nature portfolio

Corresponding author(s):	Walter Quattrociocchi, Matteo Cinelli
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Reporting Summary

Nature Portfolio wishes to improve the reproducibility of the work that we publish. This form provides structure for consistency and transparency in reporting. For further information on Nature Portfolio policies, see our <u>Editorial Policies</u> and the <u>Editorial Policy Checklist</u>.

Statistics
For all statistic

For	all statistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.
n/a	Confirmed
	The exact sample size (n) for each experimental group/condition, given as a discrete number and unit of measurement
	A statement on whether measurements were taken from distinct samples or whether the same sample was measured repeatedly
	The statistical test(s) used AND whether they are one- or two-sided Only common tests should be described solely by name; describe more complex techniques in the Methods section.
	A description of all covariates tested
	A description of any assumptions or corrections, such as tests of normality and adjustment for multiple comparisons
	A full description of the statistical parameters including central tendency (e.g. means) or other basic estimates (e.g. regression coefficient) AND variation (e.g. standard deviation) or associated estimates of uncertainty (e.g. confidence intervals)
	For null hypothesis testing, the test statistic (e.g. <i>F</i> , <i>t</i> , <i>r</i>) with confidence intervals, effect sizes, degrees of freedom and <i>P</i> value noted <i>Give P values as exact values whenever suitable.</i>
\boxtimes	For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings
X	For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes
	Estimates of effect sizes (e.g. Cohen's d , Pearson's r), indicating how they were calculated
	Our web collection on <u>statistics for biologists</u> contains articles on many of the points above.

Software and code

Policy information about availability of computer code

Data collection

Datasets from Facebook, Twitter, Gab and Voat were obtained from the previous literature. Reddit dataset was obtained through pushshift.io, therefore no software nor code were necessary. Telegram data was collected with the following tool available at:

The entire repository can be accessed at the following DOI: 10.17605/OSF.IO/FQ5DY

Data analysis

Data analysis were performed by running scripts with R 4.3.2, and Python 3.10.11, which are available in the paper repository.

For manuscripts utilizing custom algorithms or software that are central to the research but not yet described in published literature, software must be made available to editors and reviewers. We strongly encourage code deposition in a community repository (e.g. GitHub). See the Nature Portfolio guidelines for submitting code & software for further information.

Data

Policy information about availability of data

All manuscripts must include a <u>data availability statement</u>. This statement should provide the following information, where applicable:

- Accession codes, unique identifiers, or web links for publicly available datasets
- A description of any restrictions on data availability
- For clinical datasets or third party data, please ensure that the statement adheres to our <u>policy</u>

Facebook: we employed datasets from previous works collected using Facebook Graph API.

List of works:

Schmidt, A. L., Zollo, F., Scala, A., Betsch, C. & Quattrociocchi, W. Polarization of the vaccination debate on facebook. Vaccine 36, 3606–960 3612 (2018) Schmidt, A. L. et al. Anatomy of news consumption on facebook. Proceedings of the National Academy of Sciences 114, 3035–3039 (2017).

Del Vicario, M., Zollo, F., Caldarelli, G., Scala, A. & Quattrociocchi, W. 964 Mapping social dynamics on facebook: The brexit debate. Social Networks 965 50, 6–16 (2017).

Schmidt, A., Zollo, F., Scala, A. & Quattrociocchi, W. Polarization rank: A study on european news consumption on facebook (2018). Preprint at https://arxiv.org/abs/1805.08030

Gab: we collected data from Pushshift.io archive;

Reddt: we collected data from Pushshift.io archive;

Telegram: data were manually downloaded using Telegram Web service;

Twitter: we collected data using Twitter Academic API;

List of works:

Valensise, C. M. et al., Lack of evidence for correlation between covid-19 infodemic and vaccine acceptance infodemic and vaccine acceptance;

Falkenberg, M. et al. Growing polarization around climate change on social media. Nature Climate Change 1–8 (2022)

Quattrociocchi, A., Etta, G., Avalle, M., Cinelli, M. & Quattrociocchi, W. Reliability of news and toxicity in Twitter conversations. In Hopfgartner, F., Jaidka, K., Mayr, P., Jose, J. & Breitsohl, J. (eds.) Social Informatics, 245–256 (Springer International Publishing, Cham, 2022)

Usenet: we collected data by querying the Usenet Archive;

Voat: we employed a dataset presented in another paper;

List of work:

Mekacher, A. & Papasavva, A. "I can't keep it up" a dataset from the defunct voat.co news aggregator. Proceedings of the International AAAI, Conference on Web and Social Media, 16, 1302–1311 (2022)

YouTube: we employed a dataset from previous works collected using YouTube Data API and new data collected using YouTube Data API. List of work:

Falkenberg, M. et al. Growing polarization around climate change on social media. Nature Climate Change 1–8 (2022)

We collected data from R ver. 3.* and Python 3.*.

