

# Information Manipulation

Lynnette Hui Xian Ng

# Lynnette Ng

- PhD in Societal Computing, Carnegie Mellon University
- Advised by Prof Kathleen Carley
- Information Manipulation
  - Influence of humans in the online space

<input type="checkbox"/> TITLE			CITED BY	YEAR
<input type="checkbox"/> <a href="#">Analyzing public opinion and misinformation in a COVID-19 telegram group chat</a> LHX Ng, JY Loke IEEE Internet Computing 25 (2), 84-91	62	*	2020	
<input type="checkbox"/> <a href="#">A synchronized action framework for responsible detection of coordination on social media</a> T Magelinski, LHX Ng, KM Carley arXiv preprint arXiv:2105.07454	49		2021	
<input type="checkbox"/> <a href="#">Stabilizing a supervised bot detection algorithm: How much data is needed for consistent predictions?</a> LHX Ng, DC Robertson, KM Carley Online Social Networks and Media 28, 100198	33		2022	
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<input type="checkbox"/> <a href="#">Investigating the spread of Russian disinformation about biolabs in Ukraine on Twitter using social network analysis</a> I Alieva, LHX Ng, KM Carley 2022 IEEE international conference on big data (big data), 1770-1775	21		2022	

## IP&M 2022 Ph.D. Paper Award Winner

TITLE

Analyzing public opinion and media  
LHX Ng, JY Loke  
IEEE Internet Computing 25 (2), 84-91

A synchronized action framework for media  
T Magelinski, LHX Ng, KM Carley  
arXiv preprint arXiv:2105.07454

Stabilizing a supervised bot detection system to produce consistent predictions?  
LHX Ng, DC Robertson, KM Carley  
Online Social Networks and Media 28,

Botbuster: Multi-platform bot detection system  
LHX Ng, KM Carley  
Proceedings of the International AAAI Conference on Web and Social Media 16,

Cross-platform information spreading analysis  
LHX Ng, IJ Cruickshank, KM Carley  
Social Network Analysis and Mining 12 (2), 1-12

Coordinating Narratives Framework for social media analysis in riots  
LHX Ng, IJ Cruickshank, KM Carley  
Computational and Mathematical Organization Theory 27 (2), 131-153

How does fake news spread? Understanding the role of APIs  
LHX Ng, A Taeihagh  
arXiv preprint arXiv:2109.12865

Investigating the spread of Russian disinformation about biolabs in Ukraine on Twitter using social network analysis  
I Alieva, LHX Ng, KM Carley  
2022 IEEE international conference on big data (big data), 1770-1775

**The Editors, Editorial Board, and Publisher are pleased to announce the winner of the 2022 IP&M Ph.D. Paper Award, which is:**

### Best PhD Paper for 2022

Ng, L. H. X., & Carley, K. M. (2022). Is my stance the same as your stance? A cross validation study of stance detection datasets. *Information Processing & Management*, 59(6),

103070. <https://www.sciencedirect.com/science/article/pii/S0306457322001728>

### Honorable Mentions

Kaya, K., Yilmaz, Y., Yaslan, Y., Öğüdücü, Ş. G., & Çingi, F. (2022). Demand forecasting model using hotel clustering findings for hospitality industry. *Information Processing & Management*, 59(1),

102816. <https://www.sciencedirect.com/science/article/abs/pii/S0306457321002909>

Zhang, X., Lin, H., Xu, B., Li, C., Lin, Y., Liu, H., & Ma, F. (2022). Dynamic intent-aware iterative denoising network for session-based recommendation. *Information Processing & Management*, 59(3),

102936. <https://www.sciencedirect.com/science/article/abs/pii/S0306457322000590>

- Analyzing public opinion and misinformation during a COVID-19 pandemic  
LHX Ng, JY Loke  
IEEE Internet Computing 25 (2), 84-91
- A synchronized action framework for responsible detection of fake news in social media  
T Magelinski, LHX Ng, KM Carley  
arXiv preprint arXiv:2105.07454
- Stabilizing a supervised bot detection algorithm: How much does it matter for consistent predictions?  
LHX Ng, DC Robertson, KM Carley  
Online Social Networks and Media 28, 100198
- Honorable Mention  
Botbuster: Multi-platform bot detection using a mixture of expert systems  
LHX Ng, KM Carley  
Proceedings of the International AAAI Conference on Web and Social Media 2020, 102816
- Cross-platform information spread during the January 6th event: Insights and findings for hospital emergency departments  
LHX Ng, IJ Cruickshank, KM Carley  
Social Network Analysis and Mining 12 (1), 133
- Coordinating Narratives Framework for cross-platform analysis of political riots  
Zhang, X., Lin, H., Xiong, Y., Ng, L.H., Carley, K.M.  
Computational and Mathematical Organization Theory 29 (3), 470-486
- How does fake news spread? Understanding pathways of disinformation via APIs  
LHX Ng, A Taeihagh  
arXiv preprint arXiv:2109.12865
- Investigating the spread of Russian disinformation about biological weapons using social network analysis  
I Alieva, LHX Ng, KM Carley  
2022 IEEE international conference on big data (big data), 1770-1775

# Standardized Data Set Annotations Could Aid in Detecting Social Media Sentiments

Byron Spice

Thursday, August 3, 2023



Social media provides an important window into the public zeitgeist, generating humongous data sets that reflect attitudes on everything from abortion to the latest Taylor Swift concert. Tapping this resource would be impossible without artificial intelligence, but Carnegie Mellon University researchers caution that the machine learning models employed to analyze these data sets — known as stance detection models — have some limitations.

Stance detection models allow AI to identify positive, negative or neutral reactions in large data sets from social media posts. However, a model trained using a data set on one topic will have trouble assessing the attitudes present in data related to a separate topic, according to research by [Lynnette Hui Xian Ng](#), a Ph.D. student in social computing in the School of Computer Science's [Software and Societal Systems Department](#). For example, a model trained to detect public sentiments using a Twitter data set on politics will have trouble discerning whether sentiments are positive, negative or neutral in a Twitter data set on COVID-19 vaccines.

Ng explored the generalizability of stance detection by training models that each used one of seven publicly available data sets on such topics as 2016 politicians, atheism, and company mergers and acquisitions. She then tested each of the



Carnegie Mellon University  
IP&M 2022 Ph.D. Paper Award Winner

SEARCH 

TITLE

- Analyzing public opinion and misinformation in COVID-19 telegram group chats  
LHX Ng, JY Lake  
IEEE Internet Computing 25 (2), 84-91

- A synchronized action framework for responsible detection of coordinated media  
T Magelinski, LHX Ng, KM Carley  
arXiv preprint arXiv:2105.07454

- Stabilizing a supervised bot detection algorithm for more consistent predictions?  
LHX Ng, DC Robertson, KM Carley  
Online Social Networks and Media 28, 100198

- Botbuster: Multi-platform bot detection using a mixture of experts  
LHX Ng, KM Carley  
Proceedings of the International AAAI Conference on Web and Social Media 2021

- Cross-platform information spread and its implications for human findings for hospitality industry  
LHX Ng, IJ Cruickshank, KM Carley  
Social Network Analysis and Mining 12 (1), 102816. <https://www.scientificreports.com/articles/102816>

- Coordinating Narratives Framework for cross-platform analysis in the context of social media stance detection in the context of social media riots  
LHX Ng, IJ Cruickshank, KM Carley  
Computational and Mathematical Organization Theory 27 (2), 479-499. <https://doi.org/10.1007/s00354-020-09349-0>

- How does fake news spread? Understanding polarization of disinformation via APIs  
LHX Ng, A Taeihagh  
arXiv preprint arXiv:2109.12865

- Investigating the spread of Russian disinformation about biolabs in Ukraine on Twitter  
I Alieva, LHX Ng, KM Carley  
2022 IEEE international conference on big data (big data), 1770-1775

## How Blatantly False Headlines Can Distort What We Believe In

The study's survey methods are "sufficiently rigorous," says Lynnette Hui Xian Ng, a misinformation and disinformation researcher at Carnegie Mellon University. She notes, however, that the respondents were all U.S. residents, and the results may not generalize to the rest of the world. Orchinik, for his part, points out that the implications of his paper (which he emphasizes has not yet gone through peer review) also depend on the volume of moderately implausible information that exists online.

23 May 2023

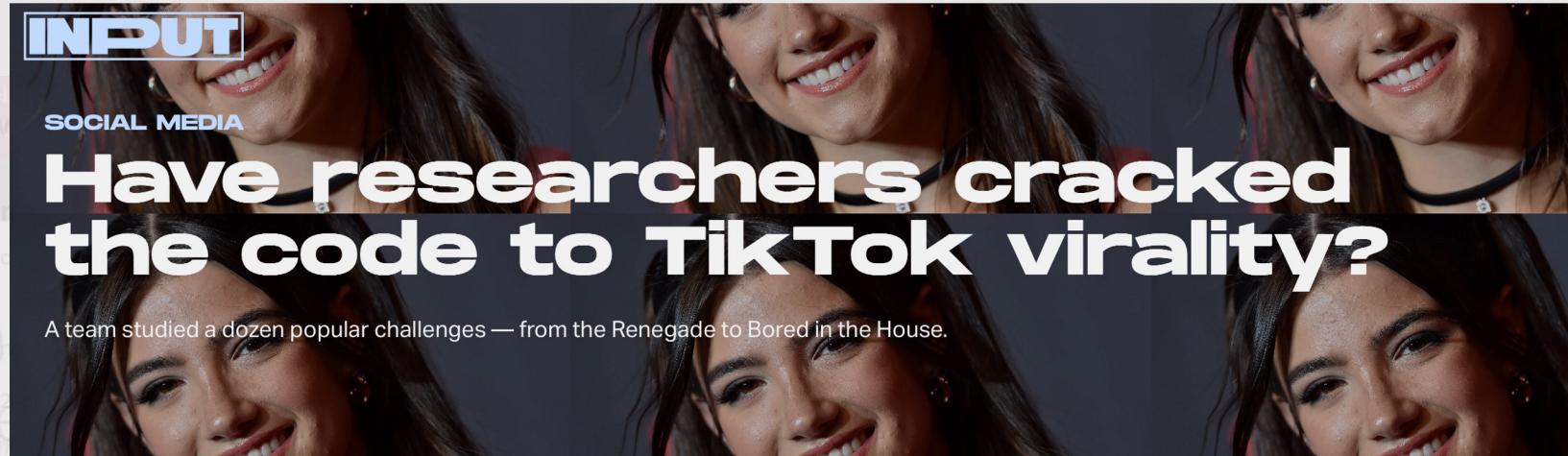
TITLE

Analyzing public opinion and misinformation in a COVID-19 telegram group  
LHX Ng, JY Loke  
IEEE Internet Computing 25 (2), 84-91

A synchronized action framework for responsible detection of coordination of media  
T Magelinski, LHX Ng, KM Carley  
arXiv preprint arXiv:2105.07454

Stabilizing a supervised bot detection algorithm: How much data is needed to get consistent predictions?

Best Ph.D Paper for 2022  
Ng, L. H. X., & Carley, K. M. (2022). Stabilizing a supervised bot detection algorithm: How much data is needed to get consistent predictions? In Datasets. Information Processing: People, Technology, and Society. https://doi.org/10.5281/zenodo.5906457322000590



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## Technology

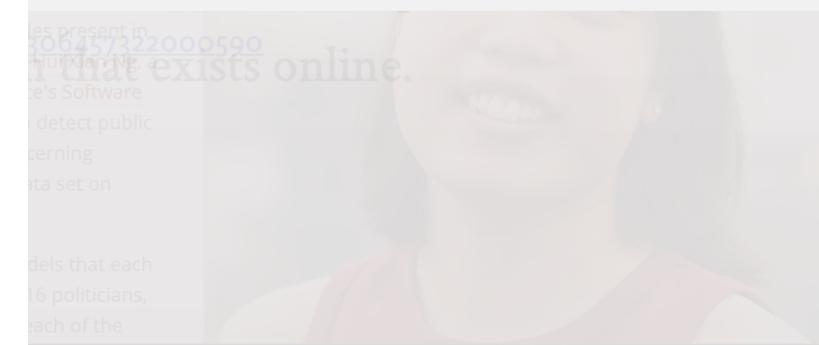
# Armies of bots battled on Twitter over Chinese spy balloon incident

Large proportions of users posting on Twitter – now X – about the Chinese balloon that drifted over the US and Canada in 2023 were bots attempting to shape the debate

By [Chris Stokel-Walker](#)

2 February 2024

Understanding how videos go viral is researchers' holy grail — and for obvious reasons: Crack it and they're guaranteed fame, and with it, potentially lots of





[r/science](#) • 4 mo. ago

Wagamaga

Armies of bots battled on Twitter over Chinese spy balloon incident. Around 35 per cent of users geotagged as located in the US exhibited bot-like behaviour, while 65 per cent were believed to be human. In China, the proportions were reversed: 64 per cent were bots and 36 per cent were humans.

Computer Science



# Information Manipulation

Lynnette Hui Xian Ng

At its core,

PERSUASION

# Ultimate Aim?

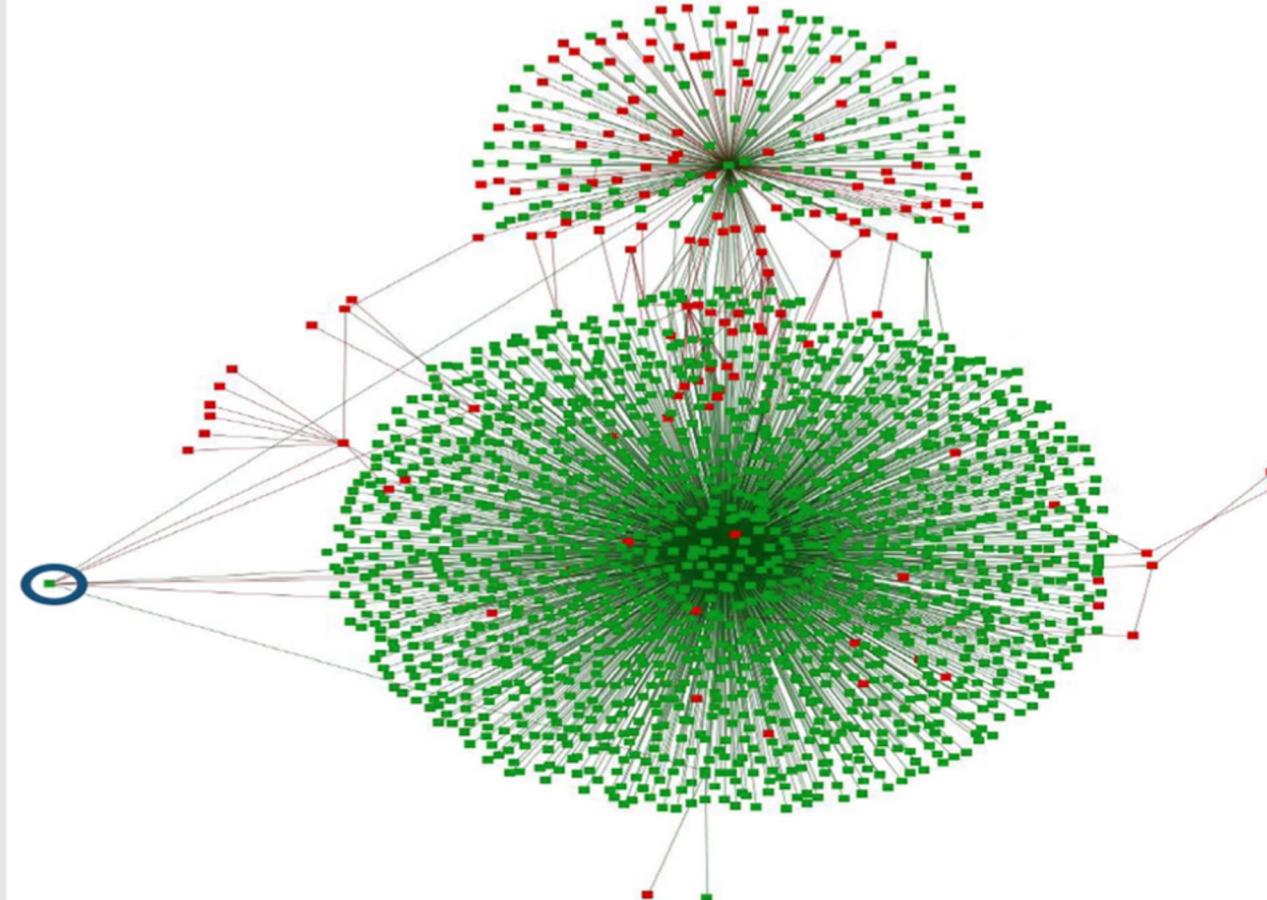
MIND CONTROL  
POWER

# WHY do we care?

## Social Influence Change People's Stances

Ng, Lynnette Hui Xian, and Kathleen M. Carley. "Pro or anti? a social influence model of online stance flipping." *IEEE Transactions on Network Science and Engineering* 10, no. 1 (2022): 3-19.

