

Protocol

The Influence of Social Media Interactions and Behaviors on Depressive Symptoms Among Sexual and Gender Minority Young Adults in the United States: Protocol for a Mixed Methods Longitudinal Study

César Escobar-Viera¹, MPH, MD, PhD; Robert W S Coulter², MPH, PhD; M Reuel Friedman³, MPH, PhD; Brian Thoma¹, PhD; Galen E Switzer⁴, PhD; Jamie Martina⁵, MPH; James Erin Egan², MPH, PhD; Brian Primack⁶, EdM, MS, MD, PhD

¹Department of Psychiatry, School of Medicine, University of Pittsburgh, Pittsburgh, PA, United States

²Department of Behavioral and Community Health Sciences, School of Public Health, University of Pittsburgh, Pittsburgh, PA, United States

³Department of Urban-Global Public Health, School of Public Health, Rutgers University, Piscataway, NJ, United States

⁴Division of General Internal Medicine, School of Medicine, University of Pittsburgh, Pittsburgh, PA, United States

⁵Department of Psychiatry, School of Medicine, University of Pittsburgh Medical Center, Pittsburgh, PA, United States

⁶Department of Health Promotion and Health Behavior, College of Public Health and Human Sciences, Oregon State University, Corvallis, OR, United States

Corresponding Author:

César Escobar-Viera, MPH, MD, PhD

Department of Psychiatry

School of Medicine

University of Pittsburgh

505 Bellefield Towers

3811 O'Hara St.

Pittsburgh, PA, 15213

United States

Phone: 1 (412) 246 5864

Email: Escobar-Viera@pitt.edu

Abstract

Background: Sexual and gender minority (SGM; ie, lesbian, gay, bisexual, transgender, and otherwise queer) young adults experience disparities in depression and other internalizing psychopathology. Although social media use is widespread and SGM people have more social media accounts and are more socially active on them than non-SGM individuals, few studies have examined the impact of social media on depression in this group.

Objective: The PRIDE iM study will be the first longitudinal, mixed methods research conducted to determine the impact of social media interactions and behaviors as pathways to depressive symptoms among SGM young adults living in the United States.

Methods: PRIDE iM uses a *bookends variation* of the longitudinal sequential mixed methods design. Participants will be recruited nationally from social media. First, between July 2019 and February 2020, we conducted a qualitative phase (T1) comprising web-based individual interviews (N=58) to inform the building and content of the quantitative survey. Second, from February 2022 to September 2022, we will conduct a series of web-based surveys (N=1000 at baseline) with 4 data points (T2-T5), each one collected every 6 to 8 weeks. Third, from October 2022 to December 2022, we will conduct a second qualitative phase (T6) of web-based interviews using outcome trajectories found in the longitudinal survey analyses to purposively sample survey participants and conduct web-based interviews to contextualize and explain survey findings. Qualitative data from T1 and T6 will be analyzed using a reflexive thematic analysis approach. As we sought to capture change over time in the association between the main predictors (ie, social media interactions and behaviors) and depressive symptoms, we propose analyzing T2 to T5 data using latent growth models with a structural equation modeling framework. Data integration at the method, interpretation, and reporting levels will be achieved through building and connecting and the use of a staged approach and joint displays, respectively. At all stages, we will assess the fit of data integration as recommended by the principles of best practice for mixed methods research in psychology.

Results: Data collection will be completed by December 2022. Qualitative data analyses will be completed by March 2023, and quantitative analyses of the primary outcome of interest will be completed by June 2023.

Conclusions: PRIDE iM will confirm, reject, or uncover the presence of potential relationships between social media interactions and behaviors and depressive symptoms among SGM people. This study represents fundamental groundwork to develop social media-based interventions that target modifiable interactions and behaviors that are most likely to influence mental health outcomes, thus seizing the opportunity to merge the popularity of this medium among SGM people with evidence-based approaches.

International Registered Report Identifier (IRRID): DERR1-10.2196/43627

(*JMIR Res Protoc* 2023;12:e43627) doi: [10.2196/43627](https://doi.org/10.2196/43627)

KEYWORDS

mixed methods; longitudinal; depression; sexual and gender minorities; social media

Introduction

Background

Sexual and gender minority (SGM; ie, lesbian, gay, bisexual, transgender, and otherwise queer [LGBTQ+]) young adults experience well-documented disparities in both internalizing [1,2] and externalizing psychopathology [3] compared with their cisgender heterosexual peers. These mental health disparities persist into adulthood and are present even among SGM people who identify as such late in their adolescence or young adulthood [4]. Minority stress theory [5] posits that, given the dominant culture, norms, and social structure, SGM people are likely subjects of an incongruence between information provided by society on how the world works and the minority person's experience of the world, determining stress processes that may worsen depression. Minority stress is the prevalent framework used to explain disparities seen in depression among SGM people; expansions of it have been developed for specific conditions such as substance use [6], cardiovascular disease [7], suicidal thoughts and behavior [1] and certain SGM groups such as adolescents [8,9] and transgender persons [10-13].

Social media encompasses a variety of websites and mobile apps (eg, TikTok, Snapchat, and WhatsApp) that enable users to create and share content and participate in web-based social networking [14]. Over 90% of adults in the United States have at least one social media account, which they use for an average of 2 to 4 hours daily, with YouTube, Facebook, and Instagram among the most popular platforms, and people aged 18 to 30 years being the group with the most sustained use growth among adults [15]. In addition, the affordances of social media (eg, asynchronicity, absence of physical cues, permanence of interactions, quantifiability via likes, and upvotes) have deeply changed the way in which people socialize, connect with others, build relationships, and seek and receive support and information [16,17].

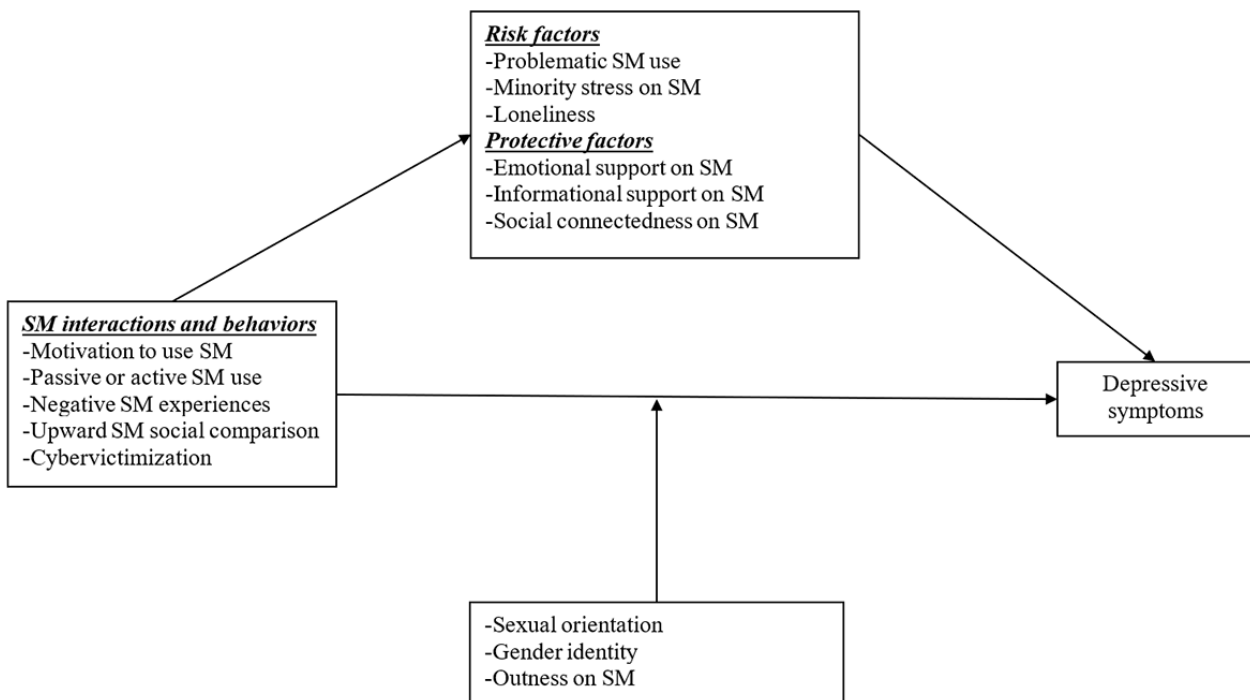
On average, SGM people are more socially active on social media and more likely to have multiple social media accounts than non-SGM individuals [18-20]. Moreover, SGM persons seek and engage with more web-based support chats than their non-SGM peers [21]; seek web-based support resources to help them navigate challenging settings where both racial and sexual

minority stigma might be salient [22,23]; and use social media to connect with others like them, increase their sense of belonging, and increase emotional well-being [24]. Despite these positive experiences, negative social media interactions also give way to social comparison, stigmatization, cybervictimization, and other forms of discrimination, which in turn might influence depressive symptoms [25,26] and other psychopathology [27,28].

Current Research Gaps

Although there is qualitative evidence available from SGM people indicating the salience of social media interactions to them [23,26], few studies have been conducted to determine the impact of social media interactions on mental health outcomes among SGM individuals, mostly among college students [29]. Moreover, the available studies follow the recent literature trend of focusing on determining the effect of the amount of time spent on social media (eg, time elapsed while using social media, number of checks per unit of time, and number of platforms used) on mental health. In the general population, the former approach showed mixed findings of positive [30,31], bidirectional [32], or no association [33] between quantity of social media use and mental health outcomes over time. These conflicting findings are indicators that we need a new approach that focuses on studying the factors that matter to SGM social media users, including the types of interactions and behaviors on social media platforms and their impacts on mental health. This is relevant as it is during these experiences on social media that SGM persons might encounter some of the minority stressors or protective factors [5,8]. On the basis of minority stress and our preliminary work [25], we propose a mediation model (Figure 1) in which the relationship between specific social media interactions and behaviors and depressive symptoms is mediated by both protective and risk factors (eg, emotional support experienced on social media). An additional issue that arises is that quantitative results alone are inadequate to describe and fully explain SGM young adults' social media behaviors and interactions or their effect on their mental health. Therefore, a mixed methods approach has the potential to unveil stressors and protective factors uniquely shaped by the affordances of social media, which may influence mental health outcomes in ways that could be different from similar offline interactions and behaviors.

