

# *A theory of media bias and disinformation*

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EEA-ESEM 2023

Barcelona, August 31, 2023

# Motivation



Source: Patrick LaMontagne.

- ▶ The digital revolution has fundamentally changed the way people consume news
- ▶ People today commonly get news via news websites/apps and social media platforms
  - ▶ Pew Research Center (2021)
- ▶ These developments have not only led to a fragmentation of the media landscape but also facilitated the spreading of **disinformation**

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- ▶ Growing evidence suggests they are widespread particularly on social media, with vast majority of people regularly encountering such stories
  - ▶ evidence on Facebook and Twitter: Allcott and Gentzkow (2017, JEP) and Vosoughi et al. (2018, Science)
- ▶ Rapidly advancing AI technology allowing for fabrication of image and video content like OpenAI's DALL-E exacerbates the problem

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- ▶ Rapidly advancing AI technology allowing for fabrication of image and video content like OpenAI's DALL-E exacerbates the problem
- ▶ At the same time, the digital revolution has also facilitated fact-checking, e.g., through cross-checking sources

We build a model of media bias that captures these stylized facts:

- ▶ Consumers with heterogeneous beliefs can choose between a variety of news outlets
- ▶ Biased outlets benefit politically or financially from consumers taking a certain action, e.g.,
  - ▶ (not) consuming a credence good like a medical treatment, or
  - ▶ voting for a party in line with its ideology

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  - ▶ (not) consuming a credence good like a medical treatment, or
  - ▶ voting for a party in line with its ideology
- ▶ To this end, the outlet may strategically spread disinformation, incl. the possibility of **fabrication** in case there is no actual news
- ▶ Consumers in turn can engage in fact-checking

# The model

- ▶ Binary state of the world  $\theta \in \{0, 1\}$
- ▶ Large population of consumers  $N = [0, 1]$  who must each choose an action  $a \in A = \{0, 1\}$
- ▶ Consumers have heterogeneous prior beliefs  $\pi$  on the true state being  $\theta = 1$ 
  - ▶ continuous and strictly increasing cdf  $F$  on  $[0, 1]$ . This talk:  $F$  symmetric around  $\frac{1}{2}$
  - ▶ identify a consumer with her prior  $\pi$



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  - ▶ continuous and strictly increasing cdf  $F$  on  $[0, 1]$ . This talk:  $F$  symmetric around  $\frac{1}{2}$
  - ▶ identify a consumer with her prior  $\pi$
- ▶ At most three media firms: a neutral media firm  $N$  and two media firms  $L$  and  $H$  that are biased in opposite directions, i.e.,  $\mathcal{M} \subseteq \{N, L, H\}$ 
  - ▶ each media firm provides information via a single news outlet

## Timing of events:

1. Nature draws state  $\theta \in \{0, 1\}$ .
2. Consumers select news outlet.
3. Firms receive private information.
4. Firms submit report to followers.
5. Followers can verify report.
6. Consumers choose action  $a \in A$ .
7. Payoffs realize.

Solution concept: trembling-hand perfect Bayesian equilibrium + weak form of confirmation bias (in case report does not matter for action).

[details](#)

## Timing of events:

1. Nature draws state  $\theta \in \{0, 1\}$ . Each consumer selects which news outlet  $M \in \mathcal{M}$  to follow (or subscribe to)
2. Consumers select news outlet.
3. Firms receive private information. ▶ media firms compete for consumers' scarce attention (relaxed in extension)
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1. Nature draws state  $\theta \in \{0, 1\}$ . Each media firm  $M$
2. Consumers select news outlet. ▶ observes the total mass of followers  $F^M(1)$ ,
3. Firms receive private information. ▶ receives the private signal  $s \in \{l, h\}$  with probability  $p_0 \in (0, 1)$
4. Firms submit report to followers.
5. Followers can verify report. ▶ precision  $p_1 = Pr(s = l | \theta = 0) = Pr(s = h | \theta = 1) > \frac{1}{2}$
6. Consumers choose action  $a \in A$ . ▶ signal  $s$  interpreted as news about  $\theta$
7. Payoffs realize. ▶ write  $s = \emptyset$  if  $M$  has received no signal

