

# Can Media Pluralism Be Harmful to News Quality?

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# Motivation

- The Internet facilitates pluralism in information but empirical evidence suggests a deterioration of the quality of the information (Allcott and Gentzkow, 2017).
  - Research question: when is media pluralism beneficial to news consumers?
  - Theoretical model with three main ingredients:
    - Biased news sources (McCarthy and Dolfsma, 2014)
    - Unbiased news consumers with heterogeneous beliefs (Hirsch, 2016)
    - Limited attention by news consumers (Pew Research Center, 2020)
- ⇒ sufficient conditions for media pluralism to be harmful.

# Model

- $\Omega = \{\omega_1, \omega_2\}$ ,  $A = \{a_1, a_2\}$  and  $S = \{s, s'\}$  are, respectively, the set of states, the set of actions and the set of messages.
- There are two types of agents: experts (media) and decision-makers (news consumers).
- Each agent  $I$  has a prior belief  $\mu_I^0(\omega_1) \in (0, 1)$ .
- Bayesian Persuasion model. [▶ Literature Review](#)
  - Commitment power: the interpretation of messages is objective.

- Each expert  $j \in J$  (he) has a preferred action  $a_j \in A$  and his payoff from a decision-maker who takes action  $a \in A$  is:

$$u_j(a, \omega) = u_j(a) = \mathbb{1}\{a = a_j\} \quad \text{for any state } \omega \in \Omega$$

- Each expert designs information to manipulate decision-makers' behaviour:
  - The expert  $j$  chooses a reporting policy  $\pi_j : \Omega \rightarrow \Delta(S)$ .
  - He commits to the probability  $\pi_j(s | \omega)$  to send message  $s$  given state  $\omega$ , for any message  $s \in S$  and any state  $\omega \in \Omega$ .

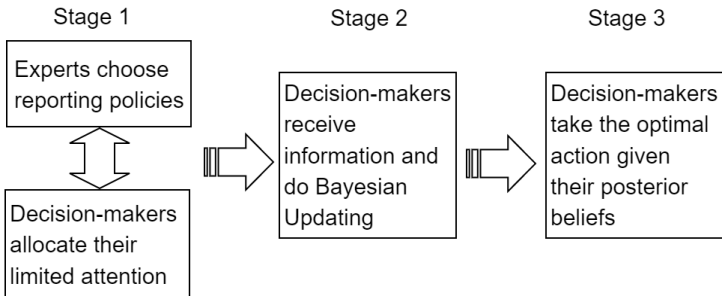
# Decision-makers

- $D$  is the set of decision-makers, who are partitioned in two homogenous subgroups: those in subgroup  $i$  share the same prior belief  $\mu_i^0(\omega_1)$  for each  $i \in \{1, 2\}$ .
- Each decision-maker (she) takes an action  $a \in A$ . Her goal is to match the action with the state:

$$u(a, \omega_k) = \mathbb{1}\{a = a_k\} \quad \text{for any } k = 1, 2.$$

- Before taking an action, each decision-maker  $d \in D$  pays attention to one expert  $j_d \in J$ :
  - She uses the information provided by the expert to update her belief.

# Timing



▶ Evidence

# Road map

- ① Focus on the problem of one expert  $\implies$  Benchmark: Monopoly
- ② Analysis of the whole game  $\implies$  Media pluralism

## Benchmark: Monopoly

- Assume that the preferred action of the expert is  $a_1$ . The *persuasion constraints* are:

$$\pi(s | \omega_2) \leq \frac{\mu_i^0(\omega_1)}{\mu_i^0(\omega_2)} \pi(s | \omega_1) = \phi_i \pi(s | \omega_1)$$

- Without information (or in case of babbling),
  - Believers ( $i = 1, \phi_1 > 1$ ) choose the expert's preferred action  $a_1$ .
  - Sceptics ( $i = 2, \phi_2 < 1$ ) choose the expert's undesired action  $a_2$ .
- The expert designs informative messages to change sceptics' behaviour but all decision-makers receive the same information  $\implies$  believers' behaviour could change.
- Trade-off between persuading sceptics and retaining believers  $\implies$  two candidates for the optimal policy: the *hard-news policy* and the *soft-news policy*.



# Optimal policy

- The hard-news policy focuses on persuading sceptics.
  - Message  $s$  must be credible i.e., misleading only to a limited extent.
  - With positive probability the expert reveals his unfavourable state (message  $s'$ )  $\implies$  believers take the expert's undesired action.
- The soft-news policy focuses on retaining believers.
  - The expert sends two messages of different credibility.
  - Message  $s$  is credible enough to persuade sceptics. Message  $s'$  is not, but does not induce believers to take the expert's undesired action  $\implies$  the expert leverages believers' credulity.
- Hard-news policy more informative than soft-news policy (Blackwell, 1953). Nevertheless, the expert prefers the soft-news policy if:
  - 1 Decision-makers have sufficiently polarized beliefs; [» Graph](#)
  - 2 The expert's unfavourable state is sufficiently likely from his perspective.

