# **Understanding the Effect of Private Data in Disinformation Propagation**

Protik Bose Pranto Arizona State University Waqar Hassan Khan Arizona State University Sahar Abdelnabi CISPA Rebecca Weil CISPA

Mario Fritz CISPA Rakibul Hasan Arizona State University

#### Abstract

Two of the major issues society is currently facing are Privacy threats from data collection by digital platforms, and the quick and large-scale propagation of disinformation on the same platforms. What if the first problem further fuels the second? Specifically, we hypothesize that private data, such as demographics, interests, and psychological and physiological states could be used to expose people to certain disinformation, resulting in higher engagement, and ultimately enabling an adversary to propagate disinformation more efficiently and effectively. This abstract details the experiment design to test this hypothesis and initial findings.

## 1 Introduction

Technologies collect large quantities of personal and potentially sensitive data, such as information about individuals' demographics, behavioral patterns, (dis)interests, etc [3,8,12]. We investigate whether this personal information can be used to "target" individuals with disinformation, to elicit desired outcomes, such as increasing the likelihood of believing the information or further propagating it to others, or both. We hypothesize that individuals targeted with disinformation based on a particular property (such as gender, interests, personality traits, etc.) will exhibit different reactions compared to those who do not possess that property. Considering the association between such properties and the susceptibility to believe fake news [7, 15, 24, 26, 27], it is probable that by serving different disinformation to different groups of people based on their possessed properties, an adversary can propagate disinformation much more *effectively* and *efficiently* than broadcasting the same message to the entire population. We test this assumption by targeting based on personal interests.

Intuitively, targeting individuals based on their interests or hobbies may lead to reduced trust in disinformation, as their prior knowledge on the subject might make them skeptical [29]. However, numerous studies indicate that the opposite is often the case. Due to the processing advantage of familiar information, familiarity with the topic may lead to the impression that the information is true [13, 14]. If targeting is possible, then groups of the population that are generally found to be resilient to disinformation, such as highly educated individuals [10] and young adults [7], can be misled by false information that resonates with their personal characteristics and interests. Moreover, as extended reality [9,25,37] and personalized AI-based systems [4, 34, 35] continue to advance, the level of interpersonal engagement becomes increasingly immersive and scalable [33]. These cheap, fast, scalable systems heavily depend on user data [18, 21, 31] and are able to create personalized content [19], this could empower adversaries to automate the creation of targeted disinformation and potentially surpass the speed and efficacy of humans [11], posing difficulties in combating disinformation.

Although targeted disinformation and targeted advertising [17] or recommender systems [28] share a common foundation (leveraging individuals' data to target them), they differ in their underlying purposes. The latter aims to deliver personalized content (e.g. advertisements, recommendations), while the former exploits personal data to craft disinformation. Thus, people may appreciate personalized ads or recommendations [20], but deception through personalized content is unlikely to be desired. As a first step towards understanding the effect of targeted disinformation, we designed a study examining whether individuals can be targeted based on their topical interests. The findings will inform future research on both privacy and disinformation, by identifying population groups who are the most vulnerable to specific types of disinformation and open the discussion on platform policy regarding private data collection and targeted content delivery.

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### 2 Experimental Design

By majority voting, three authors selected 20 news articles from a list curated by three other authors. All the articles in the list were published within two weeks before the experiment day; 10 were published in high (The New York Times, The Guardians) [23] and the other 10 in low-credible (Express.co.uk, DailyWire) [36] platforms (based on their past instances of publishing false information [6, 16, 32]). Since we used recent articles, to minimize the chance of them being familiar to the participants, they were not fact-checked. However, the low-credible sources selected for this study tend to publish false news [5], the opposite is true for the highcredible sources. We focused on articles related to health and entertainment. The choice of these topics was driven by their significance and relevance in today's context. Another selection criterion was the potential victim: believing false news related to health will most likely harm the consumer, while for entertainment the subjects may be victimized (e.g., loss of reputation).

