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December 18, 2023



Outline

- Introduction
 - Cyber violence
 - Supervision measures
- Model Setting
 - The Process of the Whole Game
 - Model Without Supervision
 - Model With Supervision
- 3 Experiment: Internet Users & The Privy Interaction
 - Design and sampling
 - Internet Users' results
 - The Privy's results
- Summary and reflection
- 5 Appendix: Questionnaire



According to the Statistical Report on China's Internet Development

- By December 2022, the number of Internet users has reached 1.067 billion.
- The number of mobile Internet users has reached 1.065 billion.



图 1-1 网民规模和互联网普及率

Figure: Size of Internet users and Internet penetration rate

- Online social network provides a platform and channel for people to obtain and exchange information.
- Due to the lax control of the Internet, it also causes a series of social problems, such as false information and network rumors.

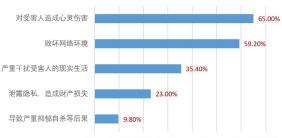
您认为引发网络暴力的原因有哪些



Figure: Questionnaire on Cognitive Attitudes towards Cyber Violence

- Cyber violence may cause the privy "social death", or suicide and other extreme behavior.
- The greater the influence of the speaker, the more serious the damage caused by the misstatement.





0.00% 10.00% 20.00% 30.00% 40.00% 50.00% 60.00% 70.00%

Figure: Questionnaire on Cognitive Attitudes towards Cyber Violence

Supervision measures

- Traditional laws and regulations take the way of ex post relief, which can not fully adapt to the changes in the network field.
- The cost of subsequent dissemination of information in the Internet age is low, and it is difficult to control subsequent dissemination.

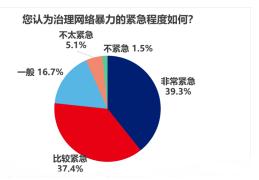


Figure: Questionnaire on Cognitive Attitudes towards Cyber Violence

Supervision measures

Governments

- Some scholars believe that the government is an important force in the rumor refuting action.
- According to the study of Zhao et al., the government is the most effective regulator in the process of rumor propagation.

Opinion Leaders

- Jain shows that opinion leaders have an important impact on information dissemination in social networks, thus influencing people's decision-making.
- The research results of Wang Xiwei et al show that opinion leaders can actively guide public opinion and have a strong influence on the spread of rumors.



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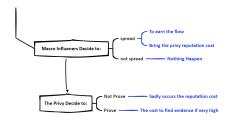


Players in the Game

- Macro influencer(网络大V),
 - Macro influencers only care about how much flow(流量) they could earn by spreading inflammatory rumors
- The privy(当事人)
 - Nature draws a type t_i for the privy from a set of feasible types $T=t_1,t_2$ according to a probability distribution $p(t_i)$
- Internet users(网民)
 - The internet users choose whether or not to forward the rumor based on their judgments, i.e. their behavior represents their judgments
 - Internet users have "rationality"

Game Process

Unformed Rumors

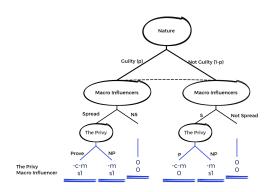




(a) Macro Influencer & The Privy

- (b) The Privy & Internet User
- For simplicity, we consider the game of macro influencer & the privy and the game of the internet users & the privy separately.
- $\bullet \ \ \mathsf{Macro\ influencer}\ \&\ \mathsf{The\ privy} \colon \mathsf{whether\ to\ spread\ the\ rumors} \to \mathsf{whether\ to\ prove\ himself}$
- The privy & The internet users: whether to spread the rumors → whether to further forward the rumor
- The privy's payoff is consistent between these 2 games while we assume the behavior of macro influencer and internet user are independent

Game Tree of Macro Influencer & The Privy

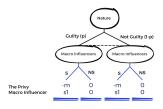


- To find the solid evidence costs the privy a lot, i.e. c is large
- If the rumors are spread, the reputation cost is even larger, i.e. m>c
- ullet Macro influencer believes the privy has probability p to be guilty, and probability 1-p to be not guilty.
- ullet By spreading the rumors, the macro influencer could earn revenue from the flow of \underline{s}_1

