

This is a repository copy of *Social media engagement in health and climate change:an exploratory analysis of Twitter*.

White Rose Research Online URL for this paper:

<https://eprints.whiterose.ac.uk/208470/>

Version: Accepted Version

Article:

Golder, Su orcid.org/0000-0002-8987-5211 and Graham, Hilary orcid.org/0000-0001-7949-6819 (2024) Social media engagement in health and climate change:an exploratory analysis of Twitter. *Environmental Research: Health*. ISSN 2752-5309

Reuse

Items deposited in White Rose Research Online are protected by copyright, with all rights reserved unless indicated otherwise. They may be downloaded and/or printed for private study, or other acts as permitted by national copyright laws. The publisher or other rights holders may allow further reproduction and re-use of the full text version. This is indicated by the licence information on the White Rose Research Online record for the item.

Takedown

If you consider content in White Rose Research Online to be in breach of UK law, please notify us by emailing eprints@whiterose.ac.uk including the URL of the record and the reason for the withdrawal request.

ACCEPTED MANUSCRIPT • OPEN ACCESS

Social media engagement in health and climate change: an exploratory analysis of Twitter

To cite this article before publication: Su Golder *et al* 2024 *Environ. Res.: Health* in press <https://doi.org/10.1088/2752-5309/ad22ea>

Manuscript version: Accepted Manuscript

Accepted Manuscript is “the version of the article accepted for publication including all changes made as a result of the peer review process, and which may also include the addition to the article by IOP Publishing of a header, an article ID, a cover sheet and/or an ‘Accepted Manuscript’ watermark, but excluding any other editing, typesetting or other changes made by IOP Publishing and/or its licensors”

This Accepted Manuscript is © 2024 The Author(s). Published by IOP Publishing Ltd.



As the Version of Record of this article is going to be / has been published on a gold open access basis under a CC BY 4.0 licence, this Accepted Manuscript is available for reuse under a CC BY 4.0 licence immediately.

Everyone is permitted to use all or part of the original content in this article, provided that they adhere to all the terms of the licence <https://creativecommons.org/licenses/by/4.0>

Although reasonable endeavours have been taken to obtain all necessary permissions from third parties to include their copyrighted content within this article, their full citation and copyright line may not be present in this Accepted Manuscript version. Before using any content from this article, please refer to the Version of Record on IOPscience once published for full citation and copyright details, as permissions may be required. All third party content is fully copyright protected and is not published on a gold open access basis under a CC BY licence, unless that is specifically stated in the figure caption in the Version of Record.

View the [article online](#) for updates and enhancements.

SOCIAL MEDIA ENGAGEMENT IN HEALTH AND CLIMATE CHANGE: AN EXPLORATORY ANALYSIS OF TWITTER

Authors

Su Golder, Department of Health Sciences, University of York, UK. Email: su.golder@york.ac.uk

Hilary Graham (corresponding author), Department of Health Sciences, University of York, UK. Email: hilary.graham@york.ac.uk

Abstract

Social media are increasingly used by the public to share information and opinions. This study explores social media engagement in health and climate change through an analysis of English-language posts on Twitter, one of the most widely-used platforms. We searched Twitter from 3rd April 2023 to 11th May 2023 for posts related to climate change using climate-related textwords and hashtags; we then used health keywords ('health', 'wellbeing', 'illness', 'illnesses', 'disease', 'death') to identify posts related to health. Focusing on posts from general public users, we investigated the proportion of climate change posts referring to health and, for a random sample of these tweets, undertook a content analysis to identify the ways in which climate change and health were represented. The content analysis drew on media research on 'framing', a selective process through which particular aspects of an issue – for example, its causes, impacts and solutions – are highlighted. 668,810 posts related to climate change were posted during the study period. Health-related text words were included in 2.3% (15,434) of these posts. The content analysis pointed to two divergent frames. The first frame represents climate change as real, with real effects on people's health. The second frame portrays climate change as a hoax, with hoax-generated health effects. While the 'reality' frame does not engage with the hoax frame, the latter provides an insistent counter-narrative that questions trust in mainstream science and government policy. Neither frame engages with people's experiences of health and climate change. In conclusion, our study points to low levels of engagement in health in a key forum for public discussions about climate change. It also asks whether the failure of the 'reality' frame to engage either with people's lived experiences or with hoax framings may be contributing to a polarised debate about climate change and health and hindering consensus-building.