Figure 1. Model depicting risk and protective factors in the pathways of characteristics of social media interactions and behaviors and depressive symptoms among sexual and gender minority young adults. SM: social media.



Study Objectives

The PRIDE iM study will be the first longitudinal, mixed methods research conducted to determine the impact of several forms of social media interaction and behavior on the pathways of depression and other mental health outcomes among SGM young adults living in the United States (Multimedia Appendix 1). To address critical methodological factors needed to ensure a high-quality longitudinal study with SGM people, the main characteristics of PRIDE iM include (1) recruitment via social media to reach members of an often-marginalized group who are users of the technology under study, (2) recruitment of young adults aged 18 to 30 years as this age group recently experienced the most sustained growth in social media users, (3) presurvey qualitative assessments to identify relevant SGM-specific social media interactions and behaviors and add them to the survey, (4) repeated measures of potentially critical risk and protective interactions and behaviors on and off social media, (5) postsurvey qualitative assessments with survey participants to contextualize the trajectory of depressive symptoms, and (6) a mixing analysis phase to identify similarities and differences across groups. Upon completion, the PRIDE iM study will provide critical data in terms of intervention targets, such as reducing the occurrence or impact of risk factors (eg, upward

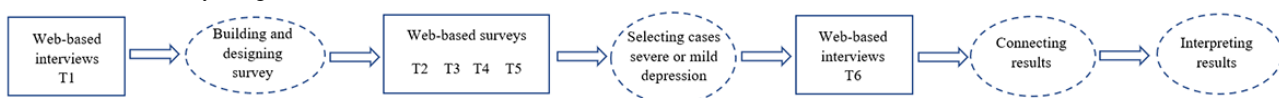
social comparison) or boosting protective factors (eg, social connectedness) for depression and other negative mental health outcomes among SGM people—a high-need, underserved, and hardly reached population.

Methods

Study Design

Given the longitudinal nature of our study, we leveraged a multistage mixed methods framework in which we combined both exploratory and explanatory approaches [34]. PRIDE iM uses a *bookends variation* of the longitudinal sequential mixed methods design [35], which is a combination of prospective and retrospective studies. In this design, we gather qualitative data in the form of individual interviews at both the beginning (T1) and the end (T6) of the study and collect quantitative data in the form of 4 longitudinal web-based surveys (T2, T3, T4, and T5) at nonconcurring times with the collection of qualitative data. Figure 2 provides an overview of the study design, including timing of data points for both quantitative and qualitative data strains as well as for analyses, data mixing, and interpretation of results. Throughout this paper, we use T1 to T6 to designate each point of data collection.

Figure 2. PRIDE iM study design. T: time.



The design that we chose was appropriate for 3 reasons. First, we used a qualitative phase (T1) comprising web-based individual interviews to inform the building and content of the quantitative survey. Although the existing literature provided a list of potentially relevant risk and protective forms of social

media interactions and behaviors for depression among the general population [36,37], we focused on social media experiences involving minority stress that are unique to SGM persons and that might help explain depressive symptoms among this group. We decided to conduct individual interviews, and

this was appropriate to balance a need for an in-depth understanding of the impact of social media experiences on mental health with the need to protect individuals' privacy and sensitive information. Second, we used a longitudinal web-based survey study with 4 data points (T2-T5), each one collected every 6 to 8 weeks. We sought to capture change in the association between the main predictors (ie, social media interactions and behaviors) and outcome variables (ie, depressive symptoms) over time. Using these 4 data points, our analyses will be able to identify trajectories of depressive symptoms over time. Third, given the limitation of quantitative data to fully explain the change in social phenomena over time, we will conduct a second qualitative phase of web-based interviews (T6). We will use the outcome trajectories identified in the T2 to T5 quantitative analyses and form groups based on these trajectories for conducting web-based interviews with SGM persons who participated in the survey in each of these groups. We will use the interviews to contextualize trajectories found in survey analyses and then conduct a comparative analysis of qualitative findings by groups identified in the survey (eg, respondents with severe vs mild depressive symptoms) to describe similarities and differences between said groups.

Ethics Approval

All recruitment and data collection procedures were approved by the University of Pittsburgh Institutional Review Board (study 19050007; approval June 20, 2019). We sought and obtained informed consent from potential participants before completing any of the research activities (web-based interviews or web-based surveys) of the study. Given that PRIDE iM study participants can be located anywhere in the United States and as the study posed minimal risk for participants, we obtained a waiver for documenting consent. We included all the standard components in the web-based informed consent forms, including study goals and description and estimated time required to complete the activity. Participants receive web-based gift cards in compensation for their time taking part in each of the research activities. We collected no identifiable information other than participant email addresses, phone numbers, and IP addresses (which were collected automatically by the web-based survey platform). This was necessary to schedule participation in the web-based interviews and to send gift cards to the participants after completing a research activity. Given the inclusion of sensitive topics and questions in both the interview and survey, we inform participants that they can choose to stop taking part at any time if they feel uncomfortable. In the web-based surveys, if the participant answers affirmatively to any of the suicide-related questions, a pop-up screen appears where we provide the contact information of nationally available resources for both SGM people and persons with suicidal ideation. These same resources appear listed at the end of the survey, and we provide the name and contact information of the principal investigator for more personalized resources.

Recruitment and Data Collection Procedures

Sample Selection

We used a purposive sampling approach throughout the 3 phases of the PRIDE iM study. This was appropriate as purposeful sampling permits identifying and selecting study participants

who experience firsthand the phenomenon under study, making this approach ideal for mixed methods research studies [38]. To recruit participants, we used targeted advertisements on social media, which have been previously used with success for the recruitment of SGM people to both cross-sectional and cohort studies [39,40]. This was appropriate for multiple reasons. As noted previously, SGM people are heavy social media users, and social media recruitment facilitates the enrollment of a diverse sample of SGM individuals, including those who have not disclosed their sexual orientation or gender identity, those who live in rural areas, and those who do not participate in community-based organizations that serve SGM persons [41]. Throughout the 3 phases of the study, individuals were eligible if they were aged 18 to 30 years; resided in the United States (as determined by zip codes); identified as LGBTQ+; and had at least one social media account and used it on at least a weekly basis.

First Series of Web-Based Interviews (T1)

Recruitment

The recruitment approach described previously was appropriate for the purpose of these interviews, which was to inform constructs and items for survey development through learning from the lived experience of SGM young adults who use social media and whether and how this use affected their mental health and well-being. In this way, the qualitative data strain served the purpose of integration through *building*, in which the results of one data collection and analysis activity inform the data collection of the other research activity [34]. Recruitment took place between July 2019 and February 2020. To create our advertisements, we used the advertisement creation feature on Meta Ads Manager (Meta Platforms, Inc; which allows for cross-posting to Facebook and Instagram) and set advertisements to be shown solely to people living in the United States. At the time, the Facebook advertisement manager allowed for targeting specific audiences based on location, age, interests (including "Interest tags" specific to the LGBTQ+ community and LGBTQ+ topics), and activity. After seeing the advertisements, interested individuals clicked on "Learn more" and were redirected to a study website that provided more information about the study goals, expected involvement, information about compensation, and an anonymous link to an eligibility questionnaire housed on the Qualtrics survey platform (Qualtrics International, Inc). Eligible individuals were invited to provide their preferred method of contact (ie, phone number or email address) so that a research assistant could contact them to schedule a time and date for the interview.

A total of 72 hours before the web-based interview, potential participants were sent an email with a link to the web-based informed consent form for their preliminary review. We encouraged potential participants to read the informed consent form and reply to the email with any clarification questions they might have. The day before the interview, we sent a final email with the link to the web-based conference platform where the interview would take place. At the date and time agreed upon for the interview, potential participants clicked on the link provided; this link took them to the formal informed consent

form, and after providing consent, participants were admitted to the web-based conference room.

Data Collection

The web-based interviews were 60 minutes long. We used a Health Insurance Portability and Accountability Act–compliant platform [42]. To protect the individuals' privacy, only audio was recorded during each interview. The interviews explored motivations for using social media and perspectives on both positive and negative social media interactions as well as the perceived impact on mental health and well-being. After completing the interview, participants received US \$50 gift cards in compensation for their time. The recordings were transcribed verbatim using a professional web-based service.

Web-Based Longitudinal Survey (T2-T5)

Recruitment and Initial Screening

Recruitment for the baseline assessment (T2) took place from February 2022 to March 2022 via targeted advertisements through Meta Ads Manager. However, as of January 2022, Meta updated its new audience targeting policy to protect the privacy of vulnerable populations [43]. The new policy eliminated the option of specifically targeting interests related to LGBTQ+ identities as well as religious or political interests. We chose an alternative option that consisted of creating a “custom audience” within the Meta Ads Manager tracking system to target future advertisements to a “lookalike audience.” After publishing a set of advertisements, a custom audience is created using the first 1000 to 5000 users that click or tap on the ads. This custom audience is then used so that ads can be seen by people who previously interacted with content on Instagram and Facebook [44]. A “lookalike audience” comprises users who are similar

to the custom audience that first interacted with the advertisement published on Instagram and Facebook [45]. Once this custom audience is created, future iterations of the advertisements are shown to new people who share similar characteristics (ie, “lookalike”) with the custom audience.

