# Polarization of Climate Change Politics During Finland's 2019 Parliamentary Elections: Evidence from Twitter

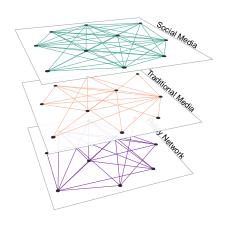
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# Echo Chambers, Experts and Activists: Networks of Political Communication (ECANET)



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- ► Recent empirical trends suggest this is changing. Why?
- ► Is there increased polarization? and what is driving it?
  - ► Political versus non-political issues
  - Electoral politics
  - ► Social media?

#### **Empirical Approach**

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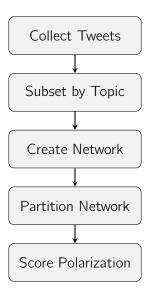
- ► Examine political communication via social media
- ► Are there filter bubbles in communication?

#### **Empirical Approach**

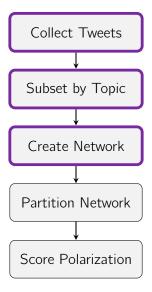
Is there increased polarization in Finland? and what is driving it?

- ► Examine political communication via social media
- ► Are there filter bubbles in communication?
- Quantify the extent to which communication is polarized
- ► Compare patterns across topics and time

# Empirical Approach: Pipeline



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# Data Collection and Processing

► Tweets were collected during Jan. 20 - Apr. 14 using a list of politically relevant hashtags

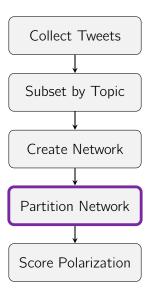
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- Subset tweets by topics and by time

# Data Collection and Processing

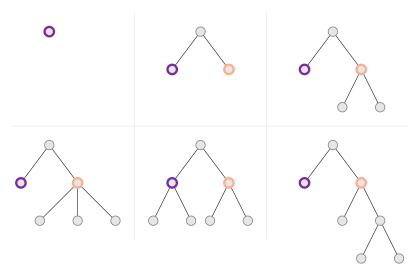
- ► Tweets were collected during Jan. 20 Apr. 14 using a list of politically relevant hashtags
- Subset tweets by topics and by time
- Create retweet networks:
  - ► Nodes are Twitter accounts
  - ► Unweighted ties are presence of a retweet between the two accounts on the topic of interest

#### **Network Partitioning**

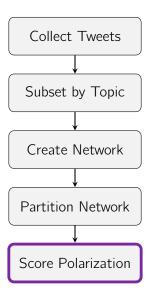


#### **Network Partitioning**

Different stochastic block model specifications



#### Random Walk Polarization

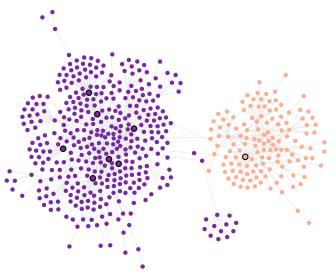


#### Random Walk Polarization

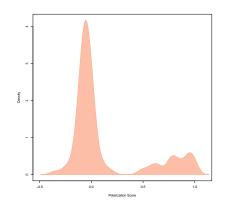
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#### Random Walk Polarization

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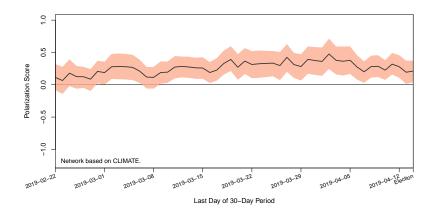


# Results: Distribution of Topic Polarization

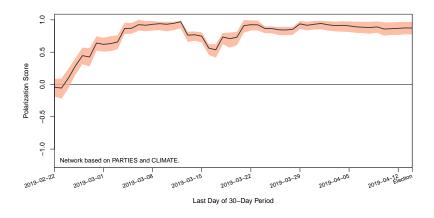


Ten Most Polarized Hashtags	
social democrats	future line
climate march	hate speech
populist party	freedom of speech
left party	same direction
oulu	green party

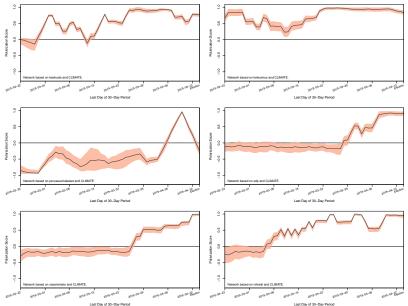
#### Results: Climate



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The code used in this project will be available after this presentation at https://github.com/tedhchen/twitter\_network\_polarization\_tools

The slides will be available at

https://tedhchen.com/assets/compon\_slides.pdf

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