Solutions

Recalling Worker-Firm Game

Step 1: Backwards Induction



- Step 2: calculating the expected payoff of macro influencer
 - S: $s_1 \times p + s_1 \times (1-p) = s_1$
 - NS: 0
- The subgame perfect nash equilibrium: [Spread, Not Prove]
- The calculation is irrelevant to the value of p, therefore the **PBE** is [Spread, Not Prove, $p \in [0,1]$]

Game Tree of Internet Users & The Privy

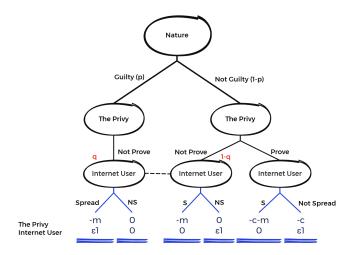


Figure: Game Tree of Internet Users & The Privy



Nash Equilibrim

Assume here nature draws the privy' type with $p=1-p=\frac{1}{2}$

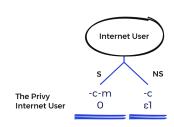
Payoff Matrix

	Internet Users				
		(S,S)	(S,NS)	(NS,S)	(NS,NS)
The Privy	(NP,P)	$-m-\frac{c}{2},\frac{\epsilon_1}{2}$	$\frac{-c-m}{2}, \epsilon_1$	$\frac{-c-m}{2}$, 0	$-\frac{c}{2}, \frac{\epsilon_1}{2}$
	(NP,NP)	$-m, \frac{\epsilon_1}{2}$	$-m, \frac{\epsilon_1}{2}$	$0, \frac{\epsilon_1}{2}$	$0, \frac{\epsilon_1}{2}$

 4 Nash Equilibrium: [(NP,NP), (S,S)], [(NP,P), (S,NS)], [(NP,NP), (NS,S)], [(NP,NP), (NS,NS)]

Subgame Perfect Nash Equilibrim

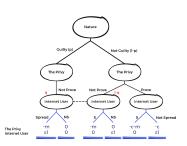
- When the privy is not guilty and tries to prove himself, the subgame perfect strategy for the internet user is not to spread the rumor.
- Eliminating [(NP,NP), (S,S)], [(NP,NP), (NS,S)]
- 2 Subgame-perfect Nash Equilibrium: [(NP,P), (S,NS)], [(NP,NP), (NS,NS)]



Perfect Bayesian Nash Equilibrium

Set belief: $q = \frac{Prob\ of\ Receiving\ NP\ From\ Guilty\ Privy}{Prob\ of\ Receiving\ NP}$

- [(NP,P), (S,NS)]
 - Separating Strategy
 - Requirement 3: q=1
 - PBE: [(NP,P), (S,NS), q=1]
- [(NP,NP), (NS,NS)]
 - Pooling Strategy
 - Requirement 3: q = 0.5
 - PBE: [(NP,NP), (NS,NS), q=0.5]
- 2PBEs: [(NP,P), (S,NS), q=1], [(NP,NP), (NS,NS), q=0.5]

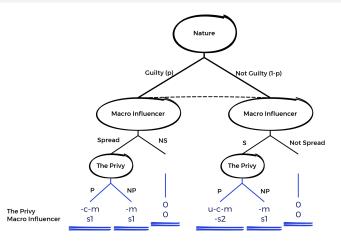


The Role of Supervision

- Recalling Basic Assumptions
 - The macro influencer only cares about the flow they earned
 - The Internet user are rational
 - The cost to find solid evidence is high, c>0
 - The reputation cost of spreading the rumors is even higher than the cost of finding evidence, m>c
- The Role of Supervision
 - Macro Influencer: If they wrongly spread the rumors, they should pay compensation to the privy, $-s_2$
 - \bullet The Privy: If they are wrongly spreading the rumors, they could get a lump sum compensation, μ
 - Internet Users: If the internet users wrongly spread the rumors of the not guilty privy, they will incur negative utility, $-\epsilon_2$



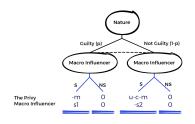
Game Tree of Macro Influencer & The Privy



• The only difference: when the macro influencer spreads the rumors of the innocent privy, they should pay the privy s_2 as compensation, while the privy will receive μ .