# WHY do we care?

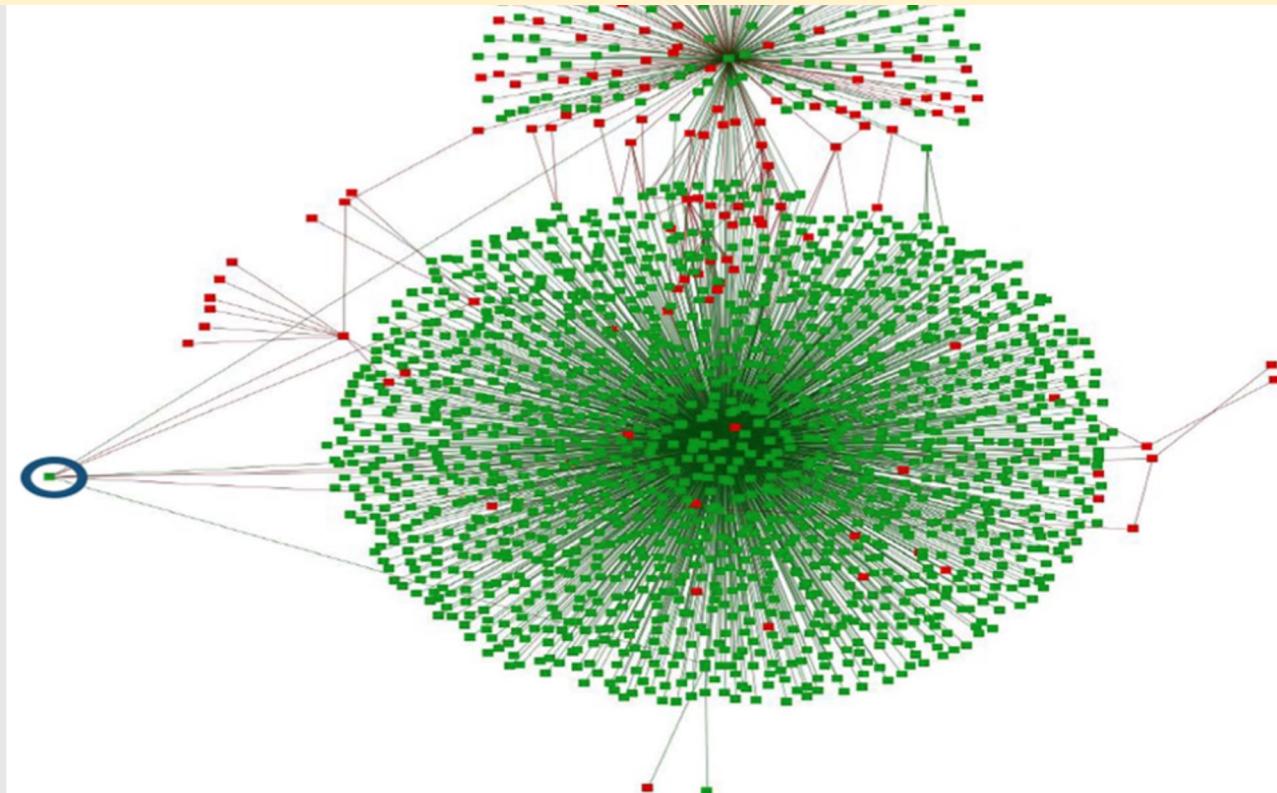


Green = Pro-Vaccine

Red = Anti-vaccine

# WHY do we care?

If you apply enough social pressure, people change their stances

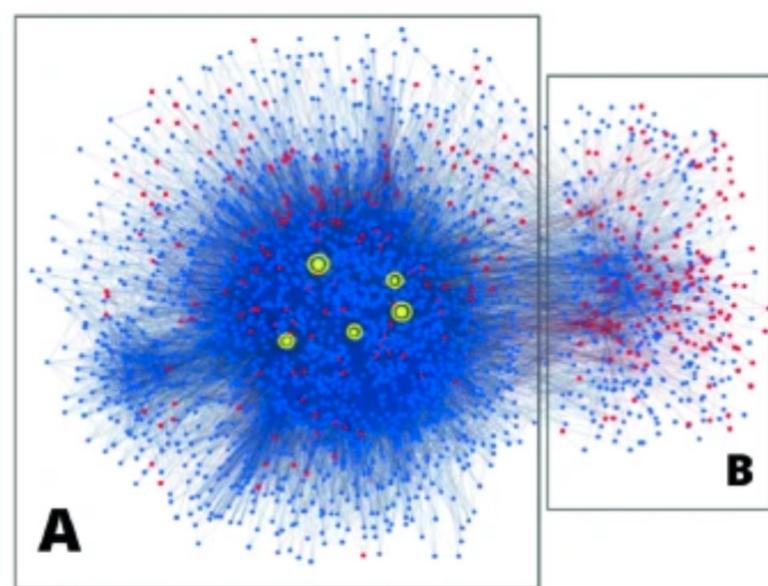


Green = Pro-Vaccine

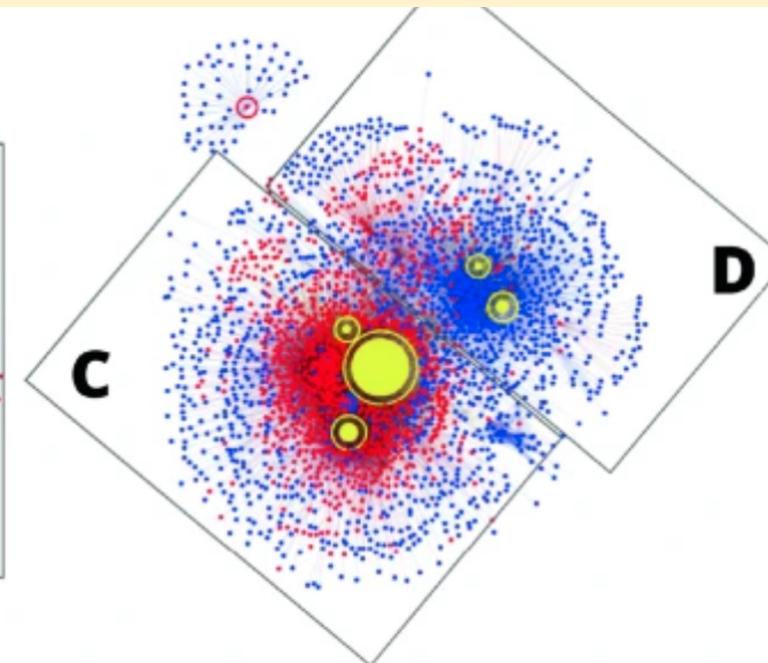
Red = Anti-vaccine

# WHY do we care?

If you apply enough social pressure, you can segregate people into clusters (i.e., polarization, echo-chambers)



**A**



**B**

**C**

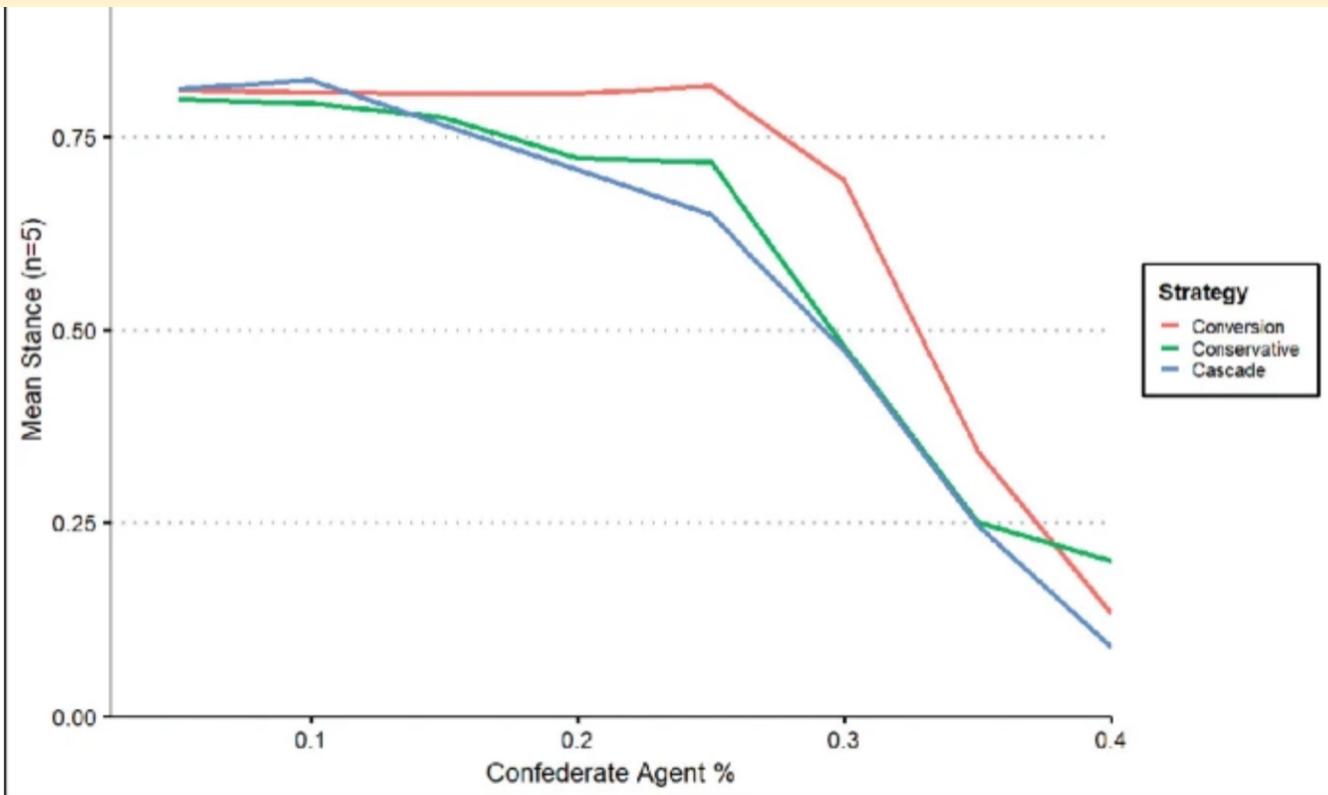
**D**

(a) Impact of D-maneuvers on International  
case study: Palestine-Israel Conflict

(b) Impact of B-maneuvers on Regional case  
study: alcohol beverage

# WHY do we care?

And stances converge faster if you manage to convert people in a cascade fashion



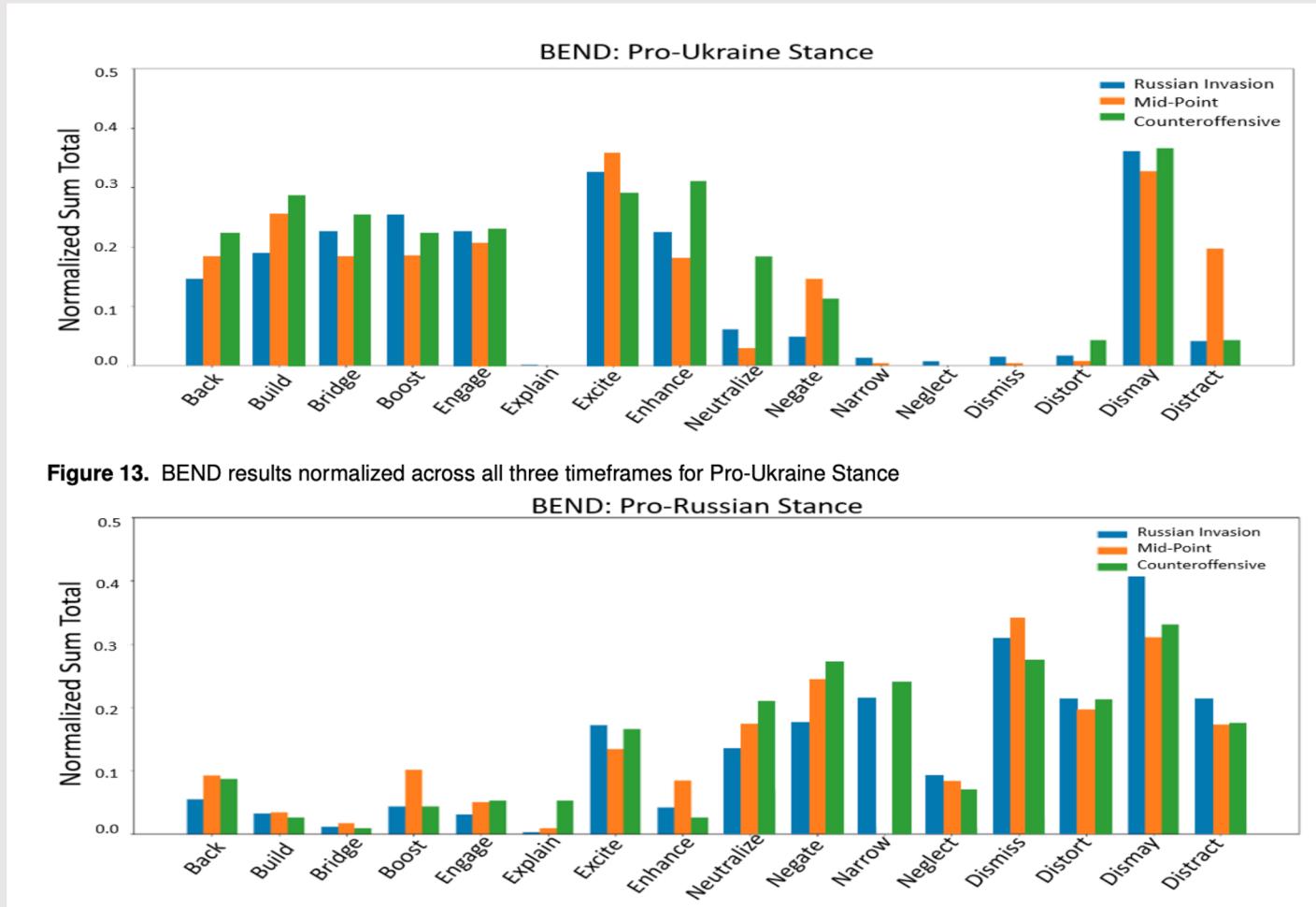
It doesn't matter  
if it's foreign or domestic;  
if it's automatic or organic;  
if it changes people's mind,  
it's influence we should watch

# HOW do we identify Information Campaigns?

## Information Maneuvers Framework 1 – BEND Framework

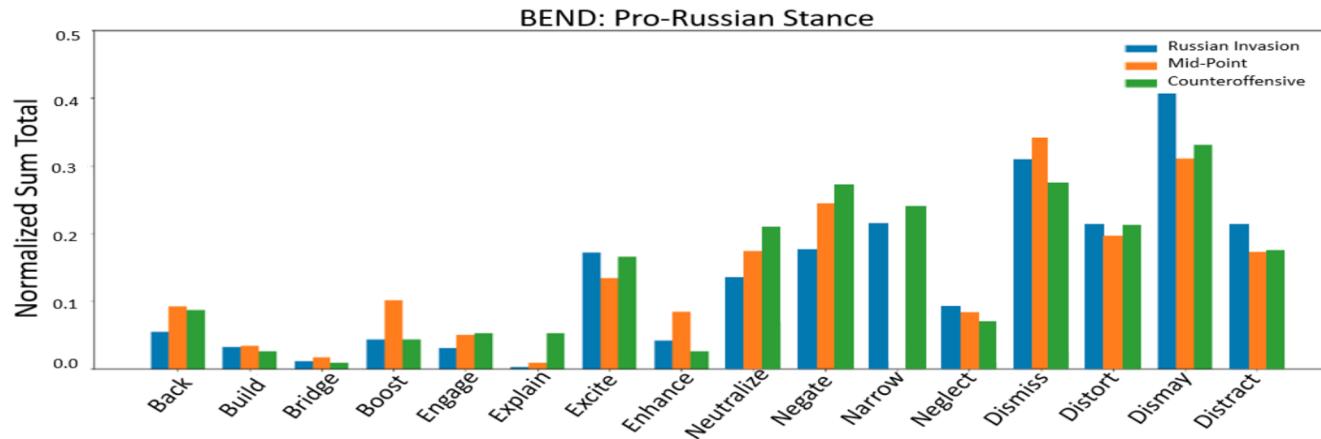
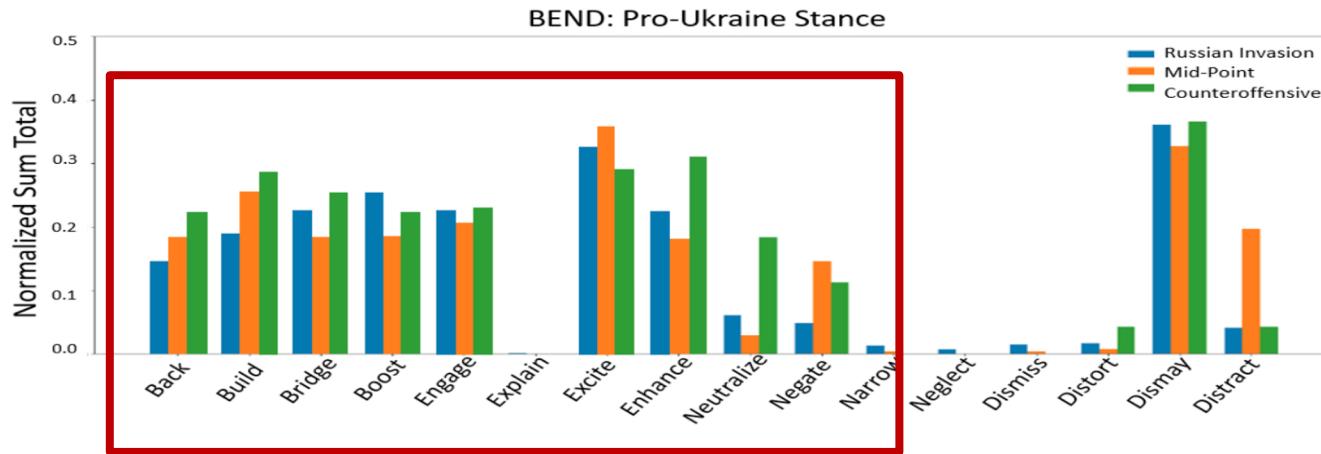
Marigliano, Rebecca, **Lynnette Hui Xian Ng**, and Kathleen M. Carley. “[Analyzing Digital Propaganda and Conflict Rhetoric: A Study on Russia’s Bot-Driven Campaigns and Counter Narratives during the Ukraine Crisis.](#)” (2024)

# Persuasion Techniques in 2022 Russia invasion of Ukraine



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Pro-Ukraine users consistently perform more positive techniques



