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## Polypharmacy and Risk of Non-fatal Overdose for Patients with HIV Infection and Substance Dependence

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### Abstract

**Introduction**—People living with HIV (PLWH) are at risk of both polypharmacy and unintentional overdose yet there are few data on whether polypharmacy increases risk of overdose. The study objective was to determine if the number and type of medication (e.g., sedating) were associated with non-fatal overdose (OD) among PLWH with past-year substance dependence or a lifetime history of injection drug use.

**Materials and Methods**—This was a longitudinal study of adults recruited from two urban, safety-net HIV clinics. Outcomes were i) lifetime and ii) past-year non-fatal OD assessed at baseline and a 12-month follow-up. We used logistic regression to examine the association between each outcome and the number of medications (identified from the electronic medical record) in the following categories: i) overall medications, ii) non-antiretroviral (non-ARV), iii) sedating, iv) non-sedating, as well as any vs. no opioid medication and any vs. no non-opioid sedating medication. Covariates included demographics, medical comorbidities, depressive and anxiety symptoms, and substance use.

**Results**—Among 250 participants, 80% were prescribed a sedating medication, 50% were prescribed an opioid; 51% exceeded risky drinking limits. In the past month, 23% reported illicit opioid use and 9% illicit opioid sedative use; 37% reported lifetime non-fatal OD and 7% past-year non-fatal OD. The median number (interquartile range) of total medications was 10 (7, 14) and 2 (1, 3) sedating. The odds of lifetime non-fatal OD were significantly higher with each additional sedating medication (OR 1.26, 95% CI 1.08, 1.46) and any opioid medication (OR 2.31;

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95% CI 1.37, 3.90), but not with each overall, non-ARV, or non-sedating medication. The odds of past year non-fatal OD were greater with each additional sedating medication (OR 1.18; 95% CI 1.00, 1.39,  $p=0.049$ ), each additional non-ARV medication (OR 1.07; 95% CI 1.00, 1.15,  $p=0.048$ ), and non-significantly for any opioid medication (OR 2.23; 95% CI 0.93, 5.35).

**Conclusions**—In this sample of PLWH with substance dependence and/or injection drug use, number of sedating medications and any opioid were associated with non-fatal overdose; sedating medications were prescribed to the majority of patients. Polypharmacy among PLWH and substance dependence warrants further research to determine whether reducing sedating medications, including opioids, lowers overdose risk.

## Keywords

HIV; overdose; polypharmacy; antiretroviral medication

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## 1. Introduction

Treatment with effective antiretroviral medications has substantially extended the lives of people living with HIV (PLWH). Widespread use of single-tablet antiretroviral medications (ARV) with at least three active medications has led to prolonged viral suppression and management of HIV infection as a chronic disease (Greene, Justice, Lampiris, & Valcour, 2013; Deeks, Lewin, & Havlir, 2013). As a result, more than one-half of PLWH in the United States are over the age 50 (High et al., 2012). This epidemiologic shift has led to the accrual of age-related comorbidities such as cardiovascular disease, cancer, and neurocognitive disease in PLWH (Althoff et al., 2015; Greene et al., 2013; Robbins, Shiels, Pfeiffer, & Engels, 2014). In addition to older age, HIV-associated inflammation, frailty, and substance use (i.e. tobacco, alcohol, and other drugs) (Justice et al., 2016; Crothers et al., 2005; Brothers & Rockwood, 2014) contribute to a greater number of comorbidities complicating the management of HIV infection. Treatment guidelines, developed for people with one disease, but applied to people with multiple chronic conditions can lead to the prescription of multiple concomitant medications, often termed “polypharmacy,” resulting in a significant daily medication burden (Edelman et al., 2013; Moore, Mao, & Oramasionwu, 2015). For PLWH, a greater number of medications raises the risk of medication interactions (Holtzman et al., 2013), medication nonadherence (Monroe, Rowe, Moore, & Chander, 2013), and discontinuation of ARV (Krentz & Gill, 2016; Cantudo-Cuenca, Jiménez-Galán, Almeida-Gonzalez, & Morillo-Verdugo, 2014).

