RESEARCH ARTICLE

Check for updates

REVISED Mapping virtual platforms to estimate the population

size of men who have sex with men (MSM) who use internet

to find sexual partners: implications to enhance HIV

prevention among MSM in Kenya [version 2; peer review: 2

approved]

Faran Emmanuel¹, Japheth Kioko², Helgar Musyoki³, Shem Kaosa², Martin Kyana Ongaro⁴, Samuel Kuria⁵, Kennedy Olango⁶, Janet Musimbi², Jeffrey Walimbwa⁷, James Blanchard¹, Shajy Isac^{1,8}, Parinita Bhattacharjee ^[],²

¹Institute of Global Public Health, University of Manitoba, Winnipeg, Canada ²Partners for Health and Development in Africa, Nairobi, Kenya ³National AIDS and STI Control Programme, Ministry of Health, Nairobi, Kenya ⁴HIV and AIDS People's Alliance of Kenya, Mombasa, Kenya ⁵Mamboleo Peer Empowerment Group, Kiambu, Kenya ⁶Men Against AIDS Youth Group, Kisumu, Kenya ⁷G10 Research Network, Nairobi, Kenya ⁸India Health Action Trust, Delhi, India

V2 First published: 16 Sep 2020, 4:131 https://doi.org/10.12688/gatesopenres.13158.1 Latest published: 10 Dec 2020, 4:131 https://doi.org/10.12688/gatesopenres.13158.2

Abstract

Introduction: Men who have sex with men (MSM) in Kenya face a disproportionate HIV disease burden. Over the last few years, the use of virtual platforms and internet sites to seek male sexual partners has increased manyfold in Kenya. New approaches are required to map, estimate and profile MSM who operate through virtual platforms to design interventions for them.

Methods: This study was conducted in three counties in Kenya: Kiambu, Kisumu and Mombasa with MSM who use virtual platforms such as geosocial networking (GSN) and social networking applications to find and connect with male sex partners. The platforms were profiled through a multi-stage approach and the number of MSM associated with these platforms were estimated. In the final stage, 435 respondents randomly selected from the virtual platforms were interviewed in a secure location after informed consent. Data analysis focused on calculating an estimate of MSM for each virtual platform in each site, adjusting for duplicate profiles and multiple registrations.



Office, New Delhi, India

2. Keith M. Sabin (D), Joint United Nations Programme on HIV and AIDS (UNAIDS), Geneva, Switzerland **Results:** We identified 24 GSN apps, 18 Facebook accounts/pages and 18 WhatsApp groups across the three counties, with Facebook being the preferred platform. Kiambu had the highest number of estimated MSM at 3,635 (95%CI = 3,335 to 3,990) followed by Kisumu at 1,567 (95%CI = 1,480 to 1,665) and Mombasa at 1,469 (95%CI = 1,335 to 1,604) who used virtual platforms to find other male sexual partners. On average, each MSM had 3.7 profiles on multiple platforms, with an average of 2.1 profiles used in the past month. **Conclusions:** The use of conventional population size estimation approaches that focus on physical sites alone may underestimate the total number of MSM in a geography. Virtual mapping should be used in conjunction with conventional hot spot based size estimation methodologies to estimate numbers of MSM to set programmatic

Any reports and responses or comments on the article can be found at the end of the article.

Keywords

targets.

MSM, Virtual platforms, GSN platforms, Size estimation, Kenya

Corresponding author: Parinita Bhattacharjee (bhattacharjee.parinita@gmail.com)

Author roles: Emmanuel F: Conceptualization, Methodology, Writing – Original Draft Preparation; Kioko J: Data Curation, Investigation, Project Administration, Writing – Original Draft Preparation; Musyoki H: Conceptualization, Supervision, Validation, Writing – Review & Editing; Kaosa S: Data Curation, Investigation, Project Administration, Supervision, Writing – Review & Editing; Ongaro MK: Project Administration, Supervision, Validation, Writing – Review & Editing; Kuria S: Investigation, Project Administration, Supervision, Validation, Writing – Review & Editing; Olango K: Investigation, Project Administration, Supervision, Validation, Writing – Review & Editing; Musimbi J: Project Administration, Supervision, Validation, Writing – Review & Editing; Blanchard J: Conceptualization, Funding Acquisition, Methodology, Resources, Validation, Writing – Review & Editing; Isac S: Conceptualization, Data Curation, Formal Analysis, Methodology, Supervision, Validation, Writing – Original Draft Preparation, Writing – Review & Editing; Bhattacharjee P: Conceptualization, Funding Acquisition, Methodology, Supervision, Writing – Review & Editing

Competing interests: No competing interests were disclosed.

Grant information: This study was supported by the Bill and Melinda Gates Foundation [OPP1191068].

Copyright: © 2020 Emmanuel F *et al.* This is an open access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

How to cite this article: Emmanuel F, Kioko J, Musyoki H *et al.* Mapping virtual platforms to estimate the population size of men who have sex with men (MSM) who use internet to find sexual partners: implications to enhance HIV prevention among MSM in Kenya [version 2; peer review: 2 approved] Gates Open Research 2020, 4:131 https://doi.org/10.12688/gatesopenres.13158.2

First published: 16 Sep 2020, 4:131 https://doi.org/10.12688/gatesopenres.13158.1

REVISED Amendments from Version 1

Based on the reviewers comments we have revised the manuscript to provide clarity on selection of counties, sample size, sex work and limitations. This includes amendments to Table 3.

Any further responses from the reviewers can be found at the end of the article

Introduction

Kenva has the joint third largest epidemic in the world, with over 1.6 million people living with HIV¹. Kenya is characterized as having a generalized epidemic among the adult population; however, key populations including female sex workers, men who have sex with men (MSM) and people who inject drugs are at a heightened risk of HIV acquisition and transmission due to their sexual and social behaviors^{2,3}. MSM carry a disproportionate burden of HIV in Kenya, with a HIV prevalence of 18.2%, compared to a HIV prevalence of 3.1% among adult Kenyan men (including MSM), and contribute to nearly 15% of new infections each year3-5. In Kenya, "MSM" encompass a range of sexual identities including gay, bi-sexual, heterosexual and men who sell sex to other men⁶. To scale up HIV prevention, there is a need to estimate the size of key populations and also understand where they congregate and can be reached7. Programmatic mapping and size estimation of MSM conducted by NASCOP in 2018 estimated a total number of 32,580 MSM (ranging between 24,704 to 40,455) in 34 counties in Kenva⁸. Since discriminatory legislation, criminalization and stigma attached to same-sex relationships poses major barriers for MSM to seek other male partners at physical sites, estimates obtained from conventional size estimation approaches including geographic and programmatic mapping are considered to underestimate of the total number of MSM9.