Key words: climate policy, frames, Net Zero, public

Introduction

Focusing on the health dimensions of climate change is advocated as a way of engaging the public in climate change (1, 2), an engagement essential for an effective policy response (3) (4). A health framing of climate change is seen as particularly important in high-income countries whose carbon-intensive lifestyles

1
2
3 have driven climate change (5) but which have been relatively protected from its
4 environmental and economic impacts (6). G7 countries, including Canada, the UK
5 and the US (7-9), are committed to net zero greenhouse gas emissions by 2050;
6 drawing attention to the health benefits of such policies may help to support the case
7 for urgent action (1, 10, 11).
8
9

10 Our study explores engagement in health and climate change on social media, a
11 networked public sphere providing online modes of interaction. These platforms are
12 widely used (over 80% and 70%, respectively, of UK and US adults are active social
13 network users) (12) and are transforming the way the public engages with health
14 (13) and climate change (14). Together with established media outlets like
15 newspapers and television, social media has become an integral part of an
16 interconnected ecosystem through which the public can access information and
17 share opinions. It has therefore become an increasing focus of inquiry. Studies of
18 social media often draw on wider research on 'framing', a process through which
19 audiences are offered 'interpretive packages' (15) in which particular aspects of an
20 issue – for example, its causes, impacts and solutions – are highlighted ('put in the
21 frame') and alternative ways of understanding the issue are obscured.
22
23
24

25 Twitter (renamed X in July 2023) and Facebook are the most widely-used social
26 media source of news (16), with Twitter having a particular focus on climate change
27 and environmental issues (17). Users of the micro-blogging platform can post brief
28 messages ('tweets') of up to 280 characters and assign 'hashtags' (e.g., #climate
29 change) to indicate their subject matter. In 2023, Twitter had over 19 million UK and
30 240 million US users (18, 19). The social profile of UK and US Twitter users broadly
31 matches that of social media users overall, but Twitter has a larger share of male,
32 urban and higher-income users (20, 21).
33
34
35
36

37 While social media engagement in climate change has been widely researched (14,
38 17, 22-24), we located only one study (of Greek-language Twitter users) (25)
39 exploring engagement in health and climate change. Our study of Twitter addresses
40 this gap. Focusing on posts from general public users, we firstly investigate the
41 proportion of tweets on climate change that engage with health. Secondly for this
42 subset of tweets, we identify the frames in which health and climate change are set.
43 Our study was conducted after Elon Musk's acquisition of Twitter in October 2022
44 but before changes to the platform reduced access to the platform for users and
45 researchers and Twitter was renamed 'X' (26).
46
47
48
49

50 **Methods**

51 We searched Twitter from 21 March to 11 May 2023. We avoided the months
52 surrounding the annual meeting of the Conference of the Parties (COP) to the UN
53 Convention on Climate Change (UNFCCC), the major international climate change
54 event associated with heightened media and political engagement in climate change
55 (27, 28). We used climate-related textwords ('climate change', 'climatechange',
56 'global warming', 'globalwarming', 'net zero', 'netzero') and hashtags
57
58
59
60

1
2
3 (#climatechange, #globalwarming and #netzero). We avoided terms and hashtags
4 that retrieved polarised views (e.g., #climatehoax, #climatescam, #endoftheworld,
5 #climate catastrophe, #climate crisis). Searches were undertaken using Mozdeh
6 software (29). To focus on posts from general public users, we filtered out high-
7 volume users (≥ 500 posts a week; most users tweet a few times a day or less) (30),
8 retweets and duplicate tweets. Mozdeh software was used to identify the country of
9 those posting the tweets; this uses location information matched to country names
10 and major cities. Only a small proportion of Twitter users list their location
11 (approximately 26%) (31).

12
13
14
15 To identify the proportion of climate change tweets that engage with health (aim 1),
16 we used topic modelling (32) to develop search queries related to 'health' (keywords:
17 'health', 'wellbeing', 'illness', 'illnesses', 'disease', 'death') (10). We measured the
18 number of health-related posts as a proportion of all climate change tweets. Where
19 users opted into location tracking or added their location details to their posts, we
20 estimated the distribution of posts by users' country of residence. To identify the
21 frames in which health and climate change are set (aim 2), we undertook a content
22 analysis of a random sample of 200 health-related posts. The analysis was informed
23 by qualitative thematic analysis, an inductive method that involves coding each item
24 of data to identify 'patterns of meaning' within and across the dataset that cohere into
25 broader organising concepts (33). Codes were developed for a random sample of
26 100 tweets by one author (HG) to generate the initial coding schema; the schema
27 was then tested using a further sample of 100 tweets and reviewed by both authors.
28
29
30
31

32 Results

33
34 668,810 climate-change related posts were posted during the study period. The
35 search terms retrieving the highest number of posts were 'climate change' (62%),
36 'global warming' (15%) and 'net zero' (10%), followed by the hashtags for these
37 terms (supplementary information: Table S1). For the majority of posts, the user's
38 country of residence could not be identified. For the subset (24%; 163,303) where
39 this was possible, the largest group were from the US (42%; 68,097), followed by the
40 UK (22%; 36,564) and Canada (9%; 15,012).

