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## Sociodemographic factors and social determinants associated with toxicology confirmed polysubstance opioid-related deaths

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### Abstract

**Background and Aims:** While prescribed and illicit opioid use are primary drivers of the national surges in overdose deaths, opioid overdose deaths in which stimulants are also present are increasing in the U.S. We determined the social determinants and sociodemographic factors associated with opioid-only versus polysubstance opioid overdose deaths in Massachusetts. Particular attention was focused on the role of stimulants in opioid overdose deaths.

**Methods:** We analyzed all opioid-related overdose deaths from 2014–2015 in an individually-linked population database in Massachusetts. We used linked postmortem toxicology data to identify drugs present at the time of death. We constructed a multinomial logistic regression model to identify factors associated with three mutually exclusive overdose death groups based on toxicological results: opioid-related deaths with (1) opioids only present, (2) opioids and other substances not including stimulants, and (3) opioids and stimulants with or without other substances.

**Results:** Between 2014 and 2015, there were 2,244 opioid-related overdose deaths in Massachusetts that had accompanying toxicology results. Toxicology reports indicated that 17%

had opioids only, 36% had opioids plus stimulants, and 46% had opioids plus another non-stimulant substance. Persons older than 24 years, non-rural residents, those with comorbid mental illness, non-Hispanic black residents, and persons with recent homelessness were more likely than their counterparts to die with opioids and stimulants than opioids alone.

**Conclusions:** Polysubstance opioid overdose is increasingly common in the US. Addressing modifiable social determinants of health including barriers to mental health services and homelessness, is important to reduce polysubstance use and overdose deaths.

### Keywords

opioid-related overdose; polysubstance use; stimulants; cocaine; amphetamines

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## 1.0 INTRODUCTION

Drug overdose is the leading cause of accidental death in the U.S., with more than 70,000 deaths in 2016 (Scholl, Seth, Kariisa, Wilson, & Baldwin, 2018). While opioids are present and likely causative in the majority of overdose deaths (CDC, 2018; Scholl et al., 2018), it is crucial to gain a better understanding of which other drugs may also be involved and who is affected by polysubstance use. Studies have consistently demonstrated an increased risk of overdose death with concurrent opioid and benzodiazepine use (Hernandez, He, Brooks, & Zhang, 2018; Sun et al., 2017). Concomitant use of stimulants—cocaine and methamphetamine—is rising and may also confer an additional risk of mortality (Al-Tayyib, Koester, Langedger, & Raville, 2017; Degenhardt et al., 2011; McCall Jones, Baldwin, & Compton, 2017; Nechuta, Tyndall, Mukhopadhyay, & McPheeters, 2018; Seth, Scholl, Rudd, & Bacon, 2018; Shiao, Arpadi, Yin, & Martins, 2017; Turner et al., 2018). While other studies evaluated sociodemographic risk factors for drug overdose deaths broadly (Kandel, Hu, Griesler, & Wall, 2017; Nechuta et al., 2018), few have compared non-polysubstance opioids-related deaths with polysubstance opioid-related deaths, specifically with regard to stimulants. This knowledge gap may be fueling disparities in the public health response to the overdose crisis and might overlook key social determinants of health that could help address the addiction crisis. We aimed to determine the factors associated with opioid-related polysubstance overdose death compared with opioid death alone.

## 2.0 METHODS

We analyzed data from the Massachusetts Public Health Data Warehouse (PHD), previously described as the “Chapter 55” database, a state-permitted, individually-linked database from several Massachusetts government agencies (Massachusetts Budget Summary, 2017; Chapter 55 Acts of 2015, 2015). The PHD links claims-level data from the Massachusetts All-Payer Claims Database (APCD) to other state databases that include person-level demographics and data. Each record is de-identified and assigned a unique identification number that is consistent across all databases (Massachusetts Department of Public Health, 2017). We analyzed opioid overdose deaths among persons 11 years of age and older from January 1, 2014 through December 31, 2015. The creation of the PHD was mandated by law and work within it is conducted by a public health authority.

