# Prevalence of 12 Common Health Conditions inSexual and Gender Minority Participants in the All of Us Research Program 

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#### Abstract

IMPORTANCE Limited data describe the health status of sexual or gender minority (SGM) people due to inaccurate and inconsistent ascertainment of gender identity, sex assigned at birth, and sexual orientation.

OBJECTIVE To evaluate whether the prevalence of 12 health conditions is higher among SGM adults in the All of Us Research Program data compared with cisgender heterosexual (non-SGM) people.

DESIGN, SETTING, AND PARTICIPANTS This cross-sectional study used data from a multidisciplinary research consortium, the All of Us Research Program, that links participantreported survey information to electronic health records (EHR) and physical measurements. In total, 372082 US adults recruited and enrolled at an All of Us health care provider organization or by directly visiting the enrollment website from May 31, 2017, to January 1, 2022, and were assessed for study eligibility.

EXPOSURES Self-identified gender identity and sexual orientation group.

MAIN OUTCOMES AND MEASURES Twelve health conditions were evaluated: 11 using EHR data and 1, body mass index (BMI; calculated as weight in kilograms divided by height in meters squared), using participants' physical measurements. Logistic regression (adjusting for age, income, and employment, enrollment year, and US Census division) was used to obtain adjusted odds ratios (AORs) for the associations between each SGM group and health condition compared with a non-SGM reference group.

RESULTS The analytic sample included 346868 participants (median [IQR] age, 55 [39-68] years; 30763 [8.9\%] self-identified as SGM). Among participants with available BMI (80.2\%) and EHR data (69.4\%), SGM groups had higher odds of anxiety, depression, HIV diagnosis, and tobacco use disorder but lower odds of cardiovascular disease, kidney disease, diabetes, and hypertension. Estimated associations for asthma (AOR, 0.39 [ $95 \% \mathrm{Cl}, 0.24-0.63$ ] for gender diverse people assigned male at birth; AOR, 0.51 [ $95 \% \mathrm{Cl}, 0.38-0.69$ ] for transgender women), a BMI of 25 or higher (AOR, 1.65 [ $95 \% \mathrm{Cl}, 1.38-1.96$ ] for transgender men), cancer (AOR, 1.15 [ $95 \% \mathrm{Cl}, 1.07-1.23$ ] for cisgender sexual minority men; AOR, 0.88 [ $95 \% \mathrm{Cl}, 0.81-0.95$ ] for cisgender sexual minority women), and substance use disorder (AOR, 0.35 [ $95 \% \mathrm{Cl}, 0.24-0.52$ ] for gender diverse people assigned female at birth; AOR, 0.65 [ $95 \% \mathrm{Cl}, 0.49-0.87$ ] for transgender men) varied substantially across SGM groups compared with non-SGM groups.

CONCLUSIONS AND RELEVANCE In this cross-sectional analysis of data from the All of Us Research Program, SGM participants experienced health inequities that varied by group and condition. The All


(continued)

## Key Points

Question Is the prevalence of certain health conditions higher among sexual and gender minority (SGM) people in the US compared with cisgender and heterosexual (non-SGM) people?

Findings In this cross-sectional study of 30763 SGM and 316105 non-SGM adults enrolled in the All of Us Research Program, the odds of 8 health conditions were significantly higher in at least 1 of 6 SGM groups compared with their non-SGM counterparts.

Meaning The findings of this study suggest that there are disparities for certain health conditions among SGM adults compared with their non-SGM counterparts.

Invited Commentary

+ Supplemental content
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Abstract (continued)
of Us Research Program can be a valuable resource for conducting health research focused on SGM people.

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## Introduction

Sexual and gender minority (SGM) people, including individuals who identify as asexual, bisexual, gay, intersex, lesbian, nonbinary, queer, transgender, or two-spirit, represent a growing population in the US. Although estimates vary, approximately $7.2 \%$ of US adults identify as lesbian, gay, bisexual, transgender, and queer or questioning. ${ }^{1}$ Due to stigma, discrimination, and minority stress (ie, prejudicial events, expectation of rejection, identity concealment, or internalized homophobia), SGM people often experience greater health and health care inequities relative to their cisgender heterosexual counterparts. ${ }^{2-5}$ (Cisgender refers to individuals whose gender identity aligns with the gender commonly associated with the sex assigned to them at birth.) These health inequities include difficulties accessing equitable and culturally competent health care services, chronic health conditions, infectious diseases, mental health, and substance use. ${ }^{6-28}$ The National Institutes of Health has recognized SGM people as a "health disparity population for research." ${ }^{29}$ However, resolving these inequities is hindered by data quality issues, such as inadequate sample sizes and limited social and biomedical data. ${ }^{30,31}$ These limitations can bias research findings, ${ }^{32}$ prevent data disaggregation of SGM populations to evaluate social and clinical exposures on health outcomes (eg, transgender people, gender diverse people, and minoritized racial or ethnic groups), and may negatively affect SGM health care practices.