Globally, with recent advances in information technology and improved mobile networks, an increased number of MSM have started using the internet and geosocial networking mobile phone applications (GSN apps) to seek and meet other male sexual partners¹⁰⁻¹². A meta-analysis of internet use among MSM concluded that approximately 35% to 45% of MSM use social media to exchange information, socialize and support each other¹³. A recent study conducted among MSM in Kenya found that 64% of the respondents used the internet and virtual platforms to seek male sexual partners¹⁴. These include GSN apps such as Grindr, Scruff, Adam4Adam, Gay Exchange etc., as well as social media applications such as Facebook and general communication apps like WhatsApp. GSN apps use geo-location features of smart phones to display potential contacts based on their physical proximity, making sexual partner seeking quick and convenient¹⁵. Through these apps, users create individual profiles with pictures and are able to view people online within their geographical proximity¹⁶. Other social media apps such as Facebook and messenger apps such as WhatsApp are messaging and calling platforms available for free, provided internet is available¹⁷. Through these networks one could connect with people they already know or

could join a local/international network or group through an invitation or a link.

As same sex relationships are stigmatized, the internet provides a safe space for MSM to connect and find sexual partners in a covert manner without facing stigma, discrimination and negative reactions from the larger community¹⁸. These virtual platforms act like a safe community space for MSM and that has led to a decline in the number and significance of public locations where MSM meet other men, especially in countries where same sex relationships are criminalized⁹. Given the increasing popularity of the internet to find sexual partners, compounded by discriminatory laws and social stigma specifically affecting MSM populations, it is more challenging to enumerate their numbers and estimate population size and expand HIV prevention services to MSM engaged in these virtual sites^{19,20}. While there has been research conducted to understand the MSM using virtual sites, the studies have mostly looked at risk behaviors and operations of this dynamic sub-typology^{12,13,15}. Indirect estimation of the population size of MSM has also been attempted; however, such estimation provides more generalized estimates based on the number of MSM registered on various sites¹¹. In this paper we present an emerging new approach called virtual mapping to locate and estimate the population size of MSM who seek male sexual partners through the internet and various phone-based applications. The approach has been tested and utilized with reliable results in a few countries and was modified to the local context in Kenya.

Methods

Study design

The data collection was done as part of the routine HIV prevention programming with MSM in the three counties, Kisumu, Mombasa and Kiambu, in Kenya. The three counties represent three distinct geographies in Kenya with an HIV prevalence between 9% to 27%. Kiambu is located in the central, Kisumu is located in the western part and Mombasa is in the coastal part of Kenya²¹. In these counties, the prevention program is being implemented by MSM-led community-based organizations (CBOs). Mapping of virtual sites where MSM meet other sexual partners and cross-sectional data collection from respondents selected from the virtual sites was done by CBO members and program staff. Secondary analysis of this data was carried out to write this paper.

Study setting

The community-led data collection was conducted in three counties, namely Kiambu, Kisumu and Mombasa, which were selected based on a high number of MSM as well as a high prevalence of HIV, at 23%, 13% and 19% in Kiambu, Kisumu and Mombasa, respectively²¹. The study was led by the University of Manitoba and National AIDS and STI Control Program (NASCOP) in partnership with three MSM-led community-based organizations (CBOs), namely Mamboleo Peer Empowerment Group (MPEG) in Kiambu, Men Against AIDS Youth Group (MAAYGO) in Kisumu and the HIV & AIDS People's Alliance of Kenya (HAPA Kenya) in Mombasa. The study received technical support from the G10 MSM research

network in Kenya. Field data collection was conducted from June to July 2018 by 12 MSM community researchers known as virtual mappers (four in each site), who were trained in a three-day training prior to the study.

Data collection

The study used a three-stage approach to map and estimate the population size of MSM.

Stage I served as the first step, with the aim of developing a comprehensive list of all virtual platforms and sites used by MSM to find sexual partners in the three geographies. A diverse group of virtual mappers were recruited. These virtual mappers were members of the three MSM-led CBO's, some of them were students and others worked as peer educator and outreach workers in the CBO and were well versed in the use of the internet. They reached out and consulted other MSM community members in their social network and developed a comprehensive list of all WhatsApp groups, Facebook pages and GSN applications in use within the selected counties.

Stage 2 involved profiling each of these virtual platforms/ sites identified in the previous stage, including validating its active functioning and estimating the size of MSMs using it at different timings. Virtual mappers created their own profiles and regularly visited each platform/site at three different times of the day for a period of two weeks based on a schedule developed by the investigators. They used a pre-designed format to note down the day and time of their visit to each platform and internet site, the total number of registered users within the county's catchment area and the number of MSM online at that particular time. Information on the total number of registered MSM within the catchment area visible while online was used to estimate the population size of MSM.

In stage 3, interviews were conducted with randomly selected MSM from multiple virtual sites in each county. To achieve an optimum sample size, we assumed a population prevalence of 50% with a precision of 5% and 95% confidence interval. Since we expected a higher non-response, we inflated the sample size calculated by 15%, which calculated an overall sample of 440. To achieve this sample, we randomly selected 15 virtual sites in each county and a random sample of 10 MSM from each selected platform were selected using a random number table from all users who were online, on different days and at different times. The virtual mapper logged on, randomly selected a person, introduced the study and invited the selected person to participate in the face-to-face survey following online informed consent. If the person agreed to participate, he was invited at a convenient time and place for a face-to-face interview as mutually agreed. The interviews were conducted by the 12 virtual mappers in a secure room, in a secure office building, mostly at the drop-in centre of the MSM led organization, after written consent was obtained. These data collectors were trained and monitored regularly by the University of Manitoba's team during the data collection process. Data quality checks were done on a regular basis and any data errors

were quickly identified and rectified by the study coordinators/data managers. The interviewers used a standard close ended questionnaire²² and each interview took 25–30 minutes. A total number of 435 MSM were interviewed (119 in Kiambu, 172 in Kisumu and 144 in Mombasa).