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## Timing of events:

1. Nature draws state  $\theta \in \{0, 1\}$ . Each media firm  $M$  submits a report  $\hat{s}_M \in \{\emptyset, l, h\}$
2. Consumers select news outlet. to its followers
3. Firms receive private information. ▶  $\hat{s}_M = \emptyset$  interpreted as news not related to  $\theta$ ,  
e.g., trivial gossip news
4. Firms submit report to followers.
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  4. Firms submit report to followers.
  5. Followers can verify report.
  6. Consumers choose action  $a \in A$ .
  7. Payoffs realize.
- ▶ After a follower has observed  $M$ 's report  $\hat{s}_M \in \{l, h\}$ , she can **verify** it at cost  $c > 0$ 
    - ▶ reveals true realization of  $s$
  - ▶ If a consumer  $\pi$  discovers that  $\hat{s}_M \neq s$ :  $M$  incurs **reputation cost**  $\alpha(\hat{s}_M, s, \mu_\pi)$  that depends on the “size” of the lie in terms of  $\pi$ 's posterior  $\mu_\pi$ . **This talk:**

$$\alpha(\hat{s}_M, s, \mu_\pi) = |\mu_\pi(\hat{s}_M) - \mu_\pi(s)|$$
 if  $\hat{s}_M \in \{l, h\} \setminus \{s\}$  and  $\alpha(\hat{s}_M, s, \mu_\pi) = 0$  else.

Solution concept: trembling-hand perfect Bayesian equilibrium + weak form of confirmation bias (in case report does not matter for action).

[details](#)

## Timing of events:

1. Nature draws state  $\theta \in \{0, 1\}$ .
  - ▶ Consumers: payoff 1 if  $a = \theta$  and 0 else
2. Consumers select news outlet.
  - ▶  $M$ 's continuation payoff depends on her reputation,  $\beta > 0$  measures importance
3. Firms receive private information.
  - ▶ decreases in the share of consumers who discover a lie
4. Firms submit report to followers.
  - ▶  $M = N$ : additional payoff from honesty
5. Followers can verify report.
  - ▶  $M \in \{L, H\}$ : additional payoff from  $a = 0$  and  $a = 1$ , respectively
6. Consumers choose action  $a \in A$ .
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# Equilibrium analysis

In a first step, we narrow down the firms' equilibrium strategies:

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- ▶ Biased firms benefit from consumers choosing a certain action and may to this end produce disinformation:

## Definition: Disinformation

We refer to  $M$ 's report  $\hat{s}_M \in \{l, h\}$  as **disinformation** if  $\hat{s}_M \neq s$ . Furthermore,  $\hat{s}_M \in \{l, h\}$

(i) **distorts the private signal** if  $\hat{s}_M \neq s \in \{l, h\}$ .

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- ▶ Further:  $M$ 's report  $\hat{s}_M = \emptyset$  **suppresses** the private signal if  $s \in \{l, h\}$ .

*Lemma 1*

Any equilibrium in which beliefs are monotonic is such that media firm  $M$  reports  $s = h$  truthfully and either suppresses or distorts  $s = l$  if  $M = H$ , and vice versa for  $M = L$ .

- ▶  $\hat{s}_H = l$  never reported because suppression induces more consumers to take its preferred action while avoiding verification

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- ▶  $\hat{s}_H = l$  never reported because suppression induces more consumers to take its preferred action while avoiding verification
- ▶ Study [monotonic equilibria with the least disinformation \(MELD\)](#) details
- ▶ **This talk:** Symmetric equilibria. We can thus represent the media firms' strategy by  $q = (q_f, q_d)$ 
  - ▶  $q_f$  and  $q_d$  are the probabilities of fabrication and distortion given the possibility to do so, respectively

## Competition between biased firms

We first investigate competition between two biased firms,  $\mathcal{M} = \{L, H\}$ .