At the beginning of the experiment, participants indicated their level of interest in health or entertainment topics, as well as the frequency with which they follow news related to these topics. We also inquired about the types of news sources they follow and the frequency with which they do so. Based on this information, we can determine whether they follow traditional (Radio/Television) or online sources in their daily lives.

Each participant then read ten articles either from lowcredible or high-credible sources (random assignment); Five articles about health and the other five about entertainment. Article sources were kept secret from the participants. Using a five-point Likert scale, participants entered their beliefs regarding the truthfulness of each news article, their inclination to share the news, and their level of surprise upon encountering the news. The last question will provide hints about a participant's level of knowledge regarding the context or topic of the news. If someone exhibits less surprise in response to a particular news item, it indicates a higher level of familiarity with the news context.

**Online Survey:** We conducted the experiment through an online survey (N = 230) created by Qualtrics [2] and promoted by Prolific [1]. The participants have provided informed consent prior to participating in the survey. At the end of the survey, we asked for their feedback on the overall study. The study was approved by the institutional review board.

### **3** Findings

**Participants:** The median completion time was 9.3 minutes and the participants were paid 1.8\$ for their time. Some responses (10%, N=23) were discarded because they contained incorrect answers to at least one attention check question. Nearly half of the participants (49.27%, N=102) were exposed to low-credible news articles, while the remaining par-

ticipants (50.73%, N=105) were presented with high-credible news articles. The details of the demographic information are provided in A.1.

Effect of predictors: Our statistical analysis indicates that the level of interest in *entertainment topics* can significantly predict the belief score (F(1,99) = 8.13, p < 0.01) for highcredible entertainment news. Individuals highly interested in entertainment topics are less inclined (M = 1.56, SD = 0.269) to share articles from low-credible sources compared to individuals who are less interested (M = 1.86, SD = 0.313) in such topics (d = 1.03, p < 0.05). Conversely, for entertainment news from high-credible sources, individuals with a higher interest in that topic tended to believe the articles more (M = 3.55, SD = 0.168) compared to those with a lower interest (M = 3.40, SD = 0.194, d = -0.83, p < 0.01). Also, how surprising an article was to the participants negatively correlated with the belief score, for both low-credible (r = -0.28, F(1, 100) = 8.24, p < 0.01) and high-credible (r = -0.29, F(1, 99) = 13.13, p < 0.001) articles. On the other hand, low-credible articles were more likely to be shared if they surprised the reader (r = 0.41, p < 0.0001).

For articles related to health, there was no significant association between interest and belief. However, how frequently one follows health-related news predicted the likelihood to share such articles from *low-credible* sources (F(1,99) = 4.93, p < 0.05). Post-hoc comparison [30] revealed that individuals who frequently follow health-related news (M = 0.420, SD = 0.262) are more likely to share low-credible health news compared to those who do not regularly follow health-related news (M = 0.613, SD = 0.212), d = 0.81, p < 0.01. Finally, the share score positively correlated to the surprise score for both low-credible (r = 0.40, p < 0.0001) and high-credible (r = 0.57, p < 0.0001) articles.

## 4 Discussion and Conclusion

Our hypothesized relationship between topical interest and belief in a piece of information was only partially supported: for entertainment-related news from high-credible sources. The null result for the low-credible articles could be attributed to the skewed sample, as most of the participants reported relying on high-credible news sources for their news consumption, and only one participant reported obtaining news from low-credible sources. However, consistent with previous research [22], our findings demonstrate that people are more likely to share news articles, whether low-credible or not, when the content is unexpected or surprising to them. This suggests that the element of surprise plays a significant role in influencing people's sharing behavior, regardless of the credibility of the news. Moving forward, we are planning future studies by actively recruiting individuals who follow low-credible news sources.

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Gender	Participants per-
	centage
Female	44% (N=91)
Male	53.1% (N=110)
Non-binary/third gender	2.9% (N=6)
Age-range	
18 – 24	16.9% (N=35)
25 - 34	37.7% (N=78)
35 – 44	22.7% (N=47)
45 - 54	15.5% (N=32)
55 - 64	5.8% (N=12)
65+	1.4% (N=3)
Literacy level	
High School	39.1% (N=81)
Bachelor's Degree	38.2% (N=79)
Master's Degree or Above	17.4% (N=36)
Others	5.3% (N=11)

Table 1: Summary of participants' demographic traits.

