

A Crowdsourcing Methodology to Measure Algorithmic Bias in Black-box Systems: A Case Study with COVID-related Searches

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Motivation



Should I get vaccinated from COVID-19?



**Search
Engine
Results
Page**



SERP 1



SERP 2



SERP 3



Should I get vaccinated from COVID-19?



RQ1:
**Do different users
get the same search results?**



Should I get vaccinated for covid



User



Should I **avoid** getting vaccinated for covid



RQ2:
**Do results vary between
positive and negative
query formulations?**

Methodology

Crowdsourcing Platform to Audit a Web Search Engine

- Requesters: Publish micro-tasks or Human Intelligent Tasks (HITs)
 - Annotation tasks to obtain labels for machine learning development and evaluation)
- Crowd workers: Can choose to carry out micro-tasks at their convenience

The logo for Amazon Mechanical Turk, featuring the word "amazon" in white with its signature arrow, followed by "mechanical turk" in orange, all on a dark grey background.

Crowdsourcing Task

Upload the HTML file for the following query: is hydroxychloroquine effective for covid

Click on the following query to open a new page with the corresponding google search results: [is hydroxychloroquine effective for covid](#)

Choose file No file chosen

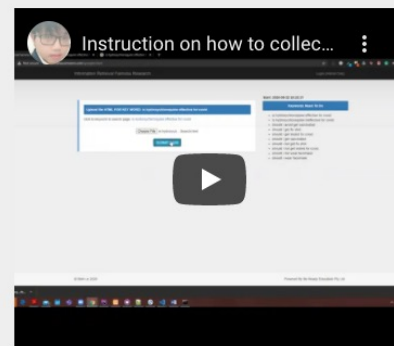
SUBMIT DATA

Start: 2021-08-30 07:27:41

Queries that still need to be completed:

- should i get flu shot
- should i get tested for covid
- should i get vaccinated
- should i not get tested for covid
- should i not get flu shot
- is hydroxychloroquine effective for covid
- is hydroxychloroquine ineffective for covid
- should i avoid get vaccinated
- should i wear facemask
- should i not wear facemask

Instruction



Useful Links

[Participant Information Sheet](#)



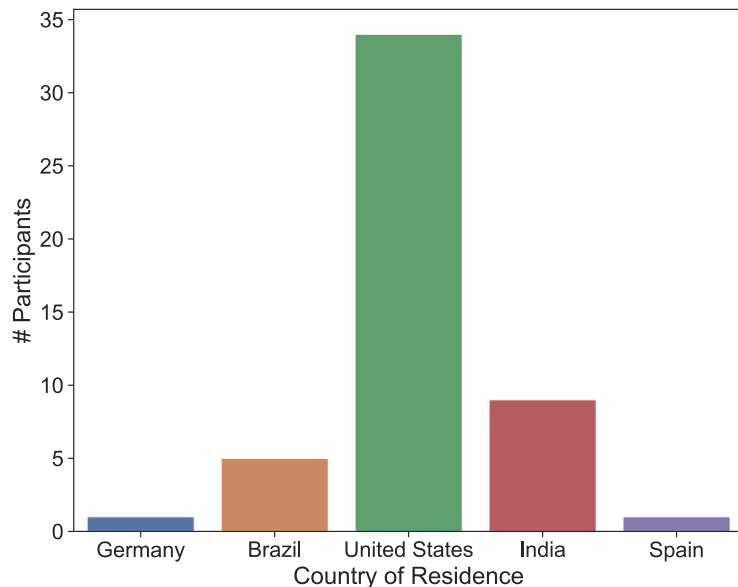
Queries

10 queries – 5 pairs

- | | | |
|----|---|--------|
| 1 | should i get tested for covid | Pair 1 |
| 2 | should i not get tested for covid | |
| 3 | should i get flu shot | Pair 2 |
| 4 | should i not get flu shot | |
| 5 | should i get vaccinated | Pair 3 |
| 6 | should i avoid get vaccinated | |
| 7 | should i wear facemask | Pair 4 |
| 8 | should i not wear facemask | |
| 9 | is hydroxychloroquine effective for covid | Pair 5 |
| 10 | is hydroxychloroquine ineffective for covid | |

Queries

- US\$ 1.20 per task
- 10 queries per task
- 1 task per participant
- N=50 participants
- Average time: 23' 30"
- All (50+1) crowdsourcing tasks completed in 2 days. Only 1 incorrect submission.
- Pre-questionnaire: Age, gender, country of origin, country of residence, level of education, ...