There are compelling needs for larger and more diverse SGM samples that integrate multiple data sources to identify health inequities and inform treatments and policies for intervention. Prior research has relied on small convenience samples, but studies have increasingly used populationbased surveys ${ }^{6-9,11,13,16,17,21}$ and electronic health records (EHRs) to examine health disparities among SGM populations. ${ }^{18,33,34}$ Although population-based surveys are often used to produce weighted estimates representative of a target population, ${ }^{35,36}$ EHR data also have the potential to improve health care quality for SGM populations. Recent developments in methods to identify transgender people in claims data, in the absence of gender identity data, have provided promising results. ${ }^{37,38}$ However, such data sources are flawed for examining SGM health inequities due to their inaccurate and inconsistent ascertainment of gender identity, sex assigned at birth, and sexual orientation. ${ }^{30,31}$ To increase overall participation and meet specific community health needs, scholars and advocates have called for community-engaged research to forge relationships with populations underrepresented in biomedical research. ${ }^{39,40}$ However, community-engaged research often lacks large volumes of diverse participants and comprehensive EHR data. Integrating data across sources to improve data quality could advance prevention and treatment of disease for SGM populations.

The National Institutes of Health's All of Us Research Program addresses these current challenges. It is a national, community-engaged program that aims to improve health and health care practices by partnering with 1 million volunteer participants, mostly from communities historically underrepresented in biomedical research across the US. ${ }^{41}$ The program links participant-reported information (including sexual orientation, gender identity, and sex assigned at birth) with EHR data, biospecimens, physical measurements, genomic data, and digital health technologies, cleaning, sorting, and unifying these disparate data to create a single repository (ie, data harmonization). With the large volume of All of Us data from different sources, demonstration projects are necessary to describe the cohort and illustrate the data quality for future health research. ${ }^{42}$ Therefore, this study aims to evaluate the potential of the All of Us data for SGM health disparities research by describing the sociodemographic and health conditions of SGM people compared with non-SGM people.

## Methods

## Data Sources and Participants

We conducted a cross-sectional analysis using the controlled tier v6 curated data repository
(C2O22Q2R2) of the All of Us Research Program. ${ }^{41}$ Data were collected for US rfesidents aged 18 years or older who enrolled from May 31, 2017, to January 1, 2022, through a health care provider organization or the enrollment website. Available data sources were harmonized using the Observational Medical Outcomes Partnership Common Data Model (version 5.2) by the All of Us Data and Research Center. ${ }^{41}$ Data sources included health surveys administered in English or Spanish, physical measurements, and EHR-documented health conditions (eTable 1 in Supplement 1). This study was approved by the All of Us Research Program Science Committee, and the requirement for informed consent was waived by the All of Us Institutional Review Board because it was considered nonhuman participants research. This study followed the Strengthening the Reporting of Observational Studies in Epidemiology (STROBE) guideline for cross-sectional studies. ${ }^{43}$

Descriptive analysis excluded some of 372082 participants eligible in All of Us for the following reasons (Figure 1): (1) a "no matching concept" value for sex assigned at birth indicating missing data due to a technological error that resulted in previous selections being overwritten with null values or that the participant skipped the item; (2) participants skipping sex assigned at birth, preferring not to answer, or reporting "intersex" or "none of these"; (3) participants skipping gender identity or preferring not to answer; and (4) cisgender participants skipping sexual orientation or reporting "have not figured out," "don't think of yourself as having sexuality," "don't use labels," or "don't know". Data were collected on intersex participants but excluded from this analysis due to small sample size and privacy concerns.


No matching concept refers to missing data in the All of Us curated data repository due to a technological error that resulted in previous selections being overwritten with null values (or the participant skipped the item). BMI indicates body mass index; EHR, electronic health record.

## Measures

## Sexual Orientation- or Gender Identity-Based Groups

Participants provided their self-identified gender identity, sex assigned at birth, and sexual orientation, and their responses were categorized into 8 mutually exclusive categories (eTable 2 in Supplement 1): (1) cisgender heterosexual men, (2) cisgender heterosexual women, (3) cisgender sexual minority men, (4) cisgender sexual minority women, (5) gender diverse (ie, outside of the man or woman binary) people assigned female sex at birth (AFAB) of any sexual orientation, (6) gender diverse people assigned male sex at birth (AMAB) of any sexual orientation, (7) transgender men of any sexual orientation, and (8) transgender women of any sexual orientation. These categories were selected to highlight the diversity of SGM populations and encompass groups affected by cisheterosexism, a sociostructural system that privileges cisgender heterosexual identities at the expense of marginalizing SGM individuals.

## Patient-Reported Outcome Measures

We assessed physical and mental health using 2 subscales from the Patient-Reported Outcomes Measurement Information System (PROMIS) Global Health survey (version 1.0). ${ }^{44}$ The PROMIS physical health (PROMIS-PH) subscale consists of 4 items on physical health, physical functioning, pain, and fatigue, and the PROMIS mental health (PROMIS-MH) subscale includes 4 items on mental health, emotional problems, satisfaction with discretionary social activities, and quality of life. ${ }^{44}$ Responses, aside from pain, were based on a 5-point Likert scale (range, 1-5), with higher values representing better health. Pain was scored from 0 to 10 but was rescored to a 5 -point scale as recommended by Hays et al ${ }^{44}(0=1 ; 1-3=2 ; 4-6=3 ; 7-9=4 ; 10=5$, with higher values representing worse pain). Raw scores were calculated for each subscale (range, 4-20) and standardized to $T$ score values with a mean of 50 and standard deviation of $10 .{ }^{45}$ PROMIS-PH scores less than 42 and PROMIS-MH scores less than 40 were used as established $T$ score cutoffs for poor or fair health ratings. ${ }^{46}$