## A Appendix

## A.1 Demographic Information

## A.2 Survey Questions

#### Preference and interest related question

- Which of the following do you use for getting news? (Multiple answers are possible)
  - Printed newspaper
  - Radio
  - Television
  - Social network site (Twitter, Facebook etc.)
  - Website or app (Dailywire, The New York Times etc.)
  - $\circ~$  Do not get news from any platform
  - Other (text box)
- How often do you use these as a source of news? (Bipartisan Report, DailyWire, Express.co.uk, Independent Journal Review, New York Times, Politico, The BBC, Dailycaller, The Guardian, The Wall Street Journal). *For each news source, we used the same point scale.* 
  - $\circ$  Never
  - Rarely
  - Sometimes
  - Very often
  - o Always

Types of news sources	Participants exposed to low-credible articles	Participants exposed to high-credible articles
Traditional news outlet	34	24
Only Low credible Sources	1	1
Only High credible Sources	52	61
Both low and high-credible sources	15	19

Table 2: Count of Participants Reporting thier Preferred News Sources

- How interested are you in these topics? (Books, Celebrity News, Cooking, General Health, Gardening, Healthy diet, Fitness and Exercise, Movies/TV Series, Music, Travel, Medical Science, Science and Technology). *For each news topic, we used the same point scale.* 
  - Not at all
  - o Slightly
  - Moderately
  - Very
  - Extremely
- How frequently do you keep up with news related to these topics? (Books, Celebrity News, Cooking, General Health, Gardening, Healthy diet, Fitness and Exercise, Movies/TV Series, Music, Travel, Medical Science, Science and Technology). *For each news topic, we used the same point scale.* 
  - Never
  - o Rarely
  - $\circ$  Sometimes
  - Very often
  - o Always

#### News article related question

Then we show 10 either low or high-credible news to the participants. Each news article holds four questions.

- Do you believe this news to be true or false?
  - I know this is false
  - This might be false
  - I don't know
  - This might be true
  - I know this is true
- Would you consider sharing this news (For example, on social media or in a conversation)?
  - o Definitely No
  - o Probably No
  - Undecided

- Probably Yes
- Definitely Yes
- How surprising was the news to you?
  - Not at all
  - o Slightly
  - o Moderately
  - $\circ$  Very
  - Extremely
- Have you seen this news previously somewhere else?
  - Yes
  - o No
  - $\circ~$  I am not sure

#### **Demographic question**

- What is your work industry?
  - Agriculture
  - Business and Finance
  - Entertainment
  - Education
  - Information Services
  - Food Services
  - Hotel Services
  - Legal Services
  - Publishing
  - Military
  - Unemployed
  - Other (text box)
  - Prefer not to disclose
- How old are you?
  - Under 18
  - o 18-24 years old
  - 25-34 years old
  - 35-44 years old

- 45-54 years old
- o 55-64 years old
- 65+ years old
- Prefer not to disclose
- How do you describe yourself?
  - $\circ$  Male
  - $\circ$  Female
  - Non binary/third gender

- Prefer not to disclose
- What is your highest level of education?
  - $\circ~$  Master's degree or above
  - Bachelor's Degree
  - $\circ$  Highschool
  - Other (text box)
  - Prefer not to disclose

#### 'Big, Historical Things': Orlando Bloom Says Katy Perry Will Be Singing At



Hollywood star Orlando Bloom gushed about his fiancee singer Katy Perry when he talked about how she's been present at "big, historical things" and would The talked adout now site is been present at big, instortical imings and would again be when she performs at King Charles III's cornation celebration. The 46-year-old actor spoke to Entertainment Tonight in Las Vegas at Sony Pictures' presentation at CinemaCon 2023, and he couldn't help but brag about his "girl" being part of the coronation concert for the king on May 7 — despite the fact that he would not get to be there with her.

