

Uncovering the gender health data gap

Revelando a lacuna de dados sobre saúde de gênero

Revelación de la brecha de datos sobre salud de género

Vanessa di Lego ¹

doi: 10.1590/0102-3111XEN065423

The way data are collected and interpreted by gender is subject to fundamental biases ¹. This generates a gender health data gap that impacts all branches and levels of health research, including disease prevention and diagnosis, medical treatment for cancer, cardiovascular and Alzheimer's disease ^{2,3}.

The gender health data gap is characterized by ^{1,4,5}: (1) missing or incomplete evidence for diseases that disproportionately impact women because of lack of funding or inclusion of women in clinical trials (henceforth called "type 1 problem"); (2) existing evidence is interpreted in light of men's symptoms as default or textbook (henceforth called "type 2 problem"). The two problems are interrelated and stem from the perspective that male disease etiology and progression is the standard threshold and that differences between women and men are restricted to reproductive health ^{6,7}. Because these issues are influenced by societal gender norms, I call this gender health data gap, and not only sex data gap, as further detailed as follows.

The type 1 problem is more prevalent in clinical research, as for over half a century the default model organism is based on male rodents ^{1,6}. The lack of a female-based model contributed to the incomplete understanding of the etiology, symptomatology and treatment of a series of diseases in women ¹. For example, women experience twice as much adverse drug reactions as men for over 86 different medications approved by the United States' Federal Drug Administration (FDA), including antidepressants, analgesics, cardiovascular and anti-seizure drugs ^{8,9}. However, most drugs are approved based on clinical trials that are either conducted solely on men or only include women in the first or second trial steps ¹⁰. As a result of such missing data on women, they face higher levels of over medication, adverse reaction, susceptibility for drug-induced liver injury, and dosage inaccuracy ¹¹. Likewise, despite important differences between women and men in cognitive deterioration and brain atrophy rates, gender is rarely considered in the design and analysis of clinical trials ¹². Lastly, women's diseases are underfunded when compared with the burden of disease they experience and the lethality of conditions ¹³, including ovarian and cervical cancers ¹⁴, Alzheimer's ¹⁵, and cardiovascular disease ¹⁶.

The type 2 problem presents itself more prominently among healthcare providers, where evidence is used inconsistently or influenced by subjective judgements. Some scholars call this "healthcare gender bias", where women's symptoms are dismissed or neglected, leading to delays in diagnosis ^{3,5}. For example, women are less likely to receive the same care recommended by guidelines defined by the European Society of Cardiology (ESC) and the Acute Cardiovascular Care Association

¹ Vienna Institute of Demography, Austrian Academy of Sciences, Vienna, Austria.

Correspondence

V. di Lego
Vienna Institute of Demography, Austrian Academy of Sciences
Dr. Ignaz Seipel Platz 2,
Vienna 1010, Austria.
Vanessa.DiLego@oeaw.ac.at



(ACCA), such as procedures like timely reperfusion therapy in the case of ST-elevation myocardial infarction (STEMI) and coronary angiography in case of non-ST-elevation myocardial infarction (NSTEMI) ^{17,18,19}. Women are also less likely to receive or be referred to cardiac rehabilitation or be prescribed a statin or an angiotensin-converting-enzyme inhibitors (ACE inhibitor), which increase their 30-day mortality risk after a heart attack ^{17,20}. As a consequence, deaths among women with acute myocardial infarction could be significantly prevented if the quality of care received was the same as for men ¹⁷, which could also be the case for conditions such as stroke, attention deficit/hyperactivity disorder (ADHD) and arthritis ¹.

The consequences of the gender health data gap are not limited to clinical settings. Gender bias can impact the quality and representativeness of cause of death statistics in civil registration and vital statistics (CRVS), due to misdiagnosis made by physicians and misreport of certain conditions ²¹. Research into how gender bias in the health system influences the quality of cause of death statistics remains limited ²². These biases can also impact population-level summary indicators, which are often used to develop and monitor progress in health, set targets, and develop strategies in national health plans ²³. Biases can also impact rapidly growing and emerging fields such as digital health, precision medicine, and the use of artificial intelligence (AI), as these technologies still do not account for gender bias detection ²⁴.