Data management and analysis

Data were collected using a structured questionnaire²², which was reviewed and revised by the virtual mappers before handing it over to the data management team. During the revisions the mappers reviewed the relevance of each question, language used and sensitivity of the MSM community towards the question. The information was entered into a database specifically designed for this study in Microsoft Excel for stage 1 and stage 2 data and SPSS 25.0 for stage 3 data. The analysis was conducted using SPSS 25.0. Stage 2 data provided the total number of users registered with each virtual platform and an unadjusted estimate of registered MSM within each county was calculated. This unadjusted estimate included duplicates owing to the use of multiple platforms as well as multiple registrations on a single platform. Questionnaire information gathered during face-to-face interviews in stage 3 provided correction factors that allowed us to adjust for this duplication using the number of profiles each MSM could have. We used a correction factor accounting for the mean number of profiles for each MSM, as well as the proportion that uses multiple platforms and sites. The correction factor was used to adjust for duplication and calculate the estimated number of MSMs in each county using the following formula;

$$E = \sum_{i=1}^{n} \operatorname{Ei} * (1-p) + \sum_{i=1}^{n} \operatorname{Ei} * \frac{p}{m}$$

Where *E* is the adjusted estimate of all MSM registered at the virtual site; *Ei* is the number of MSMs registered with virtual platform *i*; *p* is the proportion of MSMs using more than one virtual platform; *m* is the mean number of virtual platforms an MSM used; and i=1...n is the number of virtual platforms. Once an estimate was developed, we created a 95% confidence interval around the estimated number of MSM in each county as;

Lower estimate of MSM (E_L), E_L = $\sum_{i=1}^{n} \text{Ei} * (1-p) + \sum_{i=1}^{n} \text{Ei} * \left(\frac{p}{m_u}\right)$ and the upper estimate of MSM (E_U), E_U = $\sum_{i=1}^{n} \text{Ei} * (1-p) + \sum_{i=1}^{n} \text{Ei} * \left(\frac{p}{m_i}\right)$, where m₁ and m_u are the lower and upper confidence limit of mean number of profiles.

Ethical considerations

Ethical approval for secondary analysis of the study data was obtained from the Ethical Review Committee of Kenyatta National Hospital, University of Nairobi (P647/11/2017). International ethical guidance was followed to maintain confidentiality of participants i.e., no recording of participant identify or personal identification information, use of unique identifying codes, use of password protected electronic data files, and limiting access to the data files to authorized individuals only. Informed written consent was obtained, and all interviews were conducted in a safe and secure place. All participating MSM were compensated for their time and travel and were paid a compensation in Kenyan Shillings equivalent to \$5 USD. Debriefing sessions were conducted after the interviews and all participating MSM were referred to HIV prevention, treatment and care facilities.

Results

Table 1 presents information collected for various virtual platforms and internet sites used by MSM in the study counties. We identified a total number of 60 platforms classified within three broader types i.e., 24 GSN apps, 18 Facebook pages and 18 WhatsApp groups. Among the GSN sites, Badoo, Grindr, Tagged, Planet Romeo and Hornet were the five most used apps in all three counties. The majority (79%) of the MSM knew of a virtual platform other than the one they primarily used to find partners. Nearly one-fifth (19.3%) of MSM had only one registered profile, 62% had two to four user profiles on different virtual platforms and 15.4% had more than four user profiles.

on multiple virtual platforms. Analyzed by type, those using WhatsApp had 5.6 profiles on multiple sites, followed by GSN app users and Facebook users who had 3.8 and 2.7 profiles, respectively. While a high number of profiles were reported, approximately two profiles were reported to be used by respondents in the last month. Nearly three-quarters (74%) of respondents reported that they also visited physical spots, with a higher percentage of those who visited being from WhatsApp groups (86%). However, 26% of the respondents reported exclusively using virtual platforms. Overall, we estimated a total number of 6,672 (95%CI = 6,174 to 7,259) MSM registered on all virtual platforms included in this study. Facebook had the highest number of registered MSM at 5,910 (95%CI = 5,076 to 7,072), followed by GSN sites (3,118; 95%CI = 2,937 to 3,324) and WhatsApp (746; 95%CI = 642 to 891).

Table 2 presents the estimated number of MSM who operate through virtual platforms by county. Results show that MSM in Mombasa used the most virtual platforms (43) followed by those in Kiambu (34) and Kisumu (29). Kiambu had the highest

Variable	Tatal	Type of virtual platforms/site				
Variable	Iotai	GSN	Facebook	WhatsApp		
Total number of platforms identified	60	24	18	18		
Used another virtual platform in addition to the primary platform used	79.1 %	82.4 %	63.1 %	93.8 %		
Total number of profiles *						
• Single profile	19.3 %	16.9 %	32.0 %	6.3 %		
• 2 to 4 profiles	61.8 %	61.8 % 62.0 % 5		83.3 %		
• More than 4 profiles	15.4 %	18.3 %	9.7 %	10.4 %		
Average number of registered profiles	3.7	3.8	2.7	5.6		
Profiles used in the last month	2.0	2.1	2.0	1.7		
MSM who also visited physical spots to find partners (%)	74 %	71 %	78 %	86 %		
Number of MSM estimated on each virtual platform						
• Total estimated number of MSM (95% CI)	6,672 (6174- 7259)	3,118 (2937- 3324)	5,910 (5076- 7072)	746 (642- 891)		
• Average ± SD number of MSM on each site	215 ± 199	209 ± 60	391 ± 587	46 ± 22		

Table 1. Virtual platforms used by MSM in selected counties in Kenya, 2018.

* No of accounts created by each respondent.

MSM, men who have sex with men; GSN, geosocial networking.

	Total	Kiambu	Kisumu	Mombasa
Virtual platforms identified*				
• GSN apps	24	22	22	23
• Facebook	18	7	1	10
• WhatsApp	18	5	6	10
Estimated number of MSM				
• Average	6,672	3,635	1,567	1,469
• Min	6,174	3,335	1,480	1,335
• Max	7,259	3,990	1,665	1,604

 Table 2. Estimated number of MSM operating through virtual platforms in selected counties in Kenya, 2018.

* County platforms don't add to the overall total because same platforms exist across counties.

MSM, men who have sex with men; GSN, geosocial networking

number of estimated MSM, calculated at 3,635 (95%CI = 3,335 to 3,990), followed by Kisumu at 1,567 (95%CI = 1,480 to 1,665) and Mombasa at 1,469 (95%CI = 1,335 to 1,604).

