Original Paper

Early Results of an Initiative to Assess Exposure to Firearm Violence in Ambulatory Care: Descriptive Analysis of Electronic Health Record Data

Nicole Cook¹, MPA, PhD; Megan Hoopes¹, MPH; Frances M Biel¹, MPH, MS; Natalie Cartwright², PhD; Michelle Gordon¹, MPH; Marion Sills¹, MPH, MD

¹OCHIN, Portland, OR, United States

²Department of Mathematics, Norwich University, Northfield, VT, United States

Corresponding Author: Nicole Cook, MPA, PhD OCHIN PO Box 5426 Portland, OR, 97228 United States Phone: 1 503 943 2500 Fax: 1 503 943 2501 Email: cookn@ochin.org

Abstract

Background: Current research on firearm violence is largely limited to patients who received care in emergency departments or inpatient acute care settings or who died. This is because standardized disease classification codes for firearm injury only represent bodily trauma. As a result, research on pathways and health impacts of firearm violence is largely limited to people who experienced acute bodily trauma and does not include the estimated millions of individuals who were exposed to firearm violence but did not sustain acute injury. Assessing and collecting data on exposure to firearm violence in ambulatory care settings can expand research and more fully frame the public health issue.

Objective: The aim of the study is to evaluate the demographic and clinical characteristics of patients who self-reported exposure to firearm violence during a behavioral health visit.

Methods: This study assessed early data from an initiative implemented in 2022 across a national network of ambulatory behavioral health centers to support trauma-informed care by integrating structured data fields on trauma exposure into an electronic health record behavioral health patient assessment form (SmartForm), as such variables are generally not included in standard outpatient medical records. We calculated descriptive statistics on clinic characteristics, patient demographics, and select clinical conditions among clinics that chose to implement the SmartForm and among patients who reported an exposure to firearm violence. Data on patient counts are limited to positive reports of exposure to firearm violence, and the representativeness of firearm exposure among all patients could not be calculated due to unknown variability in the implementation of the SmartForm.

Results: There were 323 of 629 (51%) clinics that implemented the SmartForm and reported at least 1 patient exposed to firearm violence. In the first 11 months of implementation, 3165 patients reported a recent or past exposure to firearm violence across the 323 clinics. Among patients reporting exposure, 52.7% (n=1669) were male, 38.8% (n=1229) were Black, 45.7% (n=1445) had posttraumatic stress disorder, 37.5% (n=1186) had a substance abuse disorder (other than nicotine), and 11.7% (n=371) had hypertension.

Conclusions: Current research on firearm violence using standardized data is limited to acute care settings and death data. Early results from an initiative across a large network of behavioral health clinics demonstrate that a high number of clinics chose to implement the SmartForm, resulting in thousands of patients reporting exposure to firearm violence. This study demonstrates that collecting standardized data on firearm violence exposure in ambulatory care settings is feasible. This study further demonstrates that resultant data from ambulatory settings can be used for meaningful analysis in describing populations affected by firearm violence. The results of this study hold promise for further collection of structured data on exposure to firearm violence in ambulatory settings.

RenderX

(JMIR Public Health Surveill 2024;10:e47444) doi: 10.2196/47444

KEYWORDS

gun violence; firearm injury; surveillance; primary care; public health; ambulatory care; electronic health record; violence; burden; emergency department; data; risk factor

Introduction

The escalation in firearm injury in the United States is reflected in epidemiologic trends, including the emergence of firearm violence as the leading cause of mortality in children ages 1-18 years since 2020—yet the public health burden of firearm injury is severely undercounted [1-3]. Current incidence and prevalence of firearm injury are largely limited to acute injury data from hospitals and emergency departments and death data. This is because clinical classification codes (International Classification of Diseases) for firearm injury currently only represent acute bodily trauma [4-9]. While millions of children and adults are estimated to have experienced primary or secondary exposure to firearm violence (direct witness of firearm violence or the acute aftermath), there is no standardized data collection system to support surveillance of this public health problem [10-12]. As a result, pathways, risk factors, and intervention strategies following exposure to firearm violence are poorly understood [13]. Collecting broader data on exposure to firearm violence and the physical and psychological injury following exposure is critically needed to identify risk factors and disease pathways, frame the full impact of firearm violence on society, and inform the development of comprehensive treatments for people impacted by firearm violence [12]. Ambulatory electronic health record (EHR) data are potentially rich sources of injury and exposure data that can broaden our understanding of the spectrum of health impacts of firearm violence.