## Substance Use

Participants' substance use was assessed using 3 measures: the Alcohol Use Disorders Identification Test-Concise (AUDIT-C) scale, questions about any substance use in the previous 3 months (eg, cannabis, cocaine, stimulants, inhalants, sedatives, hallucinogens, and opioids), and current tobacco smoking status. The AUDIT-C scale contains 3 items: frequency of alcohol use, number of daily alcohol drinks, and frequency of binge drinking, ${ }^{47}$ with responses on a 5-point Likert scale (range, $0-4$ ) and scores calculated by summing across items (range, 0-12). Past-year hazardous alcohol consumption was determined based on established cutoffs by gender groups (women, $\geq 3$; men, $\geq 4$ ), ${ }^{48}$ and both cutoffs were reported for gender diverse participants.

## Health Conditions

We calculated body mass index (BMI; calculated as weight in kilograms divided by height in meters squared). A BMI of 25.0 or higher was considered overweight or obese. We extracted Systematized Nomenclature of Medicine (SNOMED) codes for 11 additional health conditions broadly defined as anxiety, asthma, cancer, cardiovascular disease (ie, myocardial infarction, stroke, and coronary artery disease), chronic kidney disease, depression, diabetes, HIV diagnosis, hypertension, substance use, and tobacco use (eTable 1 in Supplement 1). For each health condition, we required a SNOMED code to be reported on at least 2 different dates to indicate the presence of the condition.

## Covariates

Our analysis accounted for age, household income, employment, enrollment year, and US census division in adjusted models. In addition to gender identity, sex assigned at birth, and sexual orientation, we included data on self-reported racial and/or ethnic identity (African American or Black, Asian, Hispanic or Latinx, Middle Eastern or North African, Native Hawaiian or Other Pacific

Islander, or White), educational level, homeownership, and health insurance status to describe the sample.

## Statistical Analysis

Data were analyzed from November 20, 2022, to May 23, 2023. We evaluated differences in key characteristics between SGM and non-SGM groups. Using logistic regression, we conducted a complete case analysis among participants with available physical measurements and EHR data by comparing differences for each health condition between cisgender sexual minority groups and groups of gender minority participants of any sexual orientation with their cisgender heterosexual counterparts. Gender diverse participants were compared with cisgender heterosexual men and cisgender heterosexual women due to limited data on how cisheterosexism perpetuates health inequities for gender diverse individuals when compared with cisgender heterosexual counterparts. We pursued a complete case analysis because the overall focus of demonstration projects is to describe the utility of All of Us data, but we also evaluated the proportion of missingness in the overall sample and among participants with BMI and EHR data to understand how it may have biased our results (eTable 3 in Supplement 1). For sociodemographic, PROMIS, AUDIT-C, and the selfreported substance use and smoking status, we treated missingness as a separate category, indicating nonresponse due to skipping or preferring not to answer the survey question.

We conducted a post hoc analysis to assess whether the robustness of our findings was modified by residual confounding. We used inverse probability weights to generate a pseudopopulation that balanced measured covariates between SGM groups and their non-SGM counterparts. We estimated propensity scores using logistic regression and assessed conditional exchangeability through density plots (eFigure 2 in Supplement 1). To ensure covariate balance, we evaluated standardized mean differences (eFigures 3 and 4 in Supplement 1). We then refitted our models to estimate the propensity score-weighted odds ratios (ORs).

All analyses were conducted in the All of Us Researcher Workbench (a cloud-based analytic platform) in R, version 4.2, ${ }^{49}$ using the Weightlt package to estimate the weights. ${ }^{50}$ We reported adjusted ORs (AORs) and $95 \%$ Cls for the primary findings. Statistical significance was defined as a $95 \%$ Cl excluding 1. Results followed the All of Us Data and Statistics Dissemination Policy disallowing disclosure of cell counts from 1 to 19. ${ }^{51}$

## Results

Of 372082 potential participants, 346868 (93.2\%) included in the descriptive analysis (Figure 1) had a median (IQR) age of 55 years (39-68) years; 70755 (20.4\%) were African American or Black, 14237 (4.1\%) were Asian, 62357 (18.0\%) were Hispanic or Latinx, 3647 (1.1\%) were Middle Eastern or North African, 880 (0.3\%) were Native Hawaiian or Other Pacific Islander, and 201128 (58.0\%) were White; 30763 (8.9\%) identified as SGM; and 316105 (91.1\%) identified as non-SGM (eTable 3 in Supplement 1). In the SGM group, 10980 participants ( $35.7 \%$ ) were cisgender sexual minority men, 16096 participants ( $52.3 \%$ ) were cisgender sexual minority women, 1433 participants ( $4.7 \%$ ) were gender diverse people AFAB, 482 participants ( $1.6 \%$ ) were gender diverse people AMAB, 923 participants (3.0\%) were transgender men, and 849 participants ( $2.8 \%$ ) were transgender women (Table 1). Overall, SGM groups were younger (median age range, 32-51 years for 6 SGM groups vs 55-59 years for 2 non-SGM groups), had a higher proportion of individuals with median household incomes less than $\$ 25000$ annually (range, $31.7 \%-43.4 \%$ for 6 SGM groups vs $24.2 \%-26.6 \%$ for 2 non-SGM groups), and a lower median percentage of homeownership (range, 20.4\%-33.3\% for 6 SGM groups vs $46.7 \%-48.3 \%$ for 2 non-SGM groups). However, differences in minoritized racial and/or ethnic identity, educational level, and employment varied considerably across SGM and non-SGM groups. More detailed information on sociodemographic characteristics, PROMIS and AUDIT-C scores, substance use, and tobacco smoking is given in eTable 3 in Supplement 1 for the analytic sample and by SGM group in Table 1.
Table 1. Sociodemographic Characteristics, Physical and Mental Health, and Self-Reported Substance Use of 346950 Participants in the All of Us Research Program by Sexual Orientation
and Gender Identity Groups