**Assumption 1:**  $c < \frac{p_0(1-p_0)(2p_1-1)}{\max\left\{2\left(1-p_0+p_0^2p_1(1-p_1)\right), (1-p_0)^2+4p_0^2p_1(1-p_1)\right\}}$ .

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Next, we determine consumer behavior upon observing  $\hat{s}_H = h$  (analogue for  $\hat{s}_L = l$ ).

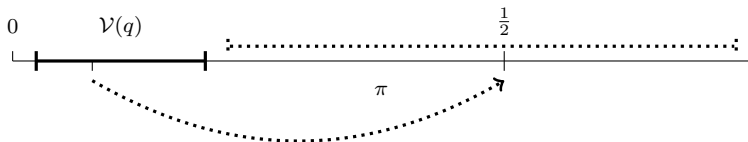
- ▶ Verification requires that, **interim**, the consumer is sufficiently uncertain about her optimal action
- ▶ Since  $\hat{s}_H = h$  shifts beliefs upwards, the typical consumer who verifies is (ex-ante) moderately biased toward the low action
  - ▶ **verification interval**  $\mathcal{V}(q)$

[details](#)

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[details](#)

### Example:



*Figure:* Verification interval  $\mathcal{V}(q)$  and the corresponding interim beliefs after observing  $\hat{s}_H = h$  (dotted line and arrow).



### Proposition 1

Suppose that  $\mathcal{M} = \{L, H\}$  and that  $F$  is symmetric around  $\frac{1}{2}$ . There exists  $\underline{\beta} > 0$  such that the symmetric MELD  $q^*$  is such that

- (i)  $\frac{1}{2} > q_f^* > 0 = q_d^*$  and consumers  $\pi \in (\underline{\mathcal{V}}(q^*), 1 - \underline{\mathcal{V}}(q^*))$  follow the outlet that is biased against their belief if  $\beta \geq \underline{\beta}$ ,
- (ii)  $q_f^* = 1 \geq q_d^* > \frac{c(2-p_0)}{p_0(2p_1-1-c)}$  and consumers  $\pi \in (\tilde{\Pi}(q_d^*), 1 - \tilde{\Pi}(q_d^*))$  follow the outlet that is biased against their belief otherwise, where  $\tilde{\Pi}(q_d^*) \geq \underline{\mathcal{V}}(q^*)$ .

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- ▶  $\pi < \frac{1}{2}$ :  $s = h$ ?
- ▶ if  $q_f < \frac{1}{2}$ ,  $\hat{s}_H = h$  more informative than  $\hat{s}_L = \emptyset$  on this matter
- ▶ vice versa if  $q_f \geq \frac{1}{2}$

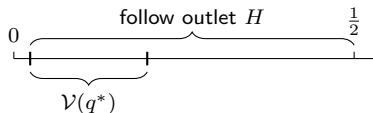


Figure: Example for Proposition 1 (i).

details

# Competition between neutral and biased firms

## Proposition 2

Suppose that  $\mathcal{M} = \{N, L, H\}$ . The unique ME is such that biased firms are uninformative and any consumer

- (i)  $\pi \leq 1 - p_1$  follows outlet  $L$ ,
- (ii)  $\pi \in (1 - p_1, p_1)$  follows outlet  $N$ ,
- (iii)  $\pi \geq p_1$  follows outlet  $H$ .

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- (iii)  $\pi \geq p_1$  follows outlet  $H$ .

- ▶ Thus, **echo chambers** in which people only hear opinions similar to their own (Sunstein, 2007) arise endogenously in equilibrium
- ▶ Nevertheless, introduction of media firm  $N$  generates a Pareto-improvement for consumers

# Conclusion

- ▶ We have developed a model of media bias that captures several stylized facts about today's news industry
- ▶ There is fabricated news in any equilibrium, and moderately biased consumers follow the different-minded outlet and fact-check counter-attitudinal news
  - ▶ those who, interim, are the most uncertain
- ▶ Second, our findings are in line with Sunstein (2007), who argues people sort themselves into echo chambers wherein they avoid counter-attitudinal news
  - ▶ occurs once a neutral outlet is present, but only for strongly biased consumers
- ▶ Furthermore: Comparative statics on verification costs and competition [details](#)
- ▶ In the paper: extension to multi-homing

## Related literature

- ▶ Literature on media bias as distortion of private information.