Polypharmacy may also contribute to overdose, the leading cause of accidental injury death in the United States (Centers for Disease Control and Prevention, 2015). Examining overdose risks specifically among HIV populations is important because PLWH have twice the risk of overdose death as people without HIV infection (Mathers et al., 2013; Green, McGowan, Yokell, Pouget, & Rich, 2012). The proportion of deaths due to overdose among PLWH has increased as AIDS-related causes have declined (Schwarcz, Vu, Hsu, & Hessol, 2014). Why PLWH have greater overdose risk is not clear, but proposed reasons include comorbid liver dysfunction, pulmonary dysfunction, more illicit drug and heavy alcohol use, and social isolation (Edelman et al., 2013; Green et al., 2012). Prescribed medications, particularly sedating medications like opioids and benzodiazepines, commonly contribute to

polysubstance use-related overdose. PLWH are more likely to be prescribed high-dose opioid medications (Becker et al., 2016). Among patients prescribed opioid medications, the risk of overdose risk is greater for patients with depressive disorders (Turner & Liang, 2015), a common comorbidity of HIV infection. Despite the risk of overdose and increasing number of medications among a population with high incidence of substance use disorders, there are few data about whether the number of medications, or “polypharmacy” is associated with a greater risk of overdose for PLWH.

The objective of this study was to determine if the number of medications prescribed and/or type of medications prescribed is associated with non-fatal overdose in PLWH. Rather than using the conventional definition of polypharmacy, (i.e., five or more medications) validated largely in elderly populations (Gnjidic et al., 2012), we also sought to determine an optimal discriminating number of medications associated with non-fatal overdose (both overall and for sedating medications specifically). We hypothesized that an association between the overall number of medications and non-fatal overdose would be driven by sedating medications, both from opioid and non-opioid sedating medications.

## 2. Material and methods

### 2.1 Study design

We used data from the Boston ARCH Cohort study, a longitudinal study of adults with HIV infection and substance dependence in the past year (as assessed by the Mini International Neuropsychiatric Interview Version 6.0 (MINI) (Sheehan et al., 1998) or ever injection drug use. Boston ARCH Cohort participants were recruited from the Center for Infectious Diseases at Boston Medical Center and the HIV program at Boston Healthcare for the Homeless Program.

Inclusion criteria were: documentation of HIV in any medical record, past 12-month substance dependence or ever injection drug use, ability to speak English, age 18 or older, and willingness to provide contact information for one other person to assist with follow up. Exclusion criteria were: pregnancy at time of enrollment, plans to leave the Boston area in the next year, or cognitive impairment such that the patient could not provide informed consent. Study enrollment occurred from December 2012 to November 2014. Past 12-month substance dependence or ever injection drug use will collectively be referred to as “substance dependence” given that PLWH with a lifetime history of injection drug use are likely to have a history of substance dependence)

Participants provided written informed consent and received compensation for each study assessment completed. The Boston University Medical Campus Institutional Review Board approved the study. The National Institute on Alcohol Abuse and Alcoholism (NIAAA) further protected participants with a Certificate of Confidentiality and the US Department of Health and Human Services approved the performance of follow-up assessments with participants who were incarcerated.

## 2.2 Data collection

Medication data were extracted from a clinical data warehouse that included the electronic medical record (EMR) of both recruitment sites. We abstracted the medication list corresponding to date of study entry for each participant. In order to obtain an accurate count of medications, duplicate medications were identified and removed by cross-referencing with both the National Drug Code (NDC) number and with the generic name as defined in the National Drug File (U.S. Department of Veterans Affairs) (“VA National Formulary - Pharmacy Benefits Management Services,” 2016). Because multiple NDC numbers exist for the same medication, unique counts of the “generic name” were used as a proxy for total number of medications. Combination ARVs were recoded into their individual drug components. After a list of unique medications was determined for each study participant, we excluded medications that are not systemically active such as emollients, irrigation solutions, vitamins (except for vitamin D), peritoneal solutions, eye drops, rectal or vaginally administered medications, and complementary and alternative medications. We then further classified medications into the subcategories “sedating” and “non-sedating” (Figure 1). Sedating medications were further subcategorized as opioid or non-opioid. The medication exclusion and categorization decisions were made by two of the study investigators (TK and AW) guided by U.S. Department of Veterans Affairs Drug Classification (“VA National Formulary - Pharmacy Benefits Management Services,” 2016).

All other study data was collected by trained research associates who administered standardized in-person interviews at a study entry and a 12-month follow-up interview.

## 2.3 Measurements

**2.3.1 Outcomes**—Two separate outcomes were examined: 1) lifetime non-fatal overdose (“Have you ever overdosed?”) assessed at study entry; and 2) past year non-fatal overdose assessed at study entry and 12-month study interview, defined as responding 1 to the question, “How many times have you overdosed in the past year?” The following information was provided by research associates to participants before asking the overdose questions. “We are referring to ANY overdose you may have had including accidental and deliberate (on purpose) overdoses on illegal drugs, over the counter medications, prescription medications, or alcohol.”