| Characteristic | Participants, No. (\%) |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Cisgender heterosexual men | Cisgender heterosexual women | Cisgender sexual minority men | Cisgender sexual minority women | Gender diverse people AFAB | Gender diverse people AMAB | Transgender men | Transgender women |
| Total No. of participants | 120568 | 195537 | 10980 | 16096 | 1433 | 482 | 923 | 849 |
| Age, mean (IQR), y | 59 (43-70) | 55 (39-67) | 51 (36-63) | 38 (30-53) | 32 (26-41) | 36 (29-50) | 40 (30-55) | 48 (35-62) |
| Race and ethnicity ${ }^{\text {a,b }}$ |  |  |  |  |  |  |  |  |
| African American or Black | 26705 (22.2) | 38110 (19.5) | 2180 (19.9) | 3181 (19.8) | 124 (8.7) | 53 (11.0) | 190 (20.6) | 212 (25.0) |
| Asian | 4927 (4.1) | 7964 (4.1) | 472 (4.3) | 684 (4.3) | 95 (6.6) | 36 (7.5) | 35 (3.8) | 24 (2.8) |
| Hispanic or Latinx | 18383 (15.3) | 38931 (19.9) | 1724 (15.7) | 25,75 (16.0) | 160 (11.2) | 56 (11.6) | 321 (34.8) | 213 (25.1) |
| Middle Eastern or North African | 1401 (1.2) | 1865 (1.0) | 139 (1.3) | 170 (1.1) | 33 (2.3) | $<20$ | $<20$ | $<20$ |
| Native Hawaiian or Other Pacific Islander | 312 (0.3) | 461 (0.2) | 36 (0.3) | 56 (0.3) | <20 | 0 | <20 | <20 |
| White | 69674 (57.8) | 111942 (57.3) | 6820 (62.0) | 10401 (64.6) | 1151 (80.3) | 344 (71.4) | 390 (42.3) | 406 (47.8) |
| Sexual orientation ${ }^{\text {a,b }}$ |  |  |  |  |  |  |  |  |
| Asexual | 0 | 0 | 82 (0.8) | 323 (2.0) | 104 (7.3) | $<20$ | $<20$ | <20 |
| Bisexual | 0 | 0 | 2804 (25.5) | 9636 (59.9) | 409 (28.5) | 117 (24.3) | 135 (14.6) | 141 (16.6) |
| Gay | 0 | 0 | 7587 (69.1) | 484 (3.0) | 56 (3.9) | 109 (22.6) | 73 (7.9) | 84 (9.9) |
| Lesbian | 0 | 0 | 39 (0.4) | 4240 (26.3) | 211 (14.7) | <20 | 48 (5.2) | 98 (11.5) |
| Mostly straight | 0 | 0 | 156 (1.4) | 506 (3.1) | $<20$ | $<20$ | $<20$ | $<20$ |
| Queer | 0 | 0 | 42 (0.4) | 311 (1.9) | 289 (20.2) | 56 (11.6) | 48 (5.2) | $<20$ |
| Polysexual, omnisexual, sapiosexual, or pansexual | 0 | 0 | 81 (0.7) | 408 (2.5) | 149 (10.4) | 42 (8.7) | 29 (3.1) | 24 (2.8) |
| Straight | 120568 (100) | 195537 (100) | 225 (2.1) | 695 (4.3) | 109 (7.6) | 93 (19.3) | 455 (49.3) | 355 (41.8) |
| Two-spirit | 0 | 0 | 33 (0.3) | $<20$ | $<20$ | $<20$ | $<20$ | $<20$ |
| Gender identity ${ }^{\text {a }}$ |  |  |  |  |  |  |  |  |
| Genderfluid, genderqueer, gender variant, unsure, specific gender, or two spirit | 0 | 0 | 0 | 0 | 169 (11.8) | 87 (18.1) | 0 | 0 |
| Man | 120568 (100) | 0 | 10980 (100) | 0 | 0 | 0 | 486 (52.7) | 0 |
| Nonbinary | 0 | 0 | 0 | 0 | 1236 (86.3) | 380 (78.8) | 0 | 0 |
| Transgender | 0 | 0 | 0 | 0 | 244 (17.0) | 64 (13.3) | 353 (38.2) | 418 (49.2) |
| Woman | 0 | 195537 (100) | 0 | 16096 (100) | 0 | 0 | 0 | 386 (45.5) |
| Annual household income, \$ |  |  |  |  |  |  |  |  |
| $<25000$ | 32028 (26.6) | 47316 (24.2) | 3479 (31.7) | 5349 (33.2) | 472 (32.9) | 173 (35.9) | 383 (41.5) | 368 (43.4) |
| 25000-49999 | 15783 (13.1) | 31450 (16.1) | 1926 (17.5) | 3060 (19.0) | 330 (23.0) | 96 (19.9) | 131 (14.2) | 117 (13.8) |
| 50000-99 999 | 21587 (17.9) | 38580 (19.7) | 2099 (19.1) | 3067 (19.1) | 289 (20.2) | 78 (16.2) | 107 (11.6) | 85 (10.0) |
| 100 000-149 999 | 12795 (10.6) | 19732 (10.1) | 1075 (9.8) | 1421 (8.8) | 107 (7.5) | 48 (10.0) | 40 (4.3) | 44 (5.2) |
| $\geq 150000$ | 15788 (13.1) | 20461 (10.5) | 1204 (11.0) | 1328 (8.3) | 94 (6.6) | 40 (8.3) | 40 (4.3) | 36 (4.2) |
| Prefer to not answer or skipped | 22587 (18.7) | 37998 (19.4) | 1197 (11.0) | 1871 (11.6) | 141 (9.8) | 47 (9.8) | 222 (24.1) | 199 (23.4) |
| Some college or higher | 79708 (66.1) | 141414 (72.3) | 8438 (76.8) | 11753 (73.0) | 1219 (85.1) | 374 (77.6) | 489 (53.0) | 421 (49.6) |
| Employed for wages | 43823 (36.4) | 88547 (45.3) | 4977 (45.3) | 8248 (51.2) | 838 (58.5) | 238 (49.4) | 362 (39.2) | 290 (34.2) |
| Own a home | 56271 (46.7) | 94365 (48.3) | 3656 (33.3) | 4745 (29.5) | 320 (22.3) | 118 (24.5) | 188 (20.4) | 190 (22.4) |
| Health insurance | 106726 (88.5) | 181527 (92.8) | 9974 (90.8) | 14704 (91.4) | 1345 (93.9) | 439 (91.1) | 757 (82.0) | 718 (84.6) |