*Besley and Prat (2006, AER), Gentzkow and Shapiro (2006, JPE), Denter et al. (2021, EJ)*

- ▶ Besley and Prat: “If we allowed the media to [fabricate] news, [. . .] we would need to get into a complex signalling game.”
  - ▶ to our knowledge we are the first to allow for fabrication
- ▶ Literature on competition between strategic news outlets.

*Chen and Suen (2019, AEJ:Micro), Richardson and Stähler (2021), Innocenti (2021)*

- ▶ Innocenti: information design, endogenous formation of echo chambers
- ▶ Richardson and Stähler: price competition between media firm and two fake-news providers, consumers with extreme beliefs choose to consume fake news to have prior beliefs confirmed
- ▶ our model: echo-chamber effect arises endogenously once there is also a neutral firm, but only for strongly biased consumers

Thank you for your attention!

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## Details on the model: Payoffs

- ▶ Consumer  $\pi$ : action  $a_\pi \in A$  yields payoff 1 if  $a_\pi = \theta$  and 0 otherwise
- ▶  $M$  receives a continuation payoff of

$$\beta \left( F^M(1) - \int_0^1 v_\pi \alpha(\hat{s}_M, s, \mu_\pi) dF^M(\pi) \right), \text{ where } \beta > 0$$

- ▶  $v_\pi \in \{0, 1\}$  verification decision of consumer  $\pi$
- ▶ may represent future revenue from advertising or subscriptions
- ▶  $M = N$ : additional payoff normalized to 1 from reporting truthfully,  $\hat{s}_N = s$
- ▶  $M \in \{L, H\}$ : additional payoff normalized to

$$\int_0^1 a_\pi + \mathbf{1}_{\{M=L\}}(1 - 2a_\pi) dF(\pi)$$

## *Details on the model: Solution concept*

- ▶ Solution concept: trembling-hand perfect Bayesian equilibrium
  - ▶ simplifies the analysis: since  $F$  is strictly increasing, expected distribution of beliefs among each firm's followers strictly increasing if consumers employ completely mixed strategies
- ▶ We further incorporate a weak form of confirmation bias:

A consumer  $\pi$  whose actions are affected by neither media firm chooses as to maximize the share of news that confirm her prior  $\pi$ , i.e., the share of high (low) messages if  $\pi \geq (<) \frac{1}{2}$ .

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# Monotonic equilibria with the least disinformation (MELD)

Monotonic equilibrium:

- ▶ We implicitly impose the common understanding that message  $\hat{s}$  means ‘ $s = \hat{s}$ ’
  - ▶ “exogenous meaning”, cf. Gordon et al. (2022)
- ▶ Therefore, it is natural to require that **beliefs are monotonic**, i.e., that  $\mu_\pi(\hat{s}_M = h) > \mu_\pi(\hat{s}_M = \emptyset) > \mu_\pi(\hat{s}_M = l)$  for all  $\pi \in (0, 1)$  and  $M \in \mathcal{M}$

Measure of disinformation:

- ▶ A monotonic equilibrium  $q^* = (q_f^*, q_d^*)$  has the **least disinformation** if  $q_f^* \leq q_f'$  and  $q_d^* \leq q_d'$  for any other monotonic equilibrium  $q'$

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## Details verification intervals