**2.3.2 Main independent variables and covariates**—The main independent variables were (1) total number of (“systemically active”) medications, 2) total number of medications excluding ARVs, 3) total number of sedating medications and 4) total number of non-sedating medications. We also examined associations with (i) any opioid medication and (ii) any non-opioid sedating medication (Figure 1). Medication count and type were measured at study entry.

Covariates included demographic data (age, sex, and race/ethnicity); medical comorbidity (Charlson Comorbidity Index Score [Quan et al., 2005]); any recent (past 30 day) heavy alcohol use (> 14 drinks in a week or 5+ drinks in a day for men and >7 drinks in a week or 4+ drinks in a day for women) assessed by 30-day Timeline Follow-Back Interview (Vinson, Reidinger, & Wilcosky, 2003); and any recent illicit opioid use, illicit sedative use, and

cocaine use assessed by the Addiction Severity Index (McLellan et al., 1992). We considered adjusting for mental health diagnosis (post-traumatic stress disorder, other anxiety disorders, depressive disorders, and bipolar or psychotic disorders as defined by Park et al. (Park, Saitz, Ganoczy, Ilgen, & Bohnert, 2015), but found that 85% of the study sample had at least one of these comorbid psychiatric illnesses. Therefore, we used binary measures of depressive symptoms (2-item Patient Health Questionnaire score  $\geq 3$ ) (Kroenke, Spitzer, & Williams, 2003) and anxiety symptoms (Overall Anxiety Severity and Impairment Scale (OASIS) score  $\geq 8$ ) (Campbell-Sills et al., 2009).

## 2.4 Statistical analysis

We used descriptive statistics to characterize the sample at study entry. Separate analyses were conducted for lifetime and past year non-fatal overdose. 1) Lifetime non-fatal overdose analyses used data collected at baseline for both medication counts and report of lifetime non-fatal overdose. Logistic regression models were used to examine the association between number of medications in each category (e.g., overall, non-ARV, sedating, non-sedating) and lifetime non-fatal overdose fitting separate models for each medication count and outcome. 2) The analysis of number of medications and past year overdose used two types of observations: i) medication data and past year non-fatal overdose from the baseline assessment and ii) medication data at baseline and past year non-fatal overdose at the 12-month follow up. Past year overdose was examined using separate generalized estimating equations (GEE) logistic regression models for each medication count and past year non-fatal overdose to account for non-independence of repeated measures.

To assess whether the association of the number of overall medications was due to sedating medications, we used a model with both the number of sedating medications and number of non-sedating medications as main predictors. To examine more closely the effect of sedating medications, we used a logistic regression model that included any opioid and any non-opioid sedating medication as the main predictors.

The modeling strategy is summarized below and in Figure 1.

Model 1 assessed the total number of medications.

Model 2 assessed the total number of medications excluding ARV.

Model 3 assessed the number of sedating and non-sedating medications.

Model 4 assessed “any opioid medication” and “any non-opioid sedating medication.”

To assess if associations were different for opioid agonists used for addiction treatment (i.e., buprenorphine or methadone) than for other opioids for pain, we ran additional models (Model 5) that replaced “any opioid medication” with two separate, mutually exclusive variables: i) any buprenorphine or methadone and ii) any other opioid medication. Because co-prescribed opioid and non-sedating medications are associated with overdose (Park et al., 2015; Collet et al., 2016), we also assessed the association of co-prescribed opioid and non-opioid sedating medications, opioid medication only, and non-opioid sedating medication only. All were dichotomous variables (Model 6). Given the number of past year non-fatal

overdoses in the sample, only a limited number of covariates could be included in a multiple logistic regression model to control for confounding. Therefore, we fit models controlling separately for each of the following covariates: age, sex, race/ethnicity, Charlson Comorbidity Score, depressive symptoms, anxiety symptoms, and any recent heavy alcohol use, illicit opioid use, illicit sedative use and cocaine use. In a Pearson correlation matrix, no covariates had a correlation coefficient of 0.4 or greater.

To explore the best cutoff value for identifying the risk of each outcome, we used receiver operating characteristic (ROC) curve analyses to calculate the area under the curve for the number of medications, overall and sedating, without adjustment for covariates. We report the Youden Index (sensitivity + specificity – 1), a summary measure of the ROC curve, to determine the optimal cutoff point. ROC curves are presented for each medication count and overdose analyses.

## 3.0 Results

### 3.1 Study participants

At study entry, the median age of the 250 participants (Table 1) was 50 (interquartile range [IQR] 44,56). The majority had both alcohol and drug dependence (51%) and 19% no substance dependence in the past year, but had a lifetime history of injection drug use. In the total sample, recent (past month) substance use was common. Specifically, 51% had heavy alcohol use; 30% reported cocaine use; and 23% and 9% had recent illicit/misused prescribed opioid and sedative use, respectively.