Some efforts have already been set in motion to start addressing these problems, like the policy of female mice inclusion and sex as a biological variable in clinical trials and scientific studies in 2016 by the U.S. National Institutes of Health (NIH) ^{1,25}. Group advocates have also focused on raising awareness for specific diseases ^{15,26}. However, little has been done on the implications of gender health data bias for summary indicators of health. More effort is needed to translate clinical research into population-level statistics ^{27,28}. In that regard, a closer collaboration between demographers, population health experts and medical specialists is required. For instance, the framework of compression and expansion of morbidity could be used to evaluate whether age at onset and disease progression patterns in men and women are impacted by those data gaps ^{29,30}. The gender paradox – or the fact that women live longer than men, but in poorer health – could also be tested to understand if it happens partly due to a lack of knowledge or proper understanding of diseases that mainly impact women ^{31,32,33}. Incorporating demographic analysis would allow alternative questions to be asked, such as: are the results upon which research currently builds accurately reflecting the health of populations by age or are they biased due to missing or inconsistent gender evidence? How do those biases, if and when they exist, impact population-level statistics such as healthy life expectancy indicators? If yes, to what extent are policies based on those population-level statistics missing the actual people they target? Lastly, innovative approaches using machine learning and demographic data and technique are a promising field and have already been devised to estimate neonatal mortality, regional disease prevalence estimates, and the role of gender bias on model accuracy ^{34,35,36,37}.

The gender health data gap is not trivial and has most likely prevented important advances in knowledge, treatment, and diagnosis of several health conditions. Disciplines, funding agencies, stakeholders, academic institutions, health care systems and the pharmaceutical industry must undertake a concerted effort to identify and bridge the gender health data gap.

Additional information

ORCID: Vanessa di Lego (0000-0002-1317-3037).

Acknowledgments

This study was supported by the European Research Council within the EU Framework Programme for Research and Innovation Horizon 2020 – ERC Grant Agreement n. 725187 (LETHE).

References

- Shansky RM, Murphy AZ. Considering sex as a biological variable will require a global shift in science culture. *Nat Neurosci* 2021; 24:457-64.
- Polack FP, Thomas SJ, Kitchin N, Absalon J, Gurtman A, Lockhart S, et al. Safety and efficacy of the BNT162b2 mRNA COVID-19 vaccine. *N Engl J Med* 2020; 383:2603-15.
- Dusenbery M. Doing harm: the truth about how bad medicine and lazy science leave women dismissed, misdiagnosed, and sick. San Francisco: HarperOne; 2018.
- Perez CC. Invisible women: data bias in a world designed for men. New York: Abrams Press; 2019.
- McGregor AJ. Sex matters: how male-centric medicine endangers women's health and what we can do about it. Paris: Hachette Go; 2020.
- Beery AK, Zucker I. Sex bias in neuroscience and biomedical research. *Neurosci Biobehav Rev* 2011; 35:565-72.
- Hay K, McDougal L, Percival V, Henry S, Klugman J, Wurie H, et al. Disrupting gender norms in health systems: making the case for change. *Lancet* 2019; 393:2535-49.
- Zucker I, Prendergast BJ. Sex differences in pharmacokinetics predict adverse drug reactions in women. *Biol Sex Differ* 2020; 11:32.
- Tamargo J, Rosano G, Walther T, Duarte J, Niessner A, Kaski J, et al. Gender differences in the effects of cardiovascular drugs. *Eur Heart J Cardiovasc Pharmacother* 2017; 3:163-82.
- Steinberg JR, Turner BE, Weeks BT, Magnani CJ, Wong BO, Rodriguez F, et al. Analysis of female enrollment and participant sex by burden of disease in US clinical trials between 2000 and 2020. *JAMA Netw Open* 2021; 4:e2113749.
- Dekker MJHJ, de Vries ST, Versantvoort CHM, Drost-van Velze EGE, Bhatt M, van Meer PJK, et al. Sex proportionality in pre-clinical and clinical trials: an evaluation of 22 marketing authorization application dossiers submitted to the European Medicines Agency. *Front Med (Lausanne)* 2021; 8:643028.
- Ferretti MT, Martinkova J, Biskup E, Benke T, Gialdini G, Nedelska Z, et al. Sex and gender differences in Alzheimer's disease: current challenges and implications for clinical practice. *Eur J Neurol* 2020; 27:928-43.
- Mirin AA. Gender disparity in the funding of diseases by the U.S. National Institutes of Health. *J Womens Health (Larchmt)* 2021; 30:956-63.
- Spencer RJ, Rice LW, Ye C, Woo K, Uppal S. Disparities in the allocation of research funding to gynecologic cancers by Funding to Lethality scores. *Gynecol Oncol* 2019; 152:106-11.
- Castro-Aldrete L, Moser MV, Putignano G, Ferretti MT, Schumacher Dimech A, Santucione Chadha A. Sex and gender considerations in Alzheimer's disease: The Women's Brain Project contribution. *Front Aging Neurosci* 2023; 15:1105620.
- Baggio G, Corsini A, Floreani A, Giannini S, Zagonel V. Gender medicine: a task for the third millennium. *Clin Chem Lab Med* 2013; 51:713-27.
- Wilkinson C, Bebb O, Dondo TB, Munyombwe T, Casadei B, Clarke S, et al. Sex differences in quality indicator attainment for myocardial infarction: a nationwide cohort study. *Heart* 2019; 105:516-23.
- Khera S, Kolte D, Gupta T, Subramanian KS, Khanna N, Aronow WS, et al. Temporal trends and sex differences in revascularization and outcomes of ST-segment elevation myocardial infarction in younger adults in the United States. *J Am Coll Cardiol* 2015; 66:1961-72.
- Mainz J, Andersen G, Valentin JB, Gude MF, Johnsen SP. Disentangling sex differences in use of reperfusion therapy in patients with acute ischemic stroke. *Stroke* 2020; 51:2332-8.
- Nguyen JT, Berger AK, Duval S, Luepker RV. Gender disparity in cardiac procedures and medication use for acute myocardial infarction. *Am Heart J* 2008; 155:862-8.
- Peralta A, Benach J, Borrell C, Espinel-Flores V, Cash-Gibson L, Queiroz BL, et al. Evaluation of the mortality registry in Ecuador (2001-2013) – social and geographical inequalities in completeness and quality. *Popul Health Metr* 2019; 17:3.
- Hamberg K. Gender bias in medicine. *Womens Health (Lond)* 2008; 4:237-43.
- Spitzer S, Weber D. Reporting biases in self-assessed physical and cognitive health status of older Europeans. *PLoS One* 2019; 14:e0223526.