# Persuasion Techniques in 2022 Russia invasion of Ukraine

Pro-Ukraine users consistently perform more positive techniques

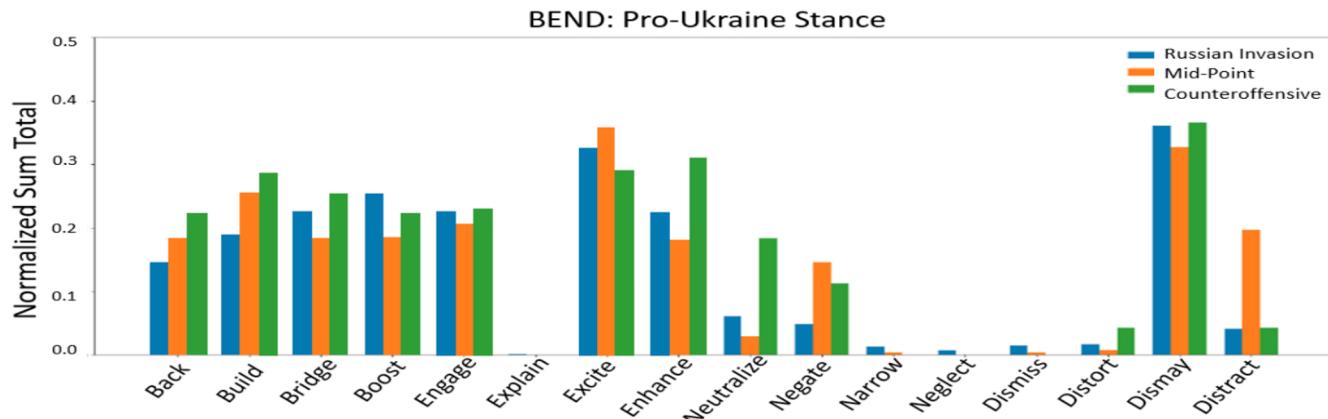
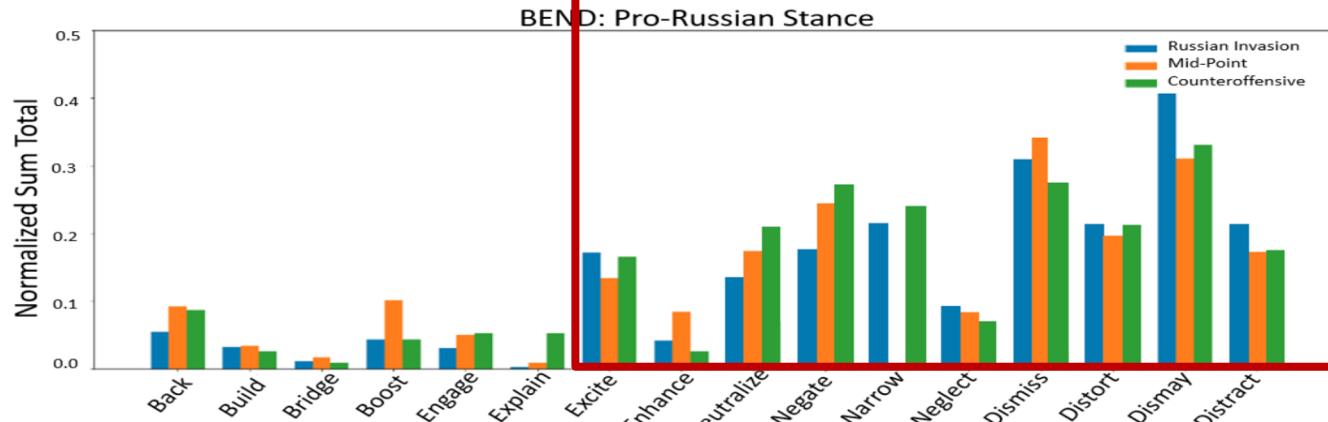


Figure 13. BEND results normalized across all three timeframes for Pro-Ukraine Stance



Pro-Russian users consistently perform more negative techniques

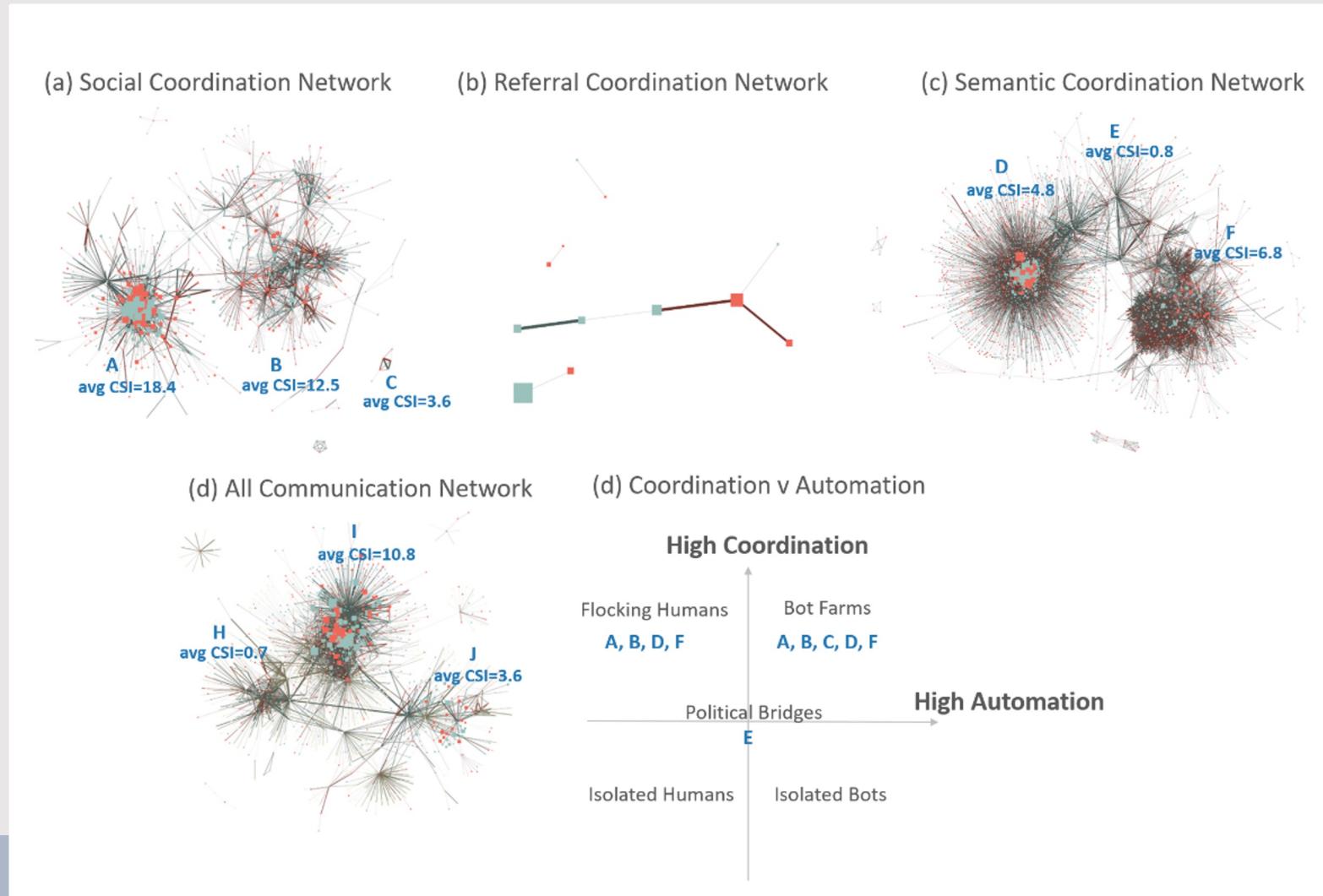
# HOW do we identify Information Campaigns?

## Information Maneuvers Framework 2 – Coordination + Automation

**Lynnette Hui Xian Ng, Mihovil Bartulovic and Kathleen M. Carley.** "Tiny-BotBuster:  
Identifying Automated Political Coordination in Digital Campaigns" (2024).

# 2024 Indonesian Elections Campaigns

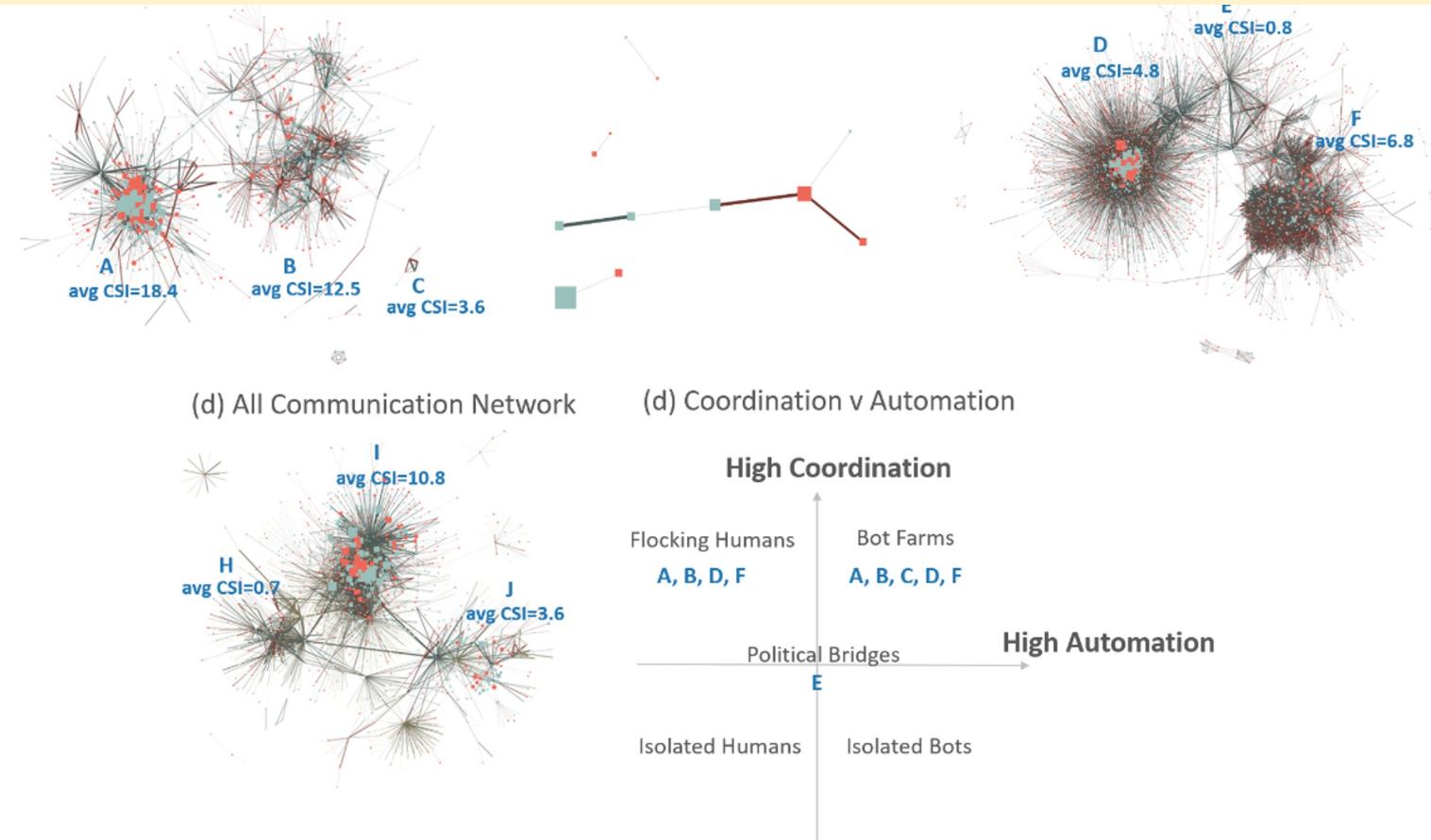
Green = Humans  
Red = Bots



# 2024 Indonesian Elections Campaigns

Three Largest Political Parties have clusters of online information influence

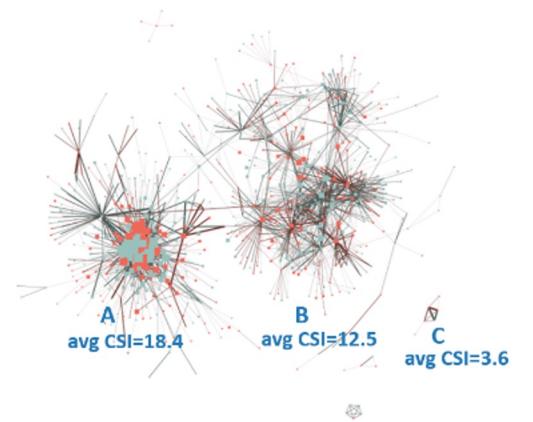
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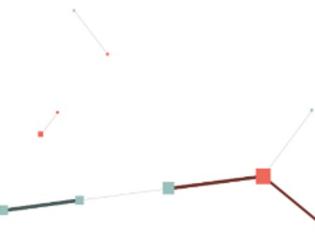
# 2024 Indonesian Elections Campaigns

Largest party (PDI-P) used the most % of bots

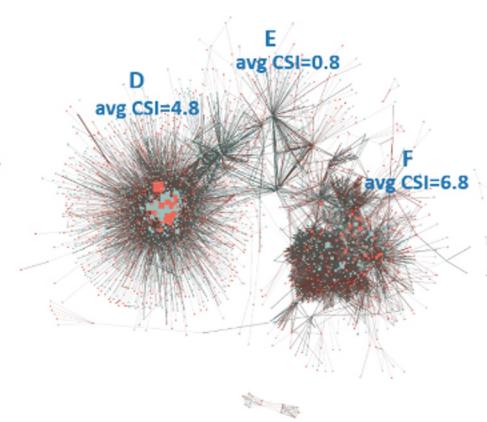
(a) Social Coordination Network



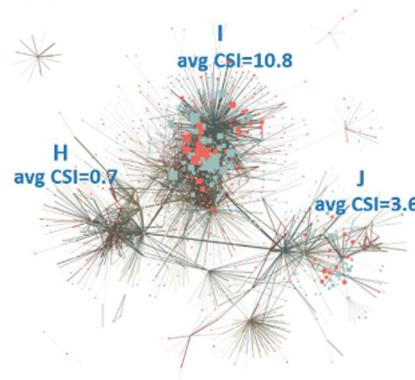
(b) Referral Coordination Network



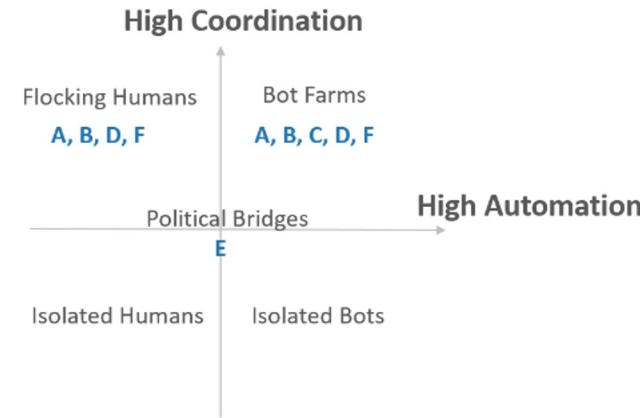
(c) Semantic Coordination Network



(d) All Communication Network



(d) Coordination v Automation



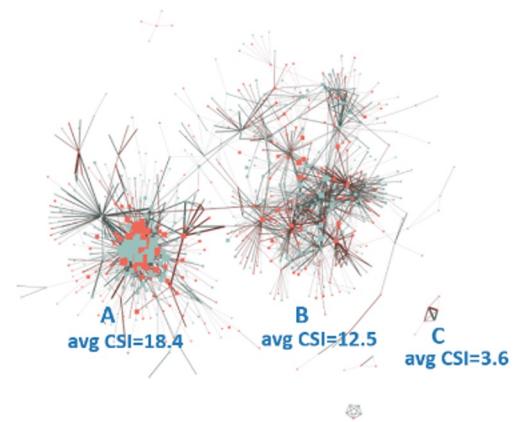
Green = Humans

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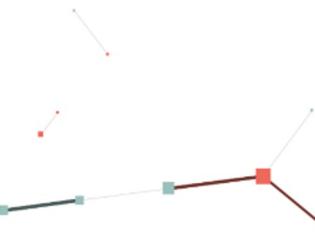
# 2024 Indonesian Elections Campaigns