The median number of prescription medications was 10 (interquartile [IQR] 7,14) overall and 8 (IQR 5,11) non-ARV medications. Prescription of five or more medications (a common definition of polypharmacy) was almost universal (91%, 227/250). Among the study sample (n=250), 80% were prescribed at least one sedating medication. This category of medications included any opioid medication (50%) and any non-opioid sedating medication (72%). Co-prescribed opioid and non-opioid medications were common (41%). The most frequent non-opioid sedating medications were (in descending order of frequency): gabapentin, mirtazapine, trazodone, hydroxyzine, diphenhydramine, amitriptyline, doxepin, zolpidem, quetiapine, and clonazepam. (See Table 1a in Appendix for a complete list of sedating medications). At baseline, almost half (45%) reported lifetime non-fatal overdose and 7% past-year non-fatal overdose. An additional nine participants reported non-fatal past-year overdose at the 12-month study follow-up.

### 3.2 Main findings

**3.2.1 Lifetime non-fatal overdose**—Each additional medication overall (odds ratio [OR] 1.05, 95% Confidence Interval [CI] 1.00, 1.10, p=0.06) (Table 2) was not significantly associated with lifetime non-fatal overdose. Excluding ARV medications from the total number of medications yielded similar results (OR 1.05, 95% CI 1.00, 1.10, p=0.08).

In a model that included the number of sedating and non-sedating medications, each additional sedating medication was significantly associated with greater odds of lifetime non-fatal overdose (OR 1.26, 95% CI 1.08, 1.46) whereas each additional non-sedating



medication was not (OR 0.99, 95% CI 0.94, 1.06). ROC curve analyses indicated the optimal cutoff for identifying lifetime non-fatal OD was 3 sedating medications (Youden index 0.23, area under the curve [AUC] 0.62) (Figure 2).

Prescription of an opioid medication (OR 2.31, 95% CI 1.37, 3.90) but not of a non-opioid sedating medication (OR 1.18, 95% CI 0.66, 2.13) was significantly associated with odds of a lifetime non-fatal overdose (Table 3). Opioid and non-opioid sedating medications were examined in one model. Because we found an effect of “any opioid medication”, we explored the association of opioid agonists for addiction treatment (i.e., buprenorphine or methadone) and other opioids for pain in the same model (Table 3). We found that opioid agonists for addiction treatment were significantly associated with lifetime non-fatal overdose (OR 4.79, 95% CI 2.53, 9.08) but that prescription of other opioid medications (e.g. for pain) was not (OR 1.11, 95%CI 0.59, 2.10).

Although non-opioid sedating medications alone were not associated with overdose (OR 1.18, 95% CI 0.66, 2.13), co-prescribed opioid and non-opioid sedating medications were associated with non-fatal lifetime overdose (global p-value 0.01) (OR 2.54, 95%CI 1.25, 5.16) (Table 4). This logistic regression model included opioid medication only (no non-opioid sedating medication) and non-opioid sedating medication only (no opioid sedating medication); the latter 2 were not significantly associated with non-fatal lifetime overdose.

**3.2.2 Past year non-fatal overdose**—Each additional non-ARV medication (OR 1.07, 95% CI 1.00, 1.15, p=0.048) was significantly associated with an increase in the odds of past year non-fatal overdose (Table 2). In a model that further characterized medications as sedating and non-sedating, each additional sedating medication was associated with past year non-fatal OD (OR 1.81, 95% CI 1.00, 1.39, p=0.049) but non-sedating medications were not (OR 1.02, 95% CI 0.92, 1.14). Optimal cutoffs for identifying non-fatal overdose were: 9 non-ARV medications (Youden index 0.22, AUC 0.61) and 2 sedating medications (Youden index 0.20, AUC 0.64) (Figure 3).

Although not statistically significant, the odds of past year non-fatal OD were greater with prescription of an opioid medication (OR 2.23, 95%CI 0.93, 5.35) and a non-opioid sedating medication (OR 1.99, 95%CI 0.66, 5.94) (Table 3). Co-prescribed opioid and non-opioid sedating medications were not associated with past year non-fatal OD (Table 4). Buprenorphine and methadone were significantly associated with past year non-fatal overdose (OR 2.73, 95%CI 1.20, 6.19). Again, we did not find an association with other opioid medications (OR 0.81, 95%CI 0.27, 2.45).

**3.2.3 Adjusted Models**—Results of adjusted models for all regression models were not substantially different (Appendix). Other predictors of greater lifetime and past year non-fatal overdose included depressive and anxiety symptoms, and recent illicit opioid use and illicit sedative use.

