Panel stacking is a threat to consensus statement validity

Kasper P. Kepp, Preben Aavitsland, Marcel Ballin, Francois Balloux, Stefan Baral, Kevin Bardosh, Howard Bauchner, Eran Bendavid, Raj Bhopal, Daniel T. Blumstein, Paolo Boffetta, Florence Bourgeois, Adam Brufsky, Peter J. Collignon, Sally Cripps, Ioana A. Cristea, Nigel Curtis, Benjamin Djulbegovic, Oliver Faude, Maria Elena Flacco, Gordon H. Guyatt, George Hajishengallis, Lars G. Hemkens, Tammy Hoffmann, Ari R. Joffe, Terry P. Klassen, Despina Koletsi, Dimitrios P. Kontoyiannis, Ellen Kuhl, Carlo La Vecchia, Tea Lallukka, John Lambris, Michael Levitt, Spyros Makridakis, Helena C. Maltezou, Lamberto Manzoli, Ana Marusic, Clio Mavragani, David Moher, Ben W. Mol, Taulant Muka, Florian Naudet, Paul W. Noble, Anna Nordström, Peter Nordström, Nikolaos Pandis, Stefania Papatheodorou, Chirag J. Patel, Irene Petersen, Stefan Pilz, Nikolaus Plesnila, Anne-Louise Ponsonby, Manuel A. Rivas, Andrea Saltelli, Manuel Schabus, Michaéla C. Schippers, Holger Schünemann, Marco Solmi, Andreas Stang, Hendrik Streeck, Joachim P. Sturmberg, Lehana Thabane, Brett D. Thombs, Athanasios Tsakris, Simon N. Wood, John P.A. Ioannidis



PII: \$0895-4356(24)00183-5

DOI: https://doi.org/10.1016/j.jclinepi.2024.111428

Reference: JCE 111428

To appear in: Journal of Clinical Epidemiology

Received Date: 25 April 2024 Revised Date: 9 June 2024 Accepted Date: 10 June 2024

Please cite this article as: Kepp KP, Aavitsland P, Ballin M, Balloux F, Baral S, Bardosh K, Bauchner H, Bendavid E, Bhopal R, Blumstein DT, Boffetta P, Bourgeois F, Brufsky A, Collignon PJ, Cripps S, Cristea IA, Curtis N, Djulbegovic B, Faude O, Flacco ME, Guyatt GH, Hajishengallis G, Hemkens LG, Hoffmann T, Joffe AR, Klassen TP, Koletsi D, Kontoyiannis DP, Kuhl E, La Vecchia C, Lallukka T, Lambris J, Levitt M, Makridakis S, Maltezou HC, Manzoli L, Marusic A, Mavragani C, Moher D, Mol BW, Muka T, Naudet F, Noble PW, Nordström A, Nordström P, Pandis N, Papatheodorou S, Patel CJ, Petersen I, Pilz S, Plesnila N, Ponsonby A-L, Rivas MA, Saltelli A, Schabus M, Schippers MC, Schünemann H, Solmi M, Stang A, Streeck H, Sturmberg JP, Thabane L, Thombs BD, Tsakris A,

Wood SN, Ioannidis JPA, Panel stacking is a threat to consensus statement validity, *Journal of Clinical Epidemiology* (2024), doi: https://doi.org/10.1016/j.jclinepi.2024.111428.

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154	Contributors and sources
155	The idea and first draft of the analysis paper was developed by KPK and JPAI. All authors
156	are top-2% cited scientists in 2022 according to the Elsevier-Stanford metric, published on
157	COVID-19, and contributed to writing the paper over multiple iterations and revisions. The

corresponding author attests that all listed authors meet authorship criteria and that no others meeting the criteria have been omitted. JPAI is guarantor.

Patient involvement

No patients were involved in making this paper.

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All used data are in the paper.

- 167 Conflicts of Interest
- We have the following interests to declare:
- 169 Kasper P. Kepp declares no conflicts of interest.
- 170 Preben Aavitsland has as part of his work at the Norwegian Institute of Public Health (a
- 171 governmental agency) provided advice to the Governments of Norway and Denmark on
- handling the COVID-19 pandemic. He was a member of the WHO Review Committee on
- the Functioning of the International Health Regulations (2005) during the COVID-19
- 174 Response, and he chaired the WHO Review Committee regarding Standing
- 175 Recommendations for COVID.
- 176 Marcel Ballin declares no conflicts of interest.
- 177 Francois Balloux is the leader of two work packages of the END-VOC project funded by the
- 178 European Union's Horizon Europe programme under the grant agreement No. 101046314.
- 179 He has published multiple academic and public outreach articles on COVID-19. He has
- 180 given unpaid scientific advice on pandemic mitigation and vaccination policy to the
- 181 Governments of Austria, France and the UK.
- 182 Stefan Baral has published on COVID-19, did COVID-19 related clinical work, and was a co-
- author on a Royal Society report on homelessness during COVID-19 which included
- systematic reviews which were later published (https://rsc-src.ca/en/themes/homelessness)
- 185 Kevin Bardosh is Director of Collateral Global, a UK-based research and education charity
- that is focused on understanding the impact of COVID policies around the world.
- 187 Howard Bauchner declares no conflicts of interest.
- 188 Eran Bendavid has written Covid-19 research and opinion pieces (e.g.
- https://www.wsj.com/articles/is-the-coronavirus-as-deadly-as-they-say-11585088464) on
- 190 Covid-19, some questioning consensus on disease control interventions.
- 191 Raj Bhopal has served on COVID-19 related committees of government and NGOs,
- including the Expert Reference Group on COVID-19 and Ethnicity, the Scottish Government,
- 193 2020-2022, and was a signature on several letters, including one to the prime minister (29/5
- 194 2020): "Dominic Cumming's actions damage public trust"
- 195 (https://www.theguardian.com/commentisfree/2020/may/30/dominic-cummings-actions-
- 196 damage-public-health).
- 197 Daniel T. Blumstein is a member of the board of the International Panel on Behavior
- 198 Change, an international group that seeks to integrate behavioral knowledge to improve
- 199 global sustainability.
- 200 Paolo Boffetta is a co-PI of a grant on COVID-19 epidemic awarded by the European
- 201 Commission to the University of Bologna.
- 202 Florence Bourgeois declares no conflicts of interest.
- 203 Adam Brufsky receives consulting fees from Astrazeneca, Pfizer, Novartis, Lilly,
- 204 Genentech/Roche, SeaGen, Daiichi Sankyo, Merck, Agendia, Sanofi, Puma, Myriad, and
- 205 Gilead (unrelated to the current work).
- 206 Peter J. Collignon was member of Infection control expert group (ICEG) that provided advice
- on Infection control and prevention issues to Australian Government bodies, Federal Health
- department and Chief Health Officers during the Covid-19 pandemic from 2020 to 2022,
- 209 expert witness for the Australian Government in dispute with Western Australia on closure of
- 210 State borders, member of the review team assessing hotel quarantine procedures by states
- and territories for the Australian government, and member of the team advising the Federal
- 212 health department in 2022 on the future potential use and volumes of anti-viral and vaccines
- 213 use for Covid-19.
- 214 Sally Cripps declares no conflicts of interest.