'This S\*\*\* Has To Stop': Comedian Rob Schneider Says Stop Making Girls Compete Against Trans-Identifying Mer



Comedian Rob Schneider called on parents, coaches, and biologically female athletes to refuse to play against" biologically male trans athletes, saying this "st"- has to stop. The 59-year-old actor tweeted on Thursday to his 1.5 million followers a clip of North Carolina high school female volleyball star Payton McNabb who was spiked in the face by a trans-identifying male player in a game and suffered a concussion and more.

'There's Not A Place For Me': 'Yellowjackets' Star Won't Compete For Emmy Because Of Gendered Acting Categories



Rebecca-Louise Seddon woke up partially blind one moming, which terrified her. booked an urgent eye test. Eye specialists, however, prompted the 22-year-old to go to AE: "When I went to Specsavers." I hough it was a contact lens thing." Rebbcac-Louise, from Milrow, Rochdale, said. After four weeks in the hospital, it became clear to be beautican what had led to an earlier incident. Weets before losing some of her vision, Rebecca-Louise had experienced a sudden tingling on the left side

Common pill used to treat HIV could cure dementia, new study finds

#### Woody Harrelson Said He Wasn't Fazed By Backlash From 'SNL' Monologue: 'I Don't Look At That S\*\*\*\*



Woody Harrelson isn't too concerned about the backlash he received following his View manusch index of the "monologue in February, which included criticism of COMI (in Saturday Night Live" monologue in February, which included criticism of COMI (in vaccine mandates. "Well, people told me it was, shall we say, "trending." No, I don't look at that stirts, the 61-yaser-old actor told Esquired during a recent interview when asked about the controversy surrounding his monologue.



"Yellowiackets" star Liv Hewson said the actor won't compete for an Emmy "reliowjackets star LW rewson said the actor won't compete for an Emm award for the role of Vanesas" 4/an" Palmer on the hit Showtime series because of gendered acting categories. The 27-year-old Australian actor said there was not an available category that would fit, opting instead to simply bow out of this year's Primetime Emmys despite being eligible in the main acting races, Variety reported.

edicinal cannabis could 'safely' relieve cancer pain



Two Twitter Ac

Two Twitter accounts have been suspended for sharing a pirated copy of the box office smash "The Super Mario Bros. Movie" — which just passed the \$1 billion mark in global ticket sales — but the suspensions did not come before millions were able to vatch at least a portion of the movie for free. One account, @vidsthatgohard, shared the full movie - separated into two parts - to 1.1 (a) introduction of the intervention of the



Scientists say the drug could become a "safe" treatment option for some cancel patients as an alternative to opioids. Recreational cannabis is currently illegal in the UK, classified as a class B drug. Medicinal cannabis is still not widely available either, only legal in specific circumstances such as in severe cases of epilepsy. However, for a number of years, various groups have advocated for the health benefits of the drug

Figure 1: Low-credible news articles



thists believe repurposing the medication could reverse memory loss in ok ite. Dementia affects more than 55 million people worldwide, with numbers cells dig your in the coming decades. It is a syndrome associated with the reserve decline of the brain, causing problems such as memory loss, notify changes, and mobility issues. Currently, there is no known cure for orv loss in olde ple. De rogressive dementia

uld cause irregular heartbeat within hours, new study warns



The risk of arrhythmias could occur several hours after exposure to air pollution and pensisi for 24 hours, according to new research. A poor diet is perhaps the besk-rown risk fador for heart problems. However, a new study wans that the air you breathe could also play a role. Wornyingly, the research team suggested that air pollution could trigger heart arrhythmias within hours of exposure.





The casting of a black actor in an upcoming docudrama has angered groups in Egypt who say it is 'a falsification of Egyptian history'. In Queen Cleopatra, a new four-part drama-documentary made by Netflix, the title role is played by Adele James, an actor of mixed heritage – a move that has enraged Egyptian experts who insist the pharaonic leader had 'white skin and Hellenistic characteristics'.