## 4. Discussion

We examined the association of the type and number of prescribed medications with lifetime and past year nonfatal overdose in this study of individuals with HIV infection and substance dependence. The increasing odds of non-fatal overdose that we observed with our medication categories (systemically active < sedating < opioid) is consistent with our hypothesis that for non-fatal overdose, the risk from polypharmacy is attributable to additional sedating medications. Each additional sedating medication was associated with an approximately 25% increase in odds of lifetime non-fatal overdose. We also found that the lifetime non-fatal overdose risk from sedating medications was mostly driven by prescribed opioid medications. Co-prescribed opioid and non-opioid sedating medications were also associated with lifetime non-fatal overdose. Optimal cutoffs for identifying lifetime non-fatal overdose was 3 sedating medications and for past year non-fatal overdose 9 non-ARV medications and 2 sedating medications.

The current study extends our knowledge of overdose in PLWH with substance dependence by examining the association of polypharmacy and overdose. This is important because PLWH and substance dependence are at higher risk of developing non-AIDS-defining chronic medical conditions, also called multimorbidity (Salter et al., 2011), with an attendant higher number of prescribed medications. The study findings are consistent with literature on sedatives and risk of overdose. Patients co-prescribed opioid and benzodiazepine medications have greater mortality risk (Park et al., 2015) especially PLWH (Weisberg et al., 2015). Although the literature is less well-established for overdose and *any* sedating medication (Bernardy, Lund, Alexander, & Friedman, 2014; Turner & Liang, 2015), there are even fewer data on the risk with the number of sedating medications. One study found that the risk of overdose is associated with 5 or more sedating medications (which they termed “CNS polypharmacy”) among a high-risk population (Collett et al., 2016). Consistent with this study, we did not find *any* sedating medication to be a useful measure given that more than 80% were prescribed at least one sedating medication.

This study suggests that there is limited value to defining polypharmacy with strict cut-offs for identifying risks without regard for drug type (Gnjidic et al., 2012; Laflamme, Monárrez-Espino, Johnell, Elling, & Möller, 2015; Steinman, 2016). Conventional definitions of polypharmacy, such as five or more medications, have been validated largely in elderly populations (Gnjidic et al., 2012). It may be important to establish clinically relevant polypharmacy cut-offs for different age groups and populations (Kouladjian, Hilmer, Chen, Le Couteur, & Gnjidic, 2014). While we identified the best cutoff value in our cohort, we also demonstrated that the risk of overdose exists over a range of cutoffs. Given that almost all participants were prescribed five or more medications, we found that using this commonly used definition of polypharmacy was not appropriate in this sample. The median number of medications in this sample is somewhat higher than others in the literature (Moore, et al., 2015; Holtzman et al., 2013) but similar in another (Zhou et al., 2014). Variability in the number of prescribed medications cited by other studies stems in part from differences in age, regions of country, and study time period. The somewhat higher number of prescribed medications in this study likely reflects an insured, older (median age of 50),



multi-morbid population with a high prevalence of psychiatric illness (85%), all recruited from medical clinics.

There are several potential reasons for the associations between polypharmacy and overdose. More medications contribute to the complexity of one's treatment regimen with the potential for a less careful inspection of the medication list by providers resulting in prescriber errors and even patient confusion about medication instructions (Patel, Zimmerman, Fonda, & Linsky, 2016). Safer management of opioid and other sedating medications in clinic visits may compete for attention with HIV-related medical, psychiatric, and addiction problems (Rose et al., 2009). Although this was not a study of inappropriate prescribing, medication interactions, or pill burden, these may have been factors that contributed to the findings.

Although we adjusted for any recent illicit opioid use and benzodiazepine medication use, it is possible that misuse of prescribed sedative medications was a contributing factor. Vijayaraghavan et al. found patients with HIV prescribed opioid medications, benzodiazepines, and muscle relaxants are at greater risk of sedative misuse (Vijayaraghavan et al., 2014).

The reason that we did not find an association of opioid medications prescribed for pain and non-fatal overdose is unclear. Because our medication review was a one-time look at the EMR, we did not have information about length of time that participants were prescribed opioid medications. In many cases, opioids may have been prescribed for a brief time (e.g., after a surgical procedure) with minimal overdose risk.