- 215 Ioana A. Cristea declares no conflicts of interest.
- 216 Nigel Curtis declares no conflicts of interest.
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- 220 Gordon H. Guyatt declares no conflicts of interest.
- 221 George Hajishengallis declares no conflicts of interest.
- Lars G. Hemkens received funding for the Covid-evidence project (www.covid-evidence.org)
- by the Swiss National Science Foundation (project 31CA30_196190), unrelated to this work,
- and travel support from the WHO, unrelated to this work. LGH's institution (RC2NB) was
- 225 contracted by WHO for the development of study protocol templates to evaluate Public
- Health and Social Measures, unrelated to this work. LGH's institution (RC2NB) is supported
- by Foundation Clinical Neuroimmunology and Neuroscience Basel, unrelated to this work.
- 228 RC2NB has a contract with Roche for a steering committee participation of LGH, unrelated
- 229 to this work. These funders had no role in the conceptualisation, design, data collection,
- analysis, decision to publish, or preparation of the manuscript. He is also a member of the
- 231 Network for Evidence-based Medicine (Ebm-Netzwerk).
- 232 Tammy Hoffmann declares no conflicts of interest.
- 233 Ari R. Joffe served as an unpaid advisor to the Public Health Emergencies Governance
- 234 Review Panel in the province of Alberta, Canada, whose "report reviews legislation that
- 235 guided Alberta's response to COVID-19 and recommends changes to improve the handling
- of future public health emergencies for Albertans" (the final report was published November
- 237 2023). He signed the Great Barrington Declaration.
- 238 Terry P. Klassen declares no conflicts of interest.
- 239 Despina Koletsi declares no conflicts of interest.
- 240 Dimitrios P. Kontoviannis declares no conflicts of interest.
- 241 Ellen Kuhl declares no conflicts of interest.
- 242 Carlo La Vecchia was a member of the Vaxzevria advisory board.
- Tea Lallukka has provided an invited report for the Committee for the Future (an established,
- standing committee in the Parliament of Finland) in late 2022, where she was asked to
- 245 describe the future of public health. Her report covered e.g. inequalities in health, population
- aging, oral health, and mental health.
- 247 John Lambris declares no conflicts of interest.
- 248 Michael Levitt has signed the Great Barrington Declaration.
- 249 Spyros Makridakis declares no conflicts of interest.
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- 251 Lamberto Manzoli declares no conflicts of interest.
- 252 Ana Marusic declares no conflicts of interest.
- 253 Clio Mavragani declares no conflicts of interest.
- 254 David Moher declares that he is on the editorial board of *Journal of Clinical Epidemiology*.
- 255 Ben Mol is supported by a NHMRC Investigator grant (GNT1176437), and he reports
- consultancy, travel support and research funding from Merck and consultancy for Organon
- and Norgine, and holding stock from ObsEva.

- 258 Taulant Muka is co-founder and CEO at Epistudia GmbH and acts as advisor for the
- 259 Academic Parity Movement, a non-profit organisation uprooting academic bullying,
- 260 discrimination, and violence.
- 261 Florian Naudet received funding from the French National Research Agency (ANR-17-CE36-
- 262 0010), the French ministry of health and the French ministry of research. He is a work
- package leader in the OSIRIS project (Open Science to Increase Reproducibility in Science).
- The OSIRIS project has received funding from the European Union's Horizon Europe
- research and innovation programme under the grant agreement No. 101094725. He is a
- 266 work package leader for the doctoral network MSCA-DN SHARE-CTD (HORIZON-MSCA-
- 267 2022-DN-01 101120360), funded by the EU, unpaid member of the French Society of clinical
- 268 pharmacology and therapeutics, and unpaid member of the European society of clinical
- 269 pharmacology and therapeutics.
- 270 Paul W. Noble declares no conflicts of interest.
- 271 Anna Nordström declares no conflicts of interest.
- 272 Peter Nordström declares no conflicts of interest.
- 273 Nikolaos Pandis declares no conflicts of interest.
- 274 Stefania Papatheodorou declares no conflicts of interest.
- 275 Chirag J. Patel declares no conflicts of interest.
- 276 Irene Petersen declares no conflicts of interest.
- 277 Stefan Pilz has signed the Great Barrington Declaration.
- 278 Nikolaus Plesnila declares no conflicts of interest.
- 279 Anne Louise Ponsonby owns stock in Dysrupt Labs, a subsidiary of Slowvoice Pty Ltd.
- 280 Dysrupt Labs supplied the Almanis prediction market database for an article recently
- published in eBioMedicine in which Professor Ponsonby was the corresponding author.
- 282 entitled "Machine learning augmentation reduces prediction error in collective forecasting:
- 283 development and validation across prediction markets with application to COVID events".
- 284 Manuel A. Rivas is a Co-Founder of Broadwing Bio and consults for insitro, Mubadala
- 285 Ventures, and Curie.Bio.
- 286 Andrea Saltelli declares no conflicts of interest.
- 287 Manuel Schabus declares no conflicts of interest.
- 288 Michaéla Schippers is founder of Ikigaitv.nl: positive psychology interventions for the general
- public, to enhance mental wellbeing and co-founder of Great Citizens Movement
- 290 (greatcitizensmovement.org). She has signed the Great Barrington Declaration. She also
- 291 served as expert witness of extra-parliamentary inquiry regarding the COVID-19 crisis
- 292 handling in the Netherlands (2020); she owns the podcast followthescience.nl and does
- 293 contract research on improving study success: https://www.erim.eur.nl/erasmus-centre-for-
- 294 study-and-career-success/.
- 295 Holger Schünemann is the lead of the steering committee for the International Guideline
- 296 Training and Certification Program INGUIDE which is a ISO-certified program focusing on
- 297 bringing professionalism to the development of health recommendations by educating and
- 298 certifying those participating in the development of health recommendations; the program
- charges course fees, and time spent on teaching in INGUIDE may lead to reimbursement to
- 300 HS in the future (until now no payments have been made). He is also co-chair of the GRADE
- Working Group and chair of the board of trustees of the Guidelines International Network,
- 302 both are having transparency and trustworthy guideline development methods as a core
- 303 value. He is PI on a research contract from the Public Health Agency of Canada that focuses
- on developing and implementing post-covid-19 condition guidelines. He has been a PI on