Eva Green wins high court battle over the collapse of sci-fi film Actor wins legal case against producers, with judge ruling she is entitled to a million-dollar fee. Eva Green has hailed her victory over what she described as a group of men who tried to use her as a scapegoat, after winning a bruising legal battle over the collapse of a sci-fi film. The actor had sued White Lantern Films and SMC Speciality Finance for a \$1m (£802,000) fee that she said she was owed. However, she faced a counter-claim alleging she pulled out of the making of A Patriot, which collapsed in 2019 and breached her contract.



Scientists are pointing to a surpriving cause of some unnary tract interfactors: E. coli bactrain in mark. A new study used statistical modeling to estimate that E. coli, commonly known as the bacteria behind many foot-borne linesses, may cause hundreds of horoxands of U1.13 in the United States annulay — liekly a small fraction of overall U.13, but enough to intrigue, and in some cases concern, experts. The new study loaded at chicken, turkery and pork in particular, as previous studies suggested that these foods can become contaminated with the type of E. colifact out colifactoria cultication of loaded at colicies, the new study highlight just in two pervisive there foods-ome U.13, any job.



The pop singer Ed Sheeran took the witness stand Tuesday at a closely watched copyright trial in which he stands accused of copying his ballad "Thinking Out Loud" from Marvin Gaye's "Let's Get It On," and told a jury that he and a collaborator had written their song based on their own experiences. Appearing at federal court in Manhattan in a dark suit and blue tie, with his red hair tousled, Mr. Sheeran testified that he and his co-writer, Amy Wadge, had created "Thinking Out Loud" independently. Steven Spielberg: 'No film should be revised' based on modern sensitivity



Director has criticized the practice of re-editing older films while expressing remorse over removing guns in a later edition of ET. Steven Spielberg has criticized the idea that dired films should be re-edited to appeare modern sensities. Speaking at Times 100 Summit in New York City, the 78-yaar-old filmmaker expressed regret over taking out guns from a later reases of the 1826 sol Holokouster ET. The Extra-Terrestrial. In the 20th anniversary edition, agents saw their frearms replaced with walkis-takies. That 20th anniversary edition, agents saw their frearms replaced with walkis-takies. That are an Itsiker, be aid on stage. There should have done that. ET is a product of its error for a brown be refurning in 20th anniversary release, explaining that the guns would be returning for the 30th-anniversary release, explaining that he was "disappointed" in threed.



Menopause costs American women an estimated \$1.6 billion in lost working time per year, according to a Mayo Clinic study published their weak. The pager axamined how hot flashes, night sweats, mood swings, and the myriad other symptoms associated with this time of life affect women in the workplace. It's the largest study of its kind to have been done in the United States. Researchers survived more than 4,000 participants at four Mayo Cilici sites in Minnesota, Arizona, Fiofda, and Wisconsin. Roughly 15 percent said they had either missed work or ul back on hours because of their menopause symptoms, which the study classified as "adverse work outcomes." Those who reported the very worst symptoms were 16 times more likely to report studh outcomes than those with the least severe symptoms. A little over 1 percent said that their symptoms had become so debilitating that they either quit their jobs or were laid off in the preceding six months.

#### Researchers Identify Possible New Risk for Breast Cancer



Scientists have long known that dense breast tissue is linked to an increased risk of breast cancer in women. A study published on Thursday in JAMA Oncology adds a new twist, finding that while breast density declines with age, a slower rate of decline in one breast othen precedes a cancer diagnosis in that breast. Scientists at Washington University in St. Louis analyzed breast density changes over a 10-year period in 10,000 women who were free of cancer when the study started. Some 288 women were diagnosed with breast cancer at that time; the study compared changes in their breast tissue to those in 658 similar women who did not develop breast cancer.



People who spoke the language daily in their youth Innoide to score higher on minorry tests later in tile, here neerechnes found: a plaewing hor language provides the envidable ability to make friends in unusual places. A new study suggests that Diffuquation may also come with another benefit: Improved immonly in later tile. Studying hundreds of also come with another benefit: Improved immonly on later tile. Studying hundreds of languages cally from a yong age scored higher on totels of flamming, memory, language, and gefore/off bang patient were backed on the entrauge.



Figure 2: High-credible news articles