41 (i) Engagement in health in tweets on climate change

42
43
44
45
46 Of the climate change posts, 2.3% (15,434) included one or more of health
47 keywords. 'Health' was the search term that retrieved the largest proportion of
48 health-related posts (60%), followed by 'death' (27%) and 'disease' (13%) (Table
49 S2).

50 (ii) Framings of health and climate change

51
52
53
54
55 The content analysis generated a set of reciprocal codes (climate is happening/not
56 happening; climate change is health-damaging/not health-damaging; action on
57 climate change is required/opposed) linked to two broader frames: climate change
58 and its health effects are real and are a hoax (Figure 1; see Table S3 for the coding
59 schema). A small proportion (12%; $n=24$) could not be placed in either of frame
60

1
2
3 (Table S4). Of the remainder, 77% (n=135) adopted a 'reality' frame and 23%
4 (n=41) a hoax frame.
5

6 Climate change and its health effects are real. Tweets generally adopted a neutral
7 and fact-based reporting style ('climate change is real, and...it is one of the most
8 serious health threats to humanity'; 'impacts of climate change on human health
9 include direct heat deaths...especially old, young and sick') (Figure 1). However,
10 some tweets used more emotive language ('climate change is here, it's catastrophic';
11 'we are facing a death sentence... we are all walking in our graves'). Tweets
12 referred to both the physical and mental health impacts of climate change; extreme
13 weather events (floods, heat/heatwave, drought) were included in 16% of tweets
14 (Figure 1 and Table S3).
15
16
17

18 Over 40% of tweets referred to actions to address climate change and its health
19 effects. Some were generic calls for action: 'we must act now', 'change our way of
20 life', 'let's invest in a cleaner, healthier future'. Other tweets included more specific
21 actions by individuals and communities ('replacing car trips with an ebike', 'taking the
22 government to court') and by governments. Examples of the latter include: 'planting
23 urban trees and adding green spaces is the best way to improve health of city
24 residents', 'governments must act now to prevent worse impacts on public health',
25 'the solution to global warming is to have very strict laws on pollution. By making it
26 virtually impossible to pollute, we automatically reduce CO₂ levels, improve human
27 health'.
28
29
30
31

32 Underpinning the 'reality' frame is an implicit trust in science and the potential for
33 individual action and climate policies to yield benefits for health. As Figure 1
34 indicates, tweets are anchored in evidence of climate change and its health effects
35 and encourage individual and societal actions to ameliorate these impacts. None of
36 this group of tweets engage with alternative framings of climate change and health.
37
38

39 Climate change and its health effects are a hoax. The second frame is constructed
40 in opposition to the more dominant 'reality' frame. Climate change is a hoax, and
41 any putative health effects of climate change are the result of a gullible public being
42 taken in (Figure 1 and Table S3). The focus of the tweets was on the mental health
43 impacts of what is described as 'the false narrative about climate change' ('the crisis
44 is the mental health of the impressionable who believe the nonsense of climate
45 change', 'it's just another way to traumatise the public. As if we don't have enough
46 mental illness with[out] the endless barrage of climate change hysteria'). Physical
47 health impacts were not discussed, and no tweets referred to extreme weather
48 events.
49
50
51

52 Tweets often adopted a polemical style, using combative language to ridicule the
53 'reality' frame ('those concerned about climate change were more likely to have
54 higher psychological distress, low wellbeing and rate their mental health as "poor or
55 fair". LOL, I can believe that. You're stressing these poor dopes to death with this
56 scam').
57
58

59 Underpinning the frame is an explicit distrust of science and government. Thus
60 'climate scientists are ...dumb and corrupt people. Now they are putting together

public health (oh, boy) and climate'. With respect to government, 'you leaders bring nothing but misery, poverty & death with your stupid Climate Change policies. It's a scam' that is 'forcing people to accept the pack of lies about climate change...mental health is on the rise. Our government (both sides) are corrupt and thinking only of themselves'. Where action is advocated, it is to put an end to the hoax ('the mental health issue with climate change is the hysteria that is encouraged by activists...the propaganda onslaught needs to be stopped', 'can we prosecute the scaremongers?').

Convergences between the two frames. Despite their contrasting perspectives on climate change and health and on trust in science and government, the frames share similarities. Firstly, both present a picture of society under threat. In the reality frame, 'we are facing a death sentence' with climate change 'causing costs to rise [and] diseases to spread'. In the hoax frame, 'they want you all scared to death of climate change!' and 'people are genuinely scared stiff'). Secondly, neither frame engages with people's lived experiences. Tweets representing climate change and its health effects as real, like those disputing this framing, do not articulate the views and experiences of individuals and communities whose health is being affected by the reality or the hoax of climate change. Neither provides a platform for communicating the perspective of members of the public on climate change and health. Instead, the tweets adopt the standpoint of a detached observer, with people represented in the form of 'disease' and 'death' (the first frame) and 'poor dopes', 'the impressionable' 'the masses' (the second frame).