Socio-demographic characteristics and sexual profiles of MSM using various virtual platforms disaggregated by county as well as by the type of virtual platform used are shown in Table 3. Of the 435 respondents interviewed, 61% were below the age of 25 years. Kisumu had a high proportion (68%) of respondents who were under 25 years of age compared to Kiambu (61%) and Mombasa (51%). No age specific differences were noted between MSM using various platforms or sites. The majority of respondents had completed at least secondary education. In terms of sexual orientation, 69% of respondents self-identified as gay men, while 30% identified as bisexual. A large proportion of the respondents, 83% in Mombasa and 79% in Kiambu, identified themselves as gay men compared to 52% in Kisumu. A higher proportion of respondents (77%) using Facebook identified themselves as gay, followed by GSN apps (68%) and WhatsApp (60%). The majority of respondents (97%) identified themselves as male, with 3% identifying themselves as transgender. Almost half (48%) of respondents in Kisumu reported assuming the top sexual role compared to 40% in Mombasa and 34% in Kiamabu. Similarly, 63% of MSM on WhatsApp reported to assume the top sexual role as compared to 39% on GSN sites and 38% on Facebook. The study also found that 69% of respondents sold sex for money as sex workers; Mombasa reported a large proportion of sex workers (70%) compared to Kisumu (60%) and Kiambu (45%). More respondents using WhatsApp (68%) reported selling sex for money compared to Facebook (65%) and GSN apps (56%).

Respondents reported virtually connecting with 16.8 male partners in the last week, the highest being in Kiambu (22.7) compared to Kisumu (19.8) and Mombasa (7.9) and on GSN apps (19) compared to WhatsApp (17.4) and Facebook (10.1). The

connections mentioned are only "digital connections" i.e, other MSM connected through virtual sites and apps and does not include MSM connected through physical sites". Respondents reported an average of 4.9 men with whom they had anal sex in the last week and sold sex to an average of 2.8 men. County-wide analysis showed respondents in Kisumu had a significantly higher number of partners (8.1 and 4.4 with whom they had anal sex and sold sex, respectively) compared to Kiambu (2.7 and 1.3) and Mombasa (2.5 and 1.9) while no differences were noted in site-based analysis of sexual encounters in the last week. Similar differences were seen in the platforms/sites, with respondents using WhatsApp reporting having anal sex with five men in the last week and selling sex to 1.7 men compared to GSN platforms (4.9 and 2.7) and Facebook (4.8 and 3.5). When considered those selling sex only, on an average they sold sex to 4.1 persons as against 2.8 among the total respondents. Among the MSM selling sex, the number with whom they sold sex vary from 2.5 in Mombasa to 6.3 in Kisumu and 1.9 among WhatsApp group members to 4.8 among Facebook page users.

Discussion

Although a virtual mapping approach has been used in a few countries²³⁻²⁵ it was used for the first time in Kenya and has successfully identified all key virtual platforms and internet sites, along with the estimated number of MSM who use these platform/sites to find male sexual partners. Based on how each platform or site operates, we classified them into three broader types. The first is GSN apps (e.g., Badoo, Grindr, Hornet), which require GPS-enabled smart phones, and allow subscribers to register profiles with personal information, upload pictures, share their location and see other network members within a specific distance. The second variant is social media applications like Facebook and, finally, communication applications such as WhatsApp. The latter two are general purpose social networking platforms, have a larger generalized use and are not uniquely designed for seeking partners. Interestingly, we found several designated Facebook pages and

	Total		County		Type of virtual platform		
		Kiambu	Kisumu	Mombasa	GSN app	Facebook	WhatsApp
Total MSM interviewed (N)	435	119	172	144	284	103	48
Age							
• <25 years	61%	61%	68%	51%	60%	63%	63%
• 25+ years	39%	39%	32%	49%	40%	37%	38%
Education							
No formal education	1%	None	3%	None	1%	2%	2%
Secondary	53%	27%	48%	80%	47%	65%	60%
• Tertiary/college	46%	73%	48%	19%	51%	33%	38%
Sexual orientation							
• Gay	69%	79%	52%	83%	68%	77%	60%
• Bisexual	30%	21%	47%	17%	31%	23%	38%
Gender identity							
• Male	97%	98%	99%	94%	98%	96%	98%
• Trans	3%	2%	1%	6%	2%	4%	2%
Sexual role							
Bottom	29%	33%	27%	29%	30%	30%	21%
• Тор	42%	34%	48%	40%	39%	38%	63%
• Versatile	25%	32%	15%	31%	24%	31%	17%
Sells sex	59%	45%	60%	70%	56%	65%	68%
People connected in last week	16.8	22.7	19.8	7.9	19.0	10.1	17.4
Men with whom had anal sex in last week	4.9	2.7	8.1	2.5	4.9	4.8	5.0
Men to whom sold sex last week	2.8	1.3	4.4	1.9	2.7	3.5	1.7
Men to whom sold sex last week (among those sold sex)	4.1	2.8	6.3	2.5	4.4	4.8	1.9

Table 3. Socio-demographic, sexual & network related characteristics of MSM operating through virtualplatforms in selected counties in Kenya, 2018.

MSM, men who have sex with men; GSN, geosocial networking.

WhatsApp groups specifically created for the purpose of finding MSM sexual partners even though these sites needed invitation or acquaintance with an existing member of these groups to join. These WhatsApp and Facebook groups were local to the counties in which this study was conducted. WhatsApp and Facebook groups have no geo-spatial info for the participants, which is a feature only of GSN apps. Our finding that Facebook was the most used virtual platform by MSM to seek male sexual partners is also in agreement with previous research²⁶. The MSM estimates developed through this study

may be much more realistic and closer to the actual number of MSM population in Kenya. The previous MSM estimates were derived using geo-spot based programmatic mapping techniques and estimated 1,664 MSM in Kiambu, 2,492 in Kisumu and 2,855 in Mombasa⁸. Since that methodology did not include MSM who use virtual platforms, there could have been an underestimation of the total number of MSM in Kenya. Although our study focused on MSM who use virtual platforms and the internet and estimated 3,635 MSM in Kiambu, 1,567 MSM in Kisumu and 1,469 MSM in Mombasa, we found a significant

overlap between MSM who use virtual sites and those who go to physical spots to find new partners. Nearly three-quarters of the MSM mainly using virtual platforms also visited physical spots to find partners, which is in concurrence with another survey conducted among MSM in these three counties. The survey showed that 14.7% of the MSM sought male sexual partners only in physical sites, 64.0% in both physical and virtual sites and 21.2% in only virtual sites¹⁴. These findings warrant the importance of conducting mapping of both physical and virtual platforms, as developing size estimates from a single approach may underestimate the number of MSM. At the same time, this presents another important insight that the overall estimate of MSM isn't a simple additive function of geo-spot based MSM and virtual mapping estimates, but would require an adjustment of the overlapping proportion of MSM who use both physical and virtual sites. When adjusted for these overlaps, the total number of MSM in Kenya were approximately 25% in excess of the estimated number of MSM derived through geo-mapping.