Table 1. Sociodemographic Characteristics, Physical and Mental Health, and Self-Reported Substance Use of 346950 Participants in the All of Us Research Program by Sexual Orientation

| Characteristic | Participants, No. (\%) |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Cisgender heterosexual men | Cisgender heterosexual women | Cisgender sexual minority men | Cisgender sexual minority women | Gender diverse people AFAB | Gender diverse people AMAB | Transgender men | Transgender women |
| PROMIS ${ }^{\text {c }}$ |  |  |  |  |  |  |  |  |
| GPH poor or fair | 21039 (17.5) | 41305 (21.1) | 1812 (16.5) | 4007 (24.9) | 407 (28.4) | 89 (18.5) | 241 (26.1) | 212 (25.0) |
| GMH poor or fair | 15641 (13.0) | 26590 (13.6) | 2196 (20.0) | 4338 (27.0) | 606 (42.3) | 172 (35.7) | 253 (27.4) | 237 (27.9) |
| AUDIT-C score ${ }^{\text {d }}$ |  |  |  |  |  |  |  |  |
| $\geq 3$ | ND | 58082 (29.7) | ND | 6466 (40.2) | 492 (34.3) | 217 (45.0) | ND | 278 (32.7) |
| $\geq 4$ | 38187 (31.7) | ND | 3817 (34.8) | ND | 306 (21.4) | 167 (34.7) | 169 (18.3) | ND |
| Substance use in previous 3 mo | 11655 (9.7) | 14489 (7.4) | 1300 (11.8) | 2339 (14.5) | 241 (16.8) | 61 (12.7) | 116 (12.6) | 112 (13.2) |
| Current smoker | 26670 (22.1) | 23052 (11.8) | 2492 (22.7) | 3418 (21.2) | 140 (9.8) | 93 (19.3) | 176 (19.1) | 219 (25.8) |
| Enrollment year |  |  |  |  |  |  |  |  |
| 2017-2018 | 34848 (28.9) | 60502 (30.9) | 3411 (31.1) | 4652 (28.9) | 322 (22.5) | 123 (25.5) | 250 (27.1) | 227 (26.7) |
| 2019 | 55040 (45.7) | 86611 (44.3) | 4602 (41.9) | 6519 (40.5) | 521 (36.4) | 182 (37.8) | 471 (51.0) | 406 (47.8) |
| 2020 | 16994 (14.1) | 25753 (13.2) | 1502 (13.7) | 2234 (13.9) | 220 (15.4) | 69 (14.3) | 108 (11.7) | 103 (12.1) |
| 2021-2022 | 13686 (11.4) | 22671 (11.6) | 1465 (13.3) | 2691 (16.7) | 370 (25.8) | 108 (22.4) | 94 (10.2) | 113 (13.3) |

[^0]Measurement availability differed with BMI measurements for 278128 participants ( $80.2 \%$ ) and with EHR data for 240841 participants (69.4\%), with gender diverse people AFAB having the highest percentage of missing BMI (42.6\%) and EHR (50.6\%) data (eFigure 1 in Supplement 1). Among participants with available BMI and EHR data, compared with non-SGM groups, SGM groups had a higher prevalence of anxiety, depression, and HIV diagnosis but a lower prevalence of cancer, cardiovascular disease, kidney disease, diabetes, and hypertension (Table 2). Prevalence of asthma, BMI 25 or higher, substance use disorder, and tobacco use disorder varied more substantially across SGM and non-SGM groups. Unadjusted ORs of these health conditions are presented in eTables 4 to 11 in Supplement 1.