Figure 1: examples of health-related posts

Frame 1: Climate change and its health effects are real

The negative effects of climate change on Kenya's economy and people are profound, with droughts and floods causing food shortages, water scarcity, and public health emergencies.

I predict people will do the same in 30 years time when the impacts of climate change are more likely to be a real threat to their wellbeing. "How could we possibly have known?!?!!" - well, I don't know... Maybe you could have listened to people that actually studied this stuff who warned you. Oh well!

The effects of global warming can already be seen in rising costs and the spread of diseases.

We are facing a death sentence. We are all going to die If we don't change our way of life.

Direct mortality from heat-related causes, such as heat stroke and cardiovascular disease, especially in the elderly, young, and ill, are clear effects of climate change on human health.

"#ClimateChange doesn't just cause brand new health problems, it also exacerbates pre-existing health issues. In reality, people who suffer from chronic illnesses are more vulnerable since extreme weather events can disrupt their treatment.

Climate change is real, it's catastrophic and a threat to our planet and all of its inhabitants (including humans). Urban tree planting and increasing green spaces are the most effective ways to improve the health of urban residents. Let's get to action!

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

More than two thousand women are suing the Swiss government on the grounds that its #ClimateChange policy infringes on their fundamental rights to life and health.

On Friday, experts urged governments to take immediate action to stop the negative effects of climate change on public health.

The solution to combating global warming is to have very strict pollution laws. We can automatically lower CO2 levels and so improve human health by making it virtually impossible to pollute, which is both harmful in the short-term and the long-term.

The number of car trips that people can replace with an ebike surprises most people. You can help to combat climate change (and improve your mental health and make your community safer) by reducing SOME of your car journeys, even if you don't replace all of your trips.

Without sufficient funding for research and action on air pollution, we run the risk of exacerbating #ClimateChange and putting future generations health and wellbeing at risk. Invest in a cleaner, safer future.

Frame 2: Climate change and its health effects are a hoax

Yet another attempt to traumatise the public. As if there isn't enough mental health problems to deal with with the endless barrage of global warming hysteria.

Flying under the green thing and climate change. Climate scientists are failed real scientists. They are stupid and corrupt. They are now combining public health (yikes!) and climate change.

The constant fearmongering about global warming is really taking a toll on our mental health, and it's got to stop.

Climate change is your supposed no 1 killer followed by suicide at no 2 because academics (and I use the word very loosely) have convinced gullible fools that the world hates them (oh boy).

"Global warming is bad for mental health" NO! Constant fear mongering is bad for our mental health and it needs to be stopped right now!

The crisis is in the mental state of impressionable people who believe in this climate scam. Some of them are scared stiff genuinely.

What we call "climate change" has had no impact on any kind of vector or disease type. Climate change is a scam and Bill Gates is a halfwit.

Forcing people to accept the pack of lies about climate change....Mental health issues are increasing, but why? Our government (both political parties) is corrupt and only cares about themselves. You need to wake up!

You leaders have brought nothing but misery, suffering, poverty and death with your foolish climate change energy poverty policies that are driving up Inflation and creating a cost of living crisis, making it too expensive to live! It's a total scam

They're lying to you. There is no emergency, no crisis #NetZero is unnecessary bollocks, dangerous to your health and wellbeing It's a scam.

Climate change isn't causing mental health issues – the doom mongers are. It is all to do with the crazy propaganda that's coming out of the activists. Maybe it's time to stop the scaremongering and get some therapy instead of more publicity.

A lot of young people don't think they'll make it to middle age because they think climate change will kill them first. It's no surprise they have mental health issues and think they're on death row. Can we take the scammers to court for child abuse?

Discussion

Social media platforms are an increasingly important arena in which the public accesses and circulates information and opinions. Like traditional media outlets, they provide the public with different ways of understanding complex issues like climate change. These different frames 'tell the audience different stories' about climate change (34). Our exploratory study examined the level and types of engagement in health and climate change on Twitter.

Only a small proportion of climate change posts engaged with health. Across a six-week period in 2023, 2.3% of tweets on climate change referred to health (health, disease, death, illness). A study of Greek-language tweets from 2013 to 2023 similarly found that the large majority of climate change tweets did not engage with health (25). The content analysis suggests that Twitter is a polarised space for engagement in health and climate change, dominated by two competing frames. In the first frame, climate change is real and is having real effects on people's health, with action at all levels of society offering the potential to limit climate change and secure benefits for people's health. The frame is anchored in a trust of science and government, institutions on which effective action depends. In the second frame, climate change is a hoax, and any health effects are hoax-generated. Where action is advocated, it is to end the hoax and to silence its perpetrators. The hoax frame draws on a wider populist ideology in which 'the people' are pitted against 'the elite' (35), with various corrupt and powerful groups (governments, scientists, corporate bosses) selling false narratives about climate change which vulnerable people are believing. While the first frame does not engage with the second frame, the hoax frame is built around a rejection of the 'reality' frame: its counter-narrative seeks to disrupt trust in mainstream science and government and undermine the case for climate action. As this suggests, social media engagement in health and climate change is a site in which alternative framings of climate change are played out, with these alternative framings supported by a wider polarisation of climate change discourses on social media (34, 36-39).