Bot farms are everywhere

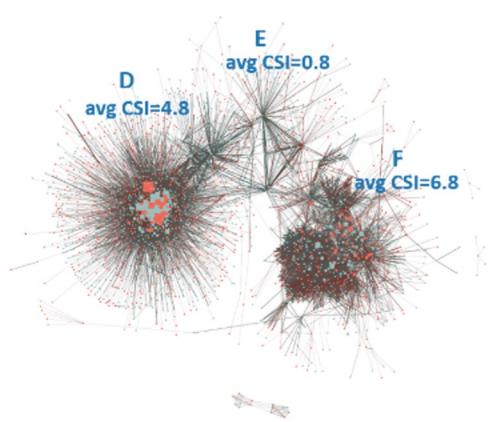
(a) Social Coordination Network



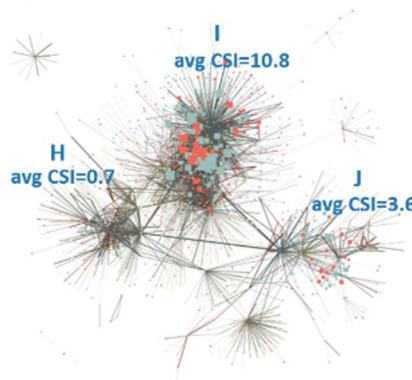
(b) Referral Coordination Network



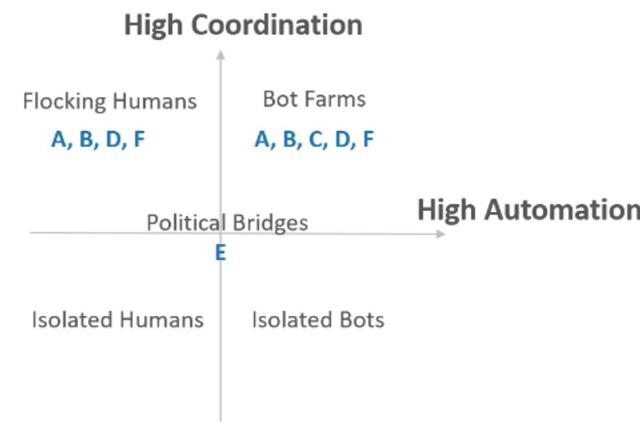
(c) Semantic Coordination Network



(d) All Communication Network



(d) Coordination v Automation



Green = Humans

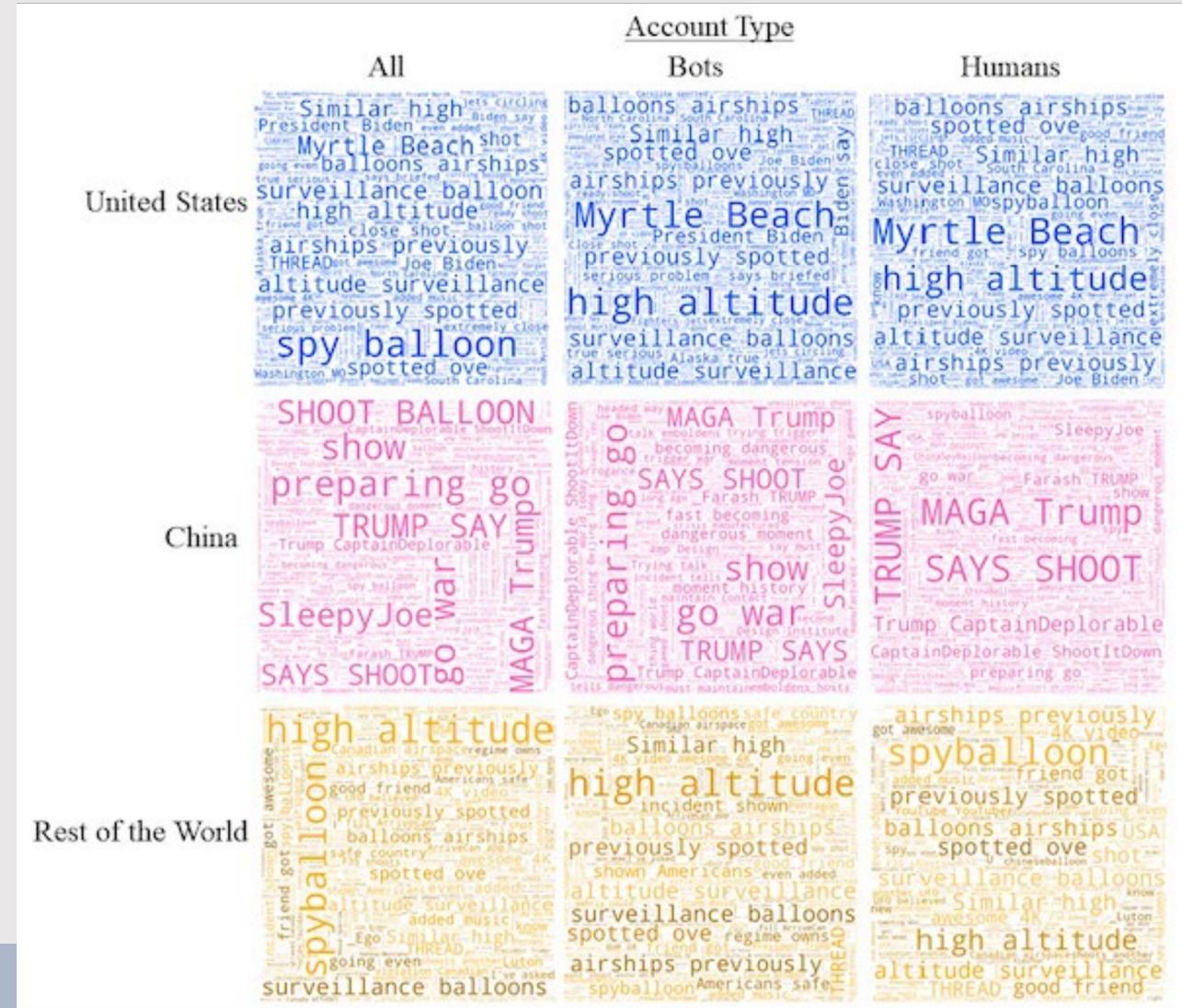
Red = Bots

# WHO are spreading information warfare?

## Bots or Humans?

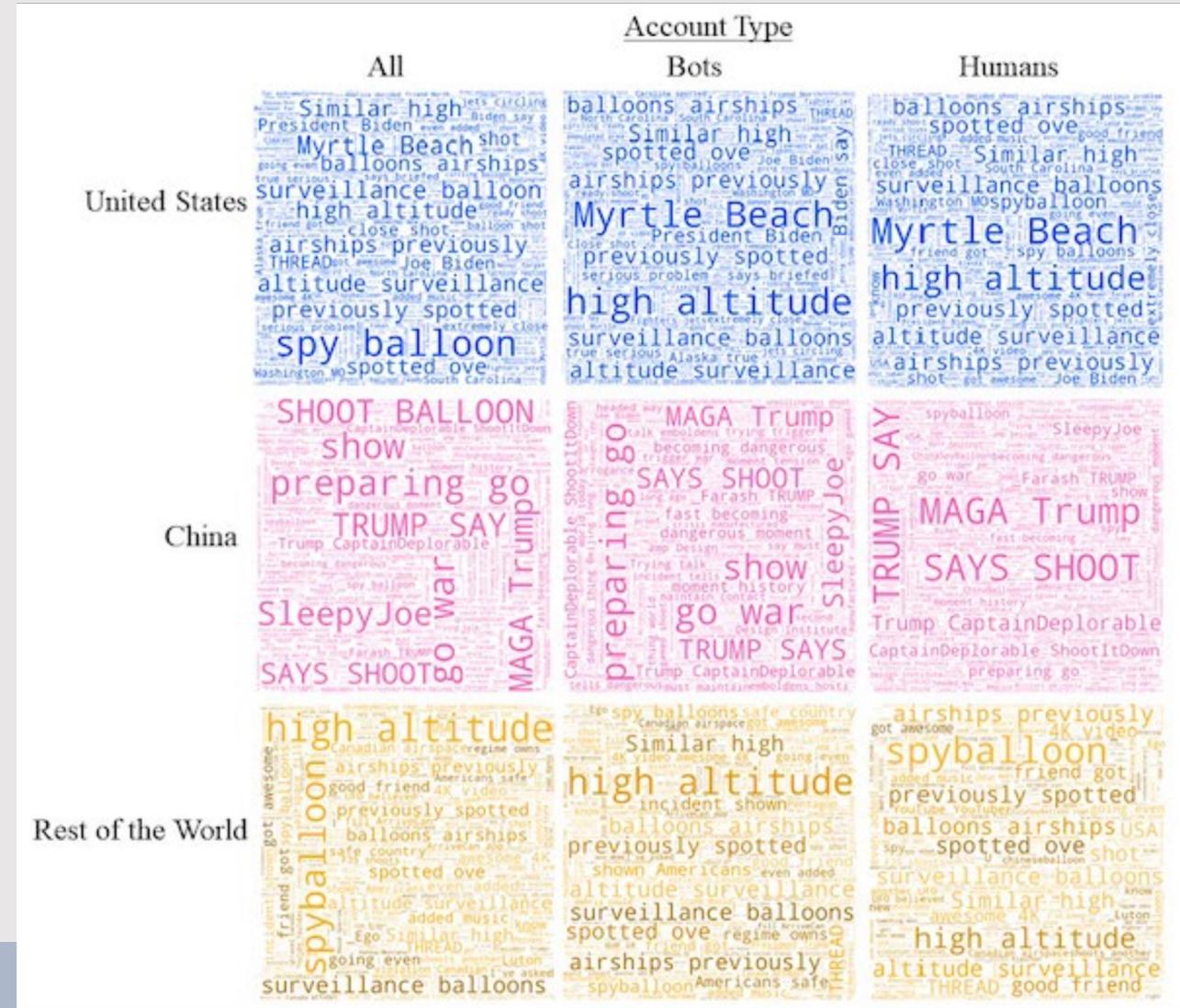
**Ng, Lynnette Hui Xian**, Ian Kloo, Samantha Clark, and Kathleen M. Carley. "An exploratory analysis of COVID bot vs human disinformation dissemination stemming from the Disinformation Dozen on Telegram." *Journal of Computational Social Science* (2024): 1-26.

# 2023 US-China Balloon Incident



# 2023 US-China Balloon Incident

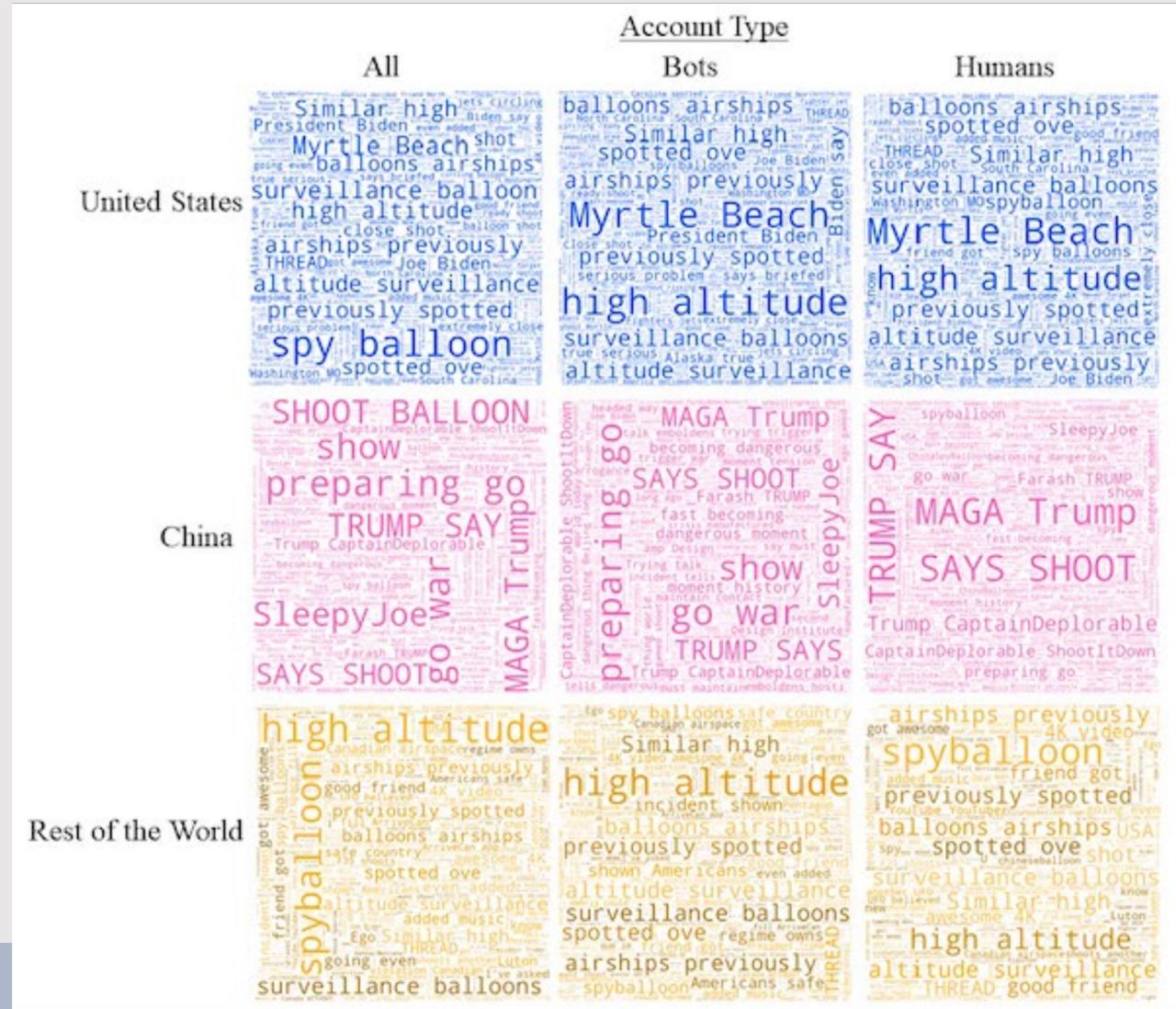
Bots mimic  
humans,  
or Humans  
mimic bots?



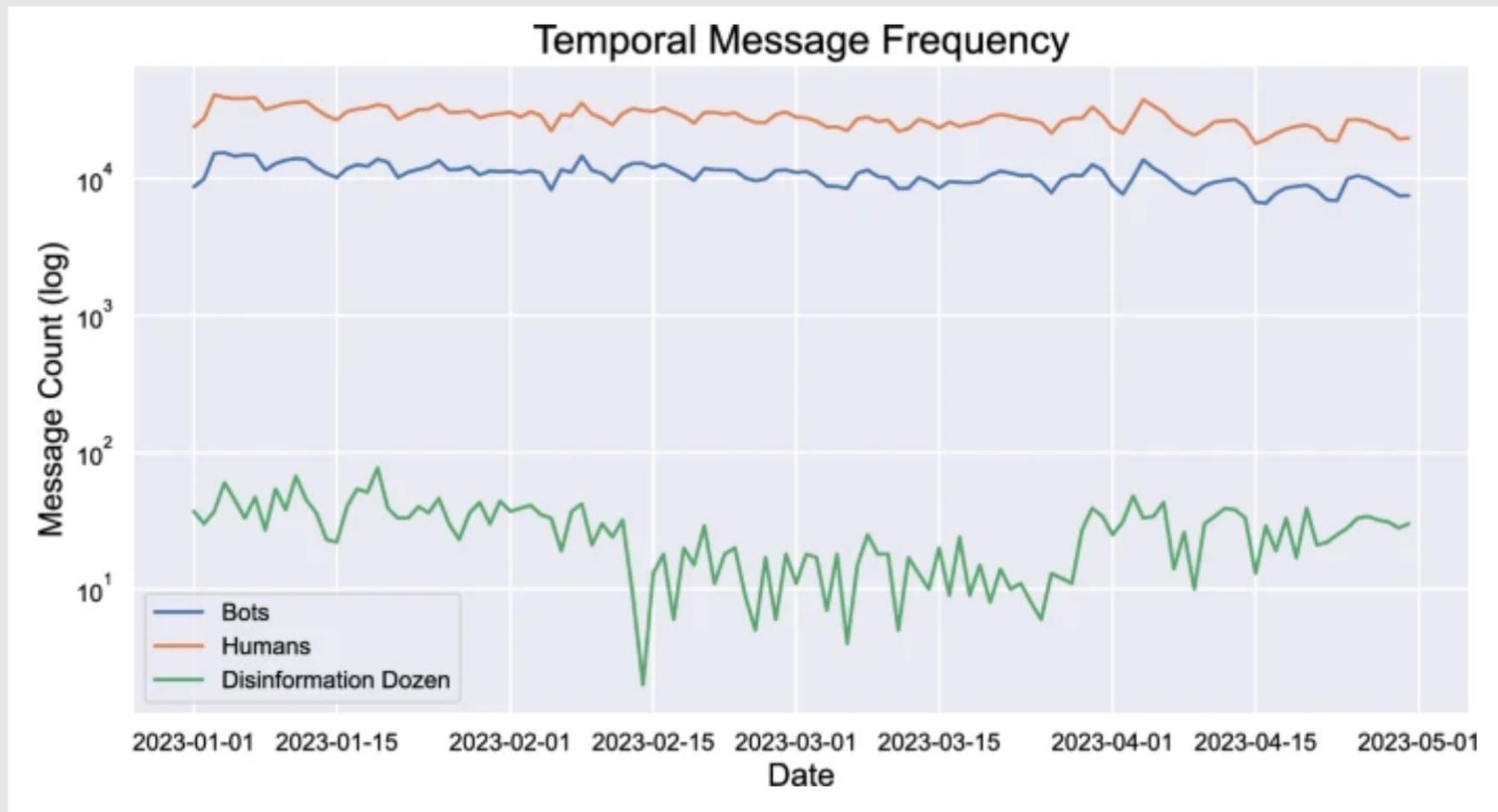
# 2023 US-China Balloon Incident

Bots mimic humans, or Humans mimic bots?