First, we identified poisoning deaths in the Registry of Vital Records and Statistics mortality files using the International Classification of Disease (ICD-10) codes for underlying cause-of-death poisoning codes: X40–49 (unintentional) or Y10–Y19 (undetermined intent). For this study, we excluded X60–69 (intentional self-harm, suicide) and X85–X90 (assault or homicide). For overdoses, the death certificate lists drugs involved as immediate or contributory causes of death. These are included as ICD-10 “T-codes.” Opioid involvement is indicated by the T-codes T40.0, T40.1, T40.2, T40.3, T40.4, T40.6. We included only those opioid-related overdoses with toxicology data for opioids, stimulants, and selected other substances obtained from the Office of the Chief Medical Examiner (Supplementary Appendix).

Based on toxicology results, we divided the population into 3 mutually exclusive groups: (1) opioid-related deaths with opioids only on toxicology, (2) opioid-related deaths with opioids and an “other substance” (benzodiazepines, alcohol, marijuana, gabapentin, or clonidine) not including stimulants (cocaine or amphetamines) on toxicology, and (3) opioid-related deaths with opioids and stimulants with or without another substance on toxicology. We constructed a multinomial logistic regression model to compare these groups by certain variables (see Supplementary Table 1 for complete variable definitions and data sources). Hepatitis C virus (HCV) infection was not included in the primary analysis since it is incompletely classified in the PHD. A reference group was chosen for each independent variable. The comparison group among the three dependent variable categories of opioid-related death was chosen as only opioids present on toxicology (opioids alone). The model produced two sets of odds ratios and 95% confidence intervals (CIs) for each non-reference exposure variable group: 1) opioids and stimulants vs. opioids alone and 2) opioids and other substances, but no stimulants, present on toxicology vs. opioids alone.

To further examine whether characteristics were different among those who used opioids and stimulants only or opioids, stimulants, and other substances, we performed a secondary analysis in which we categorized the opioid-related deaths into 4 mutually exclusive toxicology groups: (1) opioids only on toxicology (comparison group), (2) opioids and stimulants only on toxicology, (3) opioids and other substances, but no stimulants, on toxicology, and (4) opioids, stimulants, and other substances on toxicology. The methods for this analysis were the same as for the primary analysis.

### 3.0 RESULTS

Between 2014 and 2015, we identified 2,928 opioid-related overdoses in Massachusetts, and 2,244 (77%) had accompanying toxicology results (Supplementary Table 2). Of these opioid-related deaths with toxicology results, 72% involved fentanyl or heroin without prescription opioids; 9% involved prescription opioids without fentanyl or heroin; and 19% involved both (Supplementary Table 3). Additionally, 83% of these opioid-related deaths involved another substance in addition to opioids. Specifically, 389 (17%) had opioids-only; 1,047 (47%) had opioids and another substance that was neither cocaine nor amphetamines; and 808 (36%) had opioids plus stimulants with or without another substance. The breakdown of other substances present on toxicology is outlined in Figure 1.

The majority of opioid overdose deaths were among men (75%) and non-Hispanic white residents (86%), followed by non-Hispanic black residents (4.2%) (Table 1). Of the 808 deaths that involved stimulants, the proportion of residents who were non-Hispanic black was 6.2%. More than half (54%) of all overdoses occurred in people with comorbid mental health disease.

Results of the multinomial regression are outlined in Supplementary Table 4. Persons in both of the older age groupings (25–44 and 45 and older) were more likely than the youngest age group (ages 11–24) to overdose with stimulants present than with opioids alone (ages 25–44: odds ratio (OR): 1.84, 95% confidence interval (CI): 1.23–2.76; ages 45 and older: OR: 1.7, 95% CI: 1.10–2.64). The majority of all overdose deaths occurred among those living in non-rural areas (93%). Residents of rural areas were less likely than residents of non-rural areas to overdose with opioids and stimulants on toxicology than with opioids alone (OR: 0.52, 95% CI: 0.33–0.84), whereas the opposite was true for persons with other mental illness compared to those without mental illness (OR: 1.56, 95% CI: 1.20–2.03). Finally, persons with recent incarceration were less likely than those without recent incarceration to die of opioids with non-stimulant substances than with opioids alone (OR: 0.53, 95% CI: 0.36–0.79).

