti.**