After accounting for age, income, employment status, enrollment year, and US census division, SGM groups more frequently had higher odds of anxiety, depression, HIV diagnosis, and tobacco use disorder but lower odds of cardiovascular disease, kidney disease, diabetes, and hypertension
(Figure 2 and Figure 3; eTables 4 to 11 in Supplement 1). Estimated associations for cancer only varied between cisgender sexual minority men (AOR, 1.15; 95\% CI, 1.07-1.23) and cisgender sexual minority women (AOR, $0.88 ; 95 \% \mathrm{Cl}, 0.81-0.95$ ) compared with their cisgender heterosexual counterparts (eTable 4 and eTable 5 in Supplement 1). We also found considerable variation by SGM group for asthma, BMI of 25 or higher, and substance use disorder. Gender diverse people AMAB (AOR, 0.39; $95 \% \mathrm{Cl}, 0.24-0.63$ ) and transgender women (AOR, $0.51 ; 95 \% \mathrm{Cl}, 0.38-0.69$ ) had lower odds of asthma compared with cisgender heterosexual women although all other SGM groups had higher odds of asthma compared with non-SGM groups (eTables 9 and 11 in Supplement 1). Similarly, gender diverse people AFAB (AOR, 0.35; 95\% CI, 0.24-0.52) and transgender men (AOR, 0.65; 95\% CI, 0.49-0.87) had lower odds of substance use disorder compared with cisgender heterosexual men (eTables 6 and 10 in Supplement 1). In addition, compared with cisgender heterosexual men, transgender men had higher odds of BMI 25 or higher (AOR, 1.65; 95\% CI, 1.38-1.96) (eTable 10 in Supplement 1). Other SGM groups had lower odds compared with non-SGM groups.

Table 2. Health Conditions of All of Us Research Program Participants by Sexual Orientation and Gender Identity Group

| Condition | Participants, No. (\%) |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Cisgender heterosexual men | Cisgender heterosexual women | Cisgender sexual minority men | Cisgender sexual minority women | Gender diverse people AFAB | Gender diverse people AMAB | Transgender men | Transgender women |
| EHR condition ( $\mathrm{n}=240841$ ), No. ${ }^{\text {a }}$ | 83890 | 137593 | 7183 | 10028 | 707 | 287 | 573 | 580 |
| Anxiety | 12195 (14.5) | 30745 (22.3) | 1626 (22.6) | 2946 (29.4) | 251 (35.5) | 79 (27.6) | 150 (26.2) | 123 (21.2) |
| Asthma | 6288 (7.5) | 18827 (13.7) | 656 (9.1) | 1694 (16.9) | 119 (16.8) | $<20$ | 76 (13.3) | 45 (7.8) |
| Cancer | 12254 (14.6) | 17119 (12.4) | 831 (11.6) | 665 (6.6) | 29 (4.1) | 20 (7.0) | 38 (6.6) | 43 (7.4) |
| Cardiovascular disease | 13246 (15.8) | 11116 (8.1) | 798 (11.1) | 450 (4.5) | 23 (3.3) | <20 | 36 (6.3) | 47 (8.1) |
| Chronic kidney disease | 7417 (8.8) | 7318 (5.3) | 507 (7.1) | 271 (2.7) | <20 | <20 | 30 (5.2) | 33 (5.7) |
| Depression | 12398 (14.8) | 30310 (22.0) | 1790 (24.9) | 2883 (28.8) | 249 (35.2) | 74 (25.8) | 157 (27.4) | 137 (23.6) |
| Diabetes | 13810 (16.5) | 20393 (14.8) | 909 (12.7) | 1018 (10.2) | 46 (6.5) | 22 (7.7) | 83 (14.5) | 82 (14.1) |
| HIV diagnosis | 893 (1.1) | 1015 (0.7) | 1387 (19.3) | 101 (1.0) | $<20$ | $<20$ | $<20$ | 43 (7.4) |
| Hypertension | 31240 (37.2) | 44444 (32.3) | 2129 (29.6) | 2046 (20.4) | 99 (14.0) | 45 (15.7) | 147 (25.7) | 168 (29.0) |
| Substance use disorder | 7286 (8.7) | 4719 (3.4) | 752 (10.5) | 793 (7.9) | 27 (3.8) | 23 (8.0) | 49 (8.6) | 57 (9.8) |
| Tobacco use disorder | 4732 (5.6) | 6233 (4.5) | 497 (6.9) | 658 (6.6) | 27 (3.8) | <20 | 34 (5.9) | 40 (6.9) |
| BMI recorded ( $\mathrm{n}=278128$ ), No. | 100398 | 155364 | 8350 | 11462 | 804 | 332 | 715 | 703 |
| $\geq 25$ | 73063 (72.8) | 110994 (71.4) | 5585 (66.9) | 8001 (69.8) | 534 (66.4) | 188 (56.6) | 551 (77.1) | 488 (69.4) |

[^1]electronic health record.