Solutions

Step 1: Backwards Induction

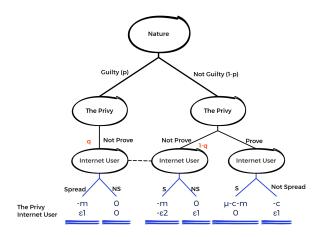


- Step 2: calculating the expected payoff of macro influencer
 - S: $s_1 \times p s_2 \times (1 p) = s_1 = (s_1 + s_2)p s_2$
 - NS: 0
- Perfect Bayesian Nash Equilibrium:

[NS, P,
$$p < \frac{s_2}{s_1 + s_2}$$
], [S, NP, $p > \frac{s_2}{s_1 + s_2}$]



Game Tree of Internet Users & The Privy



• The only difference: when the internet users spread rumors of innocent privy, they have negative utility $-\epsilon_2$

Nash Equilibrium & Subgame Perfect Equilibrium

Assume here nature draws the privy' type with $p=1-p=\frac{1}{2}$

Payoff Matrix

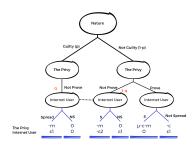
	Internet Users				
The Privy		(S,S)	(S,NS)	(NS,S)	(NS,NS)
	(NP,P)	$\frac{\mu-c-2m}{2}, \frac{\epsilon_1}{2}$	$\frac{-c-m}{2}, \epsilon_1$	$\frac{\mu-c-m}{2}, 0$	$-\frac{c}{2}, \frac{\epsilon_1}{2}$
	(NP,NP)	$-m, \frac{\epsilon_1 - \epsilon_2}{2}$	$-m, \frac{\epsilon_1 - \epsilon_2}{2}$	$0, \frac{\epsilon_1}{2}$	$0, \frac{\epsilon_1}{2}$

- Subgame also eliminates the strategy of "(,S)"
- 2 Nash Equilibrium = 2 Subgame-Perfect Nash Equilibrium: [(NP,P), (S,NS)], [(NP,NP), (NS,NS)]
- After supervision, the strategy of "(,S)" is even not in the Nash Equilibrium Strategy Sets

Perfect Bayesian Nash Equilibrium

Set belief: $q = \frac{Prob\ of\ Receiving\ NP\ From\ Guilty\ Privy}{Prob\ of\ Receiving\ NP}$

- [(NP,P), (S,NS)]
 - Separating Strategy
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Design and sampling

We designed several online rumor scenarios to capture real-life reactions.

- Process: Assumptions \rightarrow Randomly assign roles \rightarrow Q&A
- We collect 200 questionnaires with 97 Internet Users and 103 Privies, and exclude irrational people 11 and 19 respectively.

网络流言视角下的"当事人&网民"互动博弈

亲爱的朋友,您已进入一场妙趣横生的经济学实验中。首先,请您阅读完所有的前提假设,再进入具 体的情境中作答。您的选择对我们的研究开展至关重要,恳请您认真作答。

当网络上出现有关某人不当行为的事件讯息,如果当事人无辜,他们时常通过辟谣的形式来"自证清 白". 以期缓解自己的名誉损失。与此同时,面对此类讯息,网民也需要甄别其性质,再决定是否传播(转 发、点赞等), 当事人是否辟谣也可能在一定程度上影响网民的判断。

您的决策需要基于以下假定:

- 此博弈分为两阶段、假设网络上出现了有关某人不当行为的事件讯息(后文简化为流言)、先由当 事人决定是否辟谣,再由网民决定是否继续传播这一流言。您会被随机分配当事人或网民角色。
- 2、只有当事人知道自己是"有罪的"还是"无辜的",网民不知道当事人的真实类型,只能通过当事人的 行为来判断。
- 3、若网民对当事人的类型判断正确,会获得一定的正收益(来自内心的满足感)。正确判断需要满足 以下任一种情况:若当事人有罪,网民选择传播该流言;若当事人无辜,网民选择不传播该流言。
 - 4. 若网民选择传播该流言,无论当事人是否有罪,都会对当事人造成一定的名誉损失。
 - 5. 当事人辟谣往往需要收集大量的证据。"白证清白"的成本很高。

Figure: Introduction and assumptions

Internet Users' results

Internet Users' reactions when faced with "Not prove" to "Prove":

 The number of netizens who chose "Spread" drops by 46.7%, and those who chose "Not spread" increases by 150%.