In the random sample of tweets in our study, none included personal experiences of climate change. This stands in contrast to the public's wider use of Twitter, which has been found to provide a safe and anonymous space for sharing health experiences and connecting with others with similar experiences (40, 41).

Some limitations of our study should be noted. Firstly, it is possible that the search terms resulted in a sample of Tweets in which sceptical voices were over-represented. We excluded terms like '#climatehoax' and '#climatescam' (along with terms that accorded with the first frame like '#climate catastrophe' and '#climate crisis'). However, to capture engagement with health in the context of climate policy, we included 'Net Zero' terms. Net Zero is an increasingly politicised term, signifying both support for governments' climate policy (7-9) and a rejection of these policies (42). Rerunning the analysis without the Net Zero terms left the proportion of health-related tweets unchanged.

1
2
3 Secondly, the dataset is of Twitter posts, not Twitter users. The findings are
4 therefore not comparable to those from surveys of the public. However, qualitative
5 studies in the US, UK and Canada, the countries of residence for most users for
6 whom locational data were available, point to relatively low levels of public
7 engagement in the health dimensions of climate change (43-46). Wider evidence
8 suggests that a key factor is the public's lack of knowledge of the type and severity
9 of climate change's impact on people's health (47) and points to the potential for
10 testing and refining public health messaging around climate change, including
11 targeted messages for those unconcerned and sceptical about climate change (48)
12 (49).
13
14
15

16 Thirdly, we did not include visual images, an important part of climate change and
17 health communication, particularly on social media (50, 51). However, studies of
18 visual imagery in climate change and health-related tweets suggest that visual and
19 textual content are highly correlated (52, 53). Finally, the timing of the study may
20 have resulted in a higher proportion of sceptical content. The acquisition of Twitter
21 by Elon Musk in October 2022 and the consequent changes in content moderation
22 have been associated with an increase in right-wing content and an associated shift
23 from a reported left-leaning bias (54). A content analysis conducted prior to October
24 2022 may have found a smaller proportion of 'hoax' frames; however, changes to
25 research access to Twitter meant a comparison with earlier content could not be
26 undertaken. Nonetheless, as noted above, Twitter has long been a site of
27 'contestation over climate change' (17), particularly between scientific and hoax
28 discourses (34, 37). In addition, it has been argued that, while Twitter is an arena in
29 which opposing viewpoints are represented and amplified, it is not their source. The
30 origins lie instead in a broader erosion of public trust in government and science (39,
31 55).
32
33
34
35
36
37
38

39 **Conclusion**

40 Linking climate change to people's health is seen as a way of increasing public
41 awareness of climate change and building support for climate action. As advocates
42 of this approach have argued, health is 'the way we primarily and most intimately' (2)
43 experience climate change. Social media are an integral part of the contemporary
44 media landscape and a forum in which the public can access information and share
45 opinions. Our study explored engagement in climate change and health on Twitter.
46
47

48 Two conclusions for policy can be drawn from our study. Firstly, there is relatively
49 little engagement with health and climate change on social media: despite being
50 seen as way of making climate change personal, only a small proportion of climate
51 change tweets referred to health. Limited engagement in health may be linked to the
52 'threat narrative' adopted by the dominant frames: both portray a vision of societies
53 in crisis in which people's health is at risk from forces beyond their control. Shifting
54 from these negative narratives to more positive scenarios may be more effective in
55 building public engagement and policy support (56).
56
57
58
59
60

1
2
3 Secondly, our study raises questions about the science-based frame that represents
4 climate change and its health effects as real. While most tweets adopt this frame,
5 none engage with alternative frames: the tweets simply convey information and
6 recommend actions. In contrast, the hoax frame is actively constructed in opposition
7 to the reality frame, depicting it as 'fake' 'propaganda' and 'scaremongering'. The
8 240-character limit means that a tweet can only tell part of the story. Nonetheless,
9 the failure to discuss hoax framings may be inadvertently reproducing a polarised
10 debate about climate change and health and hindering consensus-building (57). The
11 'reality' frame, like the hoax frame, also fails to engage with lived experiences of
12 climate change and health. Personal accounts are conspicuous by their absence.
13 Yet broader evidence suggests that direct experience of climate change events, for
14 example flooding, is linked to greater concern about climate change and perceived
15 vulnerability to its health effects (58-60). 'Reality' frames that drew on people's
16 experiences, including accounts of the physical and mental health impacts of
17 climate-related exposures, may help to increase engagement with the health
18 dimensions of climate change.
19
20
21
22