In total, 7 copyright-free images that would appeal to a broad base of SGM persons were purchased from iStock by Getty Images for web-based advertisements. Images depicted same-sex or queer-gendered couples, a group of smiling young adults of various backgrounds and hairstyles, and a rainbow-colored heart light-emitting diode light without any humans. Figure 3 shows an example of one of the advertisements published on social media. After clicking on the advertisement, persons were directed to an institutional study website where they could find more detailed information that was beyond the character limit allowed on social media advertisements, including the goals of the study, eligibility criteria, expected commitment (ie, completing four 30-minute surveys over 7-8 months), and participant compensation. Those who remained interested were able to click on a link to an eligibility screening questionnaire housed on the Qualtrics survey platform. If eligible, potential participants were invited to provide informed consent so that they could gain immediate access to the full web-based baseline questionnaire.

After completing the baseline survey, participants were asked to provide their email address for payment, their phone number, and their preference for a contact methodology (eg, email, phone call, or SMS text message). Email addresses were used to send web-based gift cards to all participants who completed at least half of the baseline questionnaire as well as reminders for follow-up surveys.

Figure 3. Example of one of the PRIDE iM social media recruitment advertisements. LGBTQ+: lesbian, gay, bisexual, transgender, and queer.



Participant Retention Strategies for Follow-up Surveys (T3-T5)

Given both the web-based nature and the longitudinal design of this study phase, reducing participant attrition was a major concern. A recent meta-analysis found that using a mix of

retention strategies delivered via the internet improved participant retention rates in longitudinal cohort studies [46]. First, we sought to reduce barriers to participation by prioritizing survey measures hypothesized to have an association with the primary outcome of interest (ie, depression) according to the existing literature and our conceptual model (Figure 1) and

allowing for extended data collection windows (up to 1 week) for each wave. Second, to build a community around the study and our research program, we created a study brand (PRIDE iM study) and a logo, website, and social media presence on 3 social media platforms (Twitter, Instagram, and Facebook). Social media accounts and websites were created 6 to 12 months before the formal study started and were used to update our followers about ongoing research conducted by our team and others on the topic of use of communication technologies and LGBTQ+ mental health. Third, we used a variety of reminders and follow-up strategies, including bimonthly e-newsletters (sent using Mailchimp [Rocket Science Group], a web-based platform and email service that allows for managing mailing lists) in between periods of data collection, email reminders sent 72 hours before the next follow-up survey, SMS text message reminders (only in cases of participants who authorized being sent SMS text messages), and incentives of increasing value over time (gift cards of US \$10 for T2, US \$15 for T3, US \$20 for T4, and US \$25 for T5). Finally, toward the end of each data collection period, we sent targeted emails or SMS text message reminders (according to each person's preference) to participants whose responses we still had not received.

Textbox 1. Criteria to determine fraudulent survey responses.

1. Location outside the United States according to *one* of the following:
 - Location data from Mailchimp (Rocket Science Group)
 - Latitude and longitude data from Qualtrics (Qualtrics International, Inc)
2. More than 1 response per IP address:
 - If only 2 responses, keep both if they did not meet criterion 1
 - If >2 responses, keep the first 2 if none of the responses met the previous criterion 1; if any of the responses meet criterion 1, remove all of them
 - Responses that started or ended <3 minutes apart (in these cases, only the first response was retained as part of the data)
3. More than 1 response per either email address or phone number (in these cases, only the first response was retained as part of the data)

Responses that met any of the criteria listed in [Textbox 1](#) were removed from the baseline data; those participants did not receive compensation and were no longer contacted for the follow-up surveys. In addition, some baseline participants completed the survey but provided low-quality data, either because their completion time was <6 minutes or because they completed less than two-thirds of the survey. In these cases, participants were compensated for the baseline survey but were no longer contacted for follow-up surveys, and their responses were removed from the data.

Data Collection for Follow-up Surveys (T3-T5)

Eligible participants were sent email invitations and reminders for T3 to T5 surveys starting in early April 2022 (1 week after we completed baseline data collection). Follow-up surveys were hosted on Qualtrics, and responses were collected for 30 days during May 2022 (T3), July 2022 (T4), and September 2022 (T5). On the first day of each month, we sent an email to each

Eligibility Determination for Follow-up Surveys (T3-T5)

Preventing and detecting fraud in web-based survey studies with participants recruited from social media is an ongoing challenge among researchers [47]. Fraudulent surveys include duplicate responses from the same participant using different email addresses, providing response patterns, or reaccessing the survey with false responses after being deemed ineligible in the first attempt. To minimize these risks, we implemented a series of combined red flags based on previous literature [39,40,48,49] and our own team's experience. Once data collection for the baseline (T2) survey was completed, we downloaded all the data from Qualtrics. A team of research assistants not involved in data analysis or interpretation created variables representing aspects related to survey participation that could be useful to identify fraudulent responses, such as geographic location (including approximate latitude and longitude), IP address, start and end date and time, survey completion and time duration for completion, attention-control questions [50], phone number, and email address. We used 3 criteria to determine fraudulent responses ([Textbox 1](#)).

participant with a unique link to the survey. To protect individuals' right to timely information about the study, we sought re-consent from all participants before allowing access to every follow-up survey. To maintain rapport and participants' interest in the study, we sent 1 e-newsletter during the month in between data collection (mid-April, mid-June, and mid-August) and 1 reminder 3 days before sending the survey links. Finally, we sent target emails or SMS text message reminders (depending on their preference for receiving direct communication) to the participants who had not yet completed the follow-up survey 1 week before the end of each data collection period.

Survey Measures

The baseline (T2) and follow-up (T3-T5) surveys incorporated different sections in which we administered the measures outlined in [Textbox 2](#) based on our conceptual model ([Figure 1](#)).

Textbox 2. Measures administered during the baseline (T2) and follow-up (T3-T5) surveys.

Primary outcome of the study

- We seek to determine changes in depressive symptoms, which have been consistently described in the literature as disproportionately more prevalent among sexual and gender minority (SGM) individuals. *Depressive symptoms were assessed* using the 9-item Patient Health Questionnaire [51]. In addition, we assessed other mental health problems that have been consistently found to be more prevalent among SGM people, including *generalized anxiety disorder symptoms*, measured using the Generalized Anxiety Disorder-7 [52]; *sleep disturbance symptoms*, measured using the 4-item Patient-Reported Outcomes Measurement Information System (PROMIS) [53]; *suicide ideation in the past month*, measured using a subscale of the Columbia Suicide Severity Rating Scale [54]; *eating disorder symptoms*, measured using the Sick, Control, One, Fat, Food screening questionnaire [55,56]; *cigarette smoking*, measured using 2 modified items from the Behavioral Risk Factor Surveillance System questionnaire [57]; *alcohol use in past month*, measured using a modified version of a 1-item screener by Smith et al [58]; and *marijuana use in the past month*, measured using an item modified from the Youth Risk Behavior Survey [59].

Primary predictor

- Given that the focal interest of this study is determining the influence of social media behaviors and interactions on mental health symptoms, our main predictors comprise a variety of individual characteristics, behaviors, and interactions that users may have while using social media, including *passive and active social media use* [60], *motivations for using social media* [29], *negative social media experiences* (measured using a 4-item scale [25]), *upward social comparison on social media* (measured using a 2-item scale [61]), *cybervictimization on social media* (measured using an 8-item scale [62]), and *time elapsed during and frequency of social media usage* (measured using items previously developed by our team [63-65]).

Demographic variables

- We used the following items to determine study eligibility: *current location* (in or outside the United States); *age in years* (<18, 18-24, 24-29, and >30); *current sexual orientation*, measured using the item “Which of the following best describes your current sexual orientation?” (lesbian; gay; bisexual; pansexual; asexual; queer; same gender-loving; straight or heterosexual; and other, with a text box to type in) as recommended by the Sexual Minority Assessment Research Team group [57,66]; *sex assigned at birth*, measured using the question “What gender were you assigned at birth, on your original birth certificate?” (male or female); and *current gender identity*, measured using the item “Which best describes your current gender identity?” (woman, man, transgender woman, transgender man, and nonbinary or genderqueer) [57,67]. Both the current gender identity and current sexual orientation questions were also part of the attention-control questions and were asked twice (first in the eligibility screener and then in the demographics section). Other sexual identity questions included *sexual behavior*, measured using the item “In the last 5 years, who did you have sex with? By sex we mean any activity you personally define as sexual activity. Please mark all that apply” (*women, nontransgender; men, nontransgender; transgender women; transgender men; nonbinary/genderqueer*; and I have not had sex with anyone in the last 5 years) [57,66]; *sexual attraction*, measured using the question “Please indicate how sexually attracted you are to the following types of people” (*women, nontransgender; men, nontransgender; transgender women; transgender men; and nonbinary/genderqueer*) [68]; and *gender nonconformity*, measured using a 2-item scale that asked “A person’s appearance, style, or dress may affect the way people think of them. On average, how do you think people would describe your appearance, style, or dress?” and “A person’s mannerisms (such as the way they walk or talk) may affect the way people think of them. On average, how do you think people would describe your mannerisms?” Both items had responses on a 7-point Likert-type scale from “very feminine” to “very masculine” [69]. Other demographic variables included *current relationship status* (member of an unmarried couple, in a polyamorous relationship with more than 1 person, legally married or recognized civil union, and not currently in a relationship or a special commitment to someone) [57]; *current living situation*, which allowed for multiple choices (by myself; with a parent or guardian, significant other, spouse, child or children, friends, or roommate or acquaintance; or other, with a text box to type); *month and year of birth* (our team decided not to collect day of birth to preserve the privacy of study participants, crucial given the longitudinal nature of the study and the repeated contact with participants via email or SMS text messages); *race/ethnicity*, which allowed for multiple answers (American Indian or Alaskan Native; Asian or Asian American; Black or African American; Hispanic or Latina, Latino, or Latinx; Native Hawaiian or other Pacific Islander; White; or other, with a text box to type); *educational attainment* (never attended school or only attended kindergarten, grades 1 to 8, grades 9 to 11, grade 12 or general educational development, 1 to 3 years of college, college graduate, and graduate school [some or completed]); *household income* (US <\$15,000, US \$15,000 to <\$25,000, US \$25,000 to <\$50,000, US \$50,000 to <\$75,000, US \$75,000 to <\$100,000, and US ≥\$100,000); *current employment situation* (employed for wages; self-employed; out of work for ≥1 year; out of work for <1 year; homemaker; student; unable to work; and other, with a text box to type); *current zip code*; and *current state of residence*. Finally, the T5 survey included 1 item asking participants whether they would be willing to be recontacted within the subsequent three months for additional research opportunities (*yes or no*).