The association of buprenorphine and methadone with both lifetime and past year non-fatal overdose is likely due, at least in part, the result of a participant's history of severe opioid use disorder rather than the medication itself. A meta-analysis of prospective and retrospective cohort studies of the relationship between opioid agonist medication and fatal overdose demonstrated substantially lower overdose and all-cause mortality among people taking opioid agonists (Sordo et al., 2017). We would expect that people who have previously overdosed would be more likely to have a severe opioid use disorder and thus be appropriately treated with opioid agonist treatment. In the lifetime analysis, we do not know whether the medications were started before or after the overdose occurred. In the past year analysis, two thirds of the reported non-fatal overdoses occurred prior to study entry. Despite adjustment for psychiatric symptoms, the number of sedating medications could be a proxy for psychiatric comorbidity due to residual confounding. To fully sort out the attribution of the number and categories of medications to overdose risk, additional studies with larger cohorts and longer prospective observation periods are warranted to better address this confounding.

Another limitation relates to the absence of a validated method of assessing a history of overdose, a major gap in the literature (Green et al., 2012). Absent that, asking the question, "Have you had an overdose?" as we did in this study has face value. The limited number of past year overdoses may have affected the ability to detect associations between medication counts and overdose. Another limitation is the examination of non-fatal overdose rather than fatal overdose. However, sequelae of non-fatal overdose (e.g., aspiration pneumonia,

cognitive impairments, renal failure) can be devastating. Also, given that non-fatal overdose is a risk factor for fatal overdose (Caudarella et al., 2016), interventions to decrease risk of non-fatal overdose could reasonably be expected to reduce fatal overdoses.

We did not have data on alternative and over the counter medications that were not listed in the EMR, however these medications are unlikely to have a strong impact on overdose and are more difficult to assess reliably. We also did not examine data on the number of tablets (pill burden) or frequency of dosing. Finally, generalizability is another consideration given that the study sample was recruited from two urban HIV clinics in a northeastern city (where the ecology of the availability of different types of illicit drugs and prescription drugs may directly affect personal risks).

In this sample of individuals with HIV infection and substance dependence, the number of sedating medications and any opioid were associated with non-fatal overdose. Sedating medications were prescribed to over three quarters of patients. Polypharmacy among HIV patients with substance dependence warrants further research to determine whether reducing sedating medications lowers overdose risk.

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## Appendix

**Table 1a**

Non-opioid sedating medications prescribed to a cohort of HIV-infected participants with past year substance dependence or lifetime history of injection drug use (n=250)

Generic name	Number of participants n (%)
Gabapentin	56 (22%)
Mirtazapine	39 (16%)
Trazodone	36 (14%)
Hydroxyzine	29 (12%)
Diphenhydramine	25 (10%)
Amitriptyline	20 (8%)
Doxepin	20 (8%)
Zolpidem	20 (8%)
Quetiapine	19 (8%)
Clonazepam	18 (7%)
Butabarbital	15 (6%)
Prazosin	14 (6%)
Cyclobenzaprine	13 (5%)
Clonidine	12 (5%)
Lorazepam	10 (4%)
Chlorpromazine	6 (2%)
Aripirazole	5 (2%)
Dronabinol	5 (2%)
Nortriptyline	5 (2%)
Perphenazine	5 (2%)
Benzotropine	4 (2%)
Bupirone	4 (2%)
Pregabalin	4 (2%)
Risperidone	4 (2%)
Haloperidol	3 (1%)
Ziprasizone	3 (1%)
Promethazine	2 (1%)
Alprazolam	2 (1%)
Tizanidine	1 (<1%)

Generic name	Number of participants n (%)
Chlordiazepoxide	1 (<1%)
Fluphenazine	1 (<1%)
Methocarbamol	1 (<1%)
Paliperidone	1 (<1%)
Phenobarbital	1 (<1%)