There were also statistically significant and clinically notable findings in the secondary analysis in which the population with stimulants was subcategorized into those with and without other substances (Supplementary Table 5). In this analysis, non-Hispanic black residents were more likely than non-Hispanic white residents to die with stimulants and opioids than with opioids alone (OR: 2.18, 95% CI: 1.01–4.70). Persons with current or recent homelessness were more likely than persons without to die with stimulants and opioids than with opioids alone (OR: 1.85, 95% CI: 1.15–2.98).

## 4.0 DISCUSSION

This study demonstrates that among Massachusetts residents who die from an opioid-related overdose, five out of six (83%) involve another substance in addition to an opioid, and 19% of all deaths involve both heroin or fentanyl and prescription opioids. Using multiple substances, in addition to opioids, is the rule rather than the exception for opioid-related deaths.

Our study supports the notion that there are sociodemographic risk factors that are associated with overdose deaths that involve other substances—particularly stimulants—along with opioids. This analysis demonstrated that non-Hispanic blacks are twice as likely to die with opioids and stimulants than with opioids alone, as compared with non-Hispanic whites. A recent national study demonstrated that cocaine-related overdose death rates in non-Hispanic blacks were nearly equal to opioid-related overdose death rates in non-Hispanic whites (Shiels, Freedman, Thomas, & Berrington de Gonzalez, 2018). It appears non-Hispanic blacks are at increased risk for death from opioid and stimulant use than their non-Hispanic white counterparts, which may be the result, in part, of a cocaine supply that is contaminated with illicitly produced fentanyl (Khatri, Viner, & Perrone, 2018; Tomassoni et al., 2017). It is crucial to recognize this risk in an already marginalized population, such that

education efforts address the increasing risk of unintentional exposure to opioids in this population.

Our study is unique in that it highlights important modifiable risk factors associated with different types of overdoses. For example, persons with comorbid mental illness accounted for more than half of all overdoses and were more likely to die with other substances—with or without stimulants—than opioids alone. Current or recent homelessness was a risk factor for overdose with opioids and stimulants; whereas recent incarceration was a risk factor for overdose with opioids alone as opposed to polysubstance overdose. Taken together, these findings provide two key lessons. First, to adequately address the drug overdose epidemic, modifiable risk factors—social determinants of health—such as access to mental health services, homelessness, and incarceration must be addressed on a systemic level. Second, interventions aimed at decreasing overdose mortality need to account for the context of polysubstance use. For instance, overdose with opioids alone among persons recently released from incarceration may reflect the lack of opioid use disorder treatment availability in the penal system. Polysubstance opioid-related overdose may reflect inadvertent exposure to opioids, which might be the case among those recently on medications for opioid use disorder, or it may reflect the increased risk of relapse among those with co-occurring substance use disorders and mental health disorders (Brands et al., 2008; Maremmani et al., 2007; White et al., 2014). It may also reflect that the combined use of stimulants and opioids (e.g., “speedballs”) may lead a person to use increased amounts of opioids or at increased frequency, leading to greater risk of overdose (Glick et al., 2018). Also, people intending to use cocaine, but who were opioid naïve, may unwittingly be exposed to fentanyl mixed into cocaine, which may cause an opioid overdose (Khatri et al., 2018; Tomassoni et al., 2017). Our study draws attention to the heterogeneity of the problem at hand and that there is not a one-size-fits-all approach to addressing the overdose epidemic, which is increasingly driven by polysubstance use. The type of opioid, the presence of polysubstance use, and the social context all influence the type of education and prevention approaches that are needed.