- 305 several grants focusing on guideline methods and knowledge mobilisation related to COVID-
- 306 19 guidelines. He has worked with numerous global and other organisations on methods and
- 307 development of guidelines.
- 308 Marco Solmi has received honoraria/has been a consultant for AbbVie, Angelini, Lundbeck,
- 309 Otsuka, unrelated to this work.
- 310 Andreas Stang received COVID-19 research grants from the German Science Foundation
- 311 (DFC) without any conflict of interest. The granting agency DFG is not affected at all by this
- 312 manuscript.
- 313 Hendrik Streeck has been on the COVID-19 expert group pf the government of Northrhine-
- 314 Westfalia, Germany 2020-21, the COVID-19 expert group of the government of Germany
- 315 2021-23, the expert group for evaluating infectious disease laws in Germany, since 2023 on
- 316 the Enquete committee for the evaluation of crisis management of the government of
- 317 Northrhine-Westfalia, and since 2019, head of the board of trustees of the German AIDS
- 318 foundation.
- 319 Joachim P. Sturmberg declares no conflicts of interest.
- Lehana Thabane has worked as a paid consultant by the companies Bausch Health, GSK,
- 321 Teva Pharmaceuticals, and Theralase Inc and also works as Vice-President Research for St
- 322 Joseph's Healthcare Hamilton and he serves on several committees or boards of health
- 323 related organizations that include Ontario Hospital Association, HealthcareCan, the SPOR
- 324 (Strategy for Patient Oriented Research) Refresh Steering Committee of the Canadian
- 325 Institutes of Health Research, the Canadian Medical Hall of Fame, Canadian Academy of
- 326 Health Sciences, Society for Clinical Trials, Baycrest Academy, and the PCORI (Patient-
- 327 Centered Outcomes Research Institute) Methodology Committee.
- 328 Brett D. Thombs is supported by a Canada Research Chair and was PI on several grants
- from the Canadian Institutes of Health Research to study mental health in COVID-19, and
- consulted with the Public Health Agency of Canada on this topic.
- 331 Athanasios Tsakris was a member of the National Greek Committee for the Protection of
- 332 Public Health against COVID-19 from the beginning of the pandemic (February 2020) until
- 333 March 2021, when he decided to resign.
- 334 Simon Wood signed the Great Barrington Declaration, published three media articles for the
- 335 'Spectator' discussing tradeoffs, the evidence for when the UK infection waves peaked and
- 336 the evidence for mask efficacy, a small number of media appearances advocating for
- 337 sampling based assessment of incidence and prevalence and discussing tradeoffs and the
- 338 evidence on when UK infection waves peaked, and has written evidence provided to the IJK
- 339 parliament Science and Technology Committee.
- 340 John P.A. Ioannidis has published in the scientific literature both before
- 341 (https://onlinelibrary.wiley.com/doi/10.1111/eci.13162) and during the pandemic
- 342 (https://www.bmj.com/content/371/bmj.m4048) articles that are skeptical about the value of
- vote counting and signature collections for deciding scientific issues.

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Abstract

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competing interests; guidelines.

Consensus statements can be very influential in medicine and public health. Some of these statements use systematic evidence synthesis but others fail on this front. Many consensus statements use panels of experts to deduce perceived consensus through Delphi processes. We argue that stacking of panel members towards one particular position or narrative is a major threat, especially in absence of systematic evidence review. Stacking may involve financial conflicts of interest, but non-financial conflicts of strong advocacy can also cause major bias. Given their emerging importance, we describe here how such consensus statements may be misleading, by analysing in depth a recent high-impact Delphi consensus statement on COVID-19 recommendations as a case example. We demonstrate that many of the selected panel members and at least 35% of the core panel members had advocated towards COVID-19 elimination (zero-COVID) during the pandemic and were leading members of aggressive advocacy groups. These advocacy conflicts were not declared in the Delphi consensus publication, with rare exceptions. Therefore, we propose that consensus statements should always require rigorous evidence synthesis and maximal transparency on potential biases towards advocacy or lobbyist groups to be valid. While advocacy can have many important functions, its biased impact on consensus panels should be carefully avoided. Plain language summary: Consensus statements without systematic evidence may be biased towards specific views. We describe this problem both generically and in detail, by a case study of a recent high-impact consensus-statement about COVID-19. We identify substantial undeclared advocacy interests that might have affected the panel views. To solve this issue, we propose that consensus statements always need to conduct a valid, rigorous evidence synthesis, and urge the development of protocols to ensure transparency and reduce biases in panels. This can be very important as such statements become increasingly common. **Keywords:** Evidence based medicine; consensus statements; panel bias; transparency;

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378 Running title: Stacking in consensus panels

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380 Word count: 2505

Panel stacking is a threat to consensus statement validity

Thousands of consensus, guideline, and position statements are published annually and many of them exert significant influence on clinical decision-making, research priorities, public health policy, and other key matters informed by science. Scientific consensus-building should distinguish opinion from evidence¹ and ensure that the eventual consensus is supported by the evidence; this is a critical distinction between evidence- and non-evidence-based consensus statements.².³ An early and indispensable step is to systematically review and appraise the available relevant evidence in an impartial way. Then, committees of panelists can use this systematic review, deliberate, and reach conclusions ensuring that judgment reflects the strength of the underlying evidence.⁴ Delphi methods aim to improve decision-making by diminishing groupthink.⁵ However, the methods are characterised by variable implementation and lack of consistency,⁶ and validity depends on which panelists are included and their preferences and allegiances, especially when the evidence is limited, contentious, uncertain, or not systematically reviewed. Empirical data suggest that consensus-based approaches without evidence synthesis are 3-5-fold more likely than evidence-based approaches to yield misleading advice.^{5,7}

Two requirements are essential when constructing consensus panels. First, the core group and the panel should comprehensively reflect the diversity of the expert landscape. Second, there should be transparency regarding specific preferences and allegiances. Guided recruitment of similar views ("stacking") can occur when key members (e.g. chairs or core groups) nominate panelists with strong views, preferences, or allegiances independent of evidence. Recruitment specifically because of expressed viewpoints and allegiance is a recognised major problem for guideline development. The issue can be exacerbated when stacked core group and panel members also choose the topics and phrasing of questions to be answered, weigh the review or method towards their own knowledge rather than adhering to accepted evidence review standards, and/or do not disclose conflicts of interest.

