### **Predicting Authoritarian Crackdowns**

### A Machine Learning Approach

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# Policy Change Index (PCI) project

- Predict authoritarian policies based on propaganda;
- First use cases:
  - PCI-China: China's major policy moves;
  - PCI-Crackdown: China's response to Hong Kong protests;

9:15-9:45 am today

- PCI-Outbreak: true scale of COVID-19 in China.
- Future: North Korea, Iran, Cuba, Russia,...
- Open-source (GitHub).

### A time-sensitive question

Will the Hong Kong protests be met with a Tiananmen-like crackdown? If so, when??

### A time-sensitive question

There may be an answer in the Chinese government's own words.

# The problem PCI solves

## "Value" of closed regimes' propaganda

### High, because



indicates

policy intentions



# Analyzing closed regimes' propaganda

Easier said than done!

- Unstructured data;
- Labor-intensive;
- Objective mixed with subjective.

# **PCI's solution**

## Core idea



#### Two features:

- Automate content analysis of propaganda;
- Delineate boundaries between objective & subjective components.

# **PCI-Crackdown**

## **PCI-Crackdown**

- Input: *People's Daily* articles on Tiananmen and Hong Kong protests;
- Output: daily index of crackdown possibility.

### PCI-Crackdown: algorithm



#### **PCI-Crackdown:** "as if" date for the actual date



### PCI-Crackdown: result

### (Jun 9, 2019 to Jan 7, 2020)



# PCI-Crackdown monitors HK protests

### (Jun 9, 2019 to Jan 7, 2020)



# PCI-Crackdown monitors HK protests

### (2nd wave: April 16 to May 26, 2020)



### **Bottom line**

#### **Fluctuations in**

#### propaganda content



#### **Fluctuations in**

policy intentions

## **Bottom line**

Our judgment calls/hypotheses:

- There is a well-formed precedent;
- The same "playbook" is being followed now.

# Scaling up: other timeline mappings?

• COVID-19 (vis-a-vis SARS)?



- China's Taiwan policy?
- NK missile tests?
- Other rare events?

## To conclude...

## Core idea



# Thank you!

- First step toward policymaking is to better understand the problem.
- PCI's mission: crack a window to otherwise closed systems with new techniques.

# Thank you!

- Website: policychangeindex.org
- Newsletter: mercatus.org/PCInewsletter
- Code: github.com/PSLmodels/PCI-China github.com/PSLmodels/PCI-Crackdown github.com/PSLmodels/PCI-Outbreak (TBA)
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