Some limitations to this study merit attention. First, we report only opioid-related overdose deaths and did not examine overdose deaths that did not include opioids as the cause of death, based on ICD codes. The original intent of the legislation that mandated the establishment of the PHD was to study and respond to opioid-related overdoses (Chapter 55 Acts of 2015, 2015). As a result, the toxicology results for non-opioid related deaths were not initially included in the linked datasets. Also, the lack of comprehensive toxicology on all decedents may limit the generalizability of the study. Second, the two-year time period for this study was dictated by data availability (i.e., toxicology reports only available for 2014 and 2015), rather than a hypothesis-based justification. Future studies should assess overdose trends over longer time horizons to corroborate or refute these findings. Third, while the PHD individually links multiple datasets, in most cases these datasets are comprised of administrative data that may be incomplete, such as the APCD that forms the backbone of the database. Thus, certain characteristics (e.g., HCV status) are incompletely classified and were not included in the analysis. Fourth, the variable we used for rurality dichotomized rural and non-rural communities, so we were not able to investigate differences in urban and suburban locations. Finally, we did not include all possible drugs found on toxicology; rather, we chose the ones most likely to be involved in opioid

overdoses. Future studies could consider additional drugs that act on the central nervous system, but were not included in this analysis.

## 5.0 CONCLUSIONS

In sum, we identified social determinants and sociodemographic factors that are associated with opioid overdose deaths involving multiple substances. There is an urgent need to develop and implement tailored programs that address polysubstance use among people who use opioids, especially for populations that are marginalized by and from the healthcare system. This is a crucially important step to addressing the crisis of drug-related harms and associated health disparities in the U.S.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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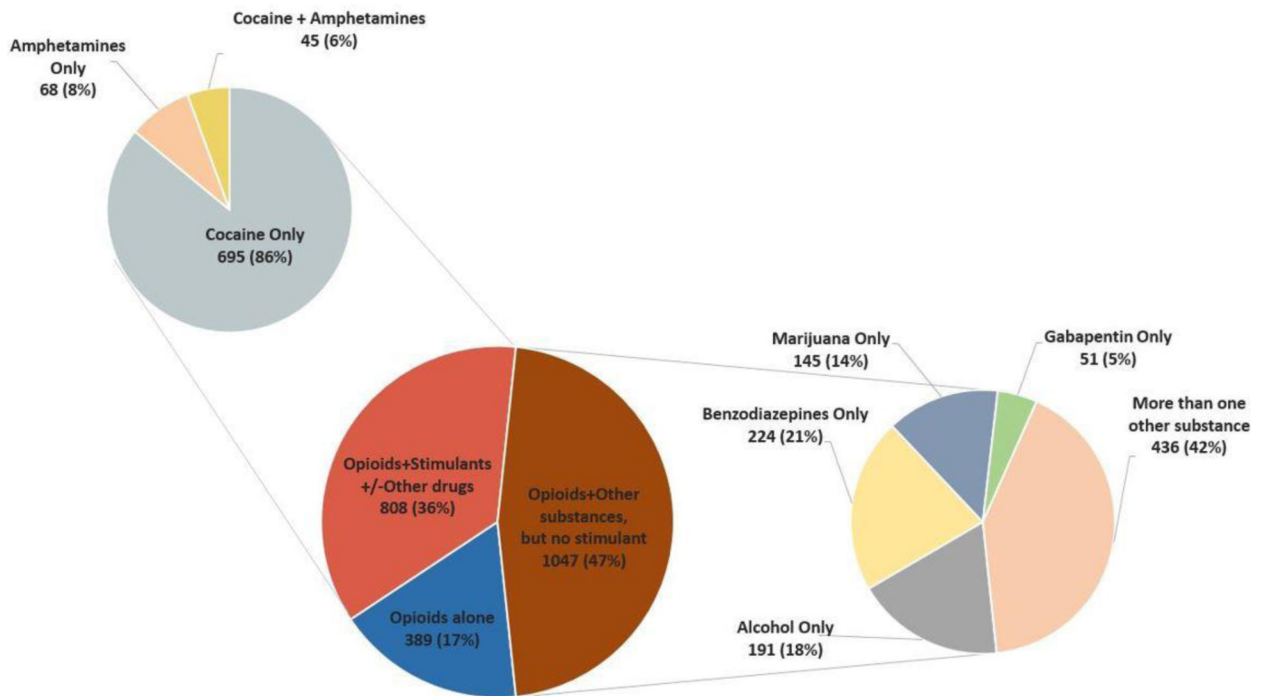
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**Figure 1. Opioid-related overdose deaths with accompanying toxicology, 2014 and 2015, combined (n=2,244)**

