## Fabricating News In Chinese Social Media<sup>1</sup>

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<sup>&</sup>lt;sup>1</sup>Based on joint work with Jennifer Pan (Stanford) and Margaret Roberts (UCSD)

<sup>&</sup>lt;sup>2</sup>GaryKing.org

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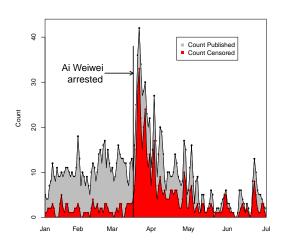
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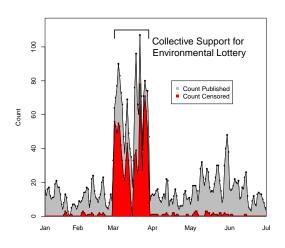
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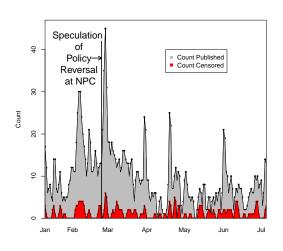
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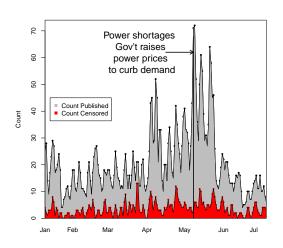
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    - Policies that generate dissent (& interest of leaders)
    - Government action outside the Internet
    - Dissidents to be arrested; peace treaties to sign; emerging scandals
    - Disagreements between central and local leaders









## Goal of China's 50c Party

• Prevailing view of scholars, activists, journalists, social media participants:

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 Prevailing view of scholars, activists, journalists, social media participants: 50c party argues with & debates against those who criticize the government, its leaders, and their policies

It's antidisestablishmentarianism!

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Evidence? A few anecdotes; "no ground truth"; "no successful attempts to quantify" 50c party activity; even several analyses with made up dependent variables!

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- Does not argue; does not engage on controversial issues
- Distracts; redirects public attention from criticism and central issues to cheerleading and positive discussions of valence issues

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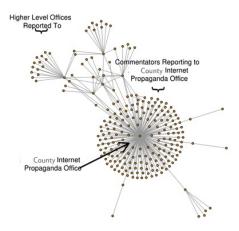
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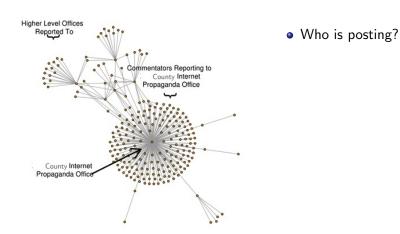
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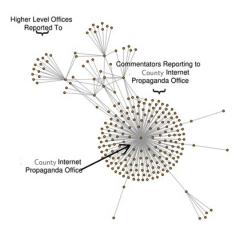
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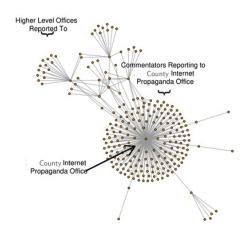
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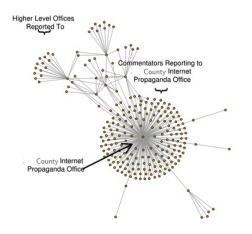




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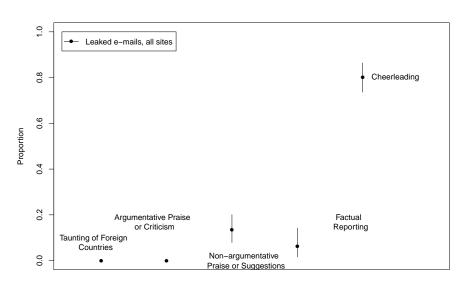
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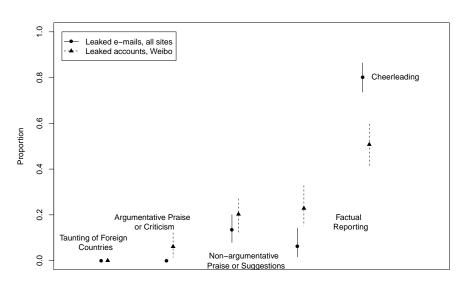
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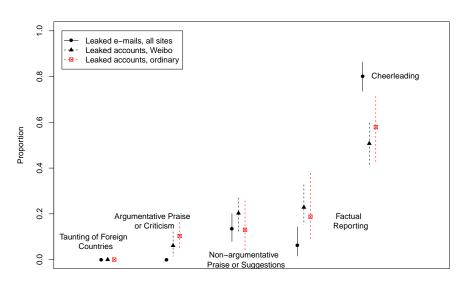
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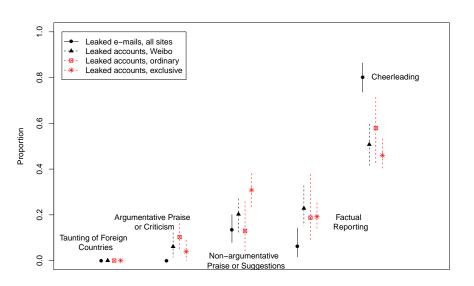
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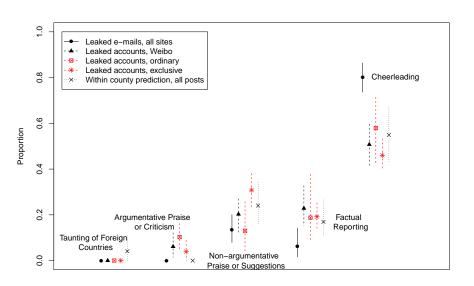
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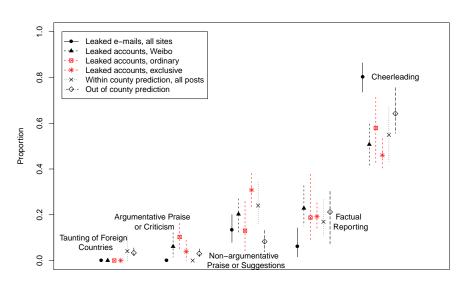












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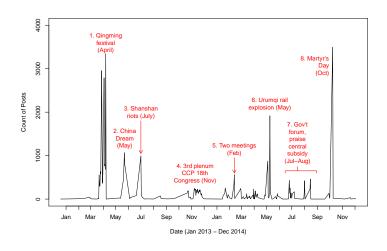
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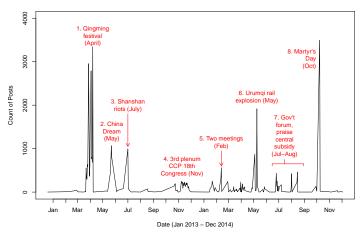
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# 43,797 Zhanggong 50c Posts: Highly Coordinated

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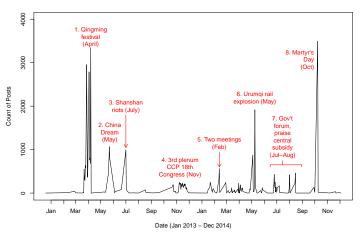


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### How Can We Validate 50c Party Membership Predictions?

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- Ask same question of random sample of known 50c (from Zhanggong)
- Ask same question of accounts known not to be 50c

50c Status	Origin	Percent Yes

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Predicted 50c	Across China	

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Predicted 50c	Across China	59%

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- For future research:
  - When studied at scale, chinese government information controls leave big footprints.

#### For more information



 ${\sf GaryKing.org}$ 

JenPan.com

MargaretRoberts.net