Bots use automation: faster and larger volume

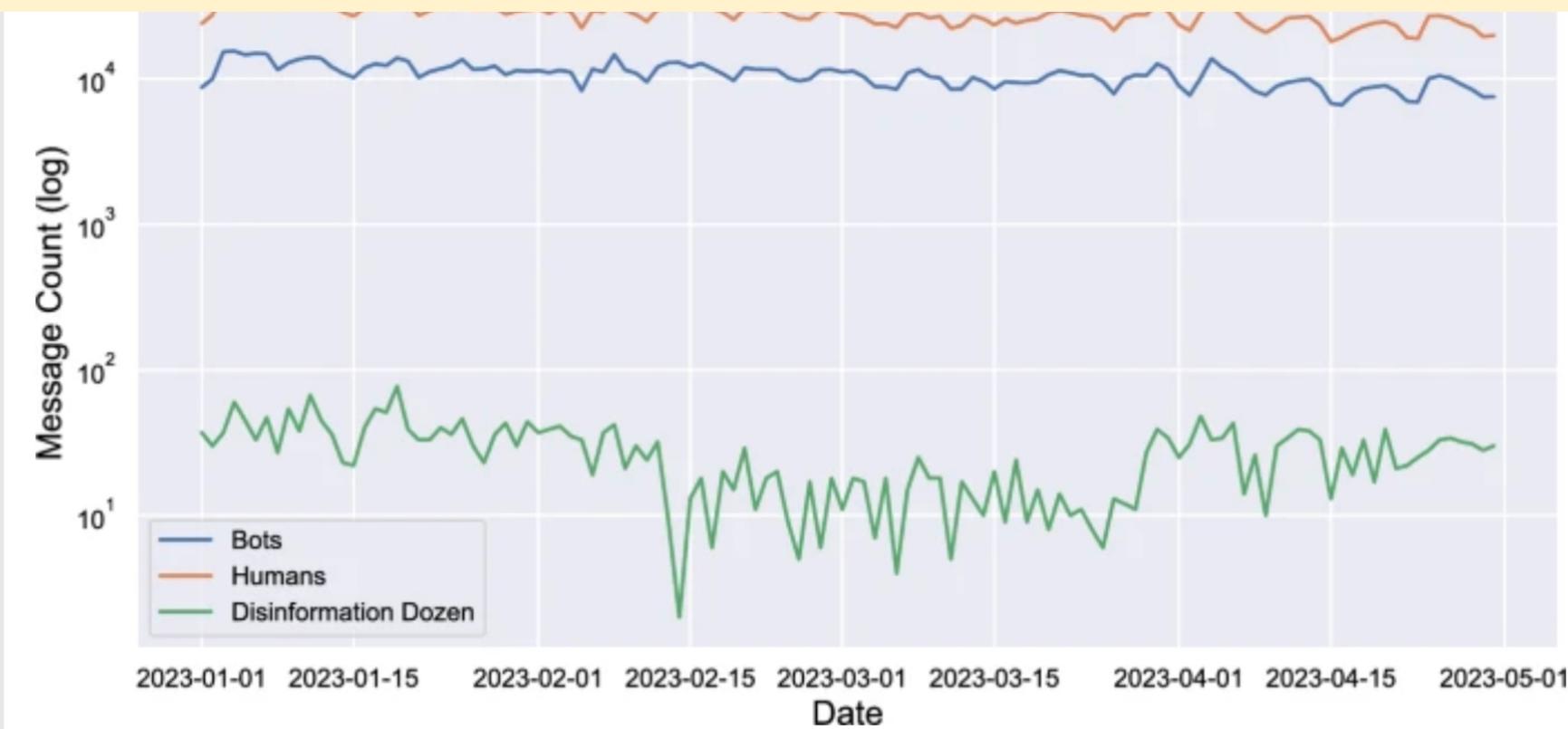


# COVID Disinformation on Telegram



# COVID Disinformation on Telegram

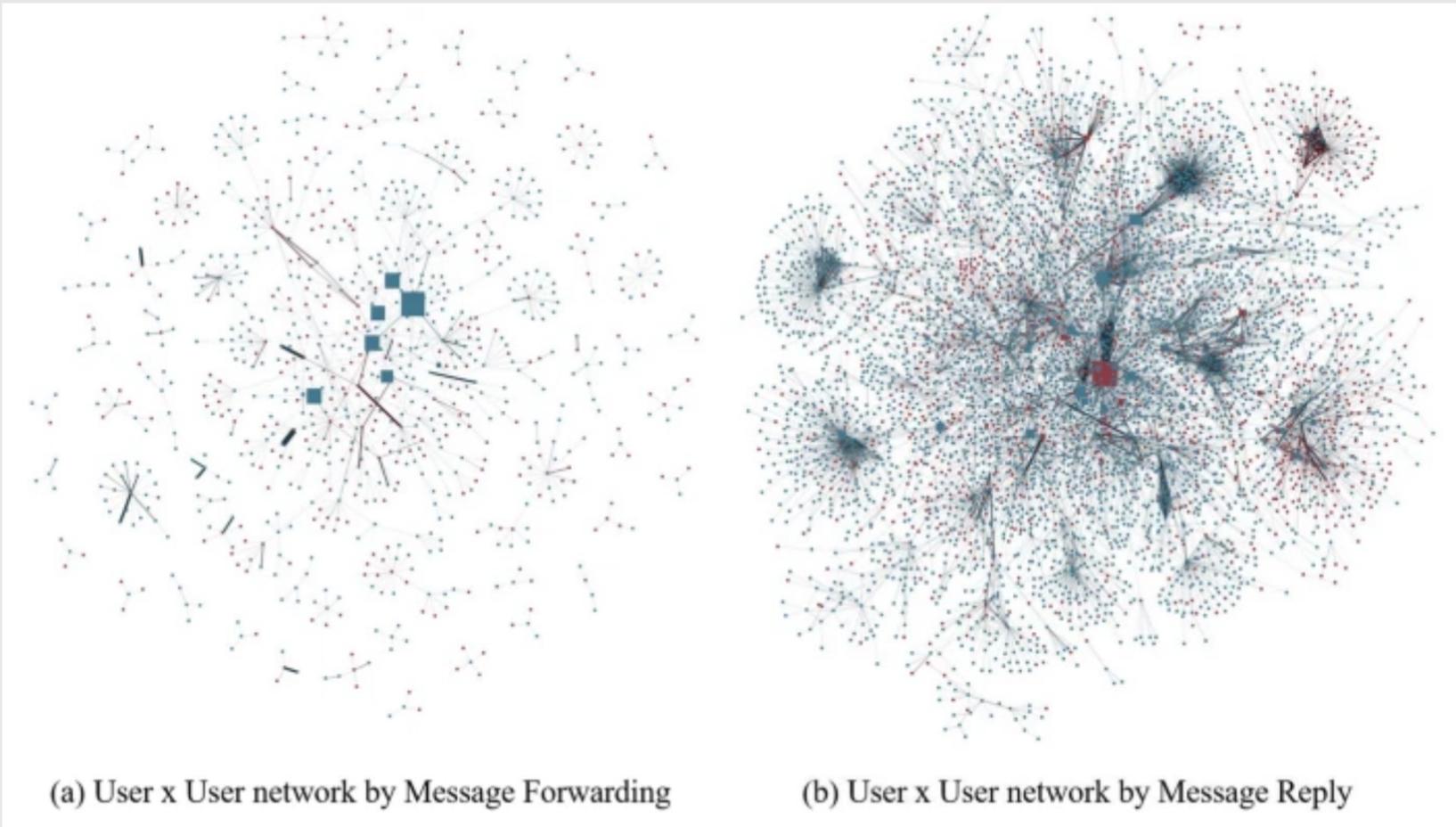
Larger Proportion of messages coming collectively from humans rather than bots



# COVID Disinformation on Telegram

Green = Humans

Red = Bots

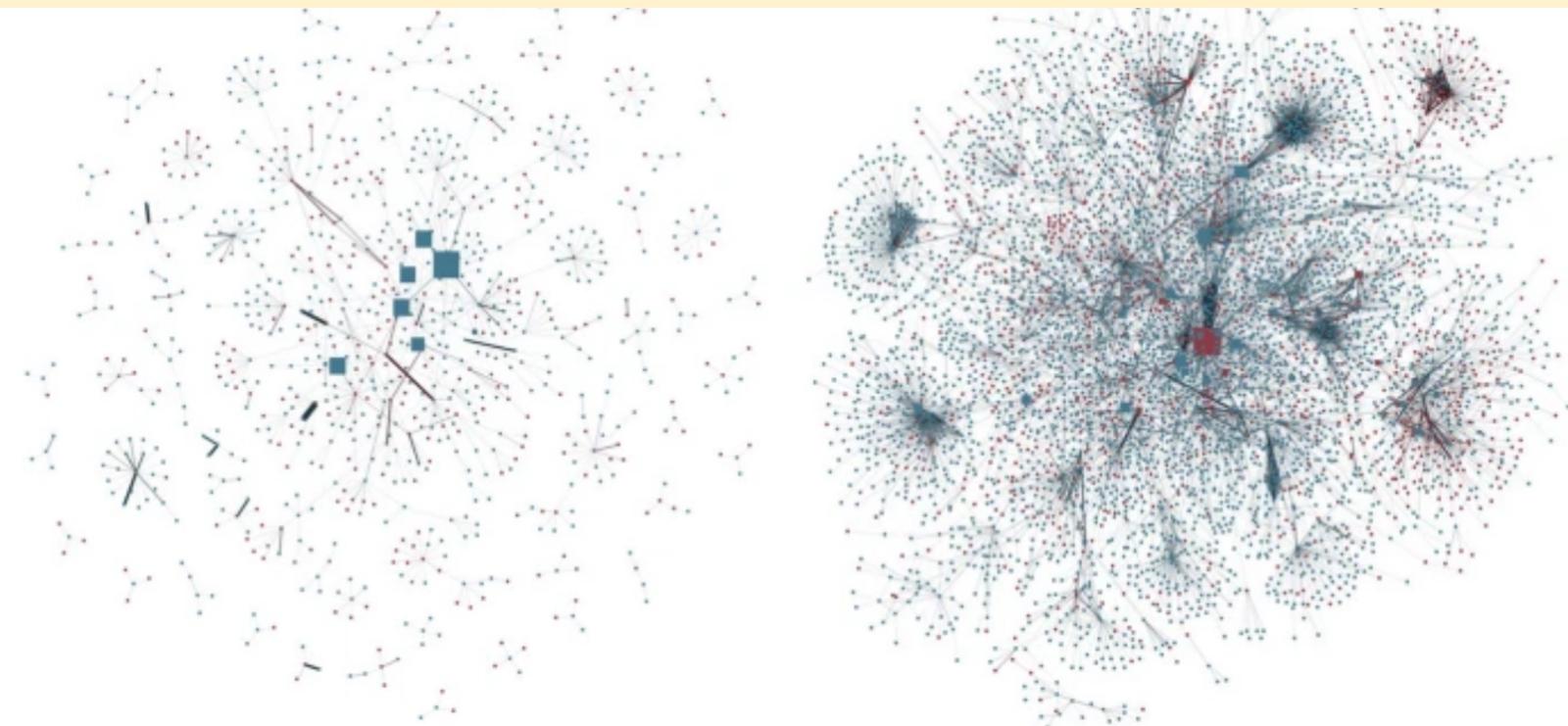


# COVID Disinformation on Telegram

Bots continue conversations (replies),  
Humans spread disinformation (forwards)

Green = Humans

Red = Bots



(a) User x User network by Message Forwarding

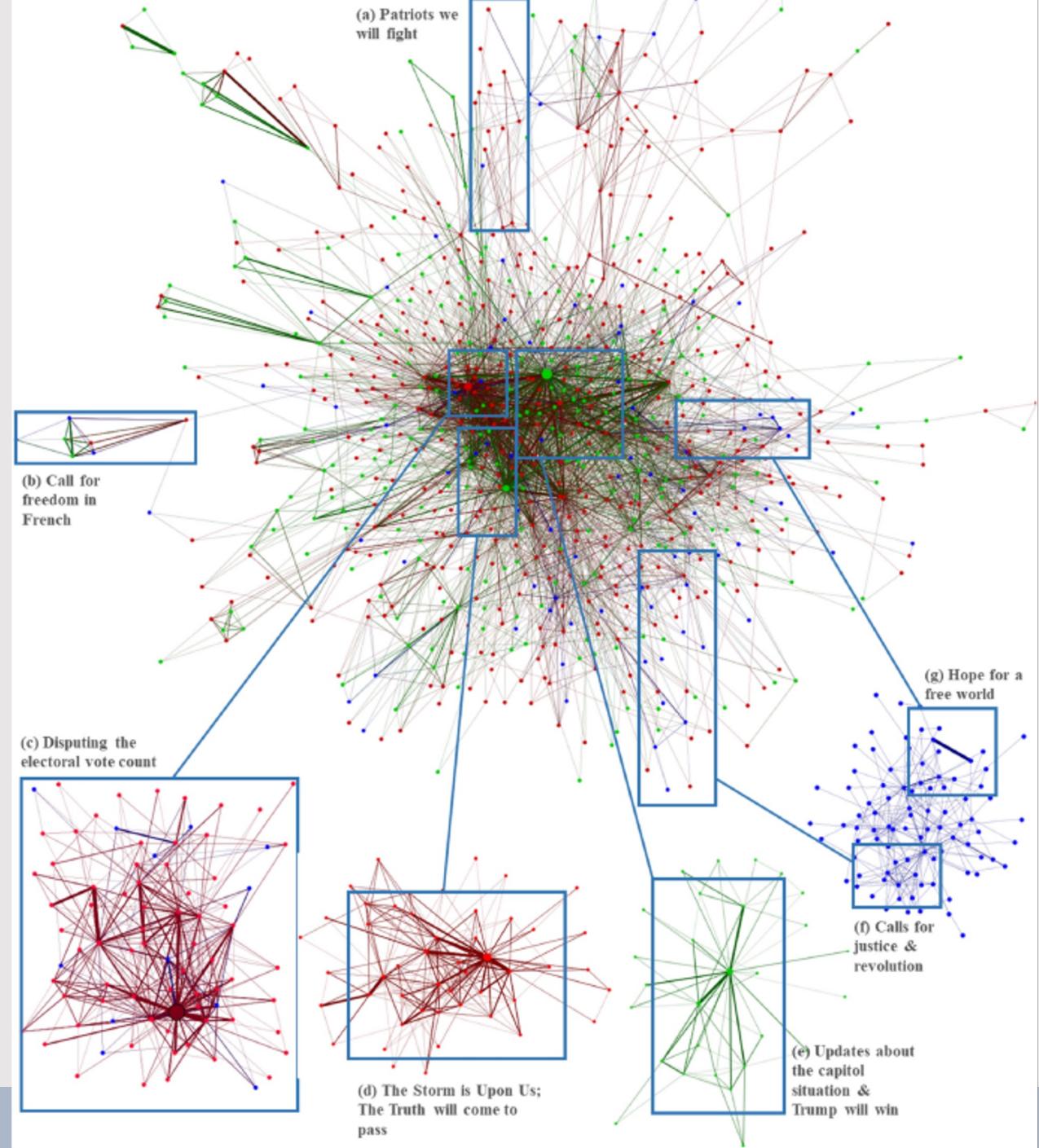
(b) User x User network by Message Reply

# WHAT narratives are being spread?

## Information Spread Across Platforms

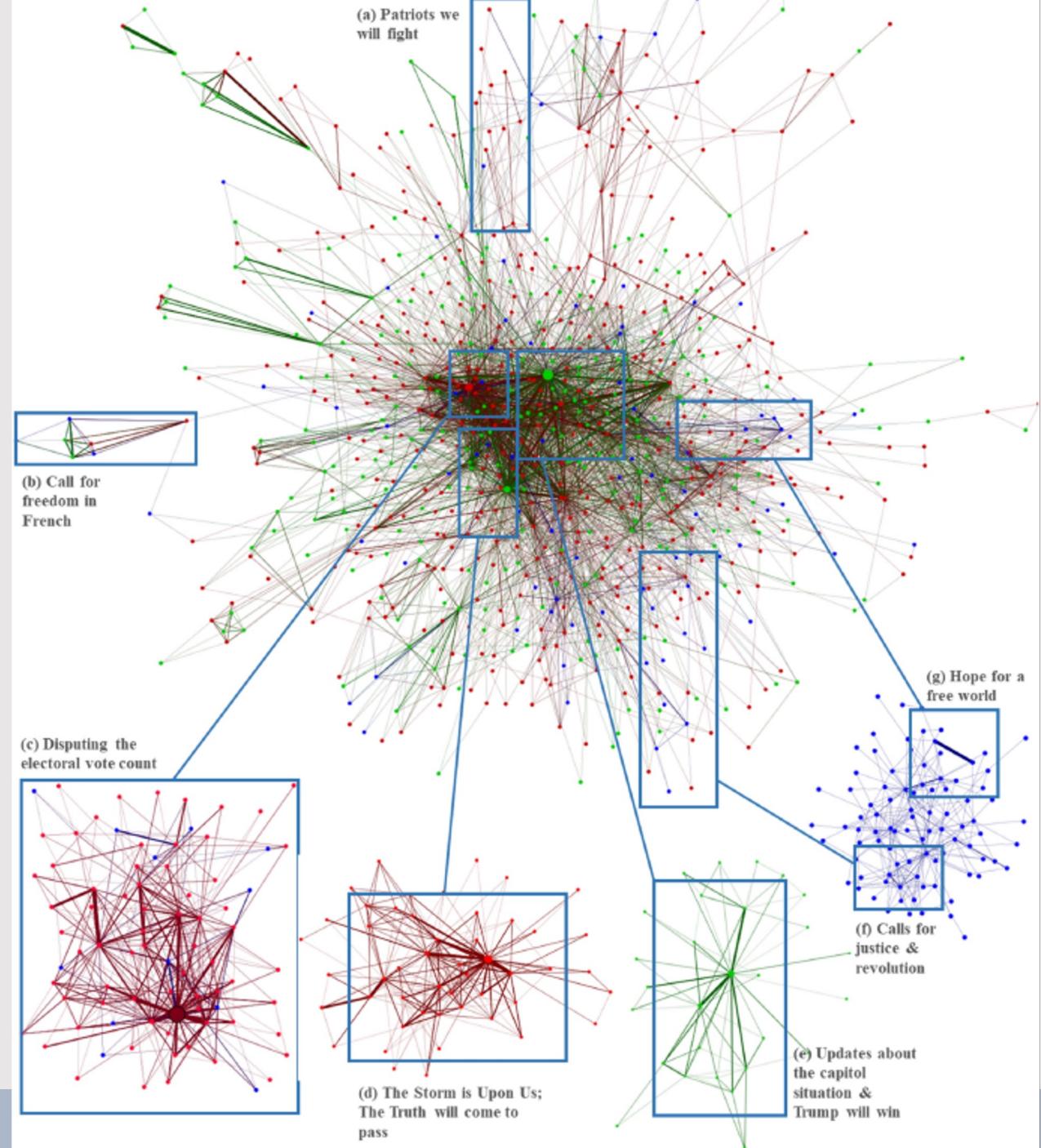
**Ng, Lynnette Hui Xian, Iain J. Cruickshank, and Kathleen M. Carley.** "Cross-platform information spread during the January 6th capitol riots." *Social Network Analysis and Mining* 12, no. 1 (2022): 133.

# 2021 US Capitol Riots



# 2021 US Capitol Riots

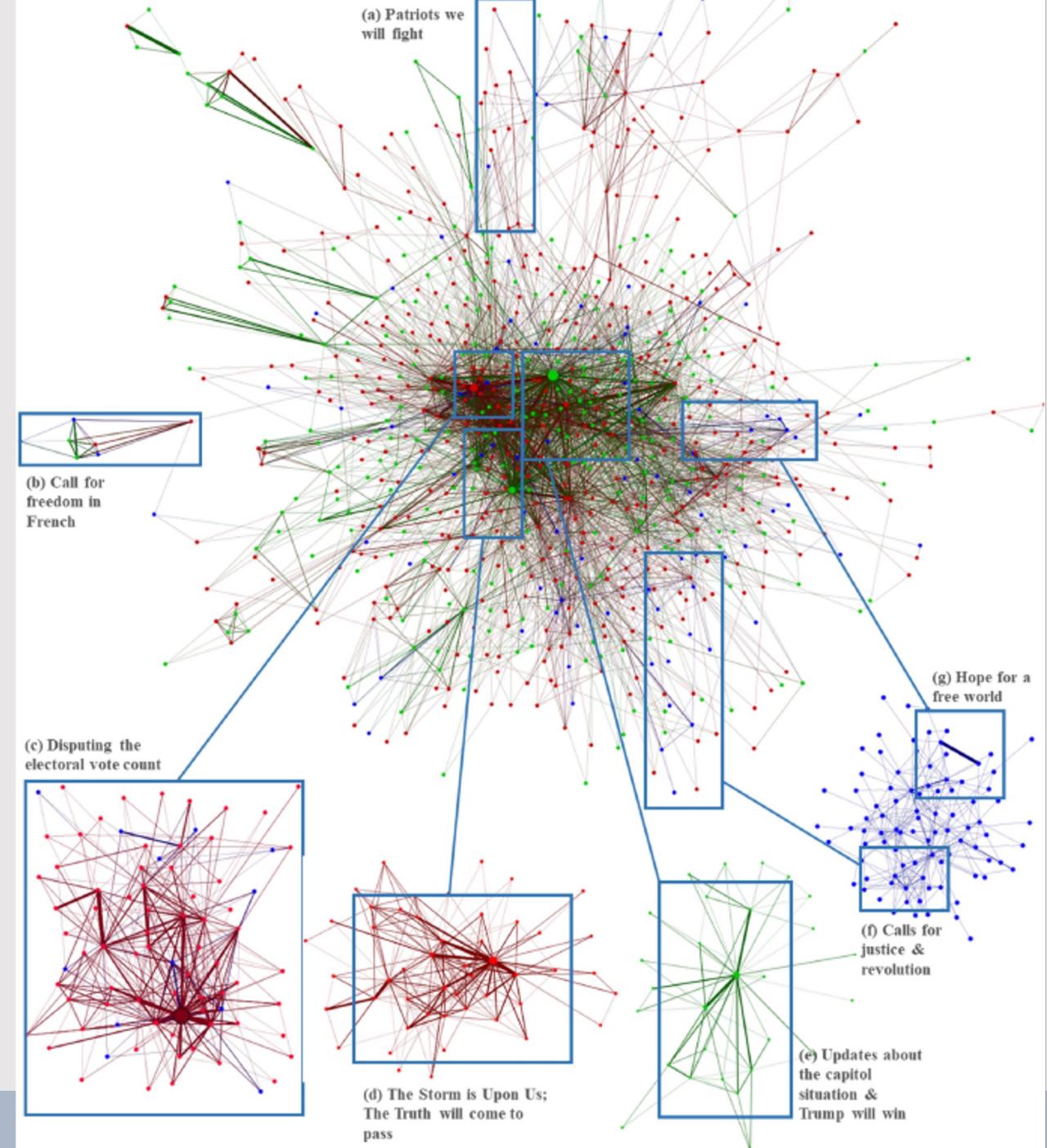
Three main groups of users:  
Military, Patriot, QAnon



