# Crisis is a Gateway to Censored Information: The Case of Coronavirus in China

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- But independent media is not available in many places

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- Gateway effects may make crises additionally sensitive for autocracies

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  - cf. Wikipedia not blocked in Iran and Russia, no increase of historical leaders

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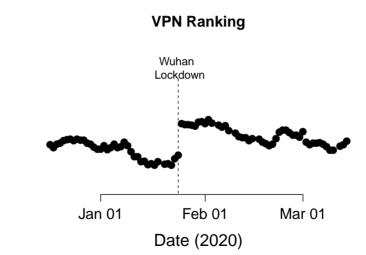
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  - Wikipedia page views in Germany, Italy, Iran, and Russia

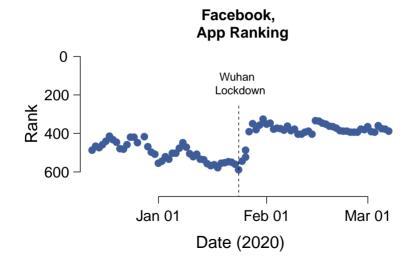
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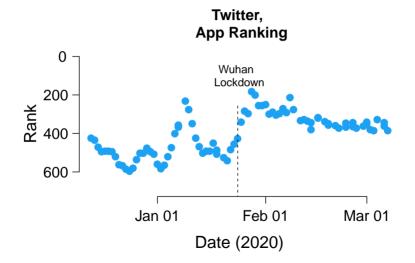
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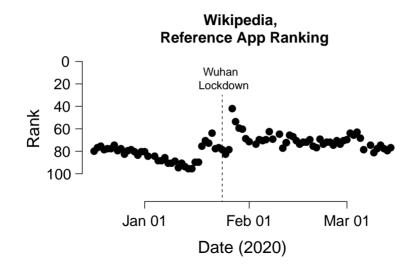
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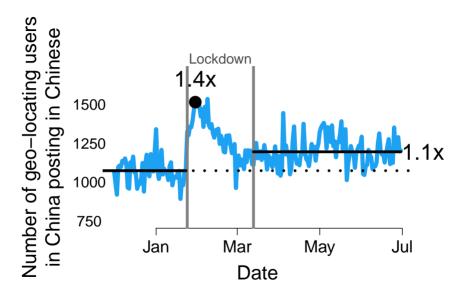
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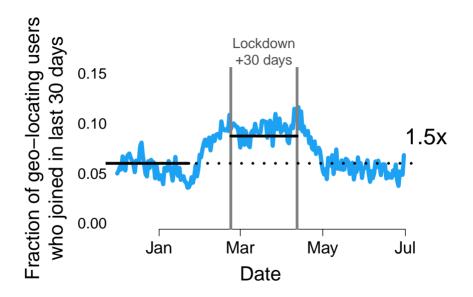
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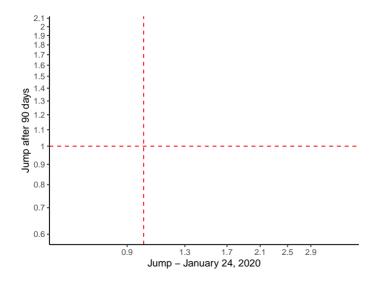
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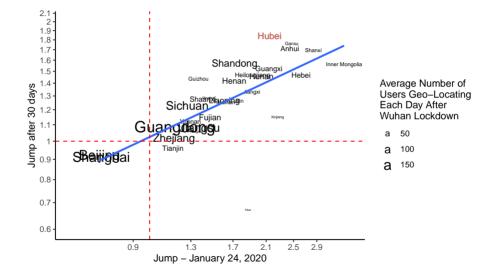




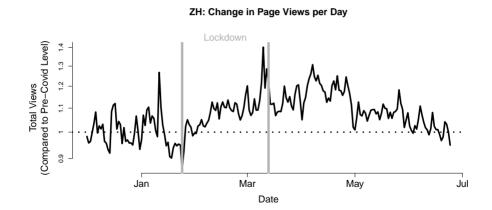
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#### **Views of Wikipedia Pages in Chinese**



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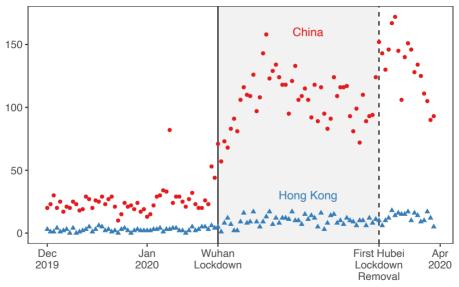
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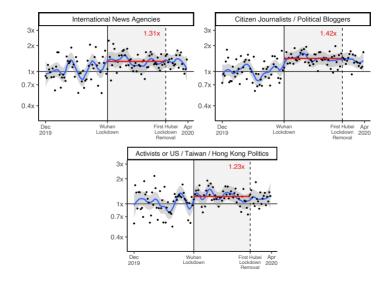
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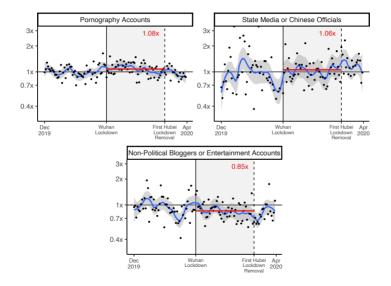
#### Twitter @ChineseWSJ Number of New Followers by Location