24. Cirillo D, Catuara-Solarz S, Morey C, Guney E, Subirats L, Mellino S, et al. Sex and gender differences and biases in artificial intelligence for biomedicine and healthcare. *npj Digit Med* 2020; 3:81.
25. NIH Office of Research on Women's Health. NIH policy on sex as a biological variable. <https://orwh.od.nih.gov/sex-gender/nih-policy-sex-biological-variable> (accessed on Apr/2023).
26. Vogel B, Acevedo M, Appelman Y, Merz CNB, Chieffo A, Figtree GA, et al. The Lancet Women and Cardiovascular Disease Commission: reducing the global burden by 2030. *Lancet* 2021; 397:2385-438.
27. Arnegard ME, Whitten LA, Hunter C, Clayton JA. Sex as a biological variable: a 5-year progress report and call to action. *J Womens Health (Larchmt)* 2020; 29:858-64.
28. White J, Tannenbaum C, Klinge I, Schiebinger L, Clayton J. The integration of sex and gender considerations into biomedical research: lessons from international funding agencies. *J Clin Endocrinol Metab* 2021; 106:3034-48.
29. Beltrán-Sánchez H, Jiménez MP, Subramanian S V. Assessing morbidity compression in two cohorts from the Health and Retirement Study. *J Epidemiol Community Health* 2016; 70:1011-6.
30. Crimmins EM, Kim JK, Solé-Auró A. Gender differences in health: results from SHARE, ELSA and HRS. *Eur J Public Health* 2011; 21:81-91.
31. Luy M, Minagawa Y. Gender gaps: life expectancy and proportion of life in poor health. *Health Rep* 2014; 25:12-9.
32. Austad SN. Why women live longer than men: sex differences in longevity. *Gend Med* 2006; 3:79-92.
33. di Lego V, Lazarevič P, Luy M. The Male-Female Health-Mortality Paradox. In: Gu D, Dupre ME, editors. *Encyclopedia of gerontology and population aging*. New York: Springer; 2020. p. 1-8.
34. Luo W, Nguyen T, Nichols M, Tran T, Rana S, Gupta S, et al. Is demography destiny? Application of machine learning techniques to accurately predict population health outcomes from a minimal demographic dataset. *PLoS One* 2015; 10:e0125602.
35. Wu Y, Xiang C, Jia M, Fang Y. Interpretable classifiers for prediction of disability trajectories using a nationwide longitudinal database. *BMC Geriatr* 2022; 22:627.
36. Beluzo CE, Alves LC, Martins Arruda N, Sepetauskas C, Silva E, Carvalho T. NeMoR: a new method based on data-driven for neonatal mortality rate forecasting. *medRxiv* 2021; 25 apr. <https://www.medrxiv.org/content/10.1101/2021.04.22.21255916v1.full>.
37. Chung H, Park C, Kang WS, Lee J. Gender bias in artificial intelligence: severity prediction at an early stage of COVID-19. *Front Physiol* 2021; 12:778720.

Submitted on 04/Apr/2023

Final version resubmitted on 20/Jun/2023

Approved on 23/Jun/2023