# 2021 US Capitol Riots

Three main groups of users:  
Military, Patriot, QAnon

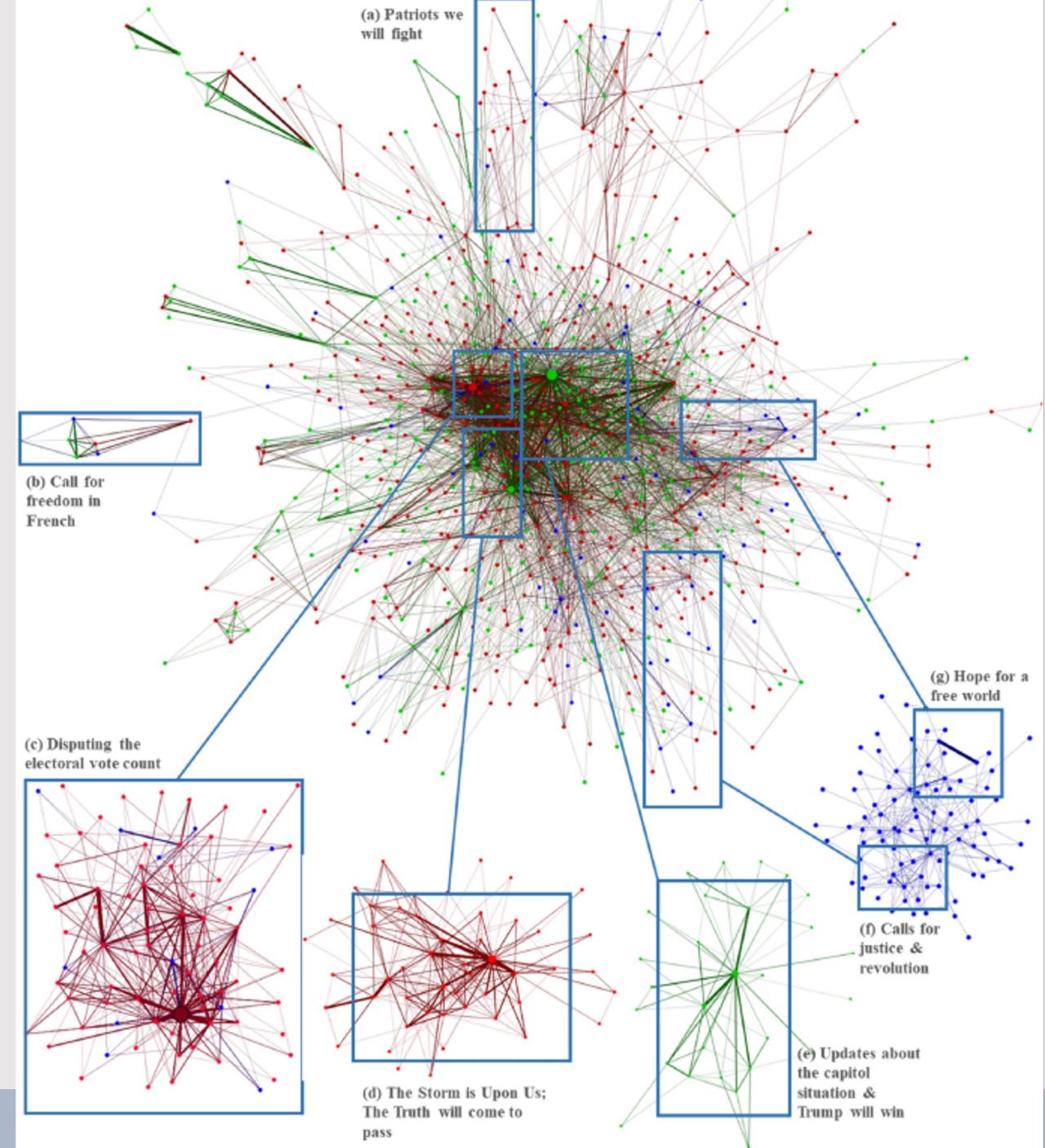
Segregated communication  
for each set of users



# 2021 US Capitol Riots

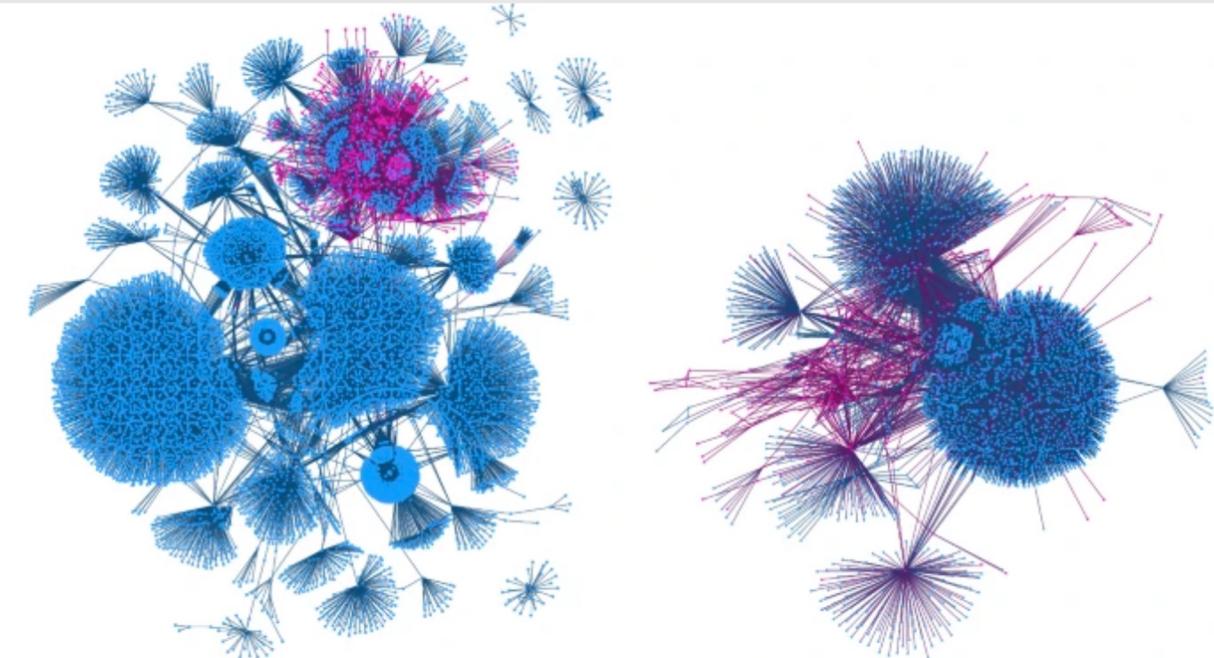
Three main groups of users:  
Military, Patriot, QAnon

Separate communication  
spheres for sets of users



# 2021 US Capitol Riots

Comparison of website URLs  
across Parler & Twitter



(a) Website URL matches

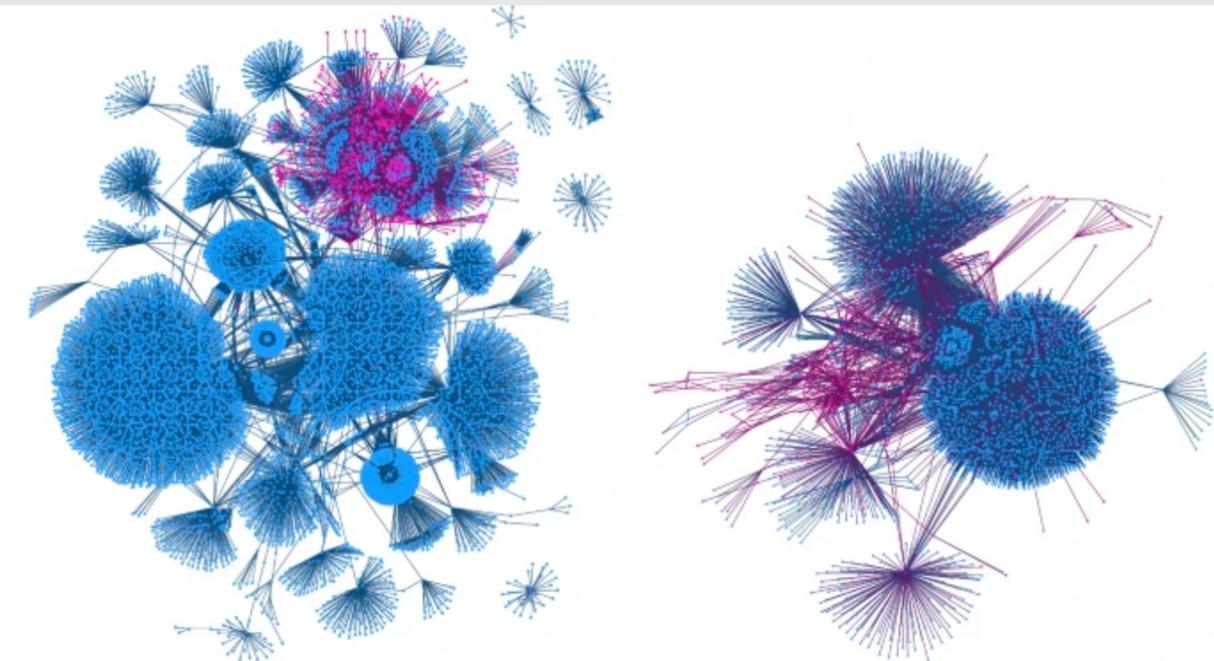
(b) YouTube Link matches

Similar link sharing networks. Pink nodes are Parler users, Blue nodes are Twitter users.  
The width of the links represents the strength of the link similarity, calculated by the  
number of links shared between both users

# 2021 US Capitol Riots

Comparison of website URLs  
across Parler & Twitter

Separate communication  
spheres for sets of users



Similar link sharing networks. Pink nodes are Parler users, Blue nodes are Twitter users. The width of the links represents the strength of the link similarity, calculated by the number of links shared between both users

# WHEN are the narratives spread?

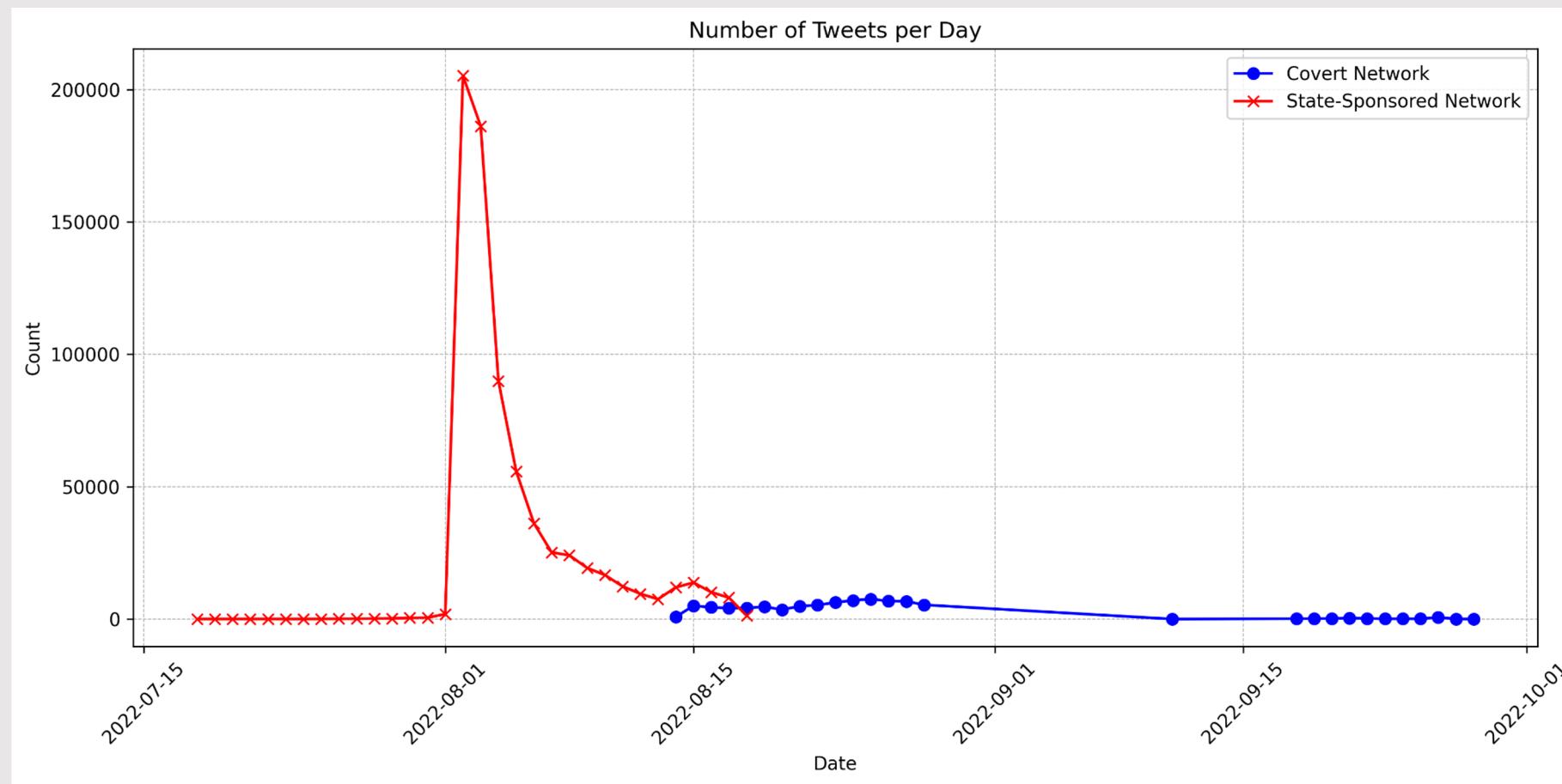
## Critical National and International Events

Danaditya, Adya, **Lynnette Hui Xian Ng**, and Kathleen M. Carley. "From curious hashtags to polarized effect: profiling coordinated actions in Indonesian Twitter discourse." *Social Network Analysis and Mining* 12, no. 1 (2022): 105.

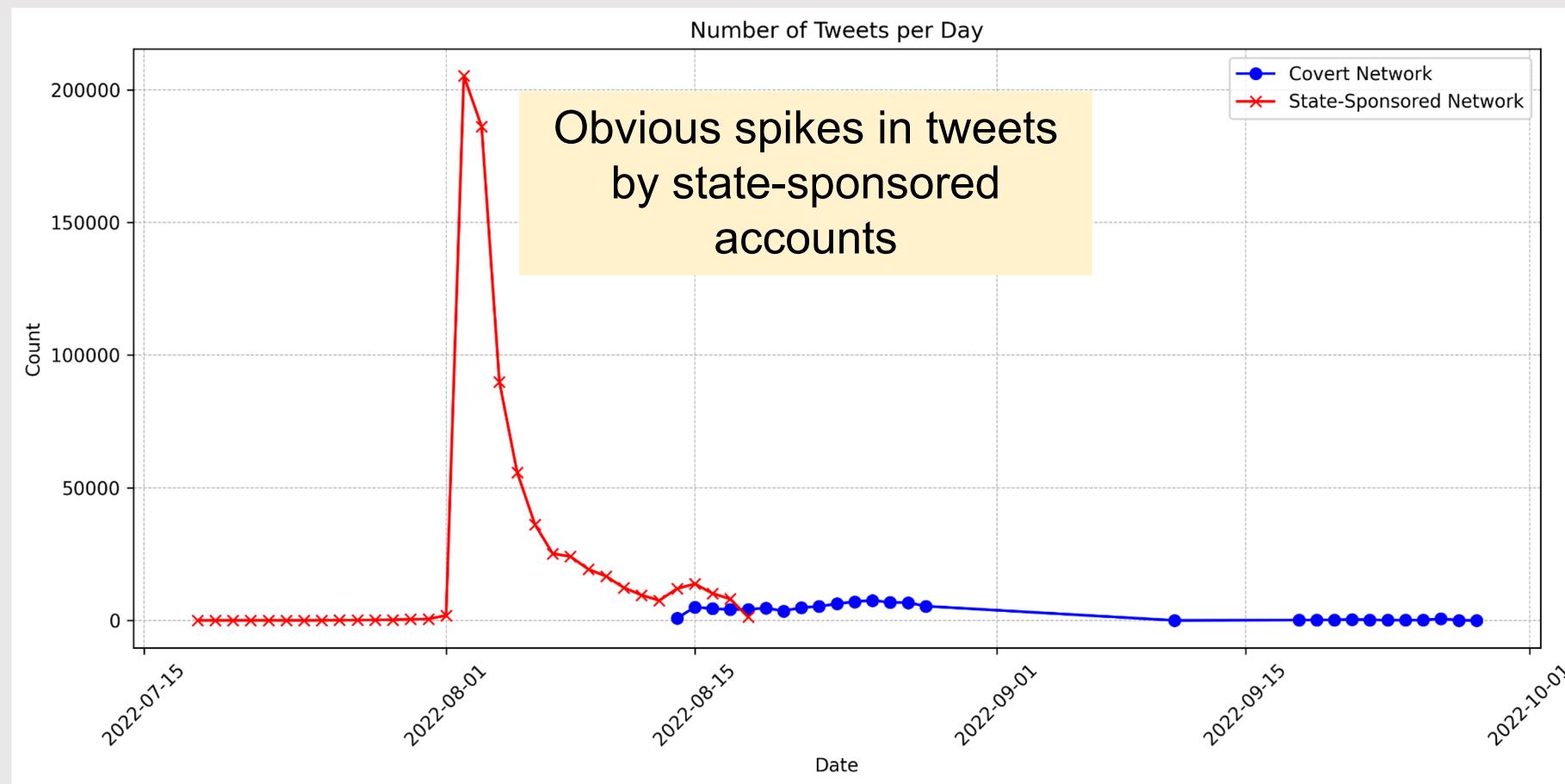
**Ng, Lynnette Hui Xian**, and Kathleen M. Carley. "A combined synchronization index for evaluating collective action on social media." *Applied network science* 8, no. 1 (2023): 1.