We also calculated the standard measure of per capita i.e., number of online MSM per 1000 adult (15-64 years) males. It shows that the per capita MSM online per 1000 adult males are 6.7, 7.2 and 4.1 for Kiambu, Kisumu and Mombasa respectively. In addition to providing population size estimates, the current study has also enhanced our understanding of virtual platform and internet based MSM in terms of their profiles, networks and how they connect with each other. Our results show that the participants in this study are young males with high education levels, which has also been shown in previous studies^{10,12}. This may be reflective of the access and ease of use of the internet within a specific segment of the population in a resource constrained country. We have also seen that more than 80% of MSM use multiple sites, and also have multiple identities registered on a single site. This is also in concurrence with previous research²⁵⁻²⁷. Estimating the size of this population based on total counts of registered MSM at various virtual sites, without adjusting for these duplications will lead to an over-representation of the population size manyfold more than the actual numbers¹¹.

The findings of this study have several implications for HIV programming for MSM in Kenya. A substantial proportion of MSM stay hidden and are unlikely to receive services regularly through the existing MSM programs. Missing this population from a HIV program would mean denying critical HIV prevention and treatment services to a very high risk and vulnerable sub-population of MSM. In Kenya, we previously found that MSM who operate through virtual sites alone had a much higher HIV prevalence (26.7%) compared to those who seek sexual partners in physical and virtual sites (15.4%) or only physical sites (8.5%)¹⁴. Identifying MSM who engage in these virtual sites provides an avenue to reach them with HIV prevention and care services. HIV prevention programs should include virtual mapping in their strategic design and engage outreach workers and peer educators to reach out to these MSM. Those who wish to stay invisible and do not feel comfortable coming to the MSM led clinic or services can be offered outreach services at a safe space of their choice.

The findings of this study should be considered in light of a few limitations. Firstly, the accuracy of results is dependent on the accuracy of the app itself i.e., geo-specificity allowed by the GSN apps. Thus, the design of the study will not work appropriately in contexts where geo-specification of the catchment area is not allowed by the GSN apps. Sampling of respondents was also subject to a level of selection bias. Although the sample was based on a random selection of multiple sites, the selection of MSM was based on who was available at that moment and also who was willing to participate. The estimation of the population size of MSM is also based on the total number of MSM registered on various GSN apps and internet sites, and some registrations could have been redundant as well. Owing to a smaller sample size, the estimate generated have wider ranges, which could have been more precise if a larger sample size was achieved. Finally, our approach to virtual-site sampling made it challenging to document a non-response rate, which further limits our ability to judge selection bias. Although the methodology has limitations, it still provides a simple approach to estimate the number of MSM connected to virtual platforms in addition to understanding the operational dynamics of this concealed sub-typology which can be utilized to improve their reach and coverage.

Conclusions

To conclude, as internet usage around the world increases, its use by MSM will continue to gain popularity to find sexual partners, especially in cultures where same sex relationships are stigmatized. There is an increasing need to understand this subgroup, its size and dynamics to plan, develop and implement evidence-based prevention programs. The research methodology presented in this paper was able to map various virtual platforms and internet sites used by MSM and provide a methodology to estimate their size. The approach is simple and pragmatic and could be utilized to immediately initiate interventions among MSM who operate through virtual networks and stay hidden from programs. Although the approach might have limitations, there is a clear indication that use of geospot based mapping alone underestimates the total number of MSM in a given context and therefore should be used in conjunction with this methodology to calculate population estimates, set programmatic targets and initiate interventions to reach hidden and hard to reach MSM.

Data availability

Underlying data

This data is confidential considering the fact that MSM are a criminalized population in Kenya and sharing names of sites may put their life in danger. Aggregate level de-identified data tables are available at http://www.phdaf.org/publications/ and on Harvard Dataverse (see below). The corresponding author (bhattacharjee.parinita@gmail.com) will be able to facilitate access to the full underlying data. A formal request needs to be made and a data sharing agreement will have to be made before sharing the data.

Harvard Dataverse: Data for Virtual Mapping in Kenya. https://doi.org/10.7910/DVN/9B9FFB²⁸ This project contains the following underlying data:

- DATA MSM interviews.tab (aggregate data collected through Form C)
- DATA Virtual Site Visit profiling.tab (aggregate data collected through Form B)

Extended data

Harvard Dataverse: Questionnaire for Virtual Mapping in Kenya. https://doi.org/10.7910/DVN/HQRGYT²²

This project contains the following extended data:

- FORM MSM Interviews.pdf (Form C)
- FORM Virtual Site Visit Profiling.pdf (Form B)

Data are available under the terms of the Creative Commons Zero "No rights reserved" data waiver (CC0 1.0 Public domain dedication).

Acknowledgements

We acknowledge all the MSM community researchers and virtual mappers who conducted this study. We thank the respondents. We also thank Memory Melon, Margret Njraini and Judie Onyoni from Partners for Health and Development for their supervisory support in implementation of the study.

Disclaimer

The views expressed herein are those of the authors and do not necessarily reflect the official policy or position of Bill and Melinda Gates Foundation.