第6廳:你的角色是 网尾。你看到一条有关某人不当行为的讯息,且当事人;没有进行辞谣,此时你需要在继续传播或不传播流言之间做出选择。如果你对当事人的类型判断正确(当事人有罪,你选择传播;当事人无辜,你选择不传播),你会获得收益3;如果你判断错误,你的吃益为0,你的选择是: [单选题]

第5腿: 你的角色星 网民。你看到一条有关某人不当行为的讯息,且当事人 有进行踪谣,此时你需要在继续 传播或不传播流言之间做出选择。如果你对当事人的类型判断正确(当事人有罪,你选择传播;当事人无 辜,你选择不传播),你会获得收益3;如果你判断错误,你的收益为0.你的选择是: [单选题]

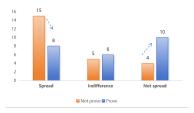


Figure: Netizens' reactions when faced with NP and P

Internet Users' results

Individual tracking:

- Netizens are less likely to spread when observing P: 70.9%
- Netizens are more likely to spread when observing P: 9.3%
- NP or P does not affect netizens' choice: 19.8%

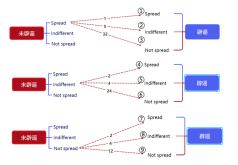


Figure: Netizens' reactions when faced with NP and P

Internet Users' results

Supervision: Netizens who spread false rumors will be punished.

- Netizens are less likely to spread when supervision appears: 64.0%
- Netizens are more likely to spread when supervision appears: 11.6%
- Supervision does not affect netizens' choice: 24.4%

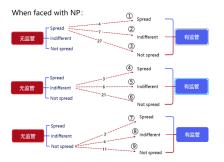


Figure: Netizens' reactions between different supervision status

The Privy's results

Privies' reactions when relative cost of self-proving decreases:

 The number of privies who chooses "Prove" increases by 30.0%, and those who chooses "Not prove" drops by 42.1%.

```
第2题:你的角色是 当事人。网络上流传着有关你某一不当行为的讯息,你知道自己的真实类型是"无辜的"。已知"自证清白"的成本为-5,是否辟谣可能会影响网友对待流言的态度。但无论你是否选择辟谣,网友都有可能继续传播该讯息。若网友选择继续传播,你将会遭受名誉损失-4。你的选择是: [单选题]
```

第4题:你的角色是 当事人。网络上流传着有关你某一不当行为的讯息,你知道自己的真实类型是"无辜的"。已知"自证清白"的成本为-5,是否辟谣可能会影响网友对待流言的态度。但无论你是否选择辟谣,网友都有可能继续传播该讯息。若网友选择继续传播,你将会遭受名誉损失-6。你的选择是: [单选题]

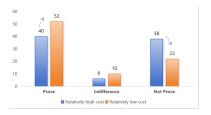


Figure: Privies' reactions when faced with different self-proving costs

The Privy's results

Supervision: Self-proving cost decreases and victims will be compensated.

- The privy is more likely to prove when supervision appears: 42.9%
- The privy is less likely to prove when supervision appears: 11.9%
- Supervision does not affect the privy's choice: 45.2%

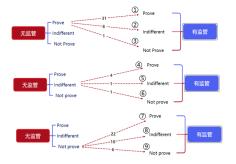


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Summary and reflection

Why are online rumors so prevalent?

- "造谣一张嘴,辟谣跑断腿": In cyberspace, spreading rumors is almost no cost while the cost of self-proving is so high.
- 舆论场上的"有罪推定": It is assumed in advance that the Privy has a problem, then he needs to prove "I'm innocent".

Policy implications:

- Strengthen supervision: Assist Privies to reduce self-proving costs, and severely punish rumor makers and spreaders.
- Movement: "清朗行动" in 2023

Model limitations:

- Guilty Privies who use "false evidence" to quibble are not taken into account.
- The influence of Macro Influence on netizens' actions has been ignored.

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Thank you!