**Ng, Lynnette Hui Xian**, and Kathleen M. Carley. "Deflating the Chinese balloon: types of Twitter bots in the US-China balloon incident." *EPJ Data Science* 12, no. 1 (2023): 63

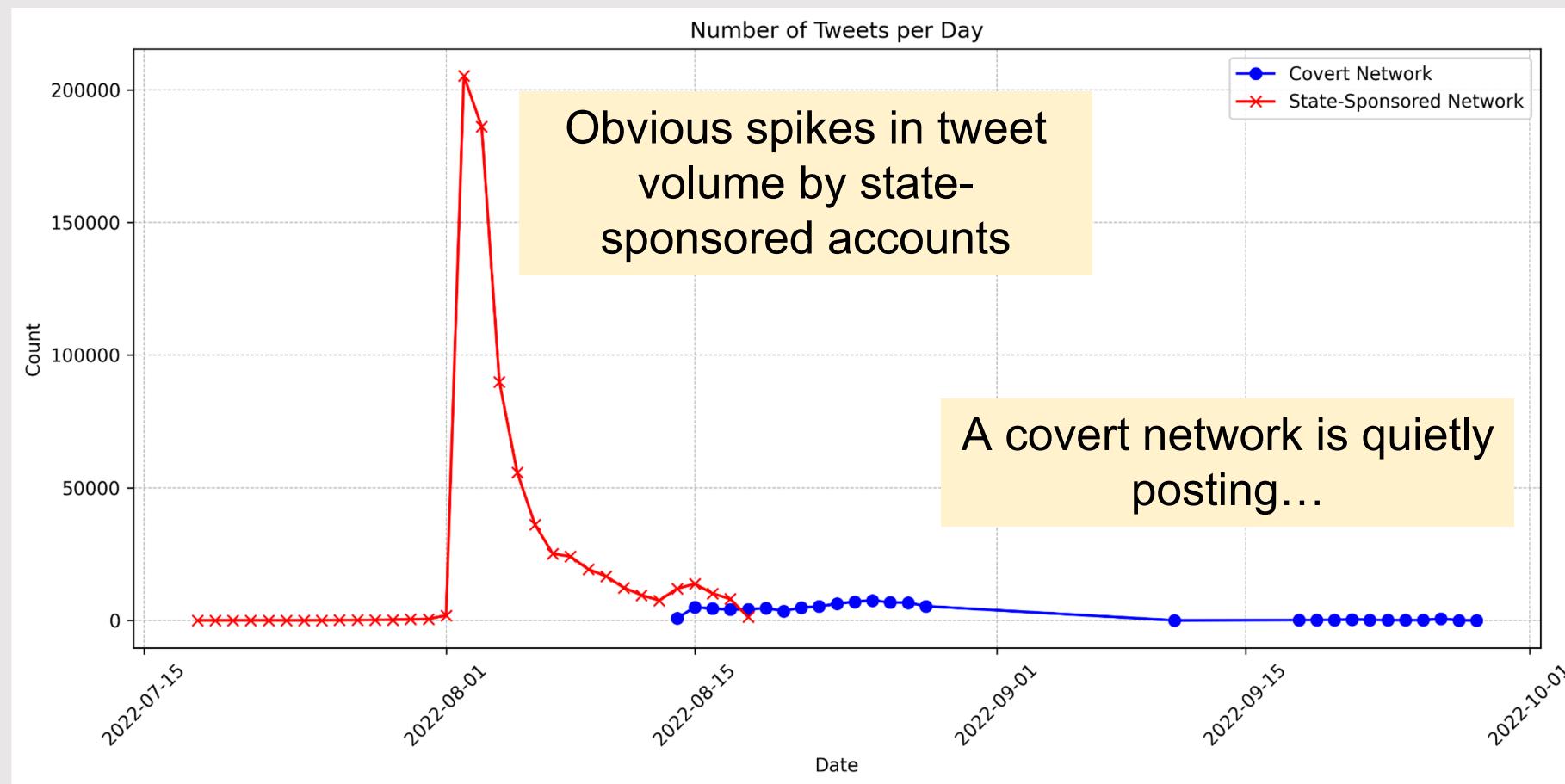
# 2022 Nancy Pelosi Visit to China



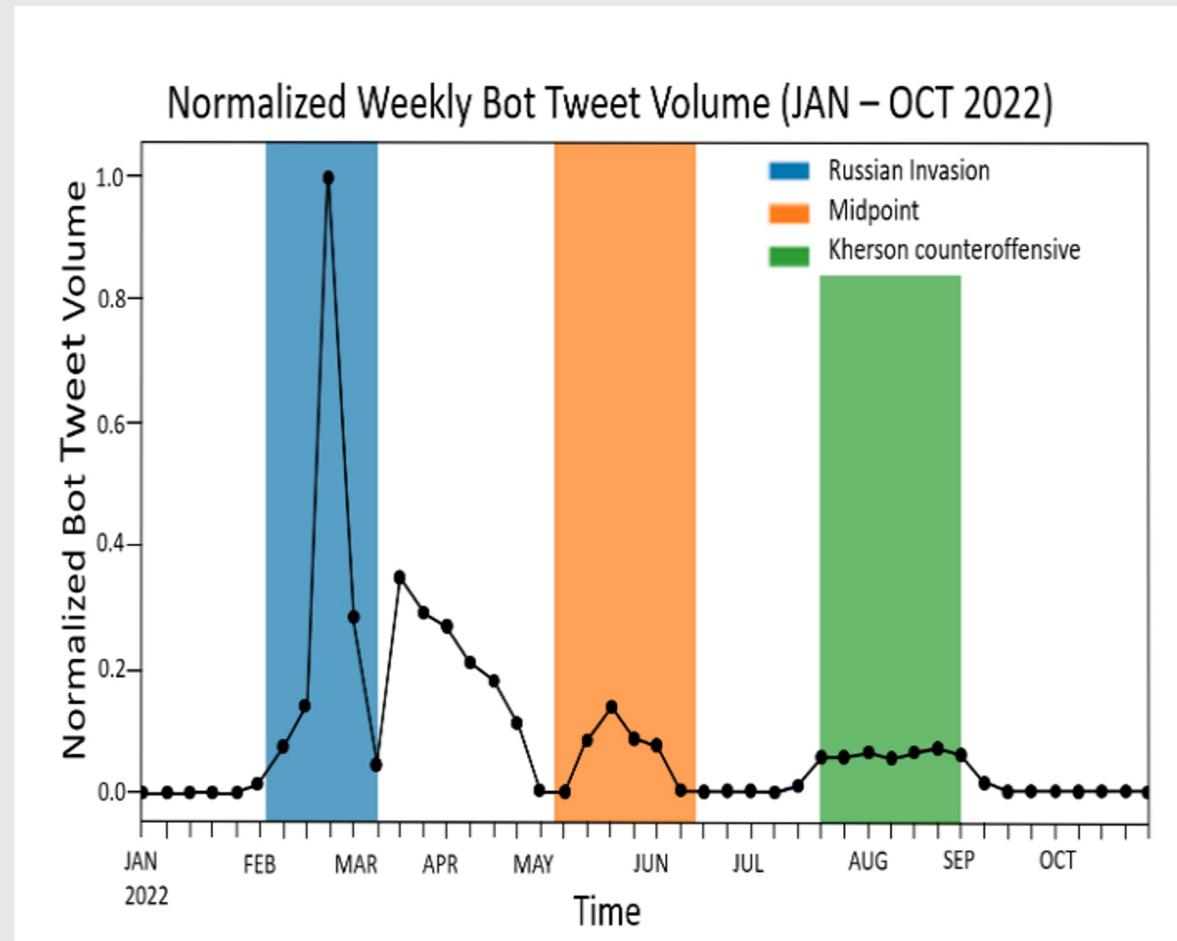
# 2022 Nancy Pelosi Visit to China



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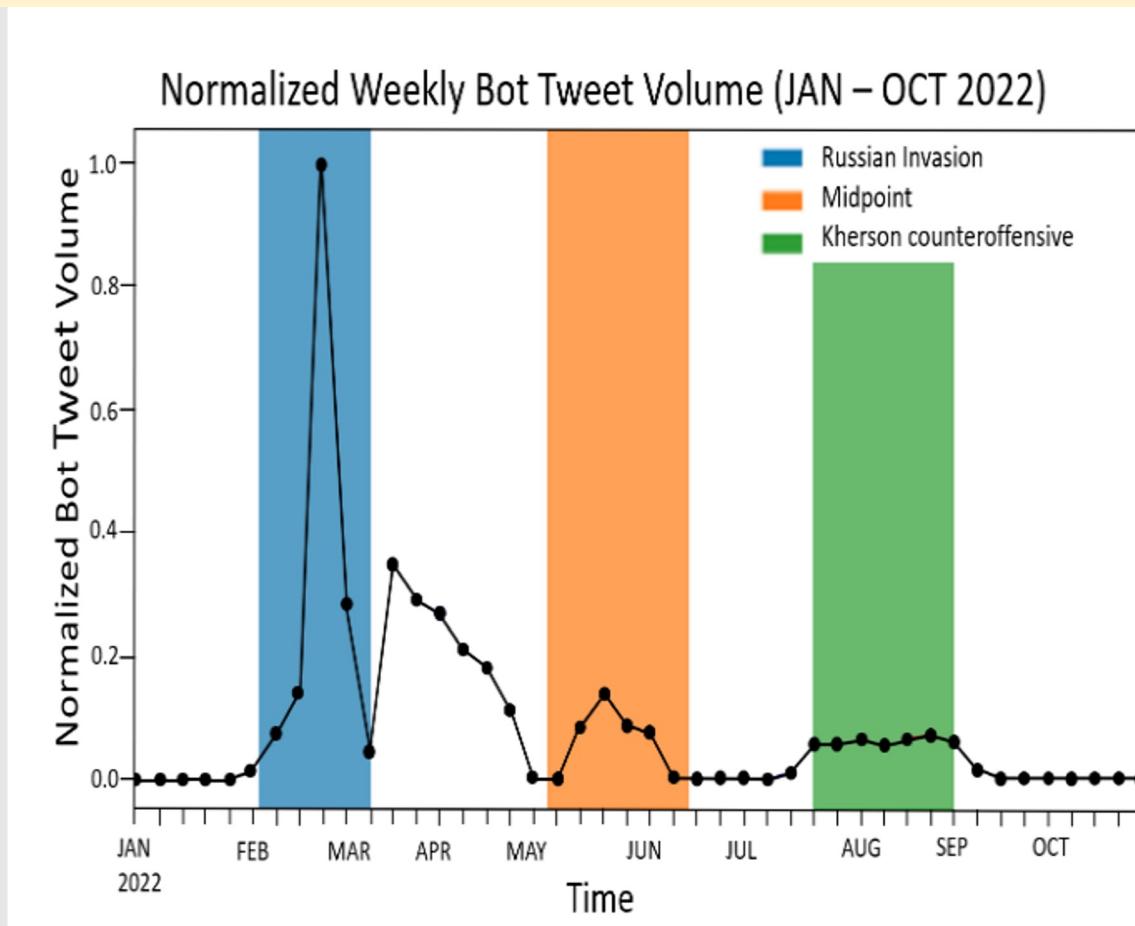


# 2022 Russian Invasion of Ukraine



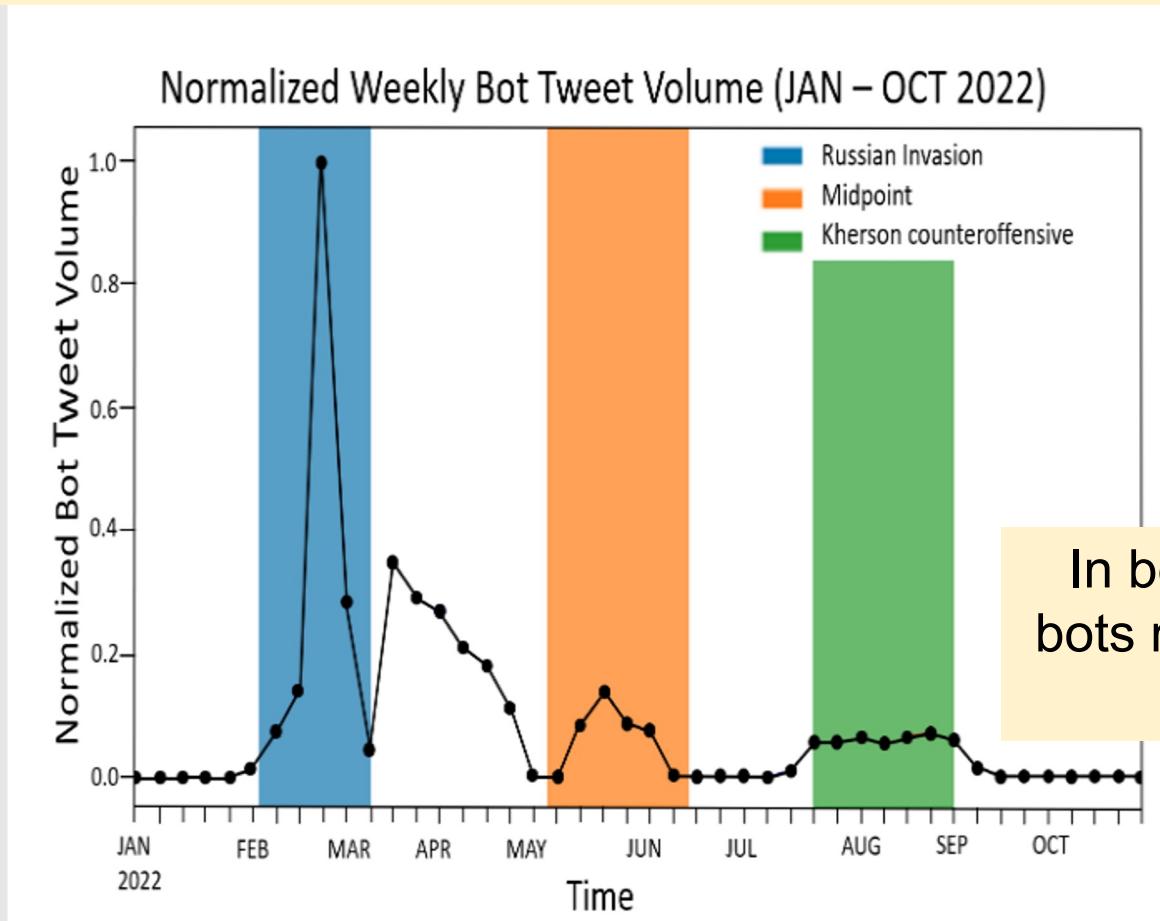
# 2022 Russian Invasion of Ukraine

Spikes in tweet volume of bots during key points of the invasion



# 2022 Russian Invasion of Ukraine

Spikes in tweet volume of bots during key points of the invasion



# WHERE are the narratives targeting?

## Tracking China's Cross-Strait Bot Networks against Taiwan

Jacobs, Charity S., **Lynnette Hui Xian Ng**, and Kathleen M. Carley. "Tracking China's cross-strait bot networks against Taiwan." In *International conference on social computing, behavioral-cultural modeling and prediction and behavior representation in modeling and simulation*, pp. 115-125. Cham: Springer Nature Switzerland, 2023.

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尽管你蔡英文把台独的口号叫得很响，但海峡两岸的人民都很明白，我们都是中国人，三十六计，和为上计。台澎金马是中国领土，确实不是美国领土。



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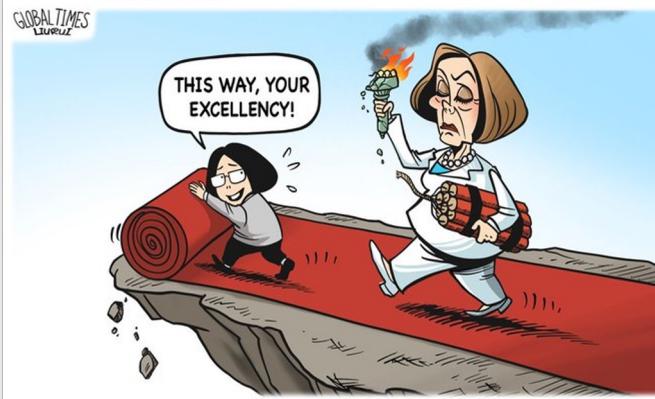
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## Hashtag Hijacking by spammy accounts

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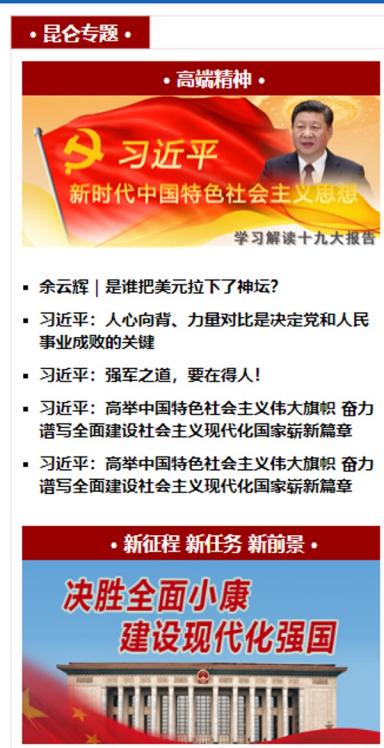


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Topics point to Chinese military (propaganda) videos