Comparing SERPs

Rank-Biased Overlap (RBO)

- Non-conjoint, top-weighted, and incomplete ranked lists
- Parameter “p” (patience): probability of the user to continue inspecting the ranking
 - It determines the strength of the weighting to top ranks
 - E.g., $p=0.67$: the user inspects only the top-3 search results.

Jaccard Similarity

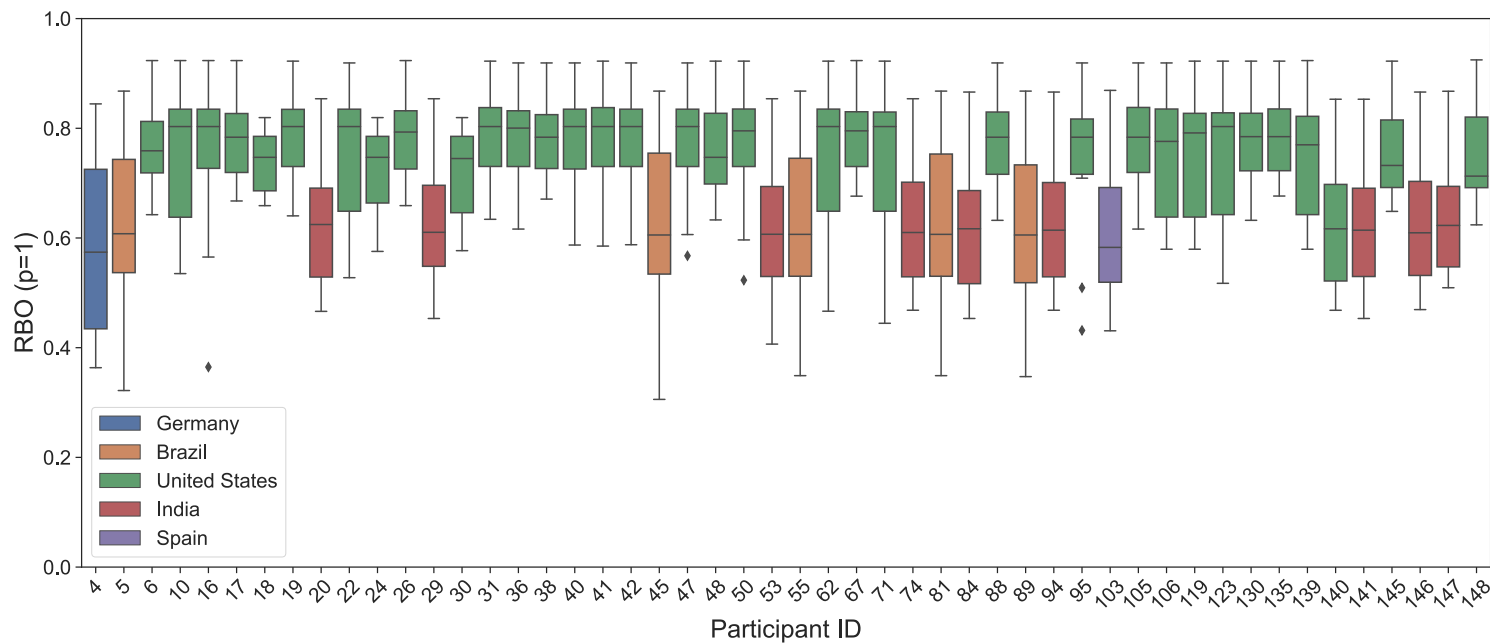
- Overlap of items in two sets
- It does not consider ranking positions, i.e., it only measures conjointness