- Two experts with different preferred actions:
  - Expert  $\alpha$ : preferred action  $a_1$ , Believers  $i = 1$  and Sceptics  $i = 2$ .
  - Expert  $\beta$ : preferred action  $a_2$ , Believers  $i = 2$  and Sceptics  $i = 1$ .
- Simultaneous-moves game: Optimal information design by experts **AND** endogenous allocation of attention by decision-makers.
- Each expert  $j$  chooses  $\pi_j$  to maximize the probability that decision-makers take  $a_j$ , given his audience  $H_j = \{d \in D \mid j_d = j\}$ .
- Given the policies of the experts, each decision-maker  $d$  of subgroup  $i$  allocates her attention to maximize her subjective probability of taking the correct action:  $j_d \in \arg \max_{j \in J} \lambda_i(\pi_j)$ .

# Equilibrium preliminaries

- It holds that  $\lambda_i(\pi_j) \in [\mu_i^0(\omega_m), 1]$ , where  $m$  is the most plausible state given prior belief.
- Receiving information is always (weakly) beneficial:
  - An expert can change the behaviour of rational decision-makers ...
  - ... but has to provide credible information, and this makes decision-makers (weakly) better off.

$\implies$  (weakly) positive subjective information gain from persuasion:  
 $\Delta_{ij} = \lambda_i(\pi_j) - \mu_i^0(\omega_m) \geq 0$

- Targeted decision-makers: a persuading message makes them just indifferent between the two actions (binding persuasion constraint)
- Subgroup  $i$  is the target of expert  $j \implies \Delta_{ij} = 0$ .

# Echo Chambers

- Strategic tension: each decision-maker wants to avoid being a target, whereas each expert has (at least) one target.
- Echo chambers (audience = believers) arise endogenously as an equilibrium outcome.
  - Babbling is the optimal policy for each expert.
  - Given babbling, decision-makers have no incentive to deviate.
- Lower information quality and (weakly) lower information gains for any decision-maker, compared to monopoly.
  - A monopolist uses either his hard-news policy or his soft-news policy.
  - These policies produce some dispersion in posterior beliefs, whereas babbling leaves beliefs unchanged.

# Symmetric Equilibrium

- An equilibrium is “symmetric” if any two decision-makers of the same subgroup  $i$  pay attention to the same expert  $j$ .
- Echo chambers is the unique symmetric equilibrium where both experts are active.
- Opposite-bias learning (audience = sceptics) is not an equilibrium.
  - Each expert uses his hard-news policy.
  - Sceptics have zero information gains, but hypothetical believers would have positive information gains.
  - Sceptics have incentive to deviate and become believers of the other expert.
- There exists also “asymmetric” equilibria. [» Details](#)

# Harmful Media Pluralism

- For any equilibrium, there exists a monopoly outcome such that for any decision-maker:
  - 1 Information gain is (weakly) higher;
  - 2 Information quality is (weakly) higher.
- Robust result:
  - Continuous distribution of beliefs; [» Details](#)
  - Costly attention; [» Details](#)
  - Partial commitment; [» Details](#)
  - Non-Bayesian persuasion; [» Details](#)
  - Attention adjustment cost; [» Details](#)
  - Entropy cost; [» Details](#)
  - Attention-concerned experts; [» Details](#)
  - Continuous state space; [» Details](#)
  - More than two experts. [» Details](#)

# Policy implications

- Increasing media pluralism has a non-monotonic effect on information quality.
  - Media pluralism backfires when attention becomes limited.
  - Endogenous allocation of attention  $\implies$  decision-makers cluster into echo chambers  $\implies$  the incentives for experts to provide valuable information vanish.
- Echo chambers can arise even with unbiased news consumers.
  - Rational foundation of confirmation bias (no intrinsic preference, equilibrium outcome).
- Open question: is the formation of echo chambers mainly demand-driven or supply-driven?
  - Necessary to design policy remedies.

Thank you for your (limited) attention!



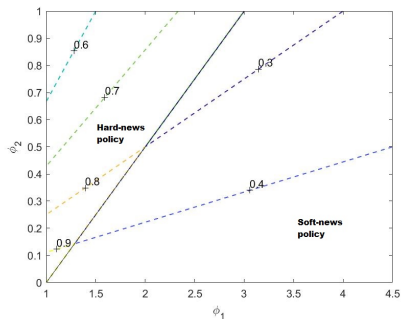
# Contributions to the literature

- Bayesian Persuasion: Kamenica and Gentzkow (2011).
  - Competition with unlimited attention: Gentzkow and Kamenica (2017);
  - Competition where media want to gather attention: Knoepfle (2020).
- Echo Chambers:
  - Cheap talk with biased news consumers: Jann and Schottmuller (2021).
  - Non-strategic media: Martinez and Tenev (2020).