Under the biased firms' strategy  $q$ , consumers with prior  $\pi \in \mathcal{V}(q)$  (and who follow outlet  $H$ ) verify  $\hat{s}_H = h$ , where

$$\underline{\mathcal{V}}(q) = \frac{c\lambda((1-p_0)q_f + p_0p_1q_d) + (1+c)p_0(1-p_1)}{p_0(1-c(2p_1-1)(1-\lambda q_d))},$$

$$\bar{\mathcal{V}}(q) = \begin{cases} \frac{((1-p_0)q_f + p_0p_1q_d)\lambda(1-c) - cp_0(1-p_1)}{\lambda(2(1-p_0)q_f + p_0q_d) + cp_0(2p_1-1)(1-\lambda q_d)}, & \text{if } q_d \leq \frac{c(2\lambda(1-p_0)q_f + p_0)}{\lambda p_0(2p_1-1-c)} \\ \frac{\lambda p_0 p_1 q_d (1-c) - c(\lambda(1-p_0)q_f + p_0(1-p_1))}{\lambda p_0 q_d + c p_0(2p_1-1)(1-\lambda q_d)}, & \text{otherwise} \end{cases}.$$

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- ▶  $\bar{\mathcal{V}}(q) > \frac{1}{2}$  iff  $q_d > \frac{c(2\lambda(1-p_0)q_f + p_0)}{\lambda p_0(2p_1-1-c)}$ 
  - ▶ consumers biased toward action 1 may also verify  $\hat{s}_H = h$  if enough distortion
- ▶ consumers with prior above  $\bar{\mathcal{V}}(q)$  take action 1 upon receiving  $\hat{s}_H = h$

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  - ▶ consumers biased toward action 1 may also verify  $\hat{s}_H = h$  if enough distortion
- ▶ consumers with prior above  $\bar{\mathcal{V}}(q)$  take action 1 upon receiving  $\hat{s}_H = h$
- ▶ The respective terms for firm  $L$  obtain by reflection at  $\frac{1}{2}$ : consumers with prior  $\pi \in \mathcal{V}^*(q) \equiv (1 - \bar{\mathcal{V}}(q), 1 - \underline{\mathcal{V}}(q))$  verify  $\hat{s}_L = l$

## Details Proposition 1

Note that consumers  $\pi \in \mathcal{V}(q)$  verify  $\hat{s}_H = h$  and consumers  $\pi \in \mathcal{V}^*(q)$  verify  $\hat{s}_L = l$ . [details](#)

### Proposition 1

Suppose that  $\mathcal{M} = \{L, H\}$  and that  $F$  is symmetric around  $\frac{1}{2}$ . There exists  $\underline{\beta} > 0$  such that the symmetric MELD  $q^*$  is such that

- (i)  $\frac{1}{2} > q_f^* > 0 = q_d^*$  and consumers  $\pi \in (\underline{\mathcal{V}}(q^*), \bar{\mathcal{V}}^*(q^*))$  follow the outlet that is biased against their belief if  $\beta \geq \underline{\beta}$ ,
- (ii)  $q_f^* = 1 \geq q_d^* > \frac{c(2-p_0)}{p_0(2p_1-1-c)}$  and consumers  $\pi \in (\tilde{\Pi}(q_d^*), 1 - \tilde{\Pi}(q_d^*))$  follow the outlet that is biased against their belief otherwise, where

$$\tilde{\Pi}(q_d^*) \equiv \frac{q_d^* p_0 (1 - p_1) + c(1 - p_0 p_1 (1 - q_d^*))}{p_0 (q_d^* - c(2p_1 - 1)(1 - q_d^*))} \left( \geq \underline{\mathcal{V}}(q^*) \right).$$



(i)  $\frac{1}{2} > q_f^* > 0 = q_d^*$  and consumers  $\pi \in (\underline{\nu}(q^*), \bar{\nu}^*(q^*))$  follow the outlet that is biased against their belief if  $\beta \geq \underline{\beta}$ ,

- ▶ Level of fabrication low and no distortion if continuation payoff high
  - ▶ no distortion because fabrication is a smaller lie than distortion ( $\Rightarrow$  lower reputational costs)
- ▶ All but extreme consumers follow outlet biased against their belief
  - ▶ if  $\pi < \frac{1}{2}$ , only relevant information is whether  $s = h$
  - ▶ since  $q_f < \frac{1}{2} \Leftrightarrow q_f < 1 - q_f$ , outlet  $H$  less likely to pool  $s = \emptyset$  with  $s = h$  (via  $\hat{s}_H = h$ ) than outlet  $L$  (via  $\hat{s}_L = \emptyset$ )
  - ▶ in turn, low level of fabrication optimal for firms