Preliminary Results

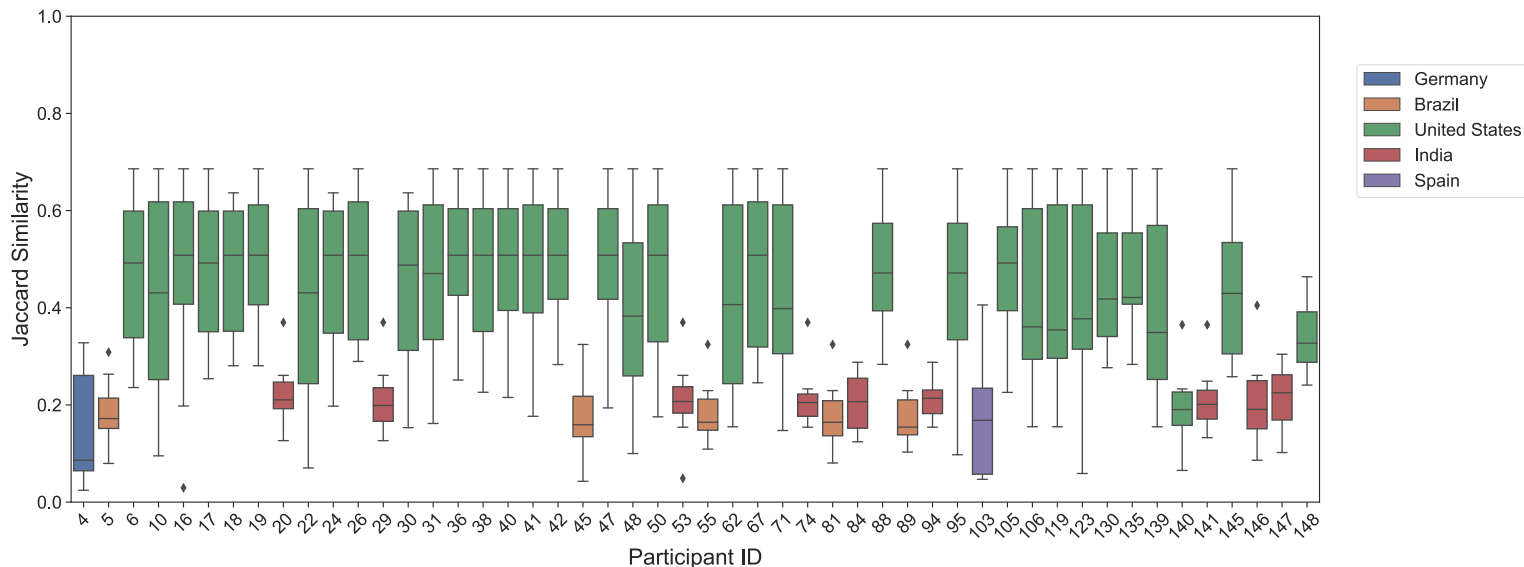
Do different users see different SERPs?

Comparing items at domain level



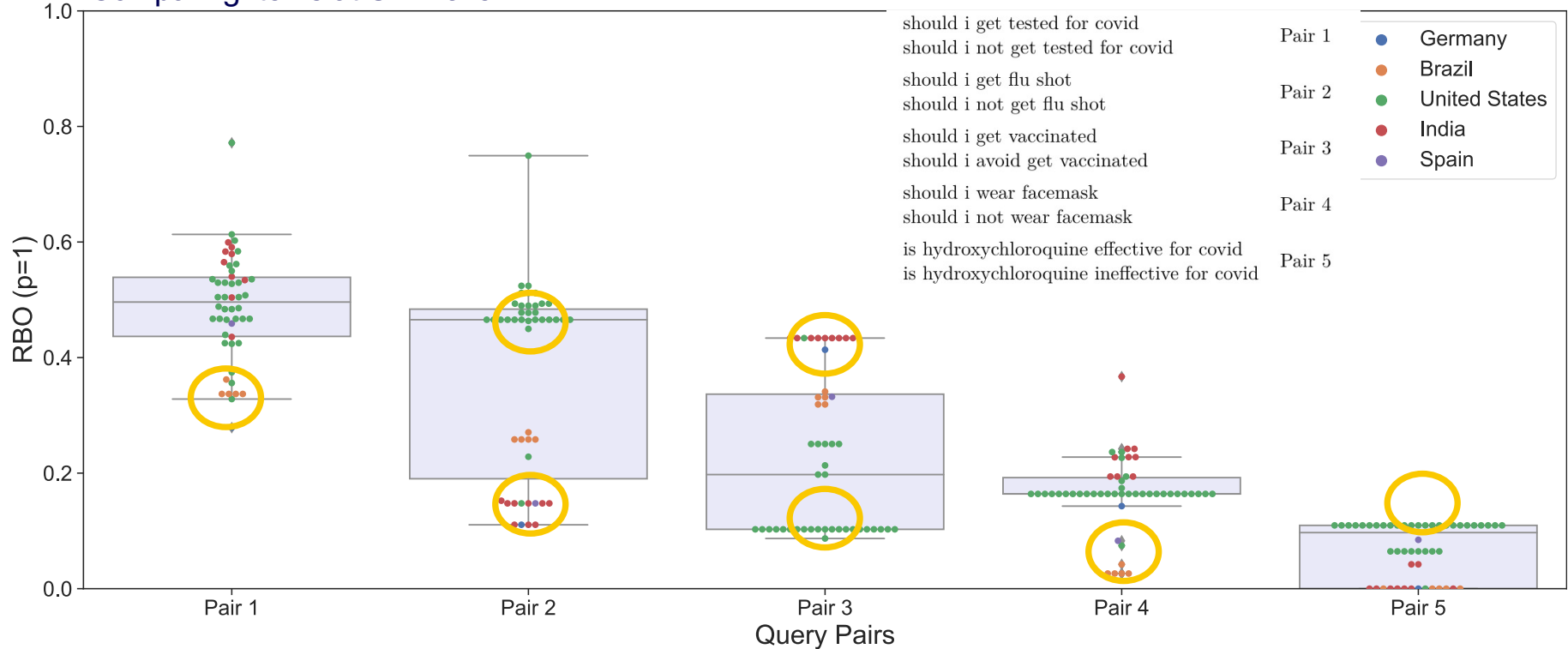
Do different users see different SERPs?