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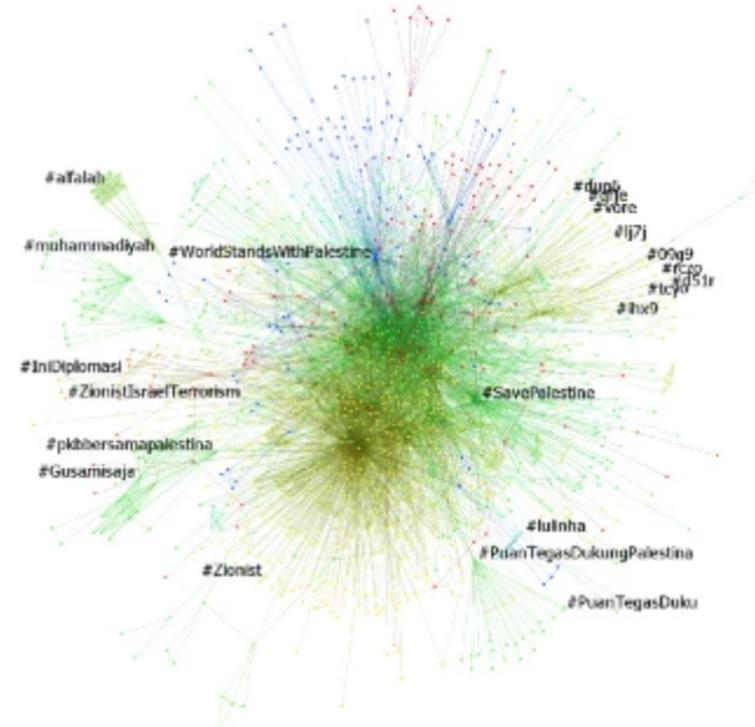
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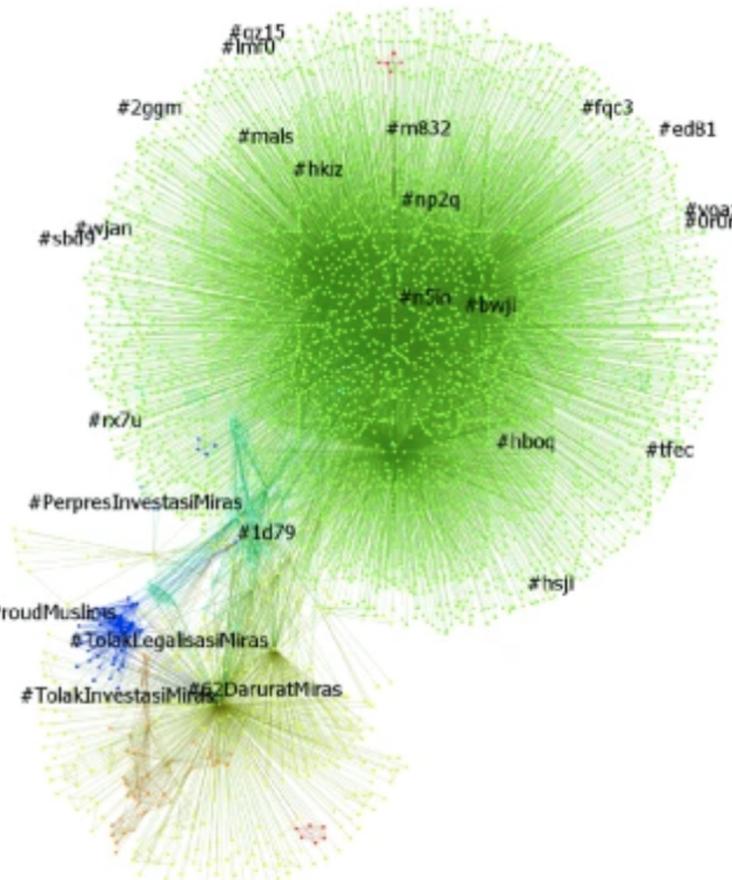
China News · 4h

Six "sins" committed by Pelosi

# 2021 Indonesian Twitter discourse



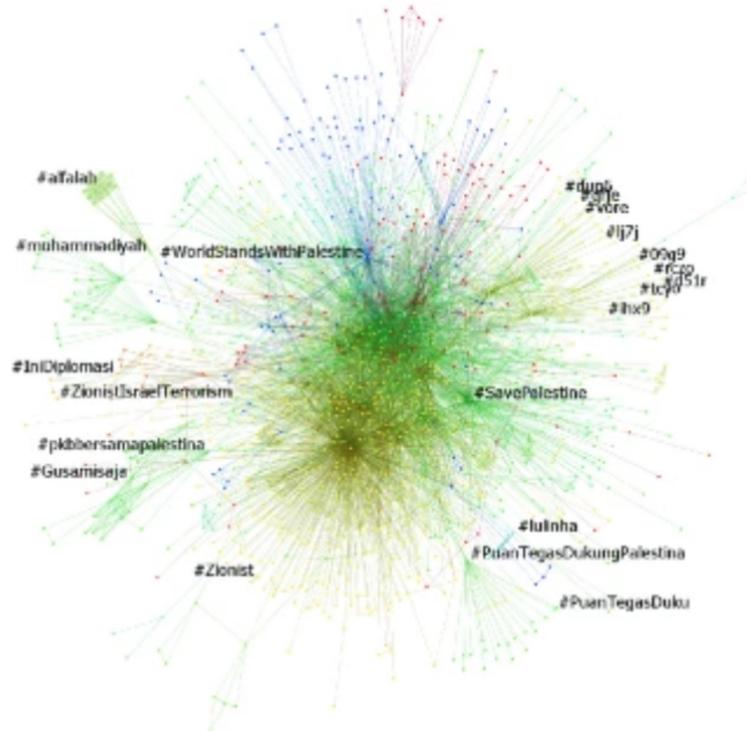
(a) International case study: Palestine-Israel Conflict



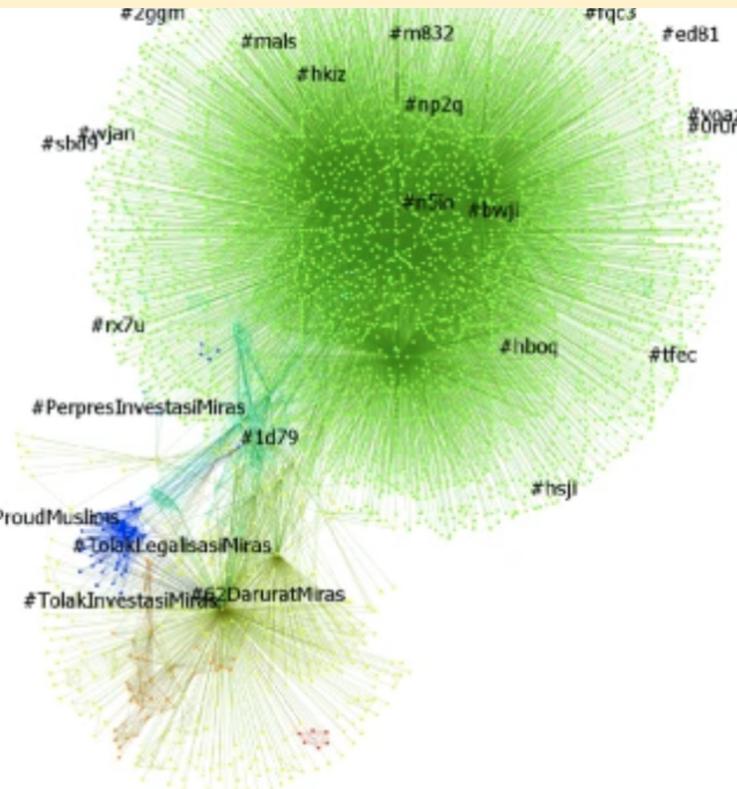
(b) Regional case study: Alcohol Beverages

# 2021 Indonesian Twitter discourse

## Hashtag Hijacking by bot farms



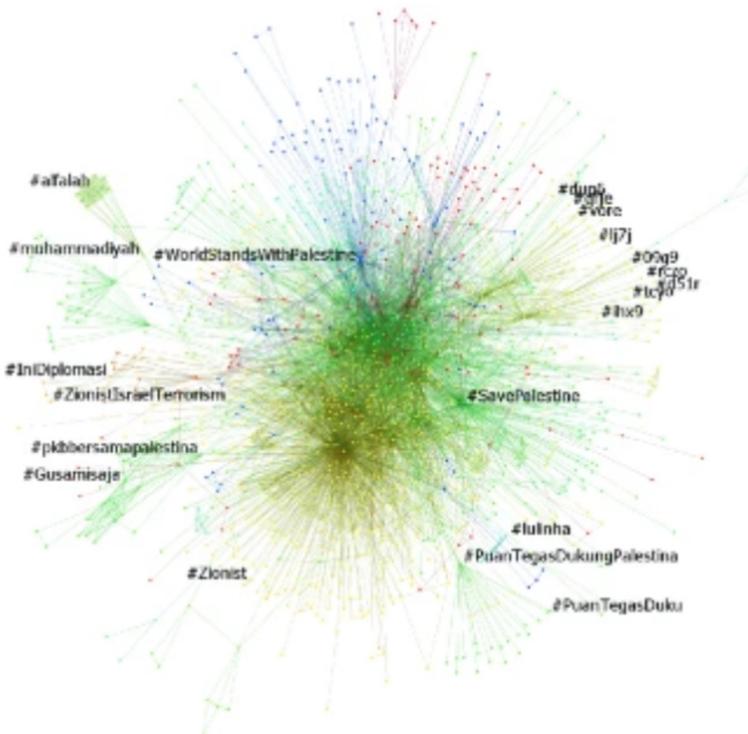
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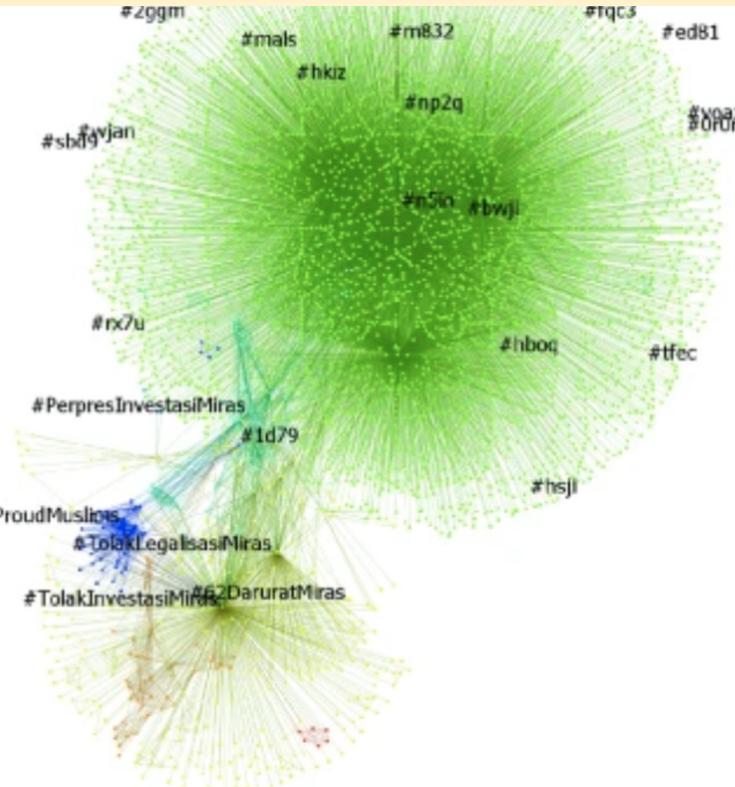
(b) Regional case study: Alcohol Beverages

# 2021 Indonesian Twitter discourse

Topics that can divide (majority-Muslim) society



(a) International case study: Palestine-Israel Conflict



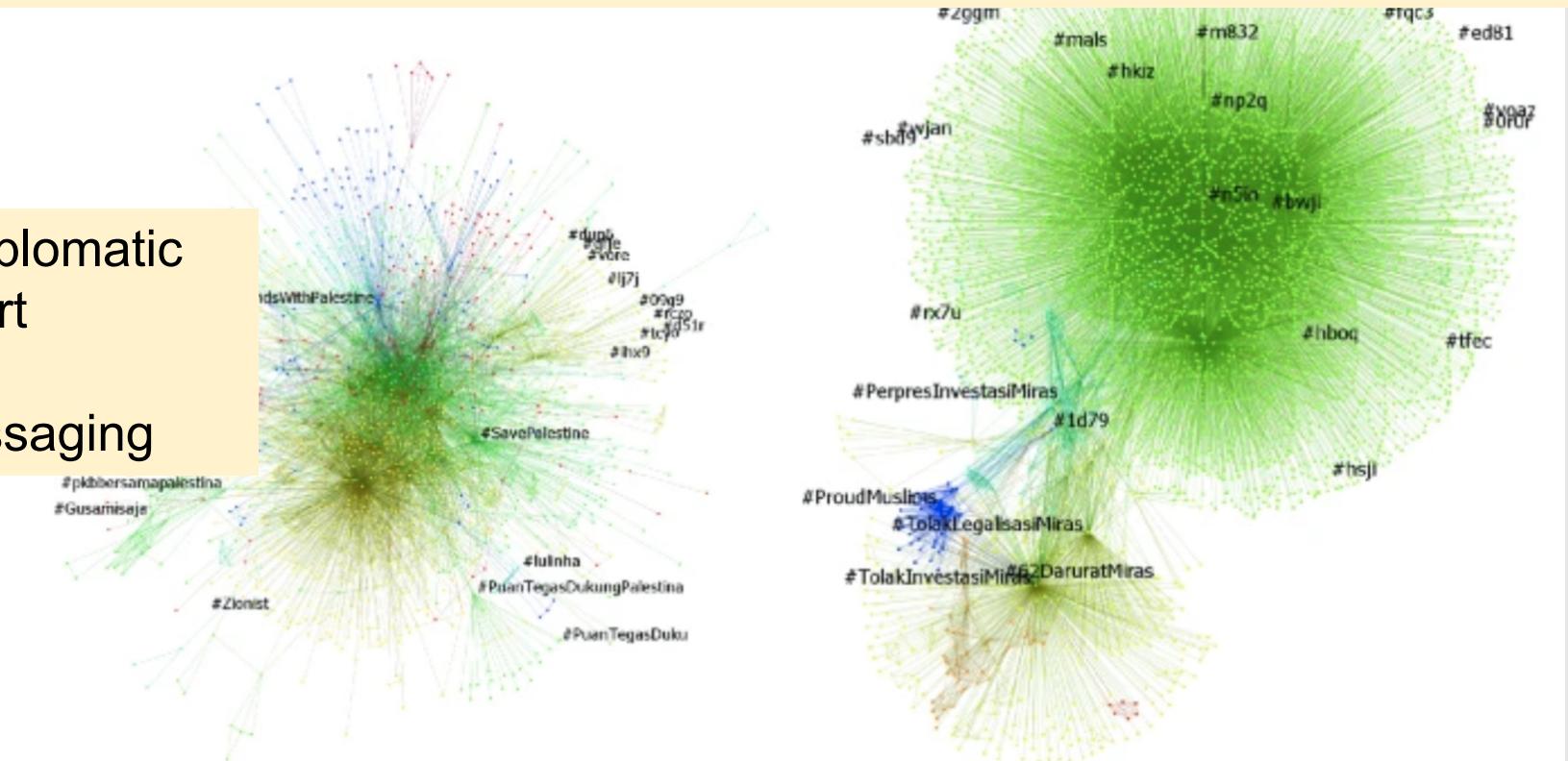
(b) Regional case study: Alcohol Beverages

# 2021 Indonesian Twitter discourse

Topics that can divide (majority-Muslim) society

Strong but Diplomatic  
Support

Radical Messaging



(a) International case study: Palestine-Israel Conflict

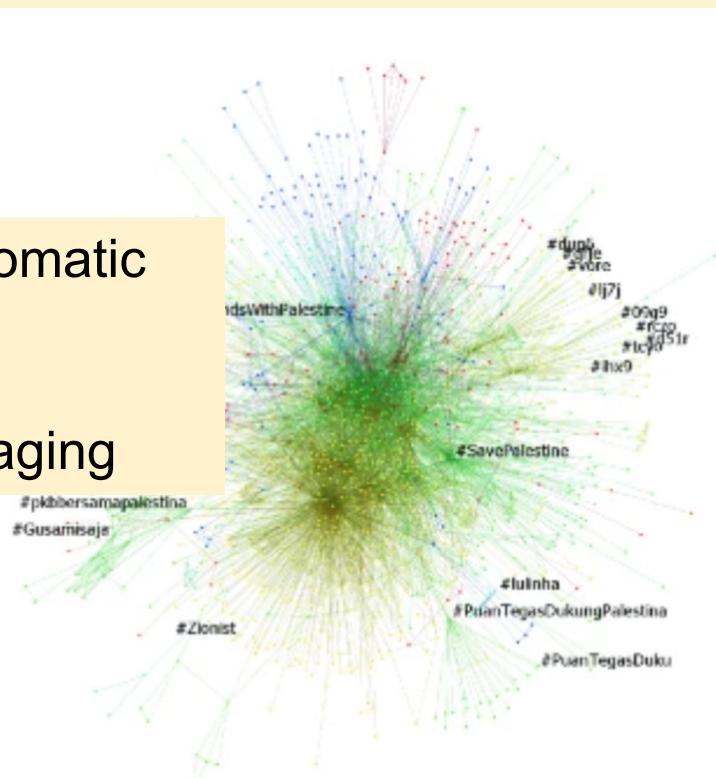
(b) Regional case study: Alcohol Beverages

# 2021 Indonesian Twitter discourse

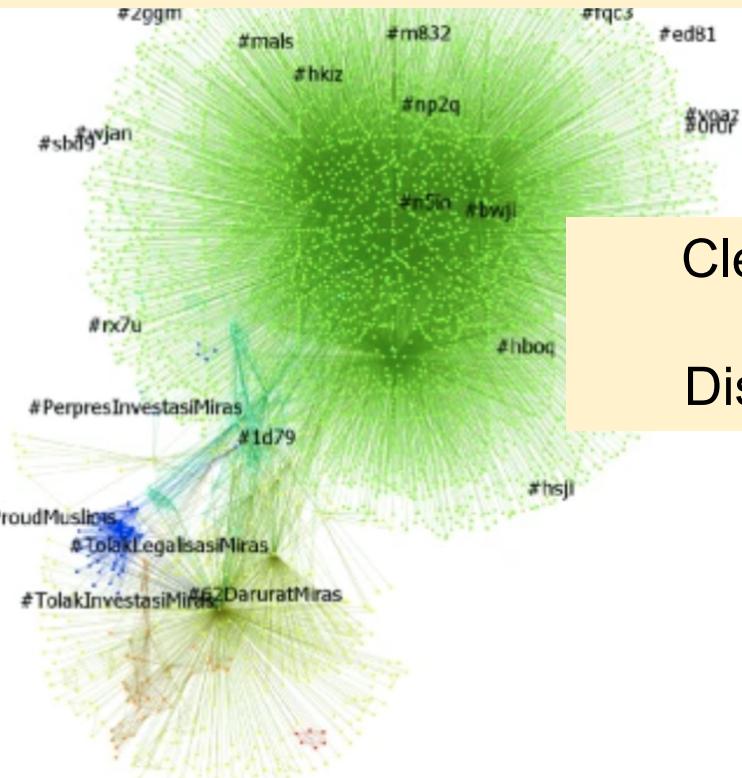
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Clear call to action  
Discursive Tweets

# Absolute Power Corrupts Absolutely

## Multi Pronged Approach