A systematic review of how guideline panels make recommendations showed that social dynamics significantly influence the development of recommendations: chairs and co-chairs dominate the process, while less influential stakeholders (such as patient partners) contribute to less than 5% of the total debate. Strong opinions particularly dominate the process when panels are faced with insufficient or low-quality evidence. Furthermore, when information was framed in terms of "positive" statements (as typically done in

417	advocacy consensus statements), the presence of cognitive "yes" bias was apparent:
418	panelists tended to more easily acquiesce with positive assertions that required less
419	cognitive effort than negative statements. 10,11
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421	A case study: Delphi consensus on COVID-19
422	As an example of potential panel stacking, we analyzed what was described as a
423	"multinational Delphi consensus to end the COVID-19 public health threat"12 published in
424	Nature. The consensus included the views of 386 panel experts who developed 41
425	statements and 57 recommendations for mitigating COVID-19, making it a potentially very
426	impactful position paper on this important topic that is already highly-cited. The authors of
427	the consensus state that: "The four co-chairs identified a core group of 40experts
428	Selection by the co-chairs was primarily based on publication record and engagement on
429	COVID-19 issues as well as online biographies. Twenty-nine of these experts were well
430	known to the chairs while seven were suggested through snowball sampling The core
431	group proposed additional experts to create a global panel of approximately 400 experts."12
432	There is no universally accepted method of selecting panelists, 13 but snowball-sampling is
433	highly sensitive to personal network biases and may sometimes reflect limited merit. 14,15 In
434	this analysis we therefore used conflict of interests by association with a particular advocacy
435	view as a proxy of potential consensus panel stacking.
436	We found that panel selection favoured the inclusion of advocates of SARS-CoV-2
437	elimination ("Zero-COVID") perspectives. Zero-COVID was a minority position in 2021 even
438	in the mild version of being feasible in "some" regions (e.g., New Zealand),16 but the groups
439	identified here advocated in Europe and North America, where the policy was less feasible.
440	Zero-COVID was widely abandoned by 202217 and eventually broadly recognised as
441	unattainable. ¹⁸
442	At least 14 of 40 (35%) core members of the Nature consensus and at least another 59
443	panelists are explicitly named in influential and highly visible Zero-COVID advocacy/activism
444	efforts in North America and Europe (Box 1: References R1-R11, Figure 1, Supplementary
445	Table 1). Thus, at least 20% of named panelists (73/367; 19 panelists did not wish their
446	names revealed) engaged in such strong advocacy/activism.
447	The 367 named panelists include 9/25 (36%) signatories of a highly publicised Zero-COVID
448	open letter, [R1] 3/8 (38%) signatories of a Lancet letter supporting elimination, [R2] 36/132
449	signatories (26%) of the World Health Network (WHN),[R3] 41/108 (38%) signatories of the
450	Vaccines Plus advocacy letter, [R4] 7/19 (37%) full members of Independent Scientific

151	Advisory Group for Emergencies (indieSAGE), [RS] 14/47 (30%) WHN members or experts-
152	advisors, ^[R6] 5/79 (6%) OzSAGE members, ^[R7] 3/14 (21%) NOCOVID members, ^[R8] 5/8 (63%)
453	End Coronavirus advisors ^[R9] , 9/13 (69%) authors of another elimination viewpoint ^[R10] and
154	3/17 (18%) ZeroCOVID-US members ^[R11] . Large overlap emerged in membership across
155	these efforts, typical of advocacy activities.
156	Only 2/73 advocates/activists we identified ("S.G.", "K.Y.") disclosed advocacy/activism in
157	the competing interests section (Independent SAGE membership). Consistent with general
1 58	guidance on disclosing conflicts of interest, Nature authorship requires disclosure of "unpaid
4 59	membership in an advocacy or lobbying organization" (https://www.nature.com/nature-
160	portfolio/editorial-policies/competing-interests), but all members of WHN, OzSAGE, End
161	Coronavirus, ZeroCOVID-US, NOCOVID Europe, and all but two of seven active members
162	of Independent SAGE declared no competing interests. Such lack of disclosures could
163	mislead readers.
164	The number of panelists engaged in related advocacy/activism is probably far larger than the
165	number we uncovered. We only assessed several well-known groups. Many similar,
166	associated groups exist, especially at national levels. Most lack publicly posted membership
167	lists. Illustratively, dozens of Zero-COVID organizations are listed in [R3]. Still, key members
168	of zero-COVID advocacy groups were probably <1% of the 720,801 scientists19 who
169	authored COVID-19-related papers in 2020-2021 alone. A 35% (or higher) prevalence of
17 0	declared Zero-COVID advocates among core panel members is extreme.

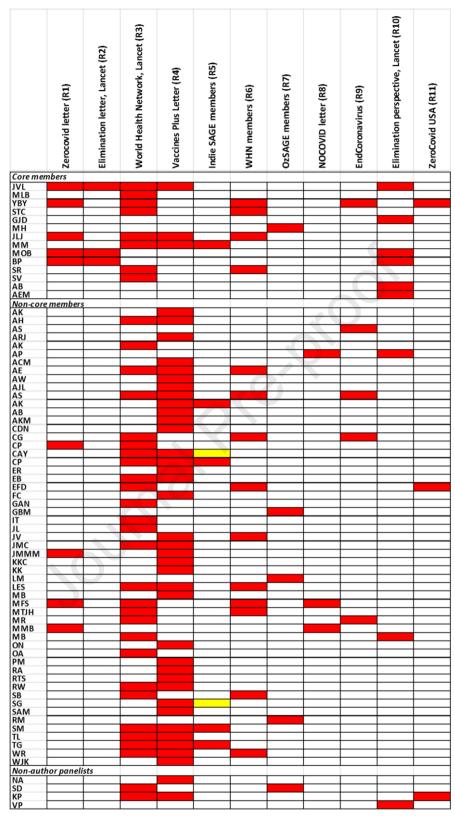


Figure 1: Named membership in advocacy efforts by panelists of Lazarus et al.¹²

Columns represent efforts/initiatives/organisations presented in the respective references. Red color means advocacy/activism not disclosed. Yellow color means advocacy/activism disclosed. For detailed methods, see Supplementary Methods, for names of panelists see Supplementary Table 1 and for information on the 11 sources see Supplementary References R1-11.