Research involving human participants, their data, or biological material

Policy information about studies with <u>human participants or human data</u>. See also policy information about <u>sex, gender (identity/presentation)</u>, and sexual orientation and <u>race</u>, ethnicity and racism.

Reporting on sex and gender

No information about sex and gender was collected.

Reporting on race, ethnicity, or other socially relevant groupings

Reporting on race, ethnicity, or No information about race, ethnicity or other socially relevant groupings was collected.

Population characteristics

No demographic information about the collected users were retained.

Recruitment

Our selection of platforms, time periods, and specific posts or individuals was driven by the goal of assembling the most representative dataset possible. This was to ensure a comprehensive understanding of online conversation dynamics. We focused on achieving broad heterogeneity in our data, capturing diverse voices and perspectives across various social media ecosystems. This approach was critical for analyzing the nuances of digital discourse, enabling us to explore a wide array of interactions and trends within online communities.

Ethics oversight

Our study involved the analysis of publicly available social media data, focusing on aggregate trends and anonymized interactions without targeting or identifying individual users. Given the public nature of the data and our adherence to ethical guidelines that protect individual privacy, our research did not require Institutional Review Board (IRB) oversight. We ensured compliance with all relevant social media platforms' terms of service and data use policies, and our methodology was designed to respect user privacy and data protection principles inherently.

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Field-specific reporting

	Please select the one below	w that is the best fit for your research	n. If you are not sure, read the appropriate sections before making your selectio
Life sciences Behavioural & social sciences Ecological, evolutionary & environmental sciences	Life sciences	Behavioural & social sciences	Ecological, evolutionary & environmental sciences

 $For a \ reference \ copy \ of \ the \ document \ with \ all \ sections, see \ \underline{nature.com/documents/nr-reporting-summary-flat.pdf}$

Behavioural & social sciences study design

All studies must disclose on these points even when the disclosure is negative.

Study description

We perform a quantitative study based on social media data analysis using a statistical approach. We also employed Deep Learning

Research sample

The research sample collected for the study includes several topics considered divisive and, therefore, with the potential to exhibit toxicity dynamics in a clearer way.

List of works that used our data:

Schmidt, A. L., Zollo, F., Scala, A., Betsch, C. & Quattrociocchi, W. Polarization of the vaccination debate on facebook. Vaccine 36, 3606–960 3612 (2018)

Schmidt, A. L. et al. Anatomy of news consumption on facebook. Proceedings of the National Academy of Sciences 114, 3035–3039 (2017).

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Mekacher, A. & Papasavva, A. "I can't keep it up" a dataset from the defunct voat.co news aggregator. Proceedings of the International AAAI,Conference on Web and Social Media,16, 1302–1311 (2022)

Sampling strategy

We used a keyword search for collecting data adherent to certain topics. Therefore, we employed all the data obtained from such a process

For two news datasets we collected data from profiles listed by the Europe Media Monitor and Newsguard.

Data collection

Facebook: we employed datasets from previous works collected using Facebook Graph API.

List of works:

Schmidt, A. L., Zollo, F., Scala, A., Betsch, C. & Quattrociocchi, W. Polarization of the vaccination debate on facebook. Vaccine 36, 3606–960 3612 (2018)

Schmidt, A. L. et al. Anatomy of news consumption on facebook. Proceedings of the National Academy of Sciences 114, 3035–3039 (2017).

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Timing

Facebook Brexit & 2015-12-31 - 2016-07-29 & 464764 & 4241 & 252156 & 0.06 \\

362718451 & 6898312 & 60235461 & 0.06 \\

Gab Feed & 2016-08-10 - 2018-10-29 & 14641433 & 3764443 & 166833 & 0.13 \\

Color Reddit Climate Change & 2018-01-01 - 2022-12-12 & 70648 & 5057 & 26521 & 0.07 \\

Reddit Conspiracy & 2018-01-01 - 2022-12-08 & 777393 & 35092 & 92678 & 0.07 \\

Reddit News & 2018-01-01 - 2018-12-31 & 389582 & 7798 & 109860 & 0.09 \\

Reddit Vaccines & 2018-01-01 - 2022-11-06 & 66457 & 4539 & 5192 & 0.04 \\

Telegram Conspiracy & 2019-08-30 - 2022-12-20 & 1416482 & 32592 & 150251 & 0.12 \\

Telegram News & 2018-04-09 -

	2022-12-20 & 724482 & 28288 & 16716 & 0.02 \\		
Data exclusions	No data were excluded.		
Non-participation	Due to the usage of extant data, no participants could drop out.		
Randomization	We performed permutation test of data.		
We require information from a	authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, evant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response. Methods		
Antibodies	ChIP-seq		
Eukaryotic cell lines			
Palaeontology and a Animals and other o Clinical data Dual use research o Plants	organisms		
Plants			
Seed stocks	No plants materials were used.		
Novel plant genotypes	No novel plant genotypes were used.		

Seed stocks or novel plant genotypes were used.

Authentication