23 Although exploratory, the study provides insights into engagement in health and
24 climate change on social media, an increasingly important forum for public
25 interaction and opinion-sharing. It found a low level of engagement and the
26 dominance of two divergent representations of climate change and health. By noting
27 the absence of people's experiences of climate change and health, the study points
28 to ways in which social media could be more effectively used as a vehicle for
29 increasing public awareness of what is widely recognised to be the major public
30 health challenge of the 21st century.
31
32
33

34 Ethics statement

35 The University of York Health Sciences Research Governance Committee was consulted
36 and recommended (29 August 2023) that the study did not require ethical approval as the
37 Twitter data used were already in the public domain and were to be used in aggregate with
38 no identifiable data.
39
40

41 Data Availability Statement

42 The data that support the findings of this study are publicly available on Twitter. Copies of
43 the tweets cannot be provided as this would breach Twitter Terms of Service and would
44 prevent anonymity of the people posting in our sample. Twitter IDs are available on request
45 from the authors for those wishing to hydrate them; however, this cannot be applied to those
46 without a paid subscription to Twitter or to those Tweets deleted or made private since the
47 time of this study. All example Tweets provided in the manuscript are paraphrased or they
48 were phrases used in multiple tweets, thus protecting the anonymity of the person tweeting.
49
50

51 Acknowledgments

52 We thank the reviewers for their helpful feedback on our paper.
53
54

55 Funding

56 This research was funded by NIHR Public Health-Policy Research Programme, grant
57 number PR_PRU_1217_20901. The study is independent research carried out by the Public
58 Health Policy Unit (PH-PRU), commissioned and funded by the National Institute for Health
59 & Care Research (NIHR) Policy Research Programme. The views expressed in the report
60

are those of the authors and not necessarily those of the NHS, the National Institute for Health & Care Research, the Department of Health and Social Care or its arm's length bodies, and other Government Departments.

References

1. World Health Organization. COP26 Special Report On Climate Change And Health: The health argument for climate action. 2021.
2. Samarasekera U, Vanessa K. Driving action on climate change and health. *The Lancet*. 2023;402(10401):519.
3. Skidmore C. Review of Net Zero. Department for Energy Security and Net Zero and Department for Business, Energy & Industrial Strategy; 2022.
4. IPCC, 2023: Summary for Policymakers. In: *Climate Change 2023: Synthesis Report. Contribution of Working Groups I, II and III to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change* [Core Writing Team, H.Lee and J. Romero (eds.)] IPCC, Geneva, Switzerland, pp.1-34, doi: 10.59327/IPCC/AR6-9789291691647.001.
5. Matthews HD, Graham TL, Keeverian S, Lamontagne C, Seto D, Smith TJ. National contributions to observed global warming. *Environmental Research Letters*. 2014;9(1):014010.
6. Pörtner H-O, Roberts D, Tignor M, Poloczanska E, Mintenbeck K. *Climate Change 2022: Working Group II Contribution to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change Impacts, Adaptation and Vulnerability 2022*.
7. United States Department of State and the United States Executive Office of the President. *The Long-Term Strategy of the United States: Pathways to Net-Zero Greenhouse Gas Emissions by 2050*. Washington DC. 2021.
8. Government of Canada. *2030 Emissions Reduction Plan : Canada's Next Steps To Clean Air And A Strong Economy*. Canada: Environment and Climate Change Canada; 2022.
9. HM Government. *Net Zero Strategy: Build Back Greener*. London UK: HM Government 2021.
10. Watts N, Amann M, Ayeb-Karlsson S, Belesova K, Bouley T, Boykoff M, et al. The Lancet Countdown on Health and Climate Change: from 25 years of inaction to a global transformation for public health. *The Lancet*. 2018;391(10120):581-630.
11. Maibach EW, Sarfaty M, Mitchell M, Gould R. Limiting global warming to 1.5 to 2.0°C—A unique and necessary role for health professionals. *PLOS Medicine*. 2019;16(5):e1002804.
12. Statista. *Active social network penetration in selected countries and territories as of January 2023* Statista: We Are Social; DataReportal; Meltwater; 2023 [Available from: <https://www.statista.com/statistics/282846/regular-social-networking-usage-penetration-worldwide-by-country/>].
13. Chen J, Wang Y. Social media use for health purposes: Systematic Review. *J Med Internet Res*. 2021;23(5):e17917.
14. Newman TP. Tracking the release of IPCC AR5 on Twitter: Users, comments, and sources following the release of the Working Group I Summary for Policymakers. *Public Underst Sci*. 2017;26(7):815-25.
15. Entman R. *Projections of power: Framing news, public opinion, and US foreign policy*. Bibliovault OAI Repository, the University of Chicago Press. 2004.
16. Newman N, Robertson C, Eddy K, Nielsen R, Fletcher R. *Digital News Report 2022*. Reuters Institute University of Oxford 2022.
17. Fownes JR, Yu C, Margolin DB. Twitter and climate change. *Sociology Compass*. 2018;12(6):e12587.
18. Strugar M. *Cybercrew.uk30.03.2023*. Available from: <https://cybercrew.uk/blog/twitter-statistics-uk/>.
19. Dean B. *Social Network Usage & Growth Statistics: How Many People Use Social Media in 2023?* backlinko.com2023 [Available from: <https://backlinko.com/social-media-users>].
20. Statista. *Social media: Twitter users in the United Kingdom*. 2023.
21. Pew Research Center. *Social Media Use in 2021*. Pew Research Center. 2021.
22. Dellmuth L, Shyrokykh K. Climate change on Twitter: Implications for climate governance research. *Wiley Interdisciplinary Reviews: Climate Change*. 2023.