Covariates

-

Covariates (protective and risk factors) were selected as they related to constructs included in minority stress [5], and whenever possible, we included modified items or measures to explore the same factors on social media. These included *outness in offline life*, measured using the question “In your everyday life (NOT on social media), are you out as an LGBTQ+ person to all, most, some, or to none of you’re a) family, b) straight friends c) co-workers” and the options “all, most, some, none, do not know” [57,70]; *outness on social media*, measured using a modified item that asked “On the social media site/app you use the most to keep in touch with the people you care about, are you out as an LGBTQ+ person to all, most, some, or to none of your...” with the same categories of people and options as in the previous question; *emotional and informational support offline*, measured using the PROMIS 8-item scale for these constructs [71]; *emotional and informational support on social media*, measured using a modified version of the PROMIS 8-item scale [72]; *social connectedness offline*, measured using a 20-item scale [73]; *social connectedness on social media*, measured using a 20-item scale [74]; *adverse childhood experiences*, measured using the Adverse Childhood Experiences 10-item questionnaire [75]; *loneliness*, measured using the 3-item University of California, Los Angeles Loneliness Scale [76]; *social isolation*, measured using a PROMIS 4-item scale [77]; *problematic social media use*, measured using a 6-item scale [78]; and *minority stress experiences offline and on social media*, measured using 24 items modified from the Sexual Minority Adolescent Stress Inventory (SMASI) [8]. Although the original instrument includes 11 subscales to cover a wide array of discriminatory experiences, we selected items to cover experiences that would most likely match those of young adults both offline and on social media. These included the following SMASI subscales (and their respective items): negative expectancies (3 items), negative disclosure experiences (5 items), homonegative communications (5 items), intersectionality experiences (3 items), and social marginalization (8 items).

Additional measures

- Although not the principal focus of our study, later waves of data collection included additional scales to explore emerging topics in the literature related to objective measures of social media use and use of geospatial dating apps. These included instructions for participants to take screenshots of their screen time app, average use time, most used apps, number of check-ins, use of mobile dating apps in the past year and past 2 weeks, number of check-ins on these apps, time elapsed during use, motivation for using dating apps, success in using dating apps, belongingness scale, perceived thriving, and reasons for stopping the use of mobile dating apps.

Second Series of Web-Based Interviews (T6)

The primary goal of the second qualitative phase in the PRIDE iM study is to help describe, compare, and explain the quantitative results from the longitudinal survey conducted in T2 to T5. We will group survey participants according to their outcome trajectories (eg, severe or mild depressive symptoms). Next, we will use a purposive sampling approach [38] among outcome trajectory groups identified in T2 to T5 for interviewing select “case” participants and contextualizing trajectories found in survey analyses. For example, if we identify 2 trajectory groups—“severe” and “mild” depressive symptoms—we will recruit 20 participants from each group (n=40). This approach is appropriate when the study goals include explaining significant results, positive performing cases, outliers, or confusing results [79].

The “cases” will be identified once we complete the statistical analysis of the longitudinal relationship between social media experience and behaviors and depressive symptoms. Within 30 days of completing the T5 survey, a research assistant with access to the contact information of survey participants will link the participant ID number with the respective contact information. This team member will contact “case” survey participants via email or SMS text message and invite them to participate in a web-based interview with the purpose of reviewing and contextualizing their survey results to shed light on what (if anything) other than their experiences and behaviors on social media might have influenced the results. Interested individuals will be offered to schedule a date and time for the web-based interview. Preinterview reminder activities on the day of the interview, data collection procedures and software, and postinterview transcribing will mimic those already described for T1. We plan to start recruitment for T6 in November 2022.

Data Analysis Plan

Qualitative Analyses

Transcriptions will be entered into NVivo (version 12; QSR International) [80] for analysis. For both T1 and T6, we will analyze the data using reflexive thematic analysis with an experiential and realist framework [81-83]. This approach will allow us to describe and connect themes driven by the data collected from SGM participants, highlighting the specific meanings and perspectives from their lived experiences. Coding will be conducted using a hybrid inductive and deductive approach, which is appropriate given that our coding framework will partly derive from research on social media use and mental health among some groups of SGM young adults [25]. However, the paucity of research related to the impact of specific social media interactions and behaviors on depression among SGM persons requires describing concepts that are not clearly articulated in the empirical evidence available [84]. We will train independent coders and triangulate among the members of the study team to enhance trustworthiness [84].

Quantitative Analyses

We propose analyzing T2 to T5 data using latent growth models (LGMs) with a structural equation modeling (SEM) framework. LGMs in SEM are appropriate for our data as our assessments will measure the same construct at each data point, will have the same metric across time, and are tested at the same time intervals [85]. Crucial to our study, SEM allows for the use of latent variables or constructs in the models (eg, attitudes toward and beliefs about social media) as well as modeling mediating and moderating effects [86]. We will conduct descriptive analyses, including means, SDs, and bivariable associations between all variables included in the study. We will build SEM models at baseline and cross-sectionally and then, with each wave of longitudinal data, test whether baseline predictor characteristics are associated with depressive symptoms over the study period, as well as between- and within-person effects

[87]. We will examine model fit, including fit statistics such as standardized root mean square residual and comparative fit index, according to standard guidelines [88,89]. We will use Stata software (StataCorp) [90] for conducting these analyses and follow best-practice guidelines for reporting latent trajectory studies [91].

To estimate the sample size, guidelines for estimating power to detect mediated effects using the product of coefficients test suggest that, for power >0.8 with an α level of .05, a sample size of 100 is needed to detect medium effects, and a sample size of 500 is needed to detect small effects [92]. Thus, we proposed starting at T2 with 1000 participants and, with an overall attrition rate of 50% throughout T3, T4, and T5, we will have 500 participants who completed T2 to T5, which gives us power to detect small, mediated effects. For the longitudinal mediation using LGM, a sample size of approximately 200 is needed for power >0.8 to detect a medium effect size with 5 measurement occasions. As statistical power increases as the number of measurement occasions increases and we will have 4 measurement occasions, we expect adequate power for longitudinal mediation models [92,93]. Although an attrition of 50% is expected, previous studies on risk or protective factors and health outcomes have shown that this phenomenon did not significantly affect estimates of associations between variables or demographic differences between groups [94-96].

Integrative Analyses

Our mixed methods study integrates quantitative and qualitative strains of data at the design, method, and interpretation and reporting levels [34,97]. We addressed the integration at the design level in the previous sections. In this section, we will describe other levels of mixed methods data integration and analyses that we will conduct in PRIDE iM. We will achieve method integration through *building* and *connecting* [97].

First, qualitative data from T1 helped us *build* the T2 to T5 quantitative surveys in that we were able to identify important constructs and potential items that were included in the questionnaires. Next, we will *connect* the quantitative data collected during T2 to T5 with the qualitative data that will be collected in T6 through purposive sampling. To do this, we will use outcome trajectories (eg, depressive symptoms) found in structural equation models and form groups based on these trajectories for inviting potential participants to the web-based interviews in T6, with the goal of describing similarities and differences across groups and explaining these differences [79].

Finally, we will integrate our quantitative and qualitative data at the interpretation and reporting level using narrative manuscripts with a *staged approach* comprising separate manuscripts to report the results of each phase of the study. This is often the case with mixed methods studies such as PRIDE iM that have a multistage approach [34]. We will use *joint displays* to bring the data together and present new insights beyond those gained from the separate quantitative and qualitative results. At all stages, we will assess the fit of data integration as recommended by the principles of best practice for mixed methods research in psychology [98,99].

Results

Data collection will be completed by December 2022. Qualitative data analyses will be completed by March 2023, and quantitative analyses of the primary outcome of interest will be completed by June 2023.

Discussion

Principal Considerations

To our knowledge, PRIDE iM is the first national mixed methods study with a longitudinal quantitative phase (T2-T5) conducted in the United States to determine the relationship between a variety of social media interactions and behaviors and depression and other mental health problems that overburden SGM young adults. Moreover, our study is the first to adapt the minority stress model to explain the path by which social media interactions and behaviors may affect depressive symptoms among SGM young adults. Since the time when minority stress theory was initially developed [5], social media has disrupted most societal processes, from the way young adults make friends to the way they keep themselves informed and become involved with their communities, and this seems to be even more true for minoritized groups. The proposed study is appropriate, timely, and innovative in several aspects, from the social media-based recruitment (which allows for the participation of SGM persons who may not interface with offline recruitment venues and, thus, may be less likely to participate in research) to the study and survey design. Our study will dramatically expand on previous research [26] that focused on identifying that social media and other communication technologies influence resilience and coping among SGM youth. PRIDE iM results will provide important information about the impact of social media on mental health for researchers that seek to better understand health inequities among persons who are minoritized because of their sexual orientation, gender identity, and race or ethnicity and reduce those inequities via interventions.

Limitations

This study has limitations to consider. First, our recruitment through social media (ie, Instagram and Facebook) might represent a barrier to participation for SGM young adults who do not use these specific platforms. However, this is unlikely given that a large majority of young adults who use social media have an Instagram or Facebook account [15]. Second, our surveys assessed social media interactions and behaviors via self-report, which subjects these reports to recall bias related to experiences on social media. To reduce this, surveys were collected every 6 to 8 weeks, and all measures asked participants only about their social media experiences “over the last 30 days.” Nevertheless, future studies would benefit from more objective methods for collecting social media data related to individuals’ interactions and behaviors. Third, we used survey assessments that are quite comprehensive, which might discourage some participants from responding to all survey items or cause them to do so hastily. To remedy this, we implemented several forms of participant engagement (eg, progressively increasing incentives, building a community

around the study, and survey reminders) and data quality checks (eg, survey completion time, attention-control questions, and survey completion progress).