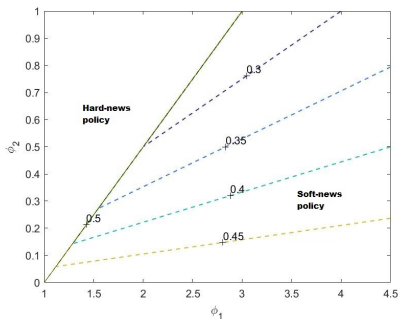
## Evidence: attention habits

- Eisensee and Strömberg (2007): Politicians' reporting about natural disasters respond strategically to attention habits.
- Ciampaglia et al. (2015): Attention towards specific issues stimulates the supply of Wikipedia articles about that issues.

# Information quality



(a) Believers



(b) Sceptics

Figure: Range of posterior beliefs when  $\mu^0(\omega_1) = \frac{1}{2}$  and  $g_1 = \frac{1}{2}$ .

## “Asymmetric” equilibria

- Necessary condition: decision-makers of the same subgroup are indifferent about the allocation of attention.
- Asymmetric equilibria with one informative expert and one babbling expert.
  - The babbling expert must collect attention only from his believers.
- Asymmetric equilibria where each expert uses his soft-news policy.
  - All decision-makers are targets of each expert  $\implies \Delta_{ij} = 0$  for any  $i$  and any  $j$ .
  - Any allocation of attention that makes it optimal for each expert to use his soft-news policy constitutes an equilibrium.

# Set of equilibria

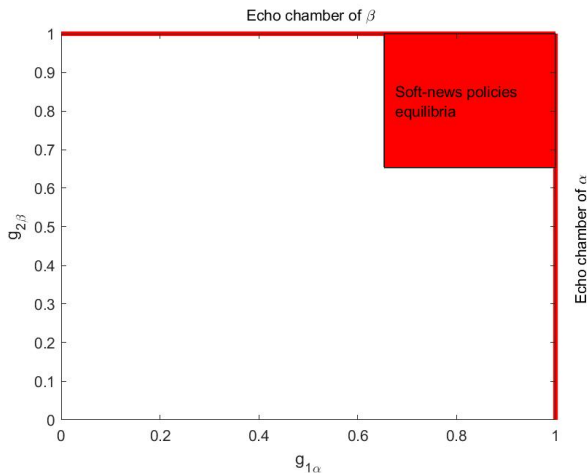


Figure: Allocations of attention that can support an equilibrium, when  $\mu_{\alpha}^0(\omega_1) = \mu_{\beta}^0(\omega_2) = \frac{7}{10}$ ,  $\phi_1 = 2$  and  $\phi_2 = \frac{1}{2}$ .

# Continuous distribution of beliefs

- In a monopoly, the optimal policy is either a hard-news policy or a soft-news policy.
- The monopolist uses a hard-news policy if  $\phi \in [0, 1]$  solves

$$h(\phi) = \frac{1}{\phi_j + \phi}$$

where  $h(\cdot)$  is the hazard rate function. [» Graph](#)

- Media pluralism with limited attention:
  - 1 Any symmetric equilibrium has at most one informative expert.
  - 2 *Partial echo chambers*: those believers with the most extreme prior beliefs join the echo chamber of the babbling expert.
  - 3 For any equilibrium, there exists a monopoly outcome such that for any decision-maker information gain and information quality are (weakly) higher.

# Costly attention

- Each decision-maker can devote attention to a second expert at a cost  $c \geq 0$ .
- Full revelation is an equilibrium if and only if  $c = 0$ .
  - $\lambda_i(\pi_\alpha) = \lambda_i(\pi_\beta) = \lambda_i(\pi_J) = 1$  for any  $i \in I$ .
  - If  $c > 0$ , each decision-maker strictly prefers to devote attention to one expert  $\implies$  truth-telling is not optimal for the experts.
- Multi-homing is not optimal because at most one expert is informative.
  - Assume  $\alpha$  is informative whereas  $\beta$  is babbling.
  - For any  $i \in H_\alpha$ , it holds  $\lambda_i(\pi_\alpha) = \lambda_i(\pi_J)$  because  $\pi_\beta$  does not affect posterior beliefs, hence optimal actions.
  - For any  $i \in H_\beta$  it must be the case that both experts are providing zero information gains, and  $\lambda_i(\pi_\alpha) = \lambda_i(\pi_\beta) = \lambda_i(\pi_J) = \mu_i^0(\omega_m)$ .