**Table 2a**Adjusted associations between number of medications and lifetime non-fatal overdose<sup>a</sup>

	All medications <sup>b</sup> OR (95%CI)	Non-antiretroviral medications OR (95%CI)	Sedating Medications <sup>c</sup> OR (95%CI)	Non-sedating medications <sup>c</sup> OR (95%CI)
Each additional medication (unadjusted)	1.05 (1.00, 1.10)	1.05 (1.00, 1.10)	1.26 (1.08, 1.46)	0.99 (0.94, 1.06)
Age	1.02 (0.99, 1.05)	1.02 (1.00, 1.05)	1.04 (1.01, 1.07)	---
Each additional medication	1.04 (0.99, 1.09)	1.04 (0.99, 1.09)	1.31 (1.12, 1.53)	0.96 (0.90, 1.03)
Sex (female vs male)	0.92 (0.54, 1.56)	0.91 (0.54, 1.55)	0.87 (0.51, 1.49)	---
Each additional medication	1.05 (1.00, 1.10)	1.05 (1.00, 1.10)	1.26 (1.09, 1.46)	1.00 (0.94, 1.06)
Race				
Hispanic vs Black	1.63 (0.87, 3.05)	1.63 (0.87, 3.04)	1.50 (0.79, 2.83)	---
White vs Black	2.74 (1.46, 5.13)	2.69 (1.44, 5.04)	2.29 (1.19, 4.43)	---
Each additional medication	1.04 (1.00, 1.10)	1.04 (0.99, 1.10)	1.19 (1.02, 1.39)	1.01 (0.95, 1.07)
Charlson Comorbidity Index	1.07 (0.96, 1.20)	1.08 (0.96, 1.21)	1.11 (0.98, 1.25)	---
Each additional medication	1.03 (0.98, 1.09)	1.03 (0.98, 1.09)	1.25 (1.08, 1.45)	0.97 (0.91, 1.04)
Depressive symptoms	2.08 (1.19, 3.65)	2.07 (1.18, 3.64)	2.02 (1.14, 3.57)	---
Each additional medication	1.04 (0.99, 1.09)	1.03 (0.98, 1.09)	1.24 (1.06, 1.44)	0.99 (0.93, 1.05)
Anxiety symptoms	1.75 (1.05, 2.92)	1.74 (1.04, 2.90)	1.53 (0.90, 2.59)	---
Each additional medication	1.04 (0.99, 1.09)	1.04 (0.99, 1.09)	1.22 (1.05, 1.42)	1.00 (0.94, 1.06)
Alcohol use, <sup>d,e</sup>				
Did not exceed daily/ weekly limits vs no alcohol	0.42 (0.19, 0.93)	0.43 (0.19, 0.94)	0.48 (0.22, 1.08)	---
Exceeded daily/weekly limits vs no alcohol	0.55 (0.31, 0.96)	0.54 (0.31, 0.95)	0.53 (0.30, 0.95)	---
Each additional medication	1.04 (1.00, 1.09)	1.04 (0.99, 1.10)	1.24 (1.07, 1.44)	0.99 (0.93, 1.06)
Illicit or misused prescription opioid, any <sup>e</sup>	3.22 (1.72, 6.00)	3.18 (1.71, 5.93)	3.08 (1.64, 5.77)	---
Each additional medication	1.05 (1.00, 1.10)	1.05 (1.00, 1.11)	1.25 (1.07, 1.46)	1.00 (0.94, 1.07)
Non-prescribed sedative medication use, any <sup>e</sup>	3.17 (1.23, 8.16)	3.10 (1.21, 7.96)	2.92 (1.12, 7.58)	---



	All medications <sup>b</sup> OR (95%CI)	Non-antiretroviral medications OR (95%CI)	Sedating Medications <sup>c</sup> OR (95%CI)	Non-sedating medications <sup>c</sup> OR (95%CI)
Each additional medication	1.05 (1.00, 1.10)	1.05 (1.00, 1.10)	1.25 (1.07, 1.45)	1.00 (0.94, 1.06)
Cocaine, any <sup>e</sup>	0.85 (0.49, 1.46)	0.84 (0.48, 1.45)	0.81 (0.46, 1.42)	---
Each additional medication	1.05 (1.00, 1.10)	1.05 (1.00, 1.10)	1.26 (1.09, 1.46)	0.99 (0.94, 1.06)

<sup>a</sup>Results of separate logistic regression models examining the association of the number of medications in each category and overdose controlling for each covariate listed above. Each regression model included the number of medications and one covariate. Analyses used study entry data. The first odds ratio (95% CI) in each row is the parameter estimate for the covariate. The second OR is the parameter estimate for the number of medications in each category.

<sup>b</sup>Includes only systemically active medications

<sup>c</sup>Results of one model examining the association of the number of sedating medications and number of non-sedating medications with overdose controlling for one covariate. There is no separate parameter estimate for the covariate and non-sedating medications (as indicated by "---").

<sup>d</sup>NIAAA defined drinking limits (> 14 drinks in a week or 5+ drinks in a day, for men; or >7 drinks in a week or 4+ drinks in a day, for women)

<sup>e</sup>Past 30 days

**Table 3a**

Adjusted associations between number of medications and past year non-fatal overdose<sup>a</sup>