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Introduction and assumptions

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- 2、只有当事人知道自己是"有罪的"还是"无辜的"。网民不知道当事人的真实类型,只能通过当事人的 行为来判断。
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 - 4、若网民选择传播该流言,无论当事人是否有罪,都会对当事人造成一定的名誉损失。
 - 当事人限译往往需要收集大量的证据。"自证清户"的成本很高。
- *1. 分配角色: 请随机选择一个数字
 - O 2
 - 3

 - O 4

Questions for Privies

2. 你的角色是当事人、网络上流传着有关你某一不当行为的讯息,你知道自己的真实类型是 "无孽的"。已知"自证清白"的成本为5,是否辟温可能会影响网友对待流言的态度。但无论你是 否选择辟竭、网友都有可能继续传播该讯息。若网友选择继续传播,你将会遭受名誉换失 4。 你的选择是:
○ 辟谣
○ 不辟谣
○是否辟谣都一样
4. 你的角色是当事人。网络上流传着有关你某一不当行为的讯息,你知道自己的真实类型是 "天寨的"。已知了自证清白的成本为5、是否辟谣可能会影响网友对待流言的态度。但无论你是 否选择辟谣,网友都有可能继续传播该讯息。若网友选择继续传播,你将会遭受名誉损失-6。你的选择是:
○ 許遜
○不辟谣
○ 是否辟谣都一样

由于网络上流言四起,真伪辨辨,严重破坏了网路铁序和公共安全, <mark>政府监管</mark> 决定介入。监管介入 后,传播虚假讯息的网民会受到一定惩罚(罚金、禁言等),而原本无罪却被网民乱惨溺的当事人 可以获得一定补偿(金钱、名誉恢复等)。同时,政府部门的协助会降低无罪当事人"自让清白"的成 本,政府监管的介入可能会在一定程度上影响当事人和网民的决策。
7. 你的角色是当事人,网络上流传着有关你某一不当行为的讯息,你知道自己的真实类型是 无辜的。若你选择辟谣,很大概率会引脸监管部门的注意,多部门协助将依宁自还高白"的成 本从、珍季 3。 但无论你是否辟谣,网友都有可能继续传播该讯息,若网友选择传播,你将遭 爱名誉损失人,同时,受益于监管部门对传递行为的严厉惩治,将在事后给予你的的名誉补 偿;若网友选择不传播,你需独自承担辟温成本。在政府监管介入下,你的选择是:
○ 辟谣
○不辟遥
○ 是否辟谣都一样
8. 你的角色是当事人。网络上流传着有关你某一不当行为的讯息,你知道自己的真实类型是"天涯的"。是否辟谣可能会影响两友对特流言的志度。若你选择辟谣,很大概率会引起监管部门的注意,多部门协助部使你自证请自己的成本从-6提至5、同时你将在事后获得名誉补偿48、但无论仲是否选择解证,仅太都与官继续传播张讯息。若网友选择继续传播、你仍会医此遇受名誉损失4。在政府监管介入下,你的选择是:
○辟谣
○不辟谣
○ 是否辟谣 都 一样

Questions for Internet Users

在继续传播或不传播流言之间做出选择。如果你对当事人的类型判断正确(当事人有罪,你选择传播;当事人无辜,你选择不传播),你会获得收益3;如果你判断错误,你的收益为0。你 的选择是:
◎ 继续传播
○ 不传播
○ 是否传播都一样
5. 你的角色是网民。你看到一条有关某人不当行为的讯息,且当事人没有进行辟谣,此时你需 更在继续传播或不传播流言之间做出选择。如果你对当事人的类型判断正确(当事人有罪,你 选择传播;当事人无辜,你选择不传播),你会获得收益3;如果你判断错误,你的收益为0。 你的选择是:
○ 继续传播
○ 不传播
○ 是否传播都一样

*5. 你的角色是网民。你看到一条有关某人不当行为的讯息,且当事人有进行辟谣,此时你需要

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- 9. 你的角色是网民。你看到一条有关某人不当行为的讯息,且当事人沒有进行辟谣,此时你需要在继续传播或不停脂流言之间做出选择。如果你对当事人的类型判断正确(当事人有罪,你选择传播,当事人无辜,你选择不传播),你会获得收益3;如果你判断错误,政府监管介入下你会要到惩罚-5。你的选择是;
 - 继续传播
 - 不传播
 - 是否传播都一样