References

- 1. UNAIDS: AIDS Info 2020. Accessed April 26, 2020. Reference Source
- NASCOP Kenya: Kenya AIDS Strategic Framework 2014. Accessed April 20, 2020.
 Reference Source
- NASCOP Kenya: 2010-2011 Integrated Biological and Behavioral Surveillance Survey among Key Populations in Nairobi and Kisumu, Kenya. Accessed April 20, 2020. Reference Source
- NACC Kenya: Kenya HIV Estimates Report 2018. Accessed January 10, 2020. Reference Source
- NASCOP Kenya: Preliminary KENPHIA 2018 Report. National AIDS and STI Control Program (NASCOP). Accessed April 14, 2020. Reference Source
- NASCOP Kenya: Geographic Mapping of Most at Risk Populations for HIV (MARPs) in Kenya. 2012. Accessed January 10, 2020. Reference Source
- Emmanuel F, Persaud N, Weir SS, et al.: Programmatic mapping: Providing evidence for high impact HIV prevention programs for female sex workers. J Med Internet Res. 2019; 21(6).
- NASCOP Kenya: Key population mapping and size estimation in selected counties in Kenya 2018. National AIDS Control Council and National AIDS and STI Control Program. Nairobi, Kenya. Accessed April 14,2020. Reference Source
- Davis SLM, Goedel WC, Emerson J, et al.: Punitive laws, key population size estimates, and global AIDS response progress reports: An ecological study of 154 countries. J Int AIDS Soc. 2017; 20(1): 21386.
 PubMed Abstract | Publisher Full Text | Free Full Text
- Benotsch EG, Kalichman S, Cage M: Men Who Have Met Sex Partners via the Internet: Prevalence, Predictors, and Implications for HIV Prevention. Arch Sex Behav. 2002; 31(2): 177–83.
 PubMed Abstract | Publisher Full Text
- Baral S, Turner RM, Lyons CE, et al.: Population size estimation of gay and bisexual men and other men who have sex with men using social mediabased platforms. J Med Internet Res. 2018; 20(2): 1–9.
- Brian M, Tom L, Garcia SC: Internet Use and Sexual Health of Young Men Who Have Sex with Men: A Mixed-Methods Study. Arch Sex Behav. 2011; 40(2): 289–300.
 PubMed Abstract | Publisher Full Text | Free Full Text
- Liau A, Millett G, Marks G: Meta-analytic examination of online sex-seeking
- and sexual risk behavior among men who have sex with men. Sex Transm Dis. 2006; 33(9): 576–84.
 PubMed Abstract | Publisher Full Text
- Bhattacharjee P, Isac S, Musyoki H, et al.: HIV prevalence, testing and treatment among men who have sex with men through engagement in virtual sexual networks in Kenya: a cross-sectional bio-behavioural study. *J Int AIDS Soc.* 2020; 23 Suppl 2(Suppl 2): e25516.
 PubMed Abstract | Publisher Full Text | Free Full Text
- 15. Macapagal K, Coventry R, Puckett JA, et al.: Geosocial Networking App Use

Among Men Who Have Sex With Men in Serious Romantic Relationships. Arch Sex Behav. 2016; **45**(6): 1513–1524. PubMed Abstract | Publisher Full Text | Free Full Text

- Brown G, Maycock B, Burns S: Your picture is your bait: use and meaning of cyberspace among gay men. J Sex Res. 2005; 42(1): 63–73.
 PubMed Abstract | Publisher Full Text
- Medaglia R, Rose J, Nyvang T, et al.: Characteristics Of Social Networking Services. The 4th Mediterranean Conference on Information Systems, MCIS 2009, Athens, Greece, 2009. Accessed May 17, 2020. Reference Source
- Wei C, Lim SH, Guadamuz TE, et al.: Virtual versus physical spaces: which facilitates greater HIV risk taking among men who have sex with men in East and South-East Asia? AIDS Behav. 2014; 18(8): 1428-35.
 PubMed Abstract | Publisher Full Text | Free Full Text
- Abdul-Quader AS, Baughman AL, Hladik W: Estimating the size of key populations: current status and future possibilities. Curr Opin HIV AIDS. 2014; 9(2): 107–114.
 PubMed Abstract | Publisher Full Text | Free Full Text
- 20. Understanding the impact of smartphone applications on the sexual health of men who have sex with men and HIV prevention in Europe. Reference Source
- National AIDS and STI Control Programme (NASCOP): Third National Behavioural Assessment of key populations in Kenya, polling booth survey report. Nairobi: Ministry of Health, Government of Kenya; 2018. Accessed April 15th 2020. Reference Source
- Isac S, Bhattacharjee P: Questionnaire for Virtual Mapping in Kenya. Harvard Dataverse, V1, 2020. http://www.doi.org/10.7910/DVN/HQRGYT
- National AIDS Control Programme (NACP): Integrated Biological and behavioral surveillance in Pakistan. National AIDS Control Program, Islamabad, Pakistan. 2017. Accessed June 10, 2020. Reference Source
- Bunjaku DG, Deva E, Gashi L, et al.: Programmatic mapping to estimate size, distribution, and dynamics of key populations in Kosovo. J Med Internet Res. 2019; 21(3): 1–9.
- Pathack A, Saumtally A, Soobhany S, et al.: Programmatic mapping to determine the size and dynamics of sex work and injecting drug use in Mauritius. Afr J AIDS Res. 2018; 17(2): 129–36.
 PubMed Abstract | Publisher Full Text
- Greenwood S, Perrin A, Duggan M: Social Media Update 2016. Accessed January 15, 2020. Reference Source
- Rhoton J, Wilkerson JM, Mengle S, et al.: Sexual Preferences and Presentation on Geosocial Networking Apps by Indian Men Who Have Sex with Men in Maharashtra. JMIR mHealth uHealth. 2016; 4(4): e120.
 PubMed Abstract | Publisher Full Text | Free Full Text
- Isac S, Bhattacharjee P: Data for Virtual Mapping in Kenya. Harvard Dataverse, V1, UNF: 6: 1XjYDdmmVAcHeHmIaEfajw== [fileUNF]. 2020. http://www.doi.org/10.7910/DVN/9B9FFB

Open Peer Review

Current Peer Review Status:

Version 1

Reviewer Report 12 October 2020

https://doi.org/10.21956/gatesopenres.14354.r29589

© **2020 Sabin K.** This is an open access peer review report distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.



Keith M. Sabin 匝

Joint United Nations Programme on HIV and AIDS (UNAIDS), Geneva, Switzerland

This manuscript describes efforts to systematically develop size estimates of men who have sex with men among those who use social media platforms. The measurement of men who use dating apps or other social media to find is a relatively new and growing area of inquiry. This paper adds a reasonable approach to the toolbox.

Specific comments:

- The selection of counties is a bit convenient. To what degree are these counties unusual? Did other counties have polling booth surveys and see smaller measured prevalence? Who participates in polling booth surveys? Are they not people already enrolled in programs and perhaps more likely to know their HIV+ status and therefore more in need of services? Just trying to understand how generalizable these sites are.
- How was the catchment area for WhatsApp or Facebook measured? Is there any geospatial info from those participants?
- I think the formula to account for duplicate accounts seems reasonable.
- Given that this sampling approach is similar to multi-stage cluster sampling, was there consideration of a design effect in the sample size calculation?
- I also question if it's reasonable to have one sample size across 3 sites and then show the data for the individual sites. I think the variance should be larger for the individual sites given that the sample size was calculated to be larger for a 95% interval.
- In the final paragraph of the results, there is allusion to "respondents connecting." Is this only digital connection? The authors might want to clarify this though I think the next sentences discussing number of sex partners suggests that these are two different categories of "connection."