The panelists include many highly respected experts (https://elsevier.digitalcommonsdata.com/datasets/btchxktzyw/6). Among 367 named panelists, 71 (19%) are in the top-2% of their scientific subfield based on a composite citation indicator²⁰ for career-long impact (**Table 1**, Supplementary Table 2). The main subfields of these 71 highly-cited authors include 24 of the 174 subfields of science (Science-Metrix classification, https://science-metrix.com/classification/). Most (41/71) are concentrated in four subfields (general/internal medicine, microbiology, public health, virology). Conversely, no named panelists were top-cited scientists in 150 of the 174 subfields of science. These 150 subfields include most biomedical research (9/12) and clinical medicine (24/32) subfields, half (4/8) of the public health and health services subfields, notably all eight psychology and cognitive sciences subfields, all 15 social sciences subfields, all 12 economics and business subfields, all four mathematics and statistics subfields, and all eight information and communication technologies subfields. These absences may have limited multidisciplinary pandemic insights, and with almost 400 panelists, expanding beyond 24 subfields seems feasible. Furthermore, there was no public involvement and commenting, and no systematic evidence review. In short, experts with strong, known preferences could select the topics, evidence, and final statements with little/no restraint from the community or impartial, systematic evidence synthesis.

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Causes and implications of stacking

The roots of stacking are often financial interests, especially statements about drugs, devices, or other health care interventions. Industry lobbyism may seek to change narratives on evidence,⁸ and stacked panels help achieve this. There is currently no systematic or quantitative way to assess the risk of bias from conflicted interests; we only require them to be declared. Committee members may have financial ties to manufacturers and sponsors of drugs and technologies under evaluation.²¹ Therefore, some guideline organisations increasingly make efforts to ensure that committee members have not had any relevant financial conflicts, especially in the recent past. Committee members may also be asked to declare that they will avoid relevant financial conflicts for some years after the guidelines are released.

Table 1 | Panelists of the "multinational Delphi consensus to end the COVID-19 public health threat" who are in the top-2% of their scientific subfield (career-long impact) among scientists who published at least 5 full papers in their career (original articles, reviews, or conference papers).

MAIN SCIENTIFIC	Core	Other	Panel	Total	RANK IN SUBFIELD**	TOTAL
SUBFIELD		author	only			SCIENTISTS IN SUBFIELD***
TOTAL	15	49	7	71		
Virology	4	2	1	7	11, 74, 131, 284,353, 696, 1264	68,279
Tropical Medicine	1	2	0	3	4, 36, 308	35,237
Toxicology	0	1	1	2	892, 1133	61,427
Substance Abuse	0	1	0	1	11	15,621
Respiratory System	0	1	0	1	204	62,483
Public Health	2	6	0	8	11, 12, 15, 165, 204, 309, 323, 756	64,147
Psychiatry	0	0	1	1	318	75,274
Oncology &	0	1	0	1	683	311,930
Carcinogenesis						·
Obstetrics &	0	1	0	1	277	91,850
Reproductive						
Medicine						
Microbiology	1	7	1	9	110, 191, 824, 965, 1186, 1934, 1947,	190,257
					3741, 3790	
Meteorology & Atmospheric Sciences	1	0	1	2	526, 681	70,828
Health Policy &	0	0	1	1	270	20,709
Services	O	U	1 05		270	20,703
Genetics & Heredity	0	1	0	1	482	38,076
General & Internal	2	14	1	17	18, 42, 138, 189, 416, 621, 698, 829, 986,	321,279
Medicine					1194, 1505, 1531, 1929, 2449, 2715,	,-:
					2876, 6205	
Gastroenterology &	1	1	0	2	373, 458	98,720
Hepatology						
Fluids & Plasmas	1	0	0	1	436	50,409
Environmental	0	3	0	3	19, 763, 905	99,480
Sciences						
Environmental &	0	1	0	1	128	14,381
Occupational Health			•		242	207.766
Energy	1	0	0	1	919	287,766
Endocrinology &	0	1	0	1	348	87,900
Metabolism Emergency & Critical	0	2	0	2	487, 650	36,979
Care Medicine	U	2	U	۷	467, 650	30,979
Building &	0	3	0	3	28, 68, 252	38,335
Construction	J	3	3	,	23, 33, 232	23,333
Applied Ethics	1	0	0	1	1	5,857
Analytical Chemistry	0	1	0	1	298	114,981
150 other subfields*	0	0	0	0	none	7,355,558