Comparing Items at domain level

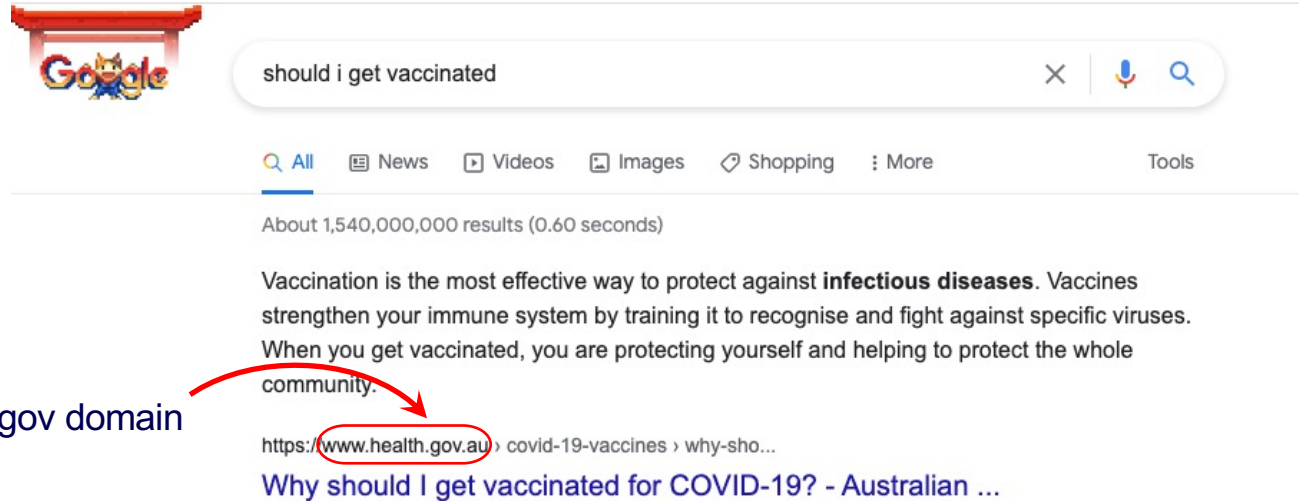


Does Query Formulation Change SERPs?

Comparing Items at URL level



[EXTRA] Quality of Information Sources



The image is a screenshot of a Google search page. The search bar contains the text "should i get vaccinated". Below the search bar, there are tabs for "All", "News", "Videos", "Images", "Shopping", and "More". The "All" tab is selected. Below the tabs, it says "About 1,540,000,000 results (0.60 seconds)". The search results show a snippet of text: "Vaccination is the most effective way to protect against **infectious diseases**. Vaccines strengthen your immune system by training it to recognise and fight against specific viruses. When you get vaccinated, you are protecting yourself and helping to protect the whole community." Below this snippet, there is a link: "https://www.health.gov.au/covid-19-vaccines/why-sho...". The link is circled in red, and a red arrow points from the text ".gov domain" to the "www.health.gov.au" part of the link. Below the link, there is a title: "Why should I get vaccinated for COVID-19? - Australian ...".