- 1
2
3 23. Pearce W, Holmberg K, Hellsten I, Nerlich B. Climate Change on Twitter: Topics,
4 Communities and Conversations about the 2013 IPCC Working Group 1 Report. *PLoS one*.
5 2014;9:e94785.
- 6 24. Pearce W, Niederer S, Ozkula S, Sanchez-Querubin N. The social media life of climate
7 change: Platforms, publics, and future imaginaries. *Wiley Interdisciplinary Reviews: Climate Change*.
8 2018;10.
- 9 25. Tyrologou V-A, Merkouriadi G, Karefyllaki I, Marini N, Markou C, Kesanopoulos K, Barbouni
10 A. Can Greek Twitter provide insight into the users' opinions on the adverse effects on health caused
11 by climate change? *Environmental Science Proceedings*, 2023. 26 [1], 154. 2023.
- 12 26. Coffey L. More Academics Take Flight From Twitter as Restrictions, Alternatives Grow
13 insidehighered.com2023 [Available from: [https://www.insidehighered.com/news/tech-](https://www.insidehighered.com/news/tech-innovation/2023/07/06/academics-take-flight-twitter-restrictions-alternatives-grow)
14 [innovation/2023/07/06/academics-take-flight-twitter-restrictions-alternatives-grow](https://www.insidehighered.com/news/tech-innovation/2023/07/06/academics-take-flight-twitter-restrictions-alternatives-grow).
- 15 27. Gurwitt S, Malkki K, Mitra M. Global issue, developed country bias: the Paris climate
16 conference as covered by daily print news organizations in 13 nations. *Climatic Change*. 2017;143.
- 17 28. Schäfer M, Ivanova A, Schmidt A. What drives media attention for climate change? Explaining
18 issue attention in Australian, German and Indian print media from 1996 to 2010. *International*
19 *Communication Gazette*. 2014;76:152-76.
- 20 29. mozdeh. [content analysis]. Available from: <http://mozdeh.wlv.ac.uk>.
- 21 30. Zarrella D *Is 22 tweets-per-day the optimum?* [Internet]. *hubspot.com* 2022. Available from:
22 <https://blog.hubspot.com/blog/tabid/6307/bid/4594/is-22-tweets-per-day-the-optimum.aspx>.
- 23 31. Cheng Z, Caverlee J, Lee K. You are where you Tweet: A content-based approach to geo-
24 locating Twitter users2010. 759-68 p.
- 25 32. Mimno D. [Topic modelling]. Available from:
26 <https://mimno.infosci.cornell.edu/jsLDA/jslda.html>.
- 27 33. Braun V, Clarke V. One size fits all? What counts as quality practice in (reflexive) thematic
28 analysis? *Qualitative Research in Psychology*. 2021;18(3):328-52.
- 29 34. Shi W, Fu H, Wang P, Chen C, Xiong J. #Climatechange vs. #Globalwarming: Characterizing
30 two competing climate discourses on Twitter with semantic network and temporal analyses.
31 *International Journal of Environmental Research and Public Health* [Internet]. 2020; 17(3).
- 32 35. Mudde C. The Populist Zeitgeist. *Government and Opposition*. 2004;39(4):541-63.
- 33 36. Falkenberg M, Galeazzi A, Torricelli M, Di Marco N, Larosa F, Sas M, et al. Growing
34 polarization around climate change on social media. *Nature Climate Change*. 2022;12:1-8.
- 35 37. Brüggemann M, Elgesem D, Bienzeisler N, Dedecek Gertz H, Walter S. Mutual group
36 polarization in the blogosphere: Tracking the hoax discourse on climate change. *International Journal*
37 *of Communication*. 2020;14:1025-48.
- 38 38. Moernaut R, Mast J, Temmerman M, Broersma M. Hot weather, hot topic. Polarization and
39 sceptical framing in the climate debate on Twitter. *Information, Communication & Society*.
40 2022;25(8):1047-66.
- 41 39. Lejano RP, Nero SJ. *The Power of Narrative: Climate Skepticism and the Deconstruction of*
42 *Science*: Oxford University Press; 2020 22 Oct 2020.
- 43 40. Golder S, Klein AZ, Magge A, O'Connor K, Cai H, Weissenbacher D, Gonzalez-Hernandez G.
44 A chronological and geographical analysis of personal reports of COVID-19 on Twitter from the UK.
45 *Digital Health*. 2022;8:20552076221097508.
- 46 41. Gajjar A, Jain A, Le A, Salem M, Hasan S, Jankowitz B, Burkhardt J-K. E-037 What stroke
47 patients post online about: An Instagram and Twitter Analysis 2022. *Journal of NeuroInterventional*
48 *Surgery* 2022; 14: A94.2-A95 p.
- 49 42. Atkins E. 'Bigger than Brexit': Exploring right-wing populism and Net-Zero policies in the
50 United Kingdom. *Energy Research & Social Science*. 2022;90:102681.
- 51 43. Hathaway J, Maibach E. Health implications of climate change: a review of the literature
52 about the perception of the public and health professionals. *Current Environmental Health Reports*.
53 2018;5.
- 54 44. Abrahamson V, Wolf J, Lorenzoni I, Fenn B, Kovats S, Wilkinson P, et al. Perceptions of
55 heatwave risks to health: Interview-based study of older people in London and Norwich, UK. *Journal*
56 *of public health (Oxford, England)*. 2009;31:119-26.
- 57 45. Cameron L, Rocque R, Penner K, Mauro I. Public perceptions of Lyme disease and climate
58 change in southern Manitoba, Canada: Making a case for strategic decoupling of climate and health
59 messages2020.
- 60