517 518 519 520 521 522 523 524 525 526 527 528 529 530 531 532 533 534	Family Studies, Gender Studies, Cultural Studies, Sociology, Social Work, International Relations, Law, Political Science & Public Administration, Science Studies, Social Science Methods, Food Science, Bioinformatics, Operations Research, Information Systems, Medical Informatics, Networking & Telecommunications, Communication & Media Studies, Anthropology, Philosophy, Agricultural Economics & Policy, Business & Management, Development Studies, Econometrics, Economic Theory, Economics, Finance, Industrial Relations, Logistics & Transportation, Marketing, Sport, Leisure & Tourism, Biochemistry & Molecular Biology, Biophysics, Developmental Biology, Nutrition & Dietetics, Physiology, Allergy, Anesthesiology, Arthritis & Rheumatology, Cardiovascular System & Hematology, Dentistry, Dermatology & Venereal Diseases, General Clinical Medicine, Geriatrics, Immunology, Legal & Forensic Medicine, Neurology & Neurosurgery, Pathology, Pediatrics, Pharmacology & Pharmacy, Sport Sciences, Surgery, Behavioral Science & Comparative Psychology, Clinical Psychology, Developmental & Child Psychology, Experimental Psychology, General Psychology & Cognitive Sciences, Human Factors, Social Psychology, Epidemiology, Gerontology, Nursing, Rehabilitation, Ecology, Evolutionary Biology, Zoology, Applied Mathematics, Statistics & Probability – and several others (the nomenclature of subfields is according to the Science Metrix classification). While most published guidelines and consensus papers typically focus on circumscribed topics where only one or a few scientific subfields are relevant, this COVID-19 consensus aims to cover so many society-wide and government-wide aspects that all of these subfields listed above (and more) have essential roles to inform the statements and recommendations. Furthermore, for subfields that are represented by top-cited scientists (e.g. Public Health), their representation does not mean that these experts represent appropriately the spectrum of different positions, given the selection process in favour o
535 536 537 538 539	**excluding self-citations ***with at least 5 full publications. For details on methods regarding this table and for another relevant bibliometric evaluation related to COVID-19-related impact, see Supplementary Methods.
540	However, these efforts may not reduce the risk of stacking with respect to non-financial
541	interests. ²² . Non-financial conflicts are very diverse and may be specific to topic and
542	circumstances. Some non-financial conflicts such as group allegiances are difficult to
543	document. Even without direct financial gain, stacking of specific narratives may
544	inadvertently occur due to the biased nature of human networks: snowballing <i>inherently</i>
545	selects for similar viewpoints. Advocates may perceive that they simply work for the broader
546	common good by promoting what they believe is true, while also promoting or facilitating
547	potential government, organisation, or ordinance policies either consciously or
548	unconsciously. Advocates may also intrinsically be more likely to accept an offer to a panel
549	on policy recommendations. For exactly these reasons, Guideline International Network
550	principles discourage the inclusion of people with strongly held pre-guidance views in
551	development of recommendations. ²³
552	The implications of stacking and simultaneous failure to disclose substantial advocacy
553	association can be far-reaching: If activism-or lobbyism-biased consensus papers become
554	common, and published by high-impact journals, organised interest networks with non-
555	transparent membership could create through biased recruitment a false impression of
556	consensus on virtually any topic, especially misleading when disclosures are incomplete.
557	This could distort consensus and even stifle efforts to obtain scientific evidence on otherwise
558	unsettled matters, with broad harms to science and society.

The problem with stacked consensus statements and recommendations is not only the increased risk of being wrong. Even when they are right, the recommendations are more likely to be incomplete and partial, as they may prioritise narratives that preoccupy the advocates. This diminishes or even eliminates other important perspectives. Choices of language, phrasing, statements, and recommendations become lopsided. Illustratively, in the COVID-19 consensus example dissected above, the lengthy 41 statements and 57 recommendations¹² never mention the words "randomised", "lockdown", "closures", "isolation", "loneliness", "learning loss", "poverty", "depression", "hunger", "cost-benefit", "tradeoff", "censorship" or "mandate". They mention the word "harm" once, in statement STMT3.1, which does not discuss harms to individuals, groups, or communities themselves, but highlights "risk of harm to others" to endorse government mandatory policies.¹² "Education" or "schools" are never mentioned and "educational" and "schooling policies" are only mentioned in recommendation REC4.6: "Prevention of SARS-CoV-2 transmission in the workplace, educational institutions and centers of commerce should remain a high priority"... "remote work/schooling policies". 12 "Mental" (health) is mentioned only for children and healthcare workers. "Evidence-based" is mentioned only twice: STMT2.1 admits lack of evidence-based standards and STMT6.8 is dismissive of the evidence-based medicine paradigm. 12

Moving forward

Despite scientific evidence being imperfect, aligning judgment with the evidence after weighing it transparently remains the most important guardrail protecting the consensus process. Every effort should be made to allow evidence to serve as a "neutral arbiter among competing views".²⁴ Consensus expert panels without systematic review are easily dominated by few individuals even when many experts participate.^{10,25,26} They should be replaced by robust evidence-based approaches when evidence exists. In the case of the COVID-19 example discussed above, the published literature exceeds 500,000 articles. However, sometimes evidence is limited, and entirely opinion-based Delphi processes may have some value, informing on opinion trends. They would then benefit from better standardisation and improved reporting²⁷ and even pre-registration.²⁸ But given how sensitive panels are to stacking, transparent efforts to ensure non-biased recruitment of panelists is critical, as is full transparency on aspects that may indicate risks of stacking. Advocacy and activism are only part of a spectrum of potential non-financial conflicts that may create panel stacking. Other relevant non-financial competing interests may include, for example, membership in a government or non-governmental organisation, advisory positions

in commercial organisations, writing or consulting for an educational company, and acting as an expert witness. Advocacy is essential for improving our world, but scientific consensus driven by advocacy agendas represents an oxymoron. While recent ACCORD guidelines on reporting of consensus methodology²⁹ emphasise transparency on panel recruitment, it is impossible to eliminate all panel biases and arguably impossible to estimate remaining bias accurately, unless conflicts of interest are widely known and in the public domain, as in the studied example. We thus propose that, besides the recent ACCORD guidelines on panel recruitment,²⁹ consensus efforts should explicitly aim to avoid advocate stacking and describe the methods to achieve this. This applies not only to panel selection, but also to choosing the topics, phrasing the questions, and performing the background systematic review of the evidence, which may also be sensitive to biases. Significant undeclared advocacy in consensus statements is unacceptable. Non-transparent conflicts of interest still pervade many guideline committees, including those on pandemics and health systems.³⁰ Journal editors should ensure transparency. Even then, consensus statements with substantial stacking cannot be trusted. Journal editors should avoid publishing consensus statements that appear to involve substantial stacking, e.g. due to a clear bias in the panel. For complex situations like COVID-19, panels may need to include experts with different views and also other important stakeholders, e.g. families and teachers to ensure a balanced view. Similarly, public and other not-for-profit funders of consensus

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Barriers

bright line between advocacy and science.

Panels may always have some bias due to the many convoluted features that define humans as experts. Therefore, one should prioritise obtaining reliable evidence and performing rigorous evidence synthesis that would be less amenable to subjective expert interpretation and distortion, and variations in interpretation should be described.

Ensuring transparency can be very difficult. Some types of potential conflicts are captured in inclusive databases, such as the databases of industry payments to clinicians. 31,32 However, there is a lack of publicly available, comprehensive information on many other types of biases. Iterative searches for undeclared conflicts can require detective work and there is no

statements could require full transparency and documentation and guarantee that stacking

did not affect the process. It is important to buttress consensus processes and to maintain a

Some authors have also been skeptical of whether non-financial conflicts are significant.³³ To understand whether they are significant, at a minimum, they should not be grouped

guarantee that all major conflicts can be revealed through some footprint they have left.

together as "non-financial conflicts", but presented more accurately and specifically in
context.33 Non-financial conflicts might also indirectly yield financial conflicts, by increasing
visibility, boosting reputation and accelerating career advancement.
Another difficulty is that in fields with substantial industry penetration, almost all major
experts may have many competing conflicts, both financial and non-financial. Yet it should
still be possible to reduce lobbyism/advocacy inclusion, avoid stacking via unconflicted
experts, and at the least exhibit full transparency on potential conflicts.34,35 Furthermore,
there is debate 36 about who should be the authors of the background systematic reviews to

Conclusions

ensure that such reviews are unbiased.