In 2022, a large national network of community-based behavioral health safety-net clinics serving racial and ethnic minority groups, low-income and underserved rural communities, sexual and gender minorities, and other health disparate populations implemented a customized data collection tool (SmartForm) in their shared EHR to collect trauma history as part of the behavioral health assessment process for clients. All network clinics are located in medically underserved areas and serve minoritized populations most likely to experience disparate community firearm violence [14,15]. The SmartForm implementation included an associated workflow to collect standardized data on recent or past exposure to firearm violence among patients presenting for behavioral health care [16]. Implementation of the trauma SmartForm is part of a larger quality improvement initiative to optimize EHR solutions to support trauma-informed care across the network [17]. To our knowledge, this initiative is the first large-scale initiative to collect standardized firearm violence exposure data in outpatient care settings. In this paper, we present early results on exposure to firearm violence from the first 11 months of implementation of the SmartForm.

Methods

Study Design

We used EHR data from the OCHIN multistate network of community-based primary and behavioral health care clinics [16]. OCHIN is a nonprofit health care innovation center that offers a fully hosted, highly customized instance of Epic practice management and EHR solutions to 140 members representing 1071 clinic sites, 629 (59%) of whom provide behavioral health services. All OCHIN members are trained on common workflows. Data on "exposure to gun violence" are incorporated as an optional standardized, reportable field as part of the behavioral health trauma SmartForm within the patient history section of the EHR used by behavioral health clinicians. While associated workflows are recommended, clinics and clinicians within the network have full autonomy to determine their use (or nonuse) of the SmartForm. As a quality improvement initiative, it is accepted that the use of the SmartForm is not consistent across all network clinics.

EHR reportable data include "recent exposure to gun violence" and "past exposure to gun violence." Our data set represents cross-sectional data from February 2022, when the trauma SmartForm was implemented in the EHR, to December 2022. The SmartForm in use during this time only collected patient-reported "yes" responses to firearm violence exposure; there was no ability to document "no" responses. As a result, there is no denominator of total patients assessed for exposure and no practical method for estimating the prevalence of self-reported firearm violence exposure within the population.

We identified all active patients with documentation of a recent or past exposure to firearm violence and extracted data on demographics (age, sex, etc) and the prevalence of a select, predefined list of active health problems including behavioral health diagnoses, diabetes, and hypertension [18]. The list of active health problems was extracted from the patient problem list within the EHR.

Ethical Considerations

This project used a deidentified data set from a data repository of clinical and administrative data of all patients seen in the OCHIN network. The data repository is under institutional review board oversight with Advarra (Pro00060082) and includes a waiver of consent and authorization. This project was reviewed by Norwich University Institutional Review Board (00005859) and OCHIN and met exemption criteria under 45 CFR 46.

Results

During the study period, there were 129 active OCHIN member organizations with 629 behavioral health clinic sites. Among those, 91 (70.5%) member organizations and 323 (51.3%) clinics

RenderX

implemented the SmartForm with at least 1 patient reporting exposure to firearm violence per clinic. Between February 1 and December 31, 2022, these clinics documented between 19 and 33,067 (median 1066, IQR 356-4309) patients with firearm violence exposure, with a median age of 17 (IQR 7-64) years. Of these, a median of 43% (IQR 39%-49%; range 2%-92%) of patients were male. Across the 323 clinics, 3165 behavioral health patients had patient-reported and clinician-documented recent or past exposure to firearm violence noted in their EHR between February 2022 and December 2022 (Table 1). Among patients with noted firearm exposure, 52.7% (n=1669) were male, 41.4% (n=1308) were between 12 and 34 years of age, 11.5% (n=364) self-reported having a sexual orientation other than straight, 38.3% (n=1229) were Black or African American, and 42.5% (n=1334) were uninsured. The median age of patients with noted exposure to firearm violence was 20 (IQR 7-64; range 3-89) years. When described by behavioral health diagnosis, 45.7% (n=1445) had a diagnosis of posttraumatic stress disorder, and 37.5% (n=1886) had a substance abuse disorder (excluding nicotine dependence). A large percentage of patients with a documented exposure had hypertension (n=371, 11.7%), and 66.7% (n=2110) had 7 or more clinic visits (for either behavioral health or primary care) during 2022. Each clinic determines which social risks, if any, they measure. Among patients screened for social determinants of health, 69.8% (n=1213) reported one or more social risks such as food insecurity or transportation insecurity.



Table 1. Demographic and active conditions of patients with self-reported exposure to recent or past firearm violence across 323 ambulatory behavioral health clinics (February to December 2022; N=3165).