(ii)  $q_f^* = 1 \geq q_d^* > \frac{c(2-p_0)}{p_0(2p_1-1-c)}$  and consumers  $\pi \in (\tilde{\Pi}(q_d^*), 1 - \tilde{\Pi}(q_d^*))$  follow the outlet that is biased against their belief otherwise, where

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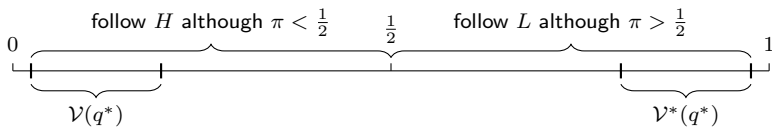
- ▶ Level of fabrication and of distortion high if continuation payoff low
  - ▶ with intermediate level of disinformation, only subset of consumers who would verify counter-attitudinal reports follow outlet biased against their belief, as  $\hat{s}_L = \emptyset$  then is a good indicator of  $s = h$
  - ▶ firms in turn have more to gain from fabrication
  - ▶ thus, if we have such an equilibrium, then also one with low level of fabrication
  - ▶ high level of disinformation: reports rather uninformative, and verification thus attractive again

### Example

Suppose that  $\mathcal{M} = \{L, H\}$ ,  $F = \mathcal{U}(0, 1)$ ,  $p_0 = \frac{1}{2}$ ,  $p_1 = 1$ , and  $c = \frac{1}{5}$ . The symmetric MELD  $q^*$  is such that

- (i)  $\frac{1}{2} > q_f^* > 0 = q_d^*$  and consumers  $\pi \in (\underline{\mathcal{V}}(q^*), \bar{\mathcal{V}}^*(q^*)) = (\frac{q_f^*}{4}, 1 - \frac{q_f^*}{4})$  follow the outlet that is biased against their belief if  $\beta \geq \underline{\beta} \approx 2.98$ ,
- (ii)  $q_f^* = q_d^* = 1$  and consumers  $\pi \in (\underline{\mathcal{V}}(q^*), \bar{\mathcal{V}}^*(q^*)) = (\frac{2}{5}, \frac{3}{5})$  follow the outlet that is biased against their belief otherwise.

In case  $\beta = 4$ , this equilibrium is such that  $q_f^* \approx 0.096 > 0 = q_d^*$ :



## Comparative statics

Consider a monopoly model with only firm  $H$ . Since  $\mathcal{V}(q)$  “shrinks” in verification costs  $c$ :

### *Proposition*

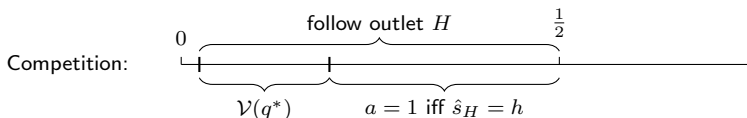
In the model with only firm  $H$ , decreasing verification costs  $c$  decreases disinformation in the MELD  $q^*$ .

- ▶ Suggests that investments in media and information literacy education may not only help those who fact-check but also result in a media environment with less disinformation

### Proposition

Introducing firm  $L$  to the model with only firm  $H$  strictly reduces disinformation associated with the incumbent firm in the MELD if  $\beta \geq \underline{\beta}$ .

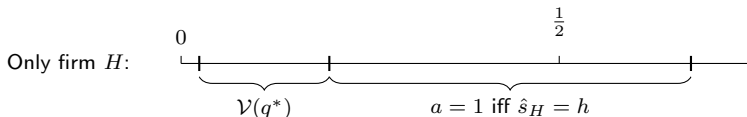
To see this, consider again the previous example:



### Proposition

Introducing firm  $L$  to the model with only firm  $H$  strictly reduces disinformation associated with the incumbent firm in the MELD if  $\beta \geq \underline{\beta}$ .

To see this, consider again the previous example:



⇒ More incentives to fabricate news without competition

- ▶ Thus, competition can reduce disinformation considerably

back