Consensus methods are characterised by unacceptably wide variation in their implementation.⁶ Consensus statements with poor methodology can even lead to polarised and misguided viewpoints deepening both conscious and unconscious confirmation and refutation biases, suboptimal decision making, and exacerbated skepticism about medical science and public health. Panel stacking can introduce bias that substantially reduces the trustworthiness and credibility of recommendations, even when carefully building on meticulous systematic review of available evidence. This is exacerbated when there is no systematic evidence review informing the process. Rigorous guideline and recommendation development efforts should ensure that diverse legitimate views are represented, while at the same time avoid disproportionately over-representing specific views, advocacy efforts, or interests, and should use systematic evidence synthesis and justification of recommendations wherever possible.

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Core mem	nbers										
JVL MIR											
YBY											
STC											
MH											
JLJ											
MOB											
BP SD											
JVL MLB YBY STC GJD MH JLJ MMM MOB BP SSV AB AEM NON-COTE AK AH AK AH AC AK ARJ AC											
AB AFM											
Non-core	members	;									
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SD KP VP											

- Consensus statements without systematic evidence carry risk of panel bias
- We document this problem by analysis of a high-impact consensus-statement
- Based on the analysis, we argue that consensus statements always need rigorous evidence synthesis to be valid
- We urge protocols to avoid stacking and undisclosed advocacy associations

Competing Interests Statement for

Selection bias with panel stacking: a threat to consensus statement validity

Kasper P. Kepp declares no conflicts of interest.

Preben Aavitsland has as part of his work at the Norwegian Institute of Public Health (a governmental agency) provided advice to the Governments of Norway and Denmark on handling the COVID-19 pandemic. He was a member of the WHO Review Committee on the Functioning of the International Health Regulations (2005) during the COVID-19 Response, and he chaired the WHO Review Committee regarding Standing Recommendations for COVID.

Marcel Ballin declares no conflicts of interest.

Francois Balloux is the leader of two work packages of the END-VOC project funded by the European Union's Horizon Europe programme under the grant agreement No. 101046314. He has published multiple academic and public outreach articles on COVID-19. He has given unpaid scientific advice on pandemic mitigation and vaccination policy to the Governments of Austria, France and the UK.

Stefan Baral has published on COVID-19, did COVID-19 related clinical work, and was a co-author on a Royal Society report on homelessness during COVID-19 which included systematic reviews which were later published (https://rsc-src.ca/en/themes/homelessness)

Kevin Bardosh is Director of Collateral Global, a UK-based research and education charity that is focused on understanding the impact of COVID policies around the world.

Howard Bauchner declares no conflicts of interest.

Eran Bendavid has written Covid-19 research and opinion pieces (e.g. https://www.wsj.com/articles/is-the-coronavirus-as-deadly-as-they-say-11585088464) on Covid-19, some questioning consensus on disease control interventions.

Raj Bhopal has served on COVID-19 related committees of government and NGOs, including the Expert Reference Group on COVID-19 and Ethnicity, the Scottish Government, 2020-2022, and was a signature on several letters, including one to the prime minister (29/5 2020): "Dominic Cumming's actions damage public trust" (https://www.theguardian.com/commentisfree/2020/may/30/dominic-cummings-actions-damage-public-health).

Daniel T. Blumstein is a member of the board of the International Panel on Behavior Change, an international group that seeks to integrate behavioral knowledge to improve global sustainability.

Paolo Boffetta is a co-PI of a grant on COVID-19 epidemic awarded by the European Commission to the University of Bologna.

Florence Bourgeois declares no conflicts of interest.

Adam Brufsky receives consulting fees from Astrazeneca, Pfizer, Novartis, Lilly, Genentech/Roche, SeaGen, Daiichi Sankyo, Merck, Agendia, Sanofi, Puma, Myriad, and Gilead (unrelated to the current work).

Peter J. Collignon was member of Infection control expert group (ICEG) that provided advice on Infection control and prevention issues to Australian Government bodies, Federal Health department and Chief Health Officers during the Covid-19 pandemic from 2020 to 2022, expert witness for the Australian Government in dispute with Western Australia on closure of State borders, member of the review team assessing hotel guarantine procedures by states and territories for the Australian government, and

member of the team advising the Federal health department in 2022 on the future potential use and volumes of anti-viral and vaccines use for Covid-19.

Sally Cripps declares no conflicts of interest.

Ioana A. Cristea declares no conflicts of interest.

Nigel Curtis declares no conflicts of interest.

Benjamin Djulbegovic declares no conflicts of interest.

Oliver Faude declares no conflicts of interest.

Maria Elena Flacco declares no conflicts of interest.

Gordon H. Guyatt declares no conflicts of interest.

George Hajishengallis declares no conflicts of interest.

Lars G. Hemkens received funding for the Covid-evidence project (www.covid-evidence.org) by the Swiss National Science Foundation (project 31CA30_196190), unrelated to this work, and travel support from the WHO, unrelated to this work. LGH's institution (RC2NB) was contracted by WHO for the development of study protocol templates to evaluate Public Health and Social Measures, unrelated to this work. LGH's institution (RC2NB) is supported by Foundation Clinical Neuroimmunology and Neuroscience Basel, unrelated to this work. RC2NB has a contract with Roche for a steering committee participation of LGH, unrelated to this work. These funders had no role in the conceptualisation, design, data collection, analysis, decision to publish, or preparation of the manuscript. He is also a member of the Network for Evidence-based Medicine (Ebm-Netzwerk).

Tammy Hoffmann declares no conflicts of interest.

Ari R. Joffe served as an unpaid advisor to the Public Health Emergencies Governance Review Panel in the province of Alberta, Canada, whose "report reviews legislation that guided Alberta's response to COVID-19 and recommends changes to improve the handling of future public health emergencies for Albertans" (the final report was published November 2023). He signed the Great Barrington Declaration.

Terry P. Klassen declares no conflicts of interest.

Despina Koletsi declares no conflicts of interest.

Dimitrios P. Kontoyiannis declares no conflicts of interest.

Ellen Kuhl declares no conflicts of interest.

Carlo La Vecchia is a member of the Vaxzevria advisory board.