	Patients reporting exposure, n (%)
Age group (years)	
0-11	56 (1.8)
12-17	193 (6.1)
18-24	334 (10.6)
25-34	781 (24.7)
35-49	1027 (32.4)
50+	774 (24.5)
Assigned sex ^a	
Female	1496 (47.3)
Male	1669 (52.7)
Gender identity	
Man	1433 (45.3)
Woman	1295 (40.9)
Transman and transwoman	43 (1.4)
Genderqueer; reported other gender identity	51 (1.6)
Decline or unknown	343 (10.8)
Sexual orientation	
Straight	2226 (70.3)
Gay, lesbian, bisexual, multiple; reported other sexual orientation	364 (11.5)
Decline or unknown	575 (18.2)
Race	
American Indian or Alaska Native	77 (2.4)
Asian	49 (1.5)
Black or African American	1229 (38.8)
Native Hawaiian or other Pacific Islander	18 (0.6)
White	1368 (43.2)
Multiple races	51 (1.6)
Decline or unknown	373 (11.8)
Ethnicity	
Hispanic or Latinx	543 (17.2)
Non-Hispanic or Latinx	2388 (75.5)
Unknown	234 (7.4)
Preferred language	
English	2958 (93.5)
Spanish	146 (4.6)
Other or unknown	61 (1.9)
Payor type	
Medicaid	1406 (44.4)
Uninsured or other public insurance	1344 (42.5)
Private	225 (7.1)
Medicare	190 (6)

https://publichealth.jmir.org/2024/1/e47444

XSL•FO RenderX JMIR Public Health Surveill 2024 | vol. 10 | e47444 | p. 4 (page number not for citation purposes)

	Patients reporting exposure, n (%)
Veteran status (among adults age 18 years and older)	63 (2.2)
Homeless	131 (4.1)
Ever screened for social determinants of health ^b	1738 (54.9)
Reported one or more adverse social determinants of health (those ever screened)	1213 (69.8)
Assigned primary care provider	2047 (64.7)
Number of clinic visits in 2022	
0-2	247 (7.8)
3-6	808 (25.5)
7+	2110 (66.6)
Active behavioral health conditions	
PTSD ^c and reaction to severe stress (F43)	1445 (45.7)
Other anxiety disorders (F41)	1268 (40.1)
Substance use disorders (excluding nicotine dependence; F10-F16, F18, and F19)	1186 (37.5)
Major depressive disorder (F33)	753 (23.8)
Depressive episode (F32)	683 (21.6)
Active medical conditions	
Hypertension (I10)	371 (11.7)
Lipid disorders (E78)	316 (10)
Type 2 diabetes (E11)	164 (5.2)

^aA small number of patients with other or unknown sex were proportionally distributed to the female and male categories to avoid reporting small cell counts.

^bSocial determinants of health is a broad category, and each clinic has the autonomy to determine which, and how many, social determinants of health they collect for patients. Adverse social determinants of health include social risks including, but not limited to, food insecurity, housing insecurity, and transportation insecurity.

^cPTSD: posttraumatic stress disorder.

Discussion

Principal Findings

Current firearm injury research, largely limited to acute injury and death, has many shortcomings [19] that can potentially be overcome by expanding the collection of standardized data on firearm violence exposure in ambulatory care settings. A review of EHR data from safety-net clinics within the OCHIN network, which initiated a standardized question on firearm violence exposure as part of collecting information on patient history during behavioral health care visits, demonstrates that data on firearm violence can be collected as part of routine behavioral health care. EHR data include patient-level variables not currently available in common firearm injury data sets (Healthcare Cost & Utilization Project; National Vital Statistics System/Web-Based Injury Statistics Query and Reporting System) used for research, including gender identity, sexual orientation, social determinants of health, experiencing homelessness, health care use, behavioral health, and chronic disease comorbidities [20-22].

Strengths and Limitations

Expanding the collection of firearm violence exposure data in outpatient EHRs opens new opportunities in firearm violence

research; these novel data may be leveraged to support more precise prevalence estimates of firearm violence exposure and injury, assess population-level associations between exposure and medical or behavioral health outcomes, and support the application of machine learning to develop predictive analytics for treatment planning [1,12,23].

Some limitations of this analysis arise from the nonmandatory nature of the data collection form. As OCHIN implemented the EHR trauma SmartForm as part of a quality improvement behavioral health EHR optimization initiative, clinics and clinicians within the network had full autonomy to determine their use (or nonuse) of the SmartForm. As the SmartForm is not consistently used across all OCHIN member clinics, the data presented here are representative of neither OCHIN's patient population nor clinician's behavior. In addition, the SmartForm currently in use only collects patient-reported "yes" responses to firearm violence exposure; there is no place to document "no" responses. As a result, there is no denominator of total patients assessed for exposure and no practical method for estimating the prevalence of self-reported firearm violence exposure within the population.