- 1
2
3 46. Martin-Kerry JM, Graham HM, Lampard P. 'I don't really associate climate change with actual
4 people's health': a qualitative study in England of perceptions of climate change and its impacts on
5 health. *Public Health*. 2023;219:85-90.
- 6 47. Kim S, Pei D, Kotcher J, Myers T. Predicting Responses to Climate Change Health Impact
7 Messages From Political Ideology and Health Status: Cognitive Appraisals and Emotional Reactions
8 as Mediators. *Environment and Behavior*. 2020;53:001391652094260.
- 9 48. Myers T, Nisbet M, Maibach E, Leiserowitz A. A public health frame arouses hopeful
10 emotions about climate change: A Letter. *Climatic Change*. 2012;113.
- 11 49. Kotcher JE, Feldman LA, Luong KT, Wyatt J, Maibach EW. Advocacy messages about
12 climate and health are more effective when they include information about risks, solutions, and a
13 normative appeal: Evidence from a conjoint experiment. *The Journal of Climate Change and Health*.
14 2021.
- 15 50. Mooseder A, Brantner C, Zamith R, Pfeffer J. (Social) media logics and visualizing climate
16 change: 10 Years of #climatechange Images on Twitter. *Social Media + Society*.
17 2023;9(1):20563051231164310.
- 18 51. Sleight J, Amann J, Schneider M, Vayena E. Qualitative analysis of visual risk communication
19 on twitter during the Covid-19 pandemic. *BMC Public Health*. 2021;21(1):810.
- 20 52. Hopke J, Hestres L. Visualizing the Paris climate talks on Twitter: Media and climate
21 stakeholder visual social media during COP21. *Social Media + Society*. 2018;4:205630511878268.
- 22 53. Chen T, Dredze M. Vaccine images on Twitter: Analysis of what images are shared. *Journal*
23 *of Medical Internet Research*. 2018;20:e130.
- 24 54. Barrie C. Did the Musk takeover boost contentious actors on Twitter? *Harvard Kennedy*
25 *School Misinformation Review*. 2023.
- 26 55. World Economic Forum. *Global Risks Report 2023*.
- 27 56. Dasandi N, Graham H, Hudson D, Jankin S, vanHeerde-Hudson J, Watts N. Positive, global,
28 and health or environment framing bolsters public support for climate policies. *Communications Earth*
29 *& Environment*. 2022;3(1):239.
- 30 57. Hmielowski J, Feldman L, Myers T, Leiserowitz A, Maibach E. An attack on science? Media
31 use, trust in scientists, and perceptions of global warming. *Science CUT (Bristol, England)*.2014
32 23(7):866-83.
- 33 58. Ogunbode C, Doran R, Böhm G. Individual and local flooding experiences are differentially
34 associated with subjective attribution and climate change concern. *Climatic Change*. 2020;162.
- 35 59. Lujala P, Lein H, Rød JK. Climate change, natural hazards, and risk perception: The role of
36 proximity and personal experience. *Local Environment*. 2014;20:1-21.
- 37 60. Graham H, Harrison A, Lampard P. Public Perceptions of climate change and its health
38 impacts: Taking account of people's exposure to floods and air pollution. *International Journal of*
39 *Environmental Research and Public Health*. 2022;19(4):2246.
- 40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60