Conclusions

PRIDE iM builds upon minority stress theory, a foundational model used to understand mental health disparities among minoritized groups, and will contribute to our current understanding of how sociocultural factors influence SGM individuals' depression outcomes in a new media environment such as social media. Our study will confirm, reject, or uncover

the presence of potential relationships between social media interactions and behaviors and depressive symptoms as well as temporality and direction. We will disseminate our findings via relevant academic journals and infographics on the PRIDE iM social media presence on Instagram, Twitter, and Facebook. This study will provide fundamental groundwork to develop social media-based interventions that target modifiable interactions and behaviors that are most likely to influence mental health outcomes, thus seizing the opportunity to merge the popularity of this medium among SGM people with an evidence-based approach.

Acknowledgments

The research conducted in this study is supported by the National Institutes of Health (grant R00 - MD012813). RWSC's participation was supported by the National Institutes of Health (grant K01 - AA027564). The funding source played no role in the study design; collection, analysis, and interpretation of the data; writing of the report; or decision to submit the paper for publication.

Data Availability

The data sets generated and analyzed during this study are not publicly available yet because of (1) the ongoing nature of the study and (2) preliminary and main outcome analyses being conducted at the time of publication of this protocol, but specific data sets might be available from the corresponding author upon reasonable request.

Conflicts of Interest

None declared.

Multimedia Appendix 1

External peer review from the National Institute on Minority Health and Health Disparities Special Emphasis Panel NIH Pathway to Independence Award (grant R00 - MD012813).

[\[DOCX File , 60 KB-Multimedia Appendix 1\]](#)

References

1. Marshal MP, Dietz LJ, Friedman MS, Stall R, Smith HA, McGinley J, et al. Suicidality and depression disparities between sexual minority and heterosexual youth: a meta-analytic review. *J Adolesc Health* 2011 Aug;49(2):115-123 [[FREE Full text](#)] [doi: [10.1016/j.jadohealth.2011.02.005](https://doi.org/10.1016/j.jadohealth.2011.02.005)] [Medline: [21783042](#)]
2. Marshal MP, Dermody SS, Cheong J, Burton CM, Friedman MS, Aranda F, et al. Trajectories of depressive symptoms and suicidality among heterosexual and sexual minority youth. *J Youth Adolesc* 2013 Aug 20;42(8):1243-1256 [[FREE Full text](#)] [doi: [10.1007/s10964-013-9970-0](https://doi.org/10.1007/s10964-013-9970-0)] [Medline: [23784511](#)]
3. Marshal M, Friedman M, Stall R, Thompson A. Individual trajectories of substance use in lesbian, gay and bisexual youth and heterosexual youth. *Addiction* 2009 Jun;104(6):974-981 [[FREE Full text](#)] [doi: [10.1111/j.1360-0443.2009.02531.x](https://doi.org/10.1111/j.1360-0443.2009.02531.x)] [Medline: [19344440](#)]
4. Fish JN, Pasley K. Sexual (minority) trajectories, mental health, and alcohol use: a longitudinal study of youth as they transition to adulthood. *J Youth Adolesc* 2015 Aug 9;44(8):1508-1527. [doi: [10.1007/s10964-015-0280-6](https://doi.org/10.1007/s10964-015-0280-6)] [Medline: [25956289](#)]
5. Meyer IH. Prejudice, social stress, and mental health in lesbian, gay, and bisexual populations: conceptual issues and research evidence. *Psychol Bull* 2003 Sep;129(5):674-697 [[FREE Full text](#)] [doi: [10.1037/0033-2909.129.5.674](https://doi.org/10.1037/0033-2909.129.5.674)] [Medline: [12956539](#)]
6. Goldbach JT, Schragr SM, Dunlap SL, Holloway IW. The application of minority stress theory to marijuana use among sexual minority adolescents. *Subst Use Misuse* 2015 Feb 10;50(3):366-375. [doi: [10.3109/10826084.2014.980958](https://doi.org/10.3109/10826084.2014.980958)] [Medline: [25493644](#)]
7. Huebner DM, McGarrity LA, Perry NS, Spivey LA, Smith TW. Cardiovascular and cortisol responses to experimentally-induced minority stress. *Health Psychol* 2021 May;40(5):316-325. [doi: [10.1037/hea0001067](https://doi.org/10.1037/hea0001067)] [Medline: [34152785](#)]
8. Schragr SM, Goldbach JT, Mamey MR. Development of the sexual minority adolescent stress inventory. *Front Psychol* 2018 Mar 15;9:319 [[FREE Full text](#)] [doi: [10.3389/fpsyg.2018.00319](https://doi.org/10.3389/fpsyg.2018.00319)] [Medline: [29599737](#)]

9. Goldbach JT, Schragger SM, Mamey MR. Criterion and divergent validity of the sexual minority adolescent stress inventory. *Front Psychol* 2017 Nov 28;8:2057 [FREE Full text] [doi: [10.3389/fpsyg.2017.02057](https://doi.org/10.3389/fpsyg.2017.02057)] [Medline: [29234292](https://pubmed.ncbi.nlm.nih.gov/29234292/)]
10. Hatzenbuehler ML, Pachankis JE. Stigma and minority stress as social determinants of health among lesbian, gay, bisexual, and transgender youth: research evidence and clinical implications. *Pediatr Clin North Am* 2016 Dec;63(6):985-997. [doi: [10.1016/j.pcl.2016.07.003](https://doi.org/10.1016/j.pcl.2016.07.003)] [Medline: [27865340](https://pubmed.ncbi.nlm.nih.gov/27865340/)]
11. Pace A, Barber M, Ziplow J, Hranilovich JA, Kaiser EA. Gender minority stress, psychiatric comorbidities, and the experience of migraine in transgender and gender-diverse individuals: a narrative review. *Curr Pain Headache Rep* 2021 Dec 15;25(12):82. [doi: [10.1007/s11916-021-00996-7](https://doi.org/10.1007/s11916-021-00996-7)] [Medline: [34910265](https://pubmed.ncbi.nlm.nih.gov/34910265/)]
12. Valentine SE, Shipherd JC. A systematic review of social stress and mental health among transgender and gender non-conforming people in the United States. *Clin Psychol Rev* 2018 Dec;66:24-38 [FREE Full text] [doi: [10.1016/j.cpr.2018.03.003](https://doi.org/10.1016/j.cpr.2018.03.003)] [Medline: [29627104](https://pubmed.ncbi.nlm.nih.gov/29627104/)]
13. Tan KK, Treharne GJ, Ellis SJ, Schmidt JM, Veale JF. Gender minority stress: a critical review. *J Homosex* 2020 Aug 23;67(10):1471-1489. [doi: [10.1080/00918369.2019.1591789](https://doi.org/10.1080/00918369.2019.1591789)] [Medline: [30912709](https://pubmed.ncbi.nlm.nih.gov/30912709/)]
14. Gelinias L, Pierce R, Winkler S, Cohen IG, Lynch HF, Bierer BE. Using social media as a research recruitment tool: ethical issues and recommendations. *Am J Bioeth* 2017 Mar;17(3):3-14 [FREE Full text] [doi: [10.1080/15265161.2016.1276644](https://doi.org/10.1080/15265161.2016.1276644)] [Medline: [28207365](https://pubmed.ncbi.nlm.nih.gov/28207365/)]
15. Auxier B, Anderson M. Social media use in 2021. Pew Research Center. 2021 Apr 7. URL: <https://www.pewresearch.org/internet/2021/04/07/social-media-use-in-2021/> [accessed 2022-05-10]
16. Nesi J, Choukas-Bradley S, Prinstein MJ. Transformation of adolescent peer relations in the social media context: part 1-a theoretical framework and application to dyadic peer relationships. *Clin Child Fam Psychol Rev* 2018 Sep 7;21(3):267-294 [FREE Full text] [doi: [10.1007/s10567-018-0261-x](https://doi.org/10.1007/s10567-018-0261-x)] [Medline: [29627907](https://pubmed.ncbi.nlm.nih.gov/29627907/)]
17. Nesi J, Choukas-Bradley S, Prinstein MJ. Transformation of adolescent peer relations in the social media context: part 2-application to peer group processes and future directions for research. *Clin Child Fam Psychol Rev* 2018 Sep 7;21(3):295-319 [FREE Full text] [doi: [10.1007/s10567-018-0262-9](https://doi.org/10.1007/s10567-018-0262-9)] [Medline: [29627906](https://pubmed.ncbi.nlm.nih.gov/29627906/)]
18. A survey of LGBT Americans. Pew Research Center. 2013 Jun 13. URL: <https://www.pewresearch.org/social-trends/2013/06/13/a-survey-of-lgbt-americans/> [accessed 2022-12-18]
19. Horvath KJ, Danilenko GP, Williams ML, Simoni J, Amico KR, Oakes JM, et al. Technology use and reasons to participate in social networking health websites among people living with HIV in the US. *AIDS Behav* 2012 May;16(4):900-910 [FREE Full text] [doi: [10.1007/s10461-012-0164-7](https://doi.org/10.1007/s10461-012-0164-7)] [Medline: [22350832](https://pubmed.ncbi.nlm.nih.gov/22350832/)]
20. Seidenberg AB, Jo CL, Ribisl KM, Lee JG, Buchtling FO, Kim Y, et al. A national study of social media, television, radio, and internet usage of adults by sexual orientation and smoking status: implications for campaign design. *Int J Environ Res Public Health* 2017 Apr 21;14(4):450 [FREE Full text] [doi: [10.3390/ijerph14040450](https://doi.org/10.3390/ijerph14040450)] [Medline: [28430161](https://pubmed.ncbi.nlm.nih.gov/28430161/)]
21. Haner D, Pepler D. Clients at kids help phone: individual characteristics and problem topics. *J Can Acad Child Adolesc Psychiatry* 2016;25(3):138-144 [FREE Full text] [Medline: [27924143](https://pubmed.ncbi.nlm.nih.gov/27924143/)]
22. White Hughto JM, Pachankis JE, Eldahan AI, Keene DE. "You can't just walk down the street and meet someone": the intersection of social-sexual networking technology, stigma, and health among gay and bisexual men in the small city. *Am J Mens Health* 2017 May 23;11(3):726-736 [FREE Full text] [doi: [10.1177/1557988316679563](https://doi.org/10.1177/1557988316679563)] [Medline: [27885147](https://pubmed.ncbi.nlm.nih.gov/27885147/)]
23. Escobar-Viera C, Shensa A, Hamm M, Melcher EM, Rzewnicki DI, Egan JE, et al. "I don't feel like the odd one": utilizing content analysis to compare the effects of social media use on well-being among sexual minority and nonminority US young adults. *Am J Health Promot* 2020 Mar 07;34(3):285-293 [FREE Full text] [doi: [10.1177/0890117119885517](https://doi.org/10.1177/0890117119885517)] [Medline: [31698919](https://pubmed.ncbi.nlm.nih.gov/31698919/)]
24. Chong E, Zhang Y, Mak W, Pang I. Social media as social capital of LGB individuals in Hong Kong: its relations with group membership, stigma, and mental well-being. *Am J Community Psychol* 2015 Mar;55(1-2):228-238. [doi: [10.1007/s10464-014-9699-2](https://doi.org/10.1007/s10464-014-9699-2)] [Medline: [25576016](https://pubmed.ncbi.nlm.nih.gov/25576016/)]
25. Escobar-Viera CG, Shensa A, Sidani J, Primack B, Marshal MP. Association between LGB sexual orientation and depression mediated by negative social media experiences: national survey study of US young adults. *JMIR Ment Health* 2020 Dec 03;7(12):e23520 [FREE Full text] [doi: [10.2196/23520](https://doi.org/10.2196/23520)] [Medline: [33270041](https://pubmed.ncbi.nlm.nih.gov/33270041/)]
26. Craig SL, Eaton AD, McInroy LB, D'Souza SA, Krishnan S, Wells GA, et al. Navigating negativity: a grounded theory and integrative mixed methods investigation of how sexual and gender minority youth cope with negative comments online. *Psychol Sexuality* 2019 Sep 11;11(3):161-179. [doi: [10.1080/19419899.2019.1665575](https://doi.org/10.1080/19419899.2019.1665575)]
27. Torous J, Keshavan M. The role of social media in schizophrenia: evaluating risks, benefits, and potential. *Curr Opin Psychiatry* 2016 May;29(3):190-195. [doi: [10.1097/YCO.0000000000000246](https://doi.org/10.1097/YCO.0000000000000246)] [Medline: [26967314](https://pubmed.ncbi.nlm.nih.gov/26967314/)]
28. Pavalanathan U, De Choudhury M. Identity management and mental health discourse in social media. In: Proceedings of the 24th International Conference on World Wide Web. 2015 Presented at: WWW '15: 24th International World Wide Web Conference; May 18 - 22, 2015; Florence Italy. [doi: [10.1145/2740908.2743049](https://doi.org/10.1145/2740908.2743049)]
29. Ceglarek PJ, Ward LM. A tool for help or harm? How associations between social networking use, social support, and mental health differ for sexual minority and heterosexual youth. *Comput Human Behav* 2016 Dec;65:201-209. [doi: [10.1016/j.chb.2016.07.051](https://doi.org/10.1016/j.chb.2016.07.051)]