This figure demonstrates the proportion of opioid-related overdose deaths by accompanying substances found on toxicology. Deaths were divided into three mutually exclusive groups: (1) opioid-related deaths with opioids only present on toxicology (dark blue), (2) opioid-related deaths with opioids and stimulants (with or without other substances) present on toxicology (red), and (3) opioid-related deaths with opioids and other substances not including stimulants present on toxicology (green). Opioids include any of the following: opiates, fentanyl and fentanyl analogs, tramadol, heroin, hydrocodone, morphine, oxycodone, codeine, hydromorphone, oxymorphone, or prescription opioids not otherwise classified). Stimulants include either cocaine or amphetamines. “Other substances” include any of the following: benzodiazepines, alcohol, marijuana, gabapentin, or clonidine. Smaller pie charts distinguish the specific stimulant or other substance present on toxicology.



**Table 1.**

Characteristics of opioid-related deaths with accompanying toxicology results in Massachusetts, 2014 and 2015 combined

	Total No. (%)	Opioids alone <sup>a</sup> No. (%)	Opioids + Other substances <sup>b</sup> , without stimulants <sup>c</sup> No. (%)	Opioids +/- Other substances with stimulants No. (%)
<b>Total</b>	2244	389 (17)	1047 (47)	808 (36)
<b>Age</b>				
11–24	224 (10)	53 (14)	110 (10)	61 (8)
25–44	1279 (57)	220 (56)	565 (54)	494 (61)
45+	741 (33)	116 (30)	372 (36)	253 (31)
<b>Sex</b>				
Male	1674 (75)	303 (78)	791 (76)	580 (72)
Female	570 (25)	86 (22)	256 (24)	228 (28)
<b>Race/Ethnicity</b>				
White, non-Hispanic	1934 (87)	334 (87)	943 (91)	657 (82)
Black, non-Hispanic	94 (4)	13 (3)	31 (3)	50 (6)
Hispanic	186 (8)	34 (9)	59 (6)	93 (11)
Other	21 (1)	§	§	§
<b>Residence</b>				
Non-Rural	2088 (93)	351 (90)	968 (92)	769 (95)
Rural	156 (7)	38 (10)	79 (8)	39 (5)
<b>HIV status</b>				
Yes	24 (1)	§	§	§
<b>Homeless<sup>d</sup></b>				
Yes	338 (15)	47 (14)	143 (42)	148 (44)
<b>Mental health comorbidity<sup>e</sup></b>				
Yes	1220 (54)	165 (42)	599 (57)	456 (56)
<b>Incarceration in past 12 months<sup>f</sup></b>				
Yes	149 (7)	28 (19)	51 (34)	70 (47)
<b>MOUD in the past 12 months<sup>g</sup></b>				
Yes	536 (24)	88 (16)	231 (44)	217 (40)

There was no missing data for this cohort of persons who had an opioid-related overdose with accompanying toxicology for any of the variables assessed

<sup>a</sup>Opioids include opiates, fentanyl, tramadol, designer fentanyl, heroin, hydrocodone, morphine, oxycodone, codeine, hydromorphone, oxymorphone, or prescription opioids not otherwise classified) on toxicology

<sup>b</sup>Other substances include marijuana, alcohol, gabapentin, benzodiazepines, or clonidine on toxicology

<sup>c</sup>Stimulants include cocaine and amphetamines on toxicology

<sup>d</sup>Homelessness during any period of time from 2011–2015

<sup>e</sup>Includes depression, bipolar disorder, schizophrenia

<sup>f</sup>Any release from prison or jail in Massachusetts in the 12 months that preceded the fatal overdose

<sup>g</sup>Medication for opioid use disorder; includes naltrexone, methadone, or buprenorphine in the 12 months that preceded the fatal overdose

<sup>§</sup>Cells with 1–10 observations were suppressed

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