Google

should i get vaccinated

× | 🔊 🔍

🔍 All 📰 News 📺 Videos 🖼️ Images 🛒 Shopping ⋮ More Tools

About 1,540,000,000 results (0.60 seconds)

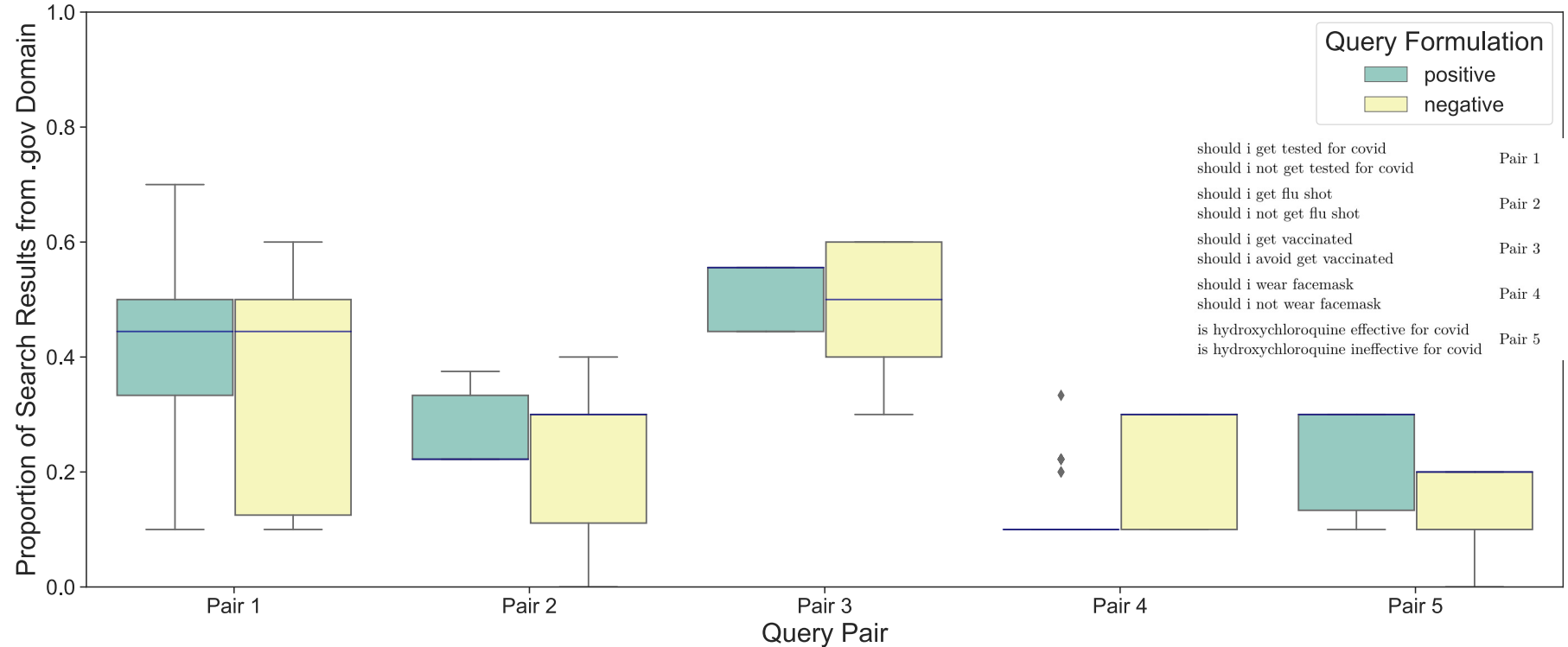
Vaccination is the most effective way to protect against **infectious diseases**. Vaccines strengthen your immune system by training it to recognise and fight against specific viruses. When you get vaccinated, you are protecting yourself and helping to protect the whole community.

<https://www.health.gov.au/covid-19-vaccines/why-sho...>

Why should I get vaccinated for COVID-19? - Australian ...

.gov domain

Items from .gov Domain in SERPs





Conclusion

- We used a crowdsourcing platform to audit a web search engine (black-box system)
 - Preliminary study
 - We observed differences in the SERPs obtained by crowd workers / participants
- Our study validates the feasibility of this approach
 - Future work: Larger dataset / number of workers
 - A more scalable (but less controlled) methodology than *data donation*

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github.com/rmit-ir/crowdsourcing-algorithmic-bias



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Acknowledgments:



Australian Government
Australian Research Council