Tea Lallukka has provided an invited report for the Committee for the Future (an established, standing committee in the Parliament of Finland) in late 2022, where she was asked to describe the future of public health. Her report covered e.g. inequalities in health, population aging, oral health, and mental health.

John Lambris declares no conflicts of interest.

Michael Levitt has signed the Great Barrington Declaration.

Spyros Makridakis declares no conflicts of interest.

Helena C. Maltezou declares no conflicts of interest.

Lamberto Manzoli declares no conflicts of interest.

Ana Marusic declares no conflicts of interest.

Clio Mavragani declares no conflicts of interest.

David Moher declares that he is on the editorial board of Journal of Clinical Epidemiology.

Ben Mol is supported by a NHMRC Investigator grant (GNT1176437), and he reports consultancy, travel support and research funding from Merck and consultancy for Organon and Norgine, and holding stock from ObsEva.

Taulant Muka is co-founder and CEO at Epistudia GmbH and acts as advisor for the Academic Parity Movement, a non-profit organisation uprooting academic bullying, discrimination, and violence.

Florian Naudet received funding from the French National Research Agency (ANR-17-CE36-0010), the French ministry of health and the French ministry of research. He is a work package leader in the OSIRIS project (Open Science to Increase Reproducibility in Science). The OSIRIS project has received funding from the European Union's Horizon Europe research and innovation programme under the grant agreement No. 101094725. He is a work package leader for the doctoral network MSCA-DN SHARE-CTD (HORIZON-MSCA-2022-DN-01 101120360), funded by the EU, unpaid member of the French Society of clinical pharmacology and therapeutics, and unpaid member of the European society of clinical pharmacology and therapeutics.

Paul W. Noble declares no conflicts of interest.

Anna Nordström declares no conflicts of interest.

Peter Nordström declares no conflicts of interest.

Nikolaos Pandis declares no conflicts of interest.

Stefania Papatheodorou declares no conflicts of interest.

Chirag J. Patel declares no conflicts of interest.

Irene Petersen declares no conflicts of interest.

Stefan Pilz has signed the Great Barrington Declaration.

Nikolaus Plesnila declares no conflicts of interest.

Anne Louise Ponsonby owns stock in Dysrupt Labs, a subsidiary of Slowvoice Pty Ltd. Dysrupt Labs supplied the Almanis prediction market database for an article recently published in eBioMedicine in which Professor Ponsonby was the corresponding author, entitled "Machine learning augmentation reduces prediction error in collective forecasting: development and validation across prediction markets with application to COVID events".

Manuel A. Rivas is a Co-Founder of Broadwing Bio and consults for insitro, Mubadala Ventures, and Curie. Bio.

Andrea Saltelli declares no conflicts of interest.

Manuel Schabus declares no conflicts of interest.

Michaéla Schippers is founder of Ikigaitv.nl: positive psychology interventions for the general public, to enhance mental wellbeing and co-founder of Great Citizens Movement (greatcitizensmovement.org). She has signed the Great Barrington Declaration. She also served as expert witness of extra-parliamentary inquiry regarding the COVID-19 crisis handling in the Netherlands (2020); she owns the podcast followthescience.nl and does contract research on improving study success: https://www.erim.eur.nl/erasmus-centre-for-study-and-career-success/.

Holger Schünemann is the lead of the steering committee for the International Guideline Training and Certification Program INGUIDE which is a ISO-certified program focusing on bringing professionalism to the development of health recommendations by educating and certifying those participating in the

development of health recommendations; the program charges course fees, and time spent on teaching in INGUIDE may lead to reimbursement to HS in the future (until now no payments have been made). He is also co-chair of the GRADE Working Group and chair of the board of trustees of the Guidelines International Network, both are having transparency and trustworthy guideline development methods as a core value. He is PI on a research contract from the Public Health Agency of Canada that focuses on developing and implementing post-covid-19 condition guidelines. He has been a PI on several grants focusing on guideline methods and knowledge mobilisation related to COVID-19 guidelines. He has worked with numerous global and other organisations on methods and development of guidelines.

Marco Solmi has received honoraria/has been a consultant for AbbVie, Angelini, Lundbeck, Otsuka, unrelated to this work.

Andreas Stang received COVID-19 research grants from the German Science Foundation (DFC) without any conflict of interest. The granting agency DFG is not affected at all by this manuscript.

Hendrik Streeck has been on the COVID-19 expert group of the government of Northrhine-Westfalia, Germany 2020-21, the COVID-19 expert group of the government of Germany 2021-23, the expert group for evaluating infectious disease laws in Germany, since 2023 on the Enquete committee for the evaluation of crisis management of the government of Northrhine-Westfalia, and since 2019, head of the board of trustees of the German AIDS foundation.

Joachim P. Sturmberg declares no conflicts of interest.

Lehana Thabane has worked as a paid consultant by the companies Bausch Health, GSK, Teva Pharmaceuticals, and Theralase Inc and also works as Vice-President Research for St Joseph's Healthcare Hamilton and he serves on several committees or boards of health related organizations that include Ontario Hospital Association, HealthcareCan, the SPOR (Strategy for Patient Oriented Research) Refresh Steering Committee of the Canadian Institutes of Health Research, the Canadian Medical Hall of Fame, Canadian Academy of Health Sciences, Society for Clinical Trials, Baycrest Academy, and the PCORI (Patient-Centered Outcomes Research Institute) Methodology Committee.

Brett D. Thombs is supported by a Canada Research Chair and was PI on several grants from the Canadian Institutes of Health Research to study mental health in COVID-19, and consulted with the Public Health Agency of Canada on this topic.

Athanasios Tsakris was a member of the National Greek Committee for the Protection of Public Health against COVID-19 from the beginning of the pandemic (February 2020) until March 2021, when he decided to resign.

Simon Wood signed the Great Barrington Declaration, published three media articles for the 'Spectator' discussing tradeoffs, the evidence for when the UK infection waves peaked and the evidence for mask efficacy, a small number of media appearances advocating for sampling based assessment of incidence and prevalence and discussing tradeoffs and the evidence on when UK infection waves peaked, and has written evidence provided to the IJK parliament Science and Technology Committee.

John P.A. loannidis has published in the scientific literature both before (https://onlinelibrary.wiley.com/doi/10.1111/eci.13162) and during the pandemic (https://www.bmj.com/content/371/bmj.m4048) articles that are skeptical about the value of vote counting and signature collections for deciding scientific issues.