This study broadens the discussion around firearm injury by demonstrating that standardized data on firearm violence exposure can be collected in outpatient settings. Such data can

```
XSL•FO
RenderX
```

extend our knowledge of the burden of firearm violence, which is typically limited to acute care settings including inpatient and emergency department data or mortality data, by incorporating a broader understanding of both exposure to firearm violence and firearm injury through the availability of rich demographic, clinical, psychological, and social risk data collected in ambulatory care EHRs.

Future Directions

Results from this study demonstrate the potential value of screening for firearm violence exposure and suggest how collection of this novel data may be leveraged to support firearm injury surveillance, understand physical and psychological firearm violence sequelae, and support treatment. Ongoing work should include identifying opportunities for more systematic screening of exposure to firearm violence across health care settings.

Acknowledgments

This work was supported by the AIM-AHEAD (Artificial Intelligence/Machine Learning Consortium to Advance Health Equity and Researcher Diversity) Coordinating Center, funded by the National Institutes of Health (NIH). Research reported in this publication was supported by the office of the director, NIH Common Fund (award 10T2OD032581-01). The work is solely the responsibility of the authors and does not necessarily represent the official view of AIM-AHEAD or the NIH.

Data Availability

The data sets generated and analyzed during this study are not publicly available due to source patient-level data from multiple health systems, which have restrictions regarding the availability and rerelease of data under cross-institution agreements. Data are available from the corresponding author on reasonable request and with permission of all relevant parties.

Conflicts of Interest

None declared.

References

- 1. Kaufman EJ, Delgado MK. The epidemiology of firearm injuries in the US: the need for comprehensive, real-time, actionable data. JAMA. 2022;328(12):1177-1178. [FREE Full text] [doi: 10.1001/jama.2022.16894] [Medline: 36166012]
- Fontanarosa PB, Bibbins-Domingo K. The unrelenting epidemic of firearm violence. JAMA. 2022;328(12):1201-1203. [FREE Full text] [doi: 10.1001/jama.2022.17293] [Medline: 36166046]
- Cunningham RM, Walton MA, Carter PM. The major causes of death in children and adolescents in the United States. N Engl J Med. 2018;379(25):2468-2475. [FREE Full text] [doi: 10.1056/NEJMsr1804754] [Medline: 30575483]
- 4. Cook P. Chapter 1. Comprehensive data on gun violence: current deficits, needed investments. In: Roman JK, Cook P, editors. Final Report. Improving Data Infrastructure to Reduce Firearms Violence. Chicago, IL. NORC at the University of Chicago; 2021.
- 5. Smart R, Peterson S, Schell TL, Kerber R, Morral AR. Inpatient hospitalizations for firearm injury: estimating state-level rates from 2000 to 2016. Rand Health Q. 2022;9(4):10. [FREE Full text] [Medline: <u>36238005</u>]
- 6. GVA Gun Violence Archive. 2023. URL: <u>https://www.gunviolencearchive.org/about</u> [accessed 2024-01-11]
- 7. Violence prevention: funded surveillance. Centers for Disease Control and Prevention. 2023. URL: <u>https://www.cdc.gov/</u> violenceprevention/firearms/funded-surveillance.html [accessed 2024-01-11]
- Zwald ML, Holland KM, Bowen DA, Simon TR, Dahlberg LL, Stein Z, et al. Using the Centers for Disease Control and Prevention's National Syndromic Surveillance Program data to monitor trends in US emergency department visits for firearm injuries, 2018 to 2019. Ann Emerg Med. 2022;79(5):465-473. [FREE Full text] [doi: 10.1016/j.annemergmed.2022.01.016] [Medline: 35277293]
- 9. Violence prevention. National Violent Death Reporting System (NVDRS). Centers for Disease Control and Prevention. 2023. URL: <u>https://www.cdc.gov/violenceprevention/datasources/nvdrs/index.html</u> [accessed 2024-01-11]
- Finkelhor D, Turner HA, Shattuck A, Hamby SL. Prevalence of childhood exposure to violence, crime, and abuse: results from the National Survey of Children's Exposure to Violence. JAMA Pediatr. 2015;169(8):746-754. [FREE Full text] [doi: 10.1001/jamapediatrics.2015.0676] [Medline: 26121291]
- 11. Schumacher S, Kirzinger A, Presiado M, Valdes I, Brodie M. Americans' experiences with gun-related violence, injuries, and deaths. KFF Health Tracking Poll. 2023. URL: <u>https://www.kff.org/other/poll-finding/</u> <u>americans-experiences-with-gun-related-violence-injuries-and-deaths/</u> [accessed 2024-01-11]
- 12. Cook N, Sills M. Tracking all injuries from firearms in the US. JAMA. 2023;329(6):514. [FREE Full text] [doi: 10.1001/jama.2022.21997] [Medline: 36786795]
- 13. Ranney M, Karb R, Ehrlich P, Bromwich K, Cunningham R, Beidas RS. What are the long-term consequences of youth exposure to firearm injury, and how do we prevent them? A scoping review. J Behav Med. 2019;42(4):724-740. [FREE Full text] [doi: 10.1007/s10865-019-00035-2] [Medline: 31367937]