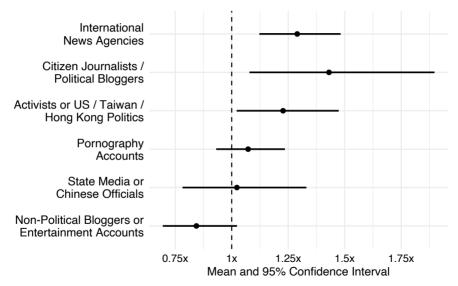
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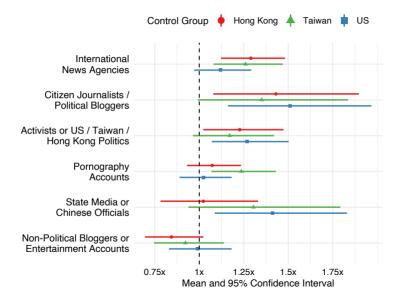
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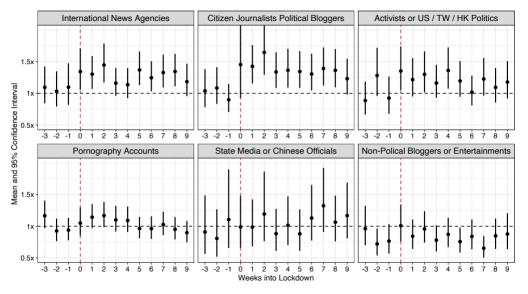
#### Relative Size of New Followers, China / Hong Kong



#### Relative Size of New Followers, China / Control Group



#### Relative Size of New Followers by Week, China / Hong Kong



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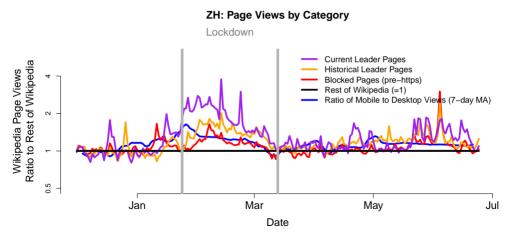
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#### **Increases in Wikipedia Page Views By Category**



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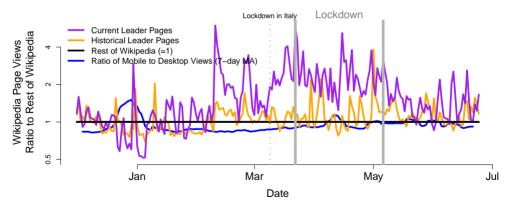
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	Overall	Blocked	Leaders	Historical
		relative to overall		Leaders
Chinese	1.09	1.15	1.86	1.42
	(1.05 - 1.12)	(1.09 - 1.22)	(1.67 - 2.07)	(1.32 - 1.52)
Persian	1.42	0.84	0.91	0.82
	(1.37 - 1.46)	(0.79 - 0.89)	(0.80 - 1.05)	(0.75 - 0.90)
Russian	1.23		1.73	0.90
	(1.18 - 1.28)		(1.48 - 2.02)	(0.82 - 0.99)
German	1.16		2.36	1.21
	(1.12 - 1.20)		(2.02 - 2.76)	(1.05 - 1.40)
Italian	1.47		3.29	1.17
	(1.40 - 1.53)		(2.72 - 4.00)	(1.02 - 1.34)

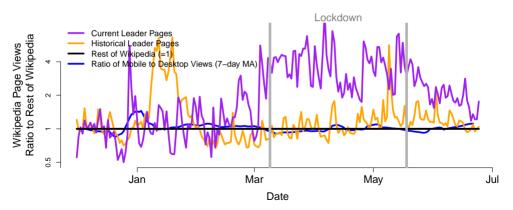
#### **Increases in Wikipedia Page Views in German**

#### **DE: Page Views by Category**

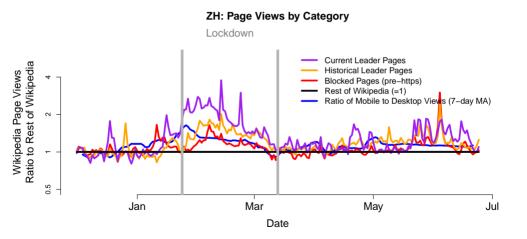


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#### **Increases in Wikipedia Page Views in Chinese**



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