

#### KDD 2017 Halifax, Nova Scotia - Canada August 13 - 17, 2017

# Tutorial: Data-Driven Approaches towards Malicious Behavior Modeling



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Tutorial link: http://bit.ly/kdd2017

#### Outline

#### Introduction

Feature-based algorithms

Spectral-based algorithms

Density-based algorithms

Sockpuppets

Vandals

Hoaxes

√isualization: "spokes", "blocks", "staircases"

Camouflage

Theoretical guarantee

III-gotten Likes

Synchronized Behaviors

Advertising campaigns

Social spam

Conclusions and future directions

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# Signs of malicious behavior to look out for

- Activity: malicious behavior is often done with "throwaway" and recent accounts
- Temporal: malicious users are often faster
- Linguistic: malicious users are often abusive and more opinionated
- Network: malicious users often collude and are densely connected to each other
- Community feedback: malicious users are harshly treated by other users, but regular negative feedback can be harmful
- Lockstep behavior:

## P1. Anonymity

What is the role of anonymity and the lack of single verified identify in antisocial behavior on the internet?

### P2. Early detection

How can antisocial behavior and disinformation be detected as early as possible?

What features can we use?
Can we skip semantic analysis and fact checking?

### P3. Adversarial setting

Bad users can actively change behavior in presence of new detection measures to avoid detection.

How do we deal with this?

### P4. Organized adversaries

How do we detect coordinated attacks on social media, as opposed to lone wolf attacks?

#### **Datasets**

- Wikipedia hoax dataset: <a href="www.cs.umd.edu/~srijan/hoax">www.cs.umd.edu/~srijan/hoax</a>
- Wikipedia personal attack dataset: <a href="https://figshare.com/projects/Wikipedia\_Talk/16731">https://figshare.com/projects/Wikipedia\_Talk/16731</a>
- Wikipedia vandals: <u>www.cs.umd.edu/~srijan/vews/</u>
- Wikipedia vandalism: <u>http://wikipapers.referata.com/wiki/List\_of\_vandalism\_dat</u> asets
- TAMU Twitter honeypot dataset: <u>http://infolab.tamu.edu/data/</u>
- Twitter synchronized malicious behavior data: <u>http://www.meng-jiang.com/pubs/catchsync-kdd14/catchsync-kdd14-code-and-data.gz</u>
- Amazon, Yelp, TripAdvisor review datasets:
- http://shebuti.com/collective-opinion-spam-detection/
- http://cs.unm.edu/~aminnich/trueview/
- https://www.cs.uic.edu/~liub/FBS/fake-reviews.html
- http://snap.stanford.edu/data/#reviews



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