RenderX

- 14. A year in review: 2020 gun deaths in the U.S. Johns Hopkins Bloomberg School of Public Health. 2022. URL: <u>https://publichealth.jhu.edu/sites/default/files/2022-05/2020-gun-deaths-in-the-us-4-28-2022-b.pdf</u> [accessed 2024-01-11]
- Rees CA, Monuteaux MC, Steidley I, Mannix R, Lee LK, Barrett JT, et al. Trends and disparities in firearm fatalities in the United States, 1990-2021. JAMA Netw Open. 2022;5(11):e2244221. [FREE Full text] [doi: <u>10.1001/jamanetworkopen.2022.44221</u>] [Medline: <u>36445703</u>]
- 16. About members. OCHIN. 2022. URL: https://ochin.org/members [accessed 2024-01-11]
- Raja S, Hasnain M, Hoersch M, Gove-Yin S, Rajagopalan C. Trauma informed care in medicine: current knowledge and future research directions. Fam Community Health. 2015;38(3):216-226. [FREE Full text] [doi: 10.1097/FCH.000000000000071] [Medline: 26017000]
- 18. Community Health Center Chartbook. 2023. URL: <u>https://www.nachc.org/resource/community-health-center-chartbook/</u> [accessed 2024-02-01]
- Goldstick JE, Kaufman EJ, Delgado MK, Jay J, Carter PM. Commentary: reducing youth firearm violence and the associated health disparities requires enhanced surveillance and modern behavioral intervention strategies—a commentary on Bottiani et al. (2021). J Child Psychol Psychiatry. 2021;62(5):580-583. [FREE Full text] [doi: 10.1111/jcpp.13421] [Medline: 33817792]
- 20. Healthcare cost and utilization project. Agency for Healthcare Research and Quality. 2023. URL: <u>https://hcup-us.ahrq.gov/tools_software.jsp</u> [accessed 2024-01-11]
- 21. WISQARS: explore fatal injury data visualization tool. Centers for Disease Control and Prevention. 2023. URL: <u>https://wisqars.cdc.gov/data/explore-data/home</u> [accessed 2024-01-11]
- 22. National Vital Statistics System. Centers for Disease Control and Prevention. 2023. URL: <u>https://www.cdc.gov/nchs/nvss/</u> index.htm [accessed 2023-01-11]
- 23. Kaufman EJ, Delgado MK. Tracking all injuries from firearms in the US—reply. JAMA. 2023;329(6):514-515. [doi: 10.1001/jama.2022.22000] [Medline: 36786792]

Abbreviations

EHR: electronic health record

Edited by A Mavragani; submitted 27.03.23; peer-reviewed by C Ordun, E Mokotoff; comments to author 02.08.23; revised version received 23.08.23; accepted 17.11.23; published 05.02.24
<u>Please cite as:</u>
Cook N, Hoopes M, Biel FM, Cartwright N, Gordon M, Sills M
Early Results of an Initiative to Assess Exposure to Firearm Violence in Ambulatory Care: Descriptive Analysis of Electronic Health
Record Data
JMIR Public Health Surveill 2024;10:e47444
URL: https://publichealth.jmir.org/2024/1/e47444
PMID:

©Nicole Cook, Megan Hoopes, Frances M Biel, Natalie Cartwright, Michelle Gordon, Marion Sills. Originally published in JMIR Public Health and Surveillance (https://publichealth.jmir.org), 05.02.2024. 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 Public Health and Surveillance, is properly cited. The complete bibliographic information, a link to the original publication on https://publichealth.jmir.org, as well as this copyright and license information must be included.