Propensity score-weighted models largely yielded consistent findings with regression-adjusted models for 91 of 96 different comparisons (eTables 4 to 11 in Supplement 1). However, where regression models found significant differences, weighted models yielded no significant differences for gender diverse people AFAB compared with cisgender heterosexual men in the odds of cardiovascular disease (AOR, $0.71 ; 95 \% \mathrm{Cl}, 0.48-1.03$ ), diabetes (AOR, $0.86 ; 95 \% \mathrm{Cl}, 0.64-114$ ), and hypertension (AOR, $0.91 ; 95 \% \mathrm{CI}, 0.76-1.10$ ) or between gender diverse people $A F A B$ compared with cisgender heterosexual women in the odds of hypertension (AOR, 0.87; 95\% CI, 0.72-1.04) (eTable 6 and eTable 7 in Supplement 1). Compared with cisgender heterosexual women, cisgender sexual minority women had higher odds of BMI 25 or higher (AOR, 1.05; 95\% CI, 1.01-1.10) (eTable 5 in Supplement 1).

## Discussion

This cross-sectional study using one of the largest data sets of diverse SGM US adults identified several health inequities that vary by SGM group and health condition. Compared with non-SGM groups, SGM groups showed higher odds of anxiety, depression, HIV diagnosis, and tobacco use disorder but lower odds of cardiovascular disease, kidney disease, diabetes, and hypertension. There were also substantial variations across SGM groups for the odds of asthma, cancer, BMI 25 or higher, and substance use disorder. These findings highlight the need to prioritize SGM populations overall and to address the specific needs of subpopulations within SGM communities. As the All of Us Research Program continues to recruit more participants from historically underrepresented

Figure 2. Adjusted Odds Ratios of Anxiety, Asthma, Body Mass Index (BMI) of 25 or Higher, Cancer, Cardiovascular Disease, and Chronic Kidney Disease Among Sexual and Gender Minority Participants in the All of Us Research Program, by Comparison Group

Cisgender heterosexual men Cisgender heterosexual women


Models controlled for current age (continuous), annual income, employment status, enrollment year, and US census division. BMI was calculated as weight in kilograms divided by height in meters squared; CSMM indicates cisgender sexual minority men; CSMW, cisgender sexual minority women; GD-AFAB, gender diverse people assigned
female at birth of any sexual orientation; GD-AMAB, gender diverse people assigned male at birth of any sexual orientation; TM, transgender men of any sexual orientation; and TW, transgender women of any sexual orientation.
populations, further data disaggregation and subpopulation analyses will enable the study of specific mechanisms affecting health outcomes, particularly for transgender and gender diverse individuals. Overall, these findings demonstrate how the All of Us Research Program's rich biomedical data can inform research, identify health inequities, and guide policies for health promotion and treatment in SGM populations.

The present study findings support prior work among cisgender sexual minority participants ${ }^{6-15}$ and research on mental health ${ }^{18}$ and HIV diagnosis ${ }^{19,52}$ among transgender people. However, there are limited data comparing the prevalence of cardiovascular disease, kidney disease, diabetes, and hypertension among transgender and gender diverse participants with cisgender populations. In prior studies using the Behavioral Risk Factor Surveillance System, transgender and gender diverse people showed a higher prevalence of self-reported cardiovascular disease compared with cisgender populations, with no differences reported for the prevalence of diabetes, kidney disease, and hypertension. 17,22,23,28

However, our findings using the All of Us data may not be directly comparable to prior research. For example, cardiovascular disease and other chronic conditions in the Behavioral Risk Factor Surveillance System are based on self-reported responses. ${ }^{17}$ Unlike in the All of Us program, there were no available data linking self-reported gender identity and sex assigned at birth to EHR data. Additionally, EHR data are currently available only for participants associated with a health care provider organization funded by All of Us, potentially introducing ascertainment bias. Transgender and gender diverse participants who self-selected to enroll in All of Us may differ from their cisgender heterosexual counterparts in factors such as age and access to health care, which can influence cardiovascular disease prevalence and other chronic conditions. ${ }^{53}$ Efforts are being made to improve

Figure 3. Adjusted Odd Ratios of Depression, Diabetes, HIV Diagnosis, Hypertension, Substance Use Disorder, and Tobacco Use Disorder Among Sexual and Gender Minority Participants in the All of Us Research Program, by Comparison Group


Models controlled for current age (continuous), annual income, employment status, enrollment year, and US census division. CSMM indicates cisgender sexual minority men; CSMW, cisgender sexual minority women; GD-AFAB, gender diverse people assigned
female at birth of any sexual orientation; GD-AMAB, gender diverse people assigned male at birth of any sexual orientation; TM, transgender men of any sexual orientation; and TW, transgender women of any sexual orientation.