30. Primack BA, Shensa A, Sidani JE, Escobar-Viera CG, Fine MJ. Temporal associations between social media use and depression. *Am J Prev Med* 2021 Feb;60(2):179-188 [FREE Full text] [doi: [10.1016/j.amepre.2020.09.014](https://doi.org/10.1016/j.amepre.2020.09.014)] [Medline: [33309454](https://pubmed.ncbi.nlm.nih.gov/33309454/)]
31. Twenge JM, Joiner TE, Rogers ML, Martin GN. Increases in depressive symptoms, suicide-related outcomes, and suicide rates among U.S. adolescents after 2010 and links to increased new media screen time. *Clin Psychological Sci* 2017 Nov 14;6(1):3-17. [doi: [10.1177/2167702617723376](https://doi.org/10.1177/2167702617723376)]
32. Orben A, Przybylski AK, Blakemore S, Kievit RA. Windows of developmental sensitivity to social media. *Nat Commun* 2022 Mar 28;13(1):1649 [FREE Full text] [doi: [10.1038/s41467-022-29296-3](https://doi.org/10.1038/s41467-022-29296-3)] [Medline: [35347142](https://pubmed.ncbi.nlm.nih.gov/35347142/)]
33. Heffer T, Good M, Daly O, MacDonell E, Willoughby T. The longitudinal association between social-media use and depressive symptoms among adolescents and young adults: an empirical reply to Twenge et al. (2018). *Clin Psychological Sci* 2019 Jan 29;7(3):462-470. [doi: [10.1177/2167702618812727](https://doi.org/10.1177/2167702618812727)]
34. Fetters MD, Curry LA, Creswell JW. Achieving integration in mixed methods designs-principles and practices. *Health Serv Res* 2013 Dec;48(6 Pt 2):2134-2156 [FREE Full text] [doi: [10.1111/1475-6773.12117](https://doi.org/10.1111/1475-6773.12117)] [Medline: [24279835](https://pubmed.ncbi.nlm.nih.gov/24279835/)]
35. Plano Clark VL, Anderson N, Wertz JA, Zhou Y, Schumacher K, Miaskowski C. Conceptualizing longitudinal mixed methods designs. *J Mixed Method Res* 2014 Jul 21;9(4):297-319. [doi: [10.1177/1558689814543563](https://doi.org/10.1177/1558689814543563)]
36. Primack BA, Escobar-Viera CG. Social media as it interfaces with psychosocial development and mental illness in transitional age youth. *Child Adolesc Psychiatr Clin N Am* 2017 Apr;26(2):217-233. [doi: [10.1016/j.chc.2016.12.007](https://doi.org/10.1016/j.chc.2016.12.007)] [Medline: [28314452](https://pubmed.ncbi.nlm.nih.gov/28314452/)]
37. Primack BA, Perryman KL, Crofford RA, Escobar-Viera CG. Social media as it interfaces with psychosocial development and mental illness in transitional-age youth. *Child Adolesc Psychiatr Clin N Am* 2022 Jan;31(1):11-30. [doi: [10.1016/j.chc.2021.07.007](https://doi.org/10.1016/j.chc.2021.07.007)] [Medline: [34801149](https://pubmed.ncbi.nlm.nih.gov/34801149/)]
38. Palinkas LA, Horwitz SM, Green CA, Wisdom JP, Duan N, Hoagwood K. Purposeful sampling for qualitative data collection and analysis in mixed method implementation research. *Adm Policy Ment Health* 2015 Sep;42(5):533-544 [FREE Full text] [doi: [10.1007/s10488-013-0528-y](https://doi.org/10.1007/s10488-013-0528-y)] [Medline: [24193818](https://pubmed.ncbi.nlm.nih.gov/24193818/)]
39. Schrage SM, Mamey MR, Rhoades H, Goldbach JT. Adolescent stress experiences over time study (ASETS) protocol: design and methods of a prospective longitudinal study of sexual minority adolescents in the USA. *BMJ Open* 2022 Mar 09;12(3):e054792 [FREE Full text] [doi: [10.1136/bmjopen-2021-054792](https://doi.org/10.1136/bmjopen-2021-054792)] [Medline: [35264352](https://pubmed.ncbi.nlm.nih.gov/35264352/)]
40. Salk RH, Thoma BC, Choukas-Bradley S. The gender minority youth study: overview of methods and social media recruitment of a nationwide sample of U.S. Cisgender and transgender adolescents. *Arch Sex Behav* 2020 Oct 18;49(7):2601-2610 [FREE Full text] [doi: [10.1007/s10508-020-01695-x](https://doi.org/10.1007/s10508-020-01695-x)] [Medline: [32306108](https://pubmed.ncbi.nlm.nih.gov/32306108/)]
41. Sterzing PR, Gartner RE, McGeough BL. Conducting anonymous, incentivized, online surveys with sexual and gender minority adolescents: lessons learned from a national polyvictimization study. *J Interpers Violence* 2018 Mar 27;33(5):740-761. [doi: [10.1177/0886260517744845](https://doi.org/10.1177/0886260517744845)] [Medline: [29295005](https://pubmed.ncbi.nlm.nih.gov/29295005/)]
42. Beyond video conferencing. Vidyo. URL: <https://www.vidyo.com/company> [accessed 2019-06-02]
43. Removing certain ad targeting options and expanding our ad controls. Meta for Business. 2021 Nov 9. URL: <https://www.facebook.com/business/news/removing-certain-ad-targeting-options-and-expanding-our-ad-controls> [accessed 2022-06-07]
44. About custom audiences. Meta. URL: https://www.facebook.com/business/help/744354708981227?id=2469097953376494&helpref=uf_permalink [accessed 2022-12-19]
45. About lookalike audiences. Meta. URL: https://www.facebook.com/business/help/164749007013531?id=401668390442328&helpref=uf_permalink [accessed 2022-12-19]
46. Teague S, Youssef GJ, Macdonald JA, Sciberras E, Shatte A, Fuller-Tyszkiewicz M, SEED Lifecourse Sciences Theme. Retention strategies in longitudinal cohort studies: a systematic review and meta-analysis. *BMC Med Res Methodol* 2018 Nov 26;18(1):151 [FREE Full text] [doi: [10.1186/s12874-018-0586-7](https://doi.org/10.1186/s12874-018-0586-7)] [Medline: [30477443](https://pubmed.ncbi.nlm.nih.gov/30477443/)]
47. Salinas MR. Are your participants real? Dealing with fraud in recruiting older adults online. *West J Nurs Res* 2023 Jan 19;45(1):93-99. [doi: [10.1177/01939459221098468](https://doi.org/10.1177/01939459221098468)] [Medline: [35587721](https://pubmed.ncbi.nlm.nih.gov/35587721/)]
48. Levi R, Ridberg R, Akers M, Seligman H. Survey fraud and the integrity of web-based survey research. *Am J Health Promot* 2022 Jan 10;36(1):18-20. [doi: [10.1177/08901171211037531](https://doi.org/10.1177/08901171211037531)] [Medline: [34372667](https://pubmed.ncbi.nlm.nih.gov/34372667/)]
49. Teitcher JEF, Bocking WO, Bauermeister JA, Hoefler CJ, Miner MH, Klitzman RL. Detecting, preventing, and responding to "fraudsters" in internet research: ethics and tradeoffs. *J Law Med Ethics* 2015;43(1):116-133 [FREE Full text] [doi: [10.1111/jlme.12200](https://doi.org/10.1111/jlme.12200)] [Medline: [25846043](https://pubmed.ncbi.nlm.nih.gov/25846043/)]
50. Aust F, Diedenhofen B, Ullrich S, Musch J. Seriousness checks are useful to improve data validity in online research. *Behav Res Methods* 2013 Jun 10;45(2):527-535. [doi: [10.3758/s13428-012-0265-2](https://doi.org/10.3758/s13428-012-0265-2)] [Medline: [23055170](https://pubmed.ncbi.nlm.nih.gov/23055170/)]
51. Kroenke K, Spitzer RL. The PHQ-9: a new depression diagnostic and severity measure. *Psychiatric Annals* 2002 Sep 01;32(9):509-515. [doi: [10.3928/0048-5713-20020901-06](https://doi.org/10.3928/0048-5713-20020901-06)]
52. Spitzer RL, Kroenke K, Williams JB, Löwe B. A brief measure for assessing generalized anxiety disorder: the GAD-7. *Arch Intern Med* 2006 May 22;166(10):1092-1097. [doi: [10.1001/archinte.166.10.1092](https://doi.org/10.1001/archinte.166.10.1092)] [Medline: [16717171](https://pubmed.ncbi.nlm.nih.gov/16717171/)]
53. Buysse D, Yu L, Moul D, Germain A, Stover A, Dodds NE, et al. Development and validation of patient-reported outcome measures for sleep disturbance and sleep-related impairments. *Sleep* 2010 Jun;33(6):781-792 [FREE Full text] [doi: [10.1093/sleep/33.6.781](https://doi.org/10.1093/sleep/33.6.781)] [Medline: [20550019](https://pubmed.ncbi.nlm.nih.gov/20550019/)]