- Is the average number of partners to whom sex was sold based on a denominator of only people who sold sex? Is this number diminished by the 40% who do not sell sex? I think this might be more informative if the numbers were disaggregated by those who did sell sex.
- What proportion of the adult male population do these online groups constitute in each county? It would be interesting to see if the proportions are consistent across counties and have some generalizability.
- This is a strong report and a good contribution to the literature.

Is the work clearly and accurately presented and does it cite the current literature? $\ensuremath{\mathsf{Yes}}$

Is the study design appropriate and is the work technically sound? Yes

Are sufficient details of methods and analysis provided to allow replication by others? $\ensuremath{\mathsf{Yes}}$

If applicable, is the statistical analysis and its interpretation appropriate? $\ensuremath{\mathsf{Yes}}$

Are all the source data underlying the results available to ensure full reproducibility? $\ensuremath{\mathsf{Yes}}$

Are the conclusions drawn adequately supported by the results? $\ensuremath{\mathsf{Yes}}$

Competing Interests: No competing interests were disclosed.

Reviewer Expertise: I work on monitoring and evaluating national HIV programs' interventions for key population. I model estimates of the size of HIV epidemics. I study methods for conducting surveys of key populations and estimating their overall sizes.

I confirm that I have read this submission and believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.

Author Response 18 Oct 2020

Parinita Bhattacharjee, University of Manitoba, Winnipeg, Canada

Response to Reviewer: Dr. Keith Sabin:

This manuscript describes efforts to systematically develop size estimates of men who have sex with men among those who use social media platforms. The measurement of men who use dating apps or other social media to find is a relatively new and growing area of inquiry. This paper adds a reasonable approach to the toolbox. We thank the reviewer for this acknowledgement.

Specific comments:

 The selection of counties is a bit convenient. To what degree are these counties unusual? Did other counties have polling booth surveys and see smaller measured prevalence? Who participates in polling booth surveys? Are they not people already enrolled in programs and perhaps more likely to know their HIV+ status and therefore more in need of services? Just trying to understand how generalizable these sites are.

As we mentioned, this study was done as part of the routine HIV prevention programming with MSM in Kenya. The three counties represent three distinct geographies in Kenya. Kiambu is located in the east, Kisumu is located in the western part and Mombasa is in the coastal part of Kenya. Polling Booth Surveys have been conducted in 6 counties and the HIV prevalence range from 9% to 27%. These three counties were selected as they represent geographic diversity and HIV prevalence.

Polling Booth Surveys use a population based random sampling approach. At the first level hotspots are randomly selected and in the second level MSM who visit the hotspots are randomly selected and screened for eligibility after consent and subsequent interview. So all MSM who visit the sampled hotspots have the possibility of being selected to participate in the survey.

In terms of generalizability of the study, the method is generalizable. The findings are presented for each of the county separately and then combined. The same cannot be considered for other counties unless a standard population level parameter is generated using the data. One such parameter to consider for estimating MSM in similar geographies is the per capita MSM (number of MSM per 1000 adult males), which ranges between 4.1 and 7.2 in the counties studied with an average of 5.9.

However, the generalizability of the findings does not affect the main objective of the study, which is to present this approach to locate and estimate the population size of MSM who seek male sexual partners through the virtual sites.

 How was the catchment area for WhatsApp or Facebook measured? Is there any geospatial info from those participants?

Thanks for this important comment. WhatsApp and Facebook groups were found to be local to the counties in which this study was conducted. WhatsApp and Facebook groups have no geospatial info for the participants, which is a feature only of GSN apps.

• I think the formula to account for duplicate accounts seems reasonable.

Thanks for the comment.

• Given that this sampling approach is similar to multi-stage cluster sampling, was there consideration of a design effect in the sample size calculation?

We did not use a design effect for sample size calculation.

• I also question if it's reasonable to have one sample size across 3 sites and then show

the data for the individual sites. I think the variance should be larger for the individual sites given that the sample size was calculated to be larger for a 95% interval.

We wanted to calculate size estimates for each county separately, and that's why we are showing the results for individual sites. However, we agree with the comment that the variance would be larger for the individual site, which has contributed to a larger range of estimates. In the revised manuscript we will include the limitation that due to a smaller sample size, the estimate generated can be slightly wider in range. However, since the mean virtual profiles used in the past month do not vary much between sites, both approach would have given a similar estimate. Future, a large scale work may include counties with different profiles and therefore can consider a larger sample size in each sites to generate a much precise estimate with narrow range.

 In the final paragraph of the results, there is allusion to "respondents connecting." Is this only digital connection? The authors might want to clarify this though I think the next sentences discussing number of sex partners suggests that these are two different categories of "connection."

The connections mentioned in the results are only "digital connections" i.e, other MSM connected through virtual sites and apps. This does not include MSM connected through physical sites as no such information was collected. We will clarify it in the revised version of the manuscript.

 Is the average number of partners to whom sex was sold based on a denominator of only people who sold sex? Is this number diminished by the 40% who do not sell sex? I think this might be more informative if the numbers were disaggregated by those who did sell sex.

Thanks for the comment. The data presented on the average number of partners to whom sex was sold (money involved) is included in the total denominator. Though we did not present this by those who sell sex and who do not, we reviewed and is informative as you suggested. We will add it in the revised manuscript. (The format did not allow us to add a table in the response).

 What proportion of the adult male population do these online groups constitute in each county? It would be interesting to see if the proportions are consistent across counties and have some generalizability.

Thanks for this excellent comment. We calculated the standard measure of per capita, number of online MSM per 1000 adult (15-64 years) males. It shows that the per capita MSM online per 1000 adult males are 6.7, 7.2 and 4.1 for Kiambu, Kisumu and Mombasa respectively. We will add this in the revised version of the manuscript.

• This is a strong report and a good contribution to the literature.

Thanks for the acknowledgement

Competing Interests: No competing interests were disclosed.

Reviewer Report 08 October 2020

https://doi.org/10.21956/gatesopenres.14354.r29592

© **2020 Adhikary R.** This is an open access peer review report distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.