EHR data transfer and reduce missing data. Future research should consider the impact of differential selection and explore psychosocial (eg, discrimination, psychological distress, and adverse childhood experiences), behavioral (eg, diet, physical activity, alcohol use, and tobacco smoking), and clinical (eg, hypertension, diabetes, HIV, vascular dysfunction, and hormone therapy) factors that may contribute to cardiovascular disease and other chronic conditions among transgender and gender diverse populations. ${ }^{23}$

The associations presented here cannot be assumed to be caused by SGM identity or experiences, as the associations may encompass possible exposure to limited legal protections, discrimination, violence, lack of access to gender-affirming hormone therapy, and lack of robust social networks. ${ }^{54,55}$ These interrelated social and structural factors may be linked to the elevated prevalence of anxiety, asthma, depression, HIV, and substance use observed in this study. ${ }^{2,3,56-58}$ Therefore, there is a need to incorporate a theoretical basis in health disparities research that connects the observed differences to mechanisms of structural and interpersonal discrimination ${ }^{55,57,59}$ to identify effective policies and interventions for eliminating health disparities and advancing equity for SGM populations.

The present study is an example of how integrating multiple data sources (eg, health surveys, physical measurements, and EHRs) can provide a novel multidimensional view of SGM people and their health outcomes. This multidimensional view is facilitated by programmatic investments to engage and enroll SGM populations through structured All of Us national community engagement partners ${ }^{60}$ and their activities and key variables that help identify SGM populations (such as employing a 2-step measurement for gender identity and assigned sex at birth). ${ }^{61,62}$ Furthermore, All of Us provides research partners with controlled tier data access to wearable device and genomic data, including whole-genome sequencing. The program also has plans to expand data access to community and international collaborators, issue new surveys, enroll participants in clinical trials, and link All of Us data to other repositories. The cloud-based data analytic platform ensures transparent analytic decisions and enables reproducibility of study findings. These ongoing developments are valuable tools for evaluating interventions to improve the health and well-being of SGM communities.

## Limitations

This study has several limitations. First, it provides an incomplete picture of the health inequities experienced by multiply marginalized groups within SGM communities due to the absence of an intersectional lens. ${ }^{56,58}$ Second, confounding due to place is a potential consideration. Although we were unable to completely account for spatial confounding in our analysis due to the data privacy policies of All of Us, we were able to describe the distribution of the analytic sample by census division and account for this factor in our regression models and propensity score approach with marginal differences in findings between the modeling approaches. Third, the validity of SNOMED diagnostic codes to accurately capture health conditions in All of Us has not yet been tested. Fourth, All of Us relies on convenience sampling and intentionally oversamples underrepresented communities in biomedical research; thus, it is not representative of the US population. Despite these data limitations, large volunteer studies, such as All of Us, provide current estimates based on what is, to our knowledge, the largest sample of SGM people. Moreover, the proportion of SGM adults enrolled in All of Us is comparable to other cross-sectional surveys ${ }^{1,63}$ but has the added strength of the longitudinal collection of data that will be leveraged over time. The ongoing challenge for the program will be to continue to accurately reflect the racial and ethnic, age, and socioeconomic diversity of SGM communities in their cohort.

## Conclusions

This cross-sectional study found that SGM groups showed higher odds of anxiety, depression, HIV diagnosis, and tobacco use disorder, but lower odds of cardiovascular disease, kidney disease,
diabetes, and hypertension than non-SGM groups. There were also substantial variations across SGM groups for the odds of asthma, cancer, BMI 25 or higher, and substance use disorder. These results also illustrate the utility of large, diverse, volunteer cohorts with multiple data types in health disparities research, although challenges remain to ensure ongoing engagement with diverse participants and methods development to reduce and address missing data. Future All of Us research examining health inequities should consider conceptual models that connect observable differences to social and structural mechanisms that facilitate these inequities.

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Additional Information: To learn more about the All of Us Research Program's research data repository, go to https:// www.researchallofus.org. For information on how LGBTQ participants are taking part in All of Us, go to https:// www.joinallofus.org/lgbtq. Precision Medicine Initiative, PMI, All of Us, the All of Us logo, and "The Future of Health Begins With You" are service marks of the US Department of Health and Human Services, NIH. A roster of past and present All of Us principal investigators is given in the eAppendix in Supplement 1.

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## SUPPLEMENT 1.

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## SUPPLEMENT 2.

Data Sharing Statement


[^0]:     Adentification Test-Concise; ND, not determined; PROMIS, Patient-Reported Outcomes Measurement Informat System; GMH, global mental health; GPH, global physical health.

    Categories are not mutually exclusive; they do not sum to the column total because participants may self-
    identify in multiple groups.
    ${ }^{\mathrm{b}}$ Groups with 1 to 19 participants were expressed as having fewer than 20 in accordance with All of Us policy.
    c Scores of less than 40 for GPH and less than 42 for GMH were considered poor or fair.

[^1]:    Abbreviations: AFAB, assigned female at birth; AMAB, assigned male at birth; BMI, body ${ }^{\text {a }}$ Groups with 1 to 19 participants were expressed as having fewer than 20 in accordance mass index (calculated as weight in kilograms divided by height in meters squared); EHR, with All of Us policy.