54. Posner K, Brown GK, Stanley B, Brent DA, Yershova KV, Oquendo MA, et al. The Columbia-Suicide Severity Rating Scale: initial validity and internal consistency findings from three multisite studies with adolescents and adults. *Am J Psychiatry* 2011 Dec;168(12):1266-1277 [FREE Full text] [doi: [10.1176/appi.ajp.2011.10111704](https://doi.org/10.1176/appi.ajp.2011.10111704)] [Medline: [22193671](https://pubmed.ncbi.nlm.nih.gov/22193671/)]
55. Hill LS, Reid F, Morgan JF, Lacey JH. SCOFF, the development of an eating disorder screening questionnaire. *Int J Eat Disord* 2010 May;43(4):344-351. [doi: [10.1002/eat.20679](https://doi.org/10.1002/eat.20679)] [Medline: [19343793](https://pubmed.ncbi.nlm.nih.gov/19343793/)]
56. Morgan JF, Reid F, Lacey JH. The SCOFF questionnaire: assessment of a new screening tool for eating disorders. *BMJ* 1999 Dec 04;319(7223):1467-1468 [FREE Full text] [doi: [10.1136/bmj.319.7223.1467](https://doi.org/10.1136/bmj.319.7223.1467)] [Medline: [10582927](https://pubmed.ncbi.nlm.nih.gov/10582927/)]
57. Meyer I. Generations: a study of the life and health of LGB people in a changing society, United States, 2016-2019. Inter-university Consortium for Political and Social Research. 2020 Aug 25. URL: <https://www.icpsr.umich.edu/web/DSDR/studies/37166> [accessed 2022-08-05]
58. Smith PC, Schmidt SM, Allensworth-Davies D, Saitz R. Primary care validation of a single-question alcohol screening test. *J Gen Intern Med* 2009 Feb 27;24(7):783-788. [doi: [10.1007/S11606-009-0928-6](https://doi.org/10.1007/S11606-009-0928-6)]
59. 2019 state and local youth risk behavior survey. Centers for Disease Control and Prevention. 2019. URL: https://www.cdc.gov/healthyyouth/data/yrbs/pdf/2019/2019_YRBS-Standard-HS-Questionnaire.pdf [accessed 2022-05-08]
60. Escobar-Viera CG, Shensa A, Bowman ND, Sidani JE, Knight J, James AE, et al. Passive and active social media use and depressive symptoms among United States adults. *Cyberpsychol Behav Soc Netw* 2018 Jul;21(7):437-443. [doi: [10.1089/cyber.2017.0668](https://doi.org/10.1089/cyber.2017.0668)] [Medline: [29995530](https://pubmed.ncbi.nlm.nih.gov/29995530/)]
61. Wang J, Wang H, Gaskin J, Hawk S. The mediating roles of upward social comparison and self-esteem and the moderating role of social comparison orientation in the association between social networking site usage and subjective well-being. *Front Psychol* 2017 May 11;8:771 [FREE Full text] [doi: [10.3389/fpsyg.2017.00771](https://doi.org/10.3389/fpsyg.2017.00771)] [Medline: [28553256](https://pubmed.ncbi.nlm.nih.gov/28553256/)]
62. Landoll RR, La Greca AM, Lai BS. Aversive peer experiences on social networking sites: development of the social networking-peer experiences questionnaire (SN-PEQ). *J Res Adolesc* 2013 Dec 01;23(4):695-705 [FREE Full text] [doi: [10.1111/jora.12022](https://doi.org/10.1111/jora.12022)] [Medline: [24288449](https://pubmed.ncbi.nlm.nih.gov/24288449/)]
63. Primack BA, Shensa A, Sidani JE, Whaite EO, Lin LY, Rosen D, et al. Social media use and perceived social isolation among young adults in the U.S. *Am J Prev Med* 2017 Jul;53(1):1-8 [FREE Full text] [doi: [10.1016/j.amepre.2017.01.010](https://doi.org/10.1016/j.amepre.2017.01.010)] [Medline: [28279545](https://pubmed.ncbi.nlm.nih.gov/28279545/)]
64. Shensa A, Sidani JE, Escobar-Viera CG, Chu K, Bowman ND, Knight JM, et al. Real-life closeness of social media contacts and depressive symptoms among university students. *J Am Coll Health* 2018 Mar 30;66(8):747-753. [doi: [10.1080/07448481.2018.1440575](https://doi.org/10.1080/07448481.2018.1440575)] [Medline: [29452042](https://pubmed.ncbi.nlm.nih.gov/29452042/)]
65. Primack BA, Shensa A, Escobar-Viera CG, Barrett EL, Sidani JE, Colditz JB, et al. Use of multiple social media platforms and symptoms of depression and anxiety: a nationally-representative study among U.S. young adults. *Comput Human Behav* 2017 Apr;69:1-9. [doi: [10.1016/j.chb.2016.11.013](https://doi.org/10.1016/j.chb.2016.11.013)]
66. Best practices for asking questions about sexual orientation on surveys. The Williams Institute UCLA School of Law. 2009. URL: <https://www.webcitation.org/6nvqd3G4U> [accessed 2017-01-31] [WebCite Cache ID 6nvqd3G4U]
67. Badgett MV, Baker KE, Conron KJ, Gates GJ, Gill A, Greytak E, et al. Best practices for asking questions to identify transgender and other gender minority respondents on population-based surveys (GenIUSS). UCLA School of Law Williams Institute. 2014 Sep. URL: <http://williamsinstitute.law.ucla.edu/wp-content/uploads/geniuss-report-sep-2014.pdf> [accessed 2022-12-19]
68. Reisner SL, White Hughto JM, Pardee D, Sevelius J. Syndemics and gender affirmation: HIV sexual risk in female-to-male trans masculine adults reporting sexual contact with cisgender males. *Int J STD AIDS* 2016 Oct 11;27(11):955-966 [FREE Full text] [doi: [10.1177/0956462415602418](https://doi.org/10.1177/0956462415602418)] [Medline: [26384946](https://pubmed.ncbi.nlm.nih.gov/26384946/)]
69. Wylie SA, Corliss HL, Boulanger V, Prokop LA, Austin SB. Socially assigned gender nonconformity: a brief measure for use in surveillance and investigation of health disparities. *Sex Roles* 2010 Aug 01;63(3-4):264-276 [FREE Full text] [doi: [10.1007/s11199-010-9798-y](https://doi.org/10.1007/s11199-010-9798-y)] [Medline: [24077680](https://pubmed.ncbi.nlm.nih.gov/24077680/)]
70. Meyer IH, Rossano L, Ellis JM, Bradford J. A brief telephone interview to identify lesbian and bisexual women in random digit dialing sampling. *J Sex Res* 2002 May;39(2):139-144. [doi: [10.1080/00224490209552133](https://doi.org/10.1080/00224490209552133)] [Medline: [12476246](https://pubmed.ncbi.nlm.nih.gov/12476246/)]
71. Carle A, Riley W, Hays R, Cella D. Confirmatory factor analysis of the patient reported outcomes measurement information system (PROMIS) adult domain framework using item response theory scores. *Med Care* 2015 Oct;53(10):894-900 [FREE Full text] [doi: [10.1097/MLR.0000000000000413](https://doi.org/10.1097/MLR.0000000000000413)] [Medline: [26366521](https://pubmed.ncbi.nlm.nih.gov/26366521/)]
72. Shensa A, Sidani JE, Escobar-Viera CG, Switzer GE, Primack BA, Choukas-Bradley S. Emotional support from social media and face-to-face relationships: associations with depression risk among young adults. *J Affect Disord* 2020 Jan 01;260:38-44 [FREE Full text] [doi: [10.1016/j.jad.2019.08.092](https://doi.org/10.1016/j.jad.2019.08.092)] [Medline: [31493637](https://pubmed.ncbi.nlm.nih.gov/31493637/)]
73. Lee RM, Draper M, Lee S. Social connectedness, dysfunctional interpersonal behaviors, and psychological distress: testing a mediator model. *J Counsel Psychol* 2001 Jul;48(3):310-318. [doi: [10.1037/0022-0167.48.3.310](https://doi.org/10.1037/0022-0167.48.3.310)]
74. Grieve R, Indian M, Witteveen K, Anne Tolan G, Marrington J. Face-to-face or Facebook: can social connectedness be derived online? *Comput Human Behav* 2013 May;29(3):604-609. [doi: [10.1016/j.chb.2012.11.017](https://doi.org/10.1016/j.chb.2012.11.017)]
75. Felitti VJ, Anda RF, Nordenberg D, Williamson DF, Spitz AM, Edwards V, et al. Relationship of childhood abuse and household dysfunction to many of the leading causes of death in adults. *Am J Preventive Med* 1998 May;14(4):245-258. [doi: [10.1016/s0749-3797\(98\)00017-8](https://doi.org/10.1016/s0749-3797(98)00017-8)]