# Partial commitment

- With probability  $\delta \in (0, 1)$  the expert can deviate from his reporting policy  $\implies$  Babbling.
- This changes the persuasion constraints. Two effects:
  - Persuasion of sceptics is possible only if  $\phi_i \geq \delta$ .
  - A targeted sceptic has a positive information gain.
- The equilibria which rely on targeted sceptics being indifferent about the allocation of attention (i.e., the asymmetric equilibria) do not exist with partial commitment.
- Instead, the symmetric equilibria (echo chambers and partial echo chambers) are robust to this extension.
  - Even if targeted sceptics have a positive information gain, they still have incentives to become believers of the other expert.



# Non-Bayesian persuasion

- Generalized version of the persuasion constraint (de Clippel and Zhang, 2020):

$$\pi(s | \omega_2) \leq \phi_i^\rho \pi(s | \omega_1) = \hat{\phi}_i \pi(s | \omega_1) \quad (1)$$

- When  $\rho \in (0, 1)$ , decision-makers are subject to base-rate neglect or over-inference  $\implies$  distribution of  $\hat{\phi}_i$  more moderate.
- When  $\rho > 1$ , decision-makers overweight priors or are subject to under-inference  $\implies$  distribution of  $\hat{\phi}_i$  more extreme.
- $\hat{\phi}_i$  is relevant for the expert's information design, whereas decision-makers keep evaluating information based on their priors.
  - If  $\rho \in (0, 1)$ , targeted sceptics have a negative information gain  $\implies$  the unique equilibrium of the game is echo chambers.
  - When  $\rho > 1$ , the targeted sceptics have a positive information gain, but still have incentives to become believers of the other expert.

# Attention adjustment cost

- Decision-makers can adjust their allocation of attention at a cost  $\zeta \geq 0$ , after the reporting policies have been settled.
- Full revelation is the equilibrium if and only if  $\zeta = 0$ .
  - Full revelation requires all decision-makers to be second-movers.
  - At the same time, given full revelation, a decision-maker is not willing to pay a positive cost to be a second-mover.
- Echo chambers are robust if  $\zeta$  is large enough.
  - Expert  $\alpha$  can attract second-movers of subgroup  $i$  only if  $\zeta \leq \lambda_i(\pi_\alpha) - \lambda_i(\pi_\beta)$ .
  - In particular, expert  $\alpha$  can attract his sceptics  $i = 2$  as second-movers if  $\lambda_2(\pi_\alpha) \geq \mu_2^0(\omega_2) + \zeta$ .
  - Therefore, a sufficient condition for the robustness of echo chambers is  $\zeta > \mu_2^0(\omega_1) \implies$  the higher polarization, the lower the threshold of  $\zeta$  for echo chambers to be robust.

# Entropy cost

- Information is costly either to process for decision-makers (Matysková and Montes, 2021) or to produce for experts (Gentzkow and Kamenica, 2014).
- In the first case, echo chambers is the unique equilibrium.
  - A decision-maker prefers receiving babbling than being a target.
  - This can be interpreted as a form of confirmation bias: news consumers bear a cognitive cost when they change their beliefs.
  - Any arbitrary confirmation bias makes echo chambers the unique robust equilibrium.
- In the second case, the optimal policies change but experts keep targeting decision-makers (unless information is so costly that babbling is the best option).
  - Same equilibria but lower quality of information.
  - Nevertheless, the negative effect of media pluralism on quality continues to exist.

## Attention-concerned experts

- Experts are biased but also care of gathering attention.
- The payoff of expert  $j$  from a decision-maker who takes action  $a \in A$  and devotes attention to expert  $j_d \in J$  is:

$$u_j(a, j_d) = \mathbb{1}\{a = a_j\} + \gamma \mathbb{1}\{j_d = j\}$$

- Each expert is better off the larger is his audience, but this does not affect his reporting policies because he take as given his audience.

## Continuous state space

- Continuous state space i.e.  $\Omega = [0, 1]$  keeping the action binary i.e.  $A = \{a_0, a_1\}$ .
- Each decision-maker wants to take action  $a_1$  if and only if the state  $\omega$  is above a threshold  $\bar{\omega}$ .
- The structure of the optimal policy changes, but experts continue to target some decision-makers.
- The latter experiences zero information gain: incentives are the same as in the baseline model.

## More than two experts

- The entry of experts with the same preferences and belief as the incumbent is not affecting information provision.
  - The entrant cannot refine the optimal policy of the incumbent.
- With limited attention, two experts using the same policy can be active  
⇒ experts split attention, but no qualitative effect on results.
  - If the experts use different policies, then decision-makers have incentive to devote attention to the most informative one.