# The Spread of Misinformation in Social Media

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# **ABSTRACT**

As social media become major channels for the diffusion of news and information, they are also increasingly attractive and targeted for abuse and manipulation [2, 3]. This talk overviews ongoing network analytics, data mining, and modeling efforts to understand the spread of misinformation online and offline. I present machine learning methods to detect astroturf [6] and social bots [4, 7], and outline initial steps toward computational fact checking [1], as well as theoretical models to study how truthful and truthy facts compete for our collective attention [9, 8]. These efforts will be framed by a case study in which, ironically, our own research became the target of a coordinated disinformation campaign [5].

# Keywords

Social media, Twitter, diffusion networks, misinformation, social bots, astroturf, hoaxes, echo chambers, social bubbles, fact checking

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# Bio

Filippo Menczer is a professor of informatics and computer science, adjunct professor of physics, and a member of the cognitive science program at Indiana University, Bloomington. He holds a Laurea in Physics from the University of Rome and a Ph.D. in

Copyright is held by the author/owner(s). WWW'16 Companion, April 11–15, 2016, Montréal, Québec, Canada. ACM 978-1-4503-4144-8/16/04. http://dx.doi.org/10.1145/2872518.2890092. Computer Science and Cognitive Science from the University of California, San Diego. Dr. Menczer has been the recipient of Fulbright, Rotary Foundation, and NATO fellowships, and a Career Award from the National Science Foundation. He currently serves as director of the Center for Complex Networks and Systems Research and is a Fellow of the Institute for Scientific Interchange Foundation in Torino, Italy, a Senior Re-



search Fellow of The Kinsey Institute, and an ACM Distinguished Scientist. He previously served as division chair in the IUB School of Informatics and Computing, and was Fellow-at-large of the Santa Fe Institute. His research focuses on Web science, social networks, social media, social computation, Web mining, distributed and intelligent Web applications, and modeling of complex information networks. His work has been covered in many US and international news sources, including *The New York Times, Wall Street Journal, Washington Post, NPR, CNN, BBC, Nature,* and *Science.* 

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