76. Hughes ME, Waite LJ, Hawkey LC, Cacioppo JT. A short scale for measuring loneliness in large surveys: results from two population-based studies. *Res Aging* 2004 Aug 19;26(6):655-672 [FREE Full text] [doi: [10.1177/0164027504268574](https://doi.org/10.1177/0164027504268574)] [Medline: [18504506](https://pubmed.ncbi.nlm.nih.gov/18504506/)]
77. Social isolation. PROMIS. URL: https://staging.healthmeasures.net/images/promis/manuals/PROMIS_Social_Isolation_Scoring_Manual.pdf [accessed 2022-12-27]
78. Shensa A, Escobar-Viera CG, Sidani JE, Bowman ND, Marshal MP, Primack BA. Problematic social media use and depressive symptoms among U.S. young adults: a nationally-representative study. *Soc Sci Med* 2017 Jun;182:150-157 [FREE Full text] [doi: [10.1016/j.socscimed.2017.03.061](https://doi.org/10.1016/j.socscimed.2017.03.061)] [Medline: [28446367](https://pubmed.ncbi.nlm.nih.gov/28446367/)]
79. Creswell J, Plano CV. Core mixed methods designs. In: *Designing and Conducting Mixed Methods Research*. Thousand Oaks, California: SAGE Publications; 2017.
80. NVIVO homepage. NVIVO. URL: <http://www.qsrinternational.com/nvivo-product> [accessed 2022-12-20]
81. Braun V, Clarke V. Using thematic analysis in psychology. *Qual Res Psychol* 2006 Jan;3(2):77-101. [doi: [10.1191/1478088706qp063oa](https://doi.org/10.1191/1478088706qp063oa)]
82. Braun V, Clarke V. It's almost time to depart: getting ready for your thematic analysis adventure. In: *Thematic Analysis: A Practical Guide*. London: SAGE Publications; 2021.
83. Nowell LS, Norris JM, White DE, Moules NJ. Thematic analysis. *Int J Qual Method* 2017 Oct 02;16(1):160940691773384. [doi: [10.1177/1609406917733847](https://doi.org/10.1177/1609406917733847)]
84. Fereday J, Muir-Cochrane E. Demonstrating rigor using thematic analysis: a hybrid approach of inductive and deductive coding and theme development. *Int J Qual Method* 2016 Nov 29;5(1):80-92. [doi: [10.1177/160940690600500107](https://doi.org/10.1177/160940690600500107)]
85. Kline R. Mean structures and latent growth models. In: *Principles and Practice of Structural Equation Modeling*. New York, United States: Guilford Press; 2016.
86. Duncan T, Duncan S, Strycker L. *An Introduction to Latent Variable Growth Curve Modeling Concepts, Issues, and Application, Second Edition*. New York: Routledge; 2006.
87. Quintana R. Thinking within-persons: using unit fixed-effects models to describe causal mechanisms. *Methods Psychol* 2021 Dec;5:100076. [doi: [10.1016/j.metip.2021.100076](https://doi.org/10.1016/j.metip.2021.100076)]
88. Iacobucci D. Structural equations modeling: fit indices, sample size, and advanced topics. *J Consum Psychol* 2009 Oct 03;20(1):90-98 [FREE Full text] [doi: [10.1016/j.jcps.2009.09.003](https://doi.org/10.1016/j.jcps.2009.09.003)]
89. Hu L, Bentler PM. Cutoff criteria for fit indexes in covariance structure analysis: conventional criteria versus new alternatives. *Structural Equation Modeling Multidisciplinary J* 1999 Jan;6(1):1-55. [doi: [10.1080/10705519909540118](https://doi.org/10.1080/10705519909540118)]
90. StataCorp. *Stata Statistical Software: Release 16*. College Station, Texas: StataCorp LLC; 2019.
91. van de Schoot R, Sijbrandij M, Winter SD, Depaoli S, Vermunt JK. The GRoLTS-checklist: guidelines for reporting on latent trajectory studies. *Structural Equation Modeling Multidisciplinary J* 2016 Nov 11;24(3):451-467. [doi: [10.1080/10705511.2016.1247646](https://doi.org/10.1080/10705511.2016.1247646)]
92. MacKinnon DP, Lockwood CM, Hoffman JM, West SG, Sheets V. A comparison of methods to test mediation and other intervening variable effects. *Psychol Methods* 2002 Mar;7(1):83-104 [FREE Full text] [doi: [10.1037/1082-989x.7.1.83](https://doi.org/10.1037/1082-989x.7.1.83)] [Medline: [11928892](https://pubmed.ncbi.nlm.nih.gov/11928892/)]
93. Cheong J. Accuracy of estimates and statistical power for testing mediation in latent growth curve modeling. *Struct Equ Modeling* 2011 Apr 06;18(2):195-211 [FREE Full text] [doi: [10.1080/10705511.2011.557334](https://doi.org/10.1080/10705511.2011.557334)] [Medline: [27547021](https://pubmed.ncbi.nlm.nih.gov/27547021/)]
94. Zethof D, Nagelhout G, de Rooij M, Driezen P, Fong GT, van den Putte B, et al. Attrition analysed in five waves of a longitudinal yearly survey of smokers: findings from the ITC Netherlands survey. *Eur J Public Health* 2016 Aug;26(4):693-699 [FREE Full text] [doi: [10.1093/eurpub/ckw037](https://doi.org/10.1093/eurpub/ckw037)] [Medline: [27060589](https://pubmed.ncbi.nlm.nih.gov/27060589/)]
95. Deeg D. Attrition in longitudinal population studies: does it affect the generalizability of the findings? An introduction to the series. *J Clin Epidemiol* 2002 Mar;55(3):213-215.
96. Gustavson K, von Soest T, Karevold E, Røysamb E. Attrition and generalizability in longitudinal studies: findings from a 15-year population-based study and a Monte Carlo simulation study. *BMC Public Health* 2012 Oct 29;12:918 [FREE Full text] [doi: [10.1186/1471-2458-12-918](https://doi.org/10.1186/1471-2458-12-918)] [Medline: [23107281](https://pubmed.ncbi.nlm.nih.gov/23107281/)]
97. Creswell J, Clark VL. *Designing and Conducting Mixed Methods Research*. Thousand Oaks, California: SAGE Publications; 2018.
98. Fetters M. *The Mixed Methods Research Workbook Activities for Designing, Implementing, and Publishing Projects*. Thousand Oaks, California: SAGE Publications; 2019.
99. McCrudden MT, Marchand G, Schutz PA. Joint displays for mixed methods research in psychology. *Methods Psychol* 2021 Dec;5:100067. [doi: [10.1016/j.metip.2021.100067](https://doi.org/10.1016/j.metip.2021.100067)]

Abbreviations

- LGBTQ+:** lesbian, gay, bisexual, transgender, and queer
- LGM:** latent growth model
- SEM:** structural equation modeling
- SGM:** sexual and gender minority

Edited by T Leung; This paper was peer reviewed by the National Institute on Minority Health and Health Disparities Special Emphasis Panel NIH Pathway to Independence Award (National Institutes of Health, USA). See the Multimedia Appendix for the peer-review report; Submitted 18.10.22; accepted 30.11.22; published 24.01.23.

Please cite as:

*Escobar-Viera C, Coulter RWS, Friedman MR, Thoma B, Switzer GE, Martina J, Egan JE, Primack B
The Influence of Social Media Interactions and Behaviors on Depressive Symptoms Among Sexual and Gender Minority Young Adults
in the United States: Protocol for a Mixed Methods Longitudinal Study*

JMIR Res Protoc 2023;12:e43627

URL: <https://www.researchprotocols.org/2023/1/e43627>

doi: [10.2196/43627](https://doi.org/10.2196/43627)

PMID:

©César Escobar-Viera, Robert W S Coulter, M Reuel Friedman, Brian Thoma, Galen E Switzer, Jamie Martina, James Erin Egan, Brian Primack. Originally published in JMIR Research Protocols (<https://www.researchprotocols.org>), 24.01.2023. This is an open-access article distributed under the terms of the Creative Commons Attribution License (<https://creativecommons.org/licenses/by/4.0/>), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work, first published in JMIR Research Protocols, is properly cited. The complete bibliographic information, a link to the original publication on <https://www.researchprotocols.org>, as well as this copyright and license information must be included.