Rajatashuvra Adhikary

National Professional Officer (HIV/AIDS), HIV Surveillance, WHO India Country Office, New Delhi, Delhi, India

It is an excellent piece of work by an outstanding group of researchers. This work will be immensely helpful in mapping and estimating the size of key populations at the virtual space. The best part of this paper is that it is simple in its approach and language. However, i do have the following key observations:

1. The conclusion section highlights, "..there is a clear indication that use of geo-spot based mapping alone underestimates the total number of MSM in a given context.." Similarly, an earlier part of the paper rightly mentions, "Since that methodology (geo-spot based mapping or programmatic mapping and size estimation exercise) did not include MSM who use virtual platforms, there could have been an underestimation of total number of MSM".

But, if we compare the current MSM estimates with the previous estimates (given in the paper), the size of MSM in Mombasa declined by 48%, in Kismu by 37% and across three counties by 5%. Whereas, it was expected to increase at least by 26% (as 26% of the respondents exclusively using virtual platforms). In fact, 118% increase in size of MSM only in one of the three counties (Kiambu) need further explanations or justifications.

- 2. Beside the 'selection bias', perhaps, there is another issue with the selection of 435 eligible respondents for the survey. Although the required number of virtual sites (15) within a county and the required number of respondents (10) within each selected virtual site was selected randomly, the adopted design did not produce a self-weighted sampling design due to different number of total virtual sites within a county and different number of total virtual site. Not carrying out an weighted analysis could be highlighted as one of the limitations.
- 3. The data collection was carried out by CBO members and program staff. It is important to mention how 'objectivity' as well as 'quality' of data was strictly maintained through rigorous monitoring and supervision mechanism. It is important to note.

Is the work clearly and accurately presented and does it cite the current literature?

Yes

Is the study design appropriate and is the work technically sound?

Yes

Are sufficient details of methods and analysis provided to allow replication by others? $\ensuremath{\mathsf{Yes}}$

If applicable, is the statistical analysis and its interpretation appropriate?

Yes

Are all the source data underlying the results available to ensure full reproducibility? $\ensuremath{\mathsf{Yes}}$

Are the conclusions drawn adequately supported by the results?

Partly

Competing Interests: No competing interests were disclosed.

Reviewer Expertise: I am working in the areas of research, surveillance and monitoring & evaluation for last 25+ years. I was involved with several rounds of BSS, IBBS, HSS, p-MPSE etc.

I confirm that I have read this submission and believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.

Author Response 17 Oct 2020

Parinita Bhattacharjee, University of Manitoba, Winnipeg, Canada

Response to Reviewer Comments (Dr. R Adhikary):

It is an excellent piece of work by an outstanding group of researchers. This work will be immensely helpful in mapping and estimating the size of key populations at the virtual space. The best part of this paper is that it is simple in its approach and language.

Thank you very much for your response and kind words.

However, I do have the following key observations:

1. The conclusion section highlights, "there is a clear indication that use of geo-spot based mapping alone underestimates the total number of MSM in a given context." Similarly, an earlier part of the paper rightly mentions, "Since that methodology (geo-spot based mapping or programmatic mapping and size estimation exercise) did not include MSM who use virtual platforms, there could have been an underestimation of total number of MSM". But, if we compare the current MSM estimates with the previous estimates (given in the paper), the size of MSM in Mombasa declined by 48%, in Kismu by 37% and across three counties by 5%. Whereas, it was expected to increase at least by 26% (as 26% of the respondents exclusively using virtual platforms). In fact, 118% increase in size of MSM only in one of the three counties (Kiambu) need further explanations or justifications.

Thank you for your comment. It was referenced in the paper that the geo-mapping or programmatic mapping under estimate the size of MSM population as they do not account for those exclusively using virtual sites. The findings presented in this paper is only from mapping and size estimation in the virtual sites. The findings show that overall (3 counties together) 74% of the virtual users visited a physical location. This suggests that 26% of MSM who seek partners in virtual sites do not visit a physical location and hence are missed when mapping and estimation

takes place using a geo-mapping/programmatic mapping approach. The size estimates presented in the results are derived from mapping and size estimation in virtual sites and hence cannot be considered as final size estimates of "all MSM" in the targeted counties. The paper is trying to communicate that it is critical to also map MSM in the virtual sites as geographic mapping may underestimate the population size considering the finding that 26% of MSM do not visit hotspots which geographic mapping cover. Hence we cannot say that numbers of MSM in the *3* counties actually declined. It needs to be considered that we have size estimates from the counties using geo-mapping method and size estimates from the same counties using virtual mapping method and both map and estimate different sites. The findings suggest that some MSM visit only physical hotpots/ sites, some visit only virtual sites and some visit both. While there is an overlap, there is also a sub population which visit only one type of site. Hence, we suggest that the total estimated size of MSM population in a county would be the number estimated using a programmatic mapping approach and the number estimated using a virtual mapping approach after subtracting the overlap, if both the mapping is done around the same time period. The main objective of this paper is not to show the overall size estimate of MSM in the counties, but to present the methodology of virtual mapping, share the findings which is the size estimate of MSM in virtual sites and the overlap with MSM visiting physical sites/ hotspots.

2. Beside the 'selection bias', perhaps, there is another issue with the selection of 435 eligible respondents for the survey. Although the required number of virtual sites (15) within a county and the required number of respondents (10) within each selected virtual site was selected randomly, the adopted design did not produce a self-weighted sampling design due to different number of total virtual sites within a county and different number of total virtual site. Not carrying out a weighted analysis could be highlighted as one of the limitations.

Thanks for the comment on an unweighted analysis. We recognize this. We have estimated the size of virtual MSM at the county level after accounting for the overlap within the county and aggregated county level estimates to produce the overall estimate for the 3 counties. Therefore, the estimate has not been affected by a county weight, though the equal sample size in virtual sites might have affected if the profile of MSM differed across virtual sites. However, since a very large proportion of virtual MSM have profiles in multiple virtual sites, an unweighted analysis might not have affected the estimates. The profile of MSM presented at the overall level for 3 counties together might have affected due to an unweighted analysis. We have noted this point and will clarify it in the revised version of the paper.

3. The data collection was carried out by CBO members and program staff. It is important to mention how 'objectivity' as well as 'quality' of data was strictly maintained through rigorous monitoring and supervision mechanism. It is important to note.

Thanks for pointing this out. The data collectors were trained by UoM and were monitored regularly by UoM and its Kenyan partner, Partners for Health and Development in Africa (PHDA). Onsite monitoring and supervision was conducted every week during the data collection process. Data quality checks were done on a regular basis by UoM and PHDA staff. We will add this in the revised version of the manuscript.

Competing Interests: No competing interests were disclosed.