	All medications <sup>b</sup> OR (95%CI)	Non-antiretroviral medications OR (95%CI)	Sedating medications <sup>c</sup> OR (95%CI)	Non-sedating medications <sup>c</sup> OR (95%CI)
Each additional medication (unadjusted)	1.06 (0.99, 1.14)	1.07 (1.00, 1.15)	1.18 (1.00, 1.39)	1.02 (0.92, 1.14)
Age	0.97 (0.92, 1.01)	0.97 (0.92, 1.01)	0.97 (0.93, 1.02)	---
Each additional medication	1.07 (1.00, 1.15)	1.09 (1.01, 1.17)	1.15 (0.98, 1.35)	1.05 (0.94, 1.17)
Sex (female vs male)	1.73 (0.77, 3.91)	1.68 (0.74, 3.80)	1.69 (0.75, 3.83)	---
Each additional medication	1.05 (0.98, 1.13)	1.06 (0.99, 1.14)	1.17 (0.99, 1.37)	1.02 (0.92, 1.13)
Race				
Hispanic vs Black	1.54 (0.60, 3.92)	1.54 (0.60, 3.93)	1.41 (0.54, 3.69)	---
White vs Black	1.49 (0.49, 4.48)	1.43 (0.47, 4.38)	1.27 (0.40, 4.03)	---
Each additional medication	1.06 (0.99, 1.14)	1.07 (1.00, 1.15)	1.16 (0.97, 1.39)	1.03 (0.93, 1.14)
Charlson Comorbidity Index	0.99 (0.85, 1.15)	0.98 (0.85, 1.14)	1.01 (0.86, 1.19)	---
Each additional medication	1.06 (0.97, 1.16)	1.08 (0.99, 1.17)	1.18 (1.00, 1.40)	1.02 (0.90, 1.16)
Depressive symptoms	3.95 (1.79, 8.71)	3.84 (1.75, 8.41)	3.84 (1.74, 8.48)	---
Each additional medication	1.04 (0.97, 1.11)	1.05 (0.98, 1.12)	1.14 (0.98, 1.32)	1.01 (0.92, 1.12)
Anxiety symptoms	2.81 (1.16, 6.80)	2.72 (1.11, 6.65)	2.65 (1.12, 6.25)	---
Each additional medication	1.04 (0.97, 1.12)	1.05 (0.98, 1.13)	1.11 (0.94, 1.32)	1.02 (0.93, 1.13)
Alcohol use <sup>d,e</sup>				
Did not exceed daily/weekly limits vs no alcohol	1.12 (0.36, 3.50)	1.12 (0.36, 3.48)	1.23 (0.40, 3.80)	---

	All medications <sup>b</sup> OR (95%CI)	Non-antiretroviral medications OR (95%CI)	Sedating medications <sup>c</sup> OR (95%CI)	Non-sedating medications <sup>c</sup> OR (95%CI)
Exceeded daily/weekly limits vs no alcohol	1.16 (0.47, 2.86)	1.15 (0.47, 2.84)	1.16 (0.47, 2.88)	---
Each additional medication	1.06 (0.99, 1.14)	1.07 (1.00, 1.15)	1.19 (1.02, 1.39)	1.02 (0.92, 1.14)
Illicit or misused prescription opioid, any <sup>e</sup>	5.53 (2.56, 11.93)	5.50 (2.54, 11.93)	5.37 (2.51, 11.51)	---
Each additional medication	1.06 (0.99, 1.14)	1.07 (1.00, 1.15)	1.14 (0.98, 1.34)	1.03 (0.94, 1.14)
Non-prescribed sedative medication use, any <sup>e</sup>	3.23 (1.07, 9.75)	3.13 (1.02, 9.56)	3.03 (1.01, 9.12)	---
Each additional medication	1.06 (0.99, 1.14)	1.07 (1.00, 1.15)	1.16 (0.99, 1.37)	1.03 (0.93, 1.14)
Cocaine, any <sup>e</sup>	1.32 (0.61, 2.87)	1.28 (0.59, 2.77)	1.27 (0.58, 2.76)	---
Each additional medication	1.06 (0.99, 1.14)	1.07 (1.00, 1.15)	1.18 (1.00, 1.38)	1.03 (0.92, 1.14)

<sup>a</sup>Results of separate logistic regression models examining the association of the number of medications in each category and overdose controlling for each covariate listed above. Each regression model included the number of medications and one covariate. The first odds ratio (95% CI) in each row is the parameter estimate for the covariate. The second odds ratio is the parameter estimate for each additional medication in each category

<sup>b</sup>Includes only systemically active medications

<sup>c</sup>Results of one model examining the association of the number of sedating medications and number of non-sedating medications with overdose controlling for one covariate. There is no separate parameter estimate for the covariate and non-sedating medications (as indicated by "---").

<sup>d</sup>National Institute on Alcohol Abuse and Alcoholism defined drinking limits (> 14 drinks in a week or 5+ drinks in a day, for men; or >7 drinks in a week or 4+ drinks in a day, for women)

<sup>e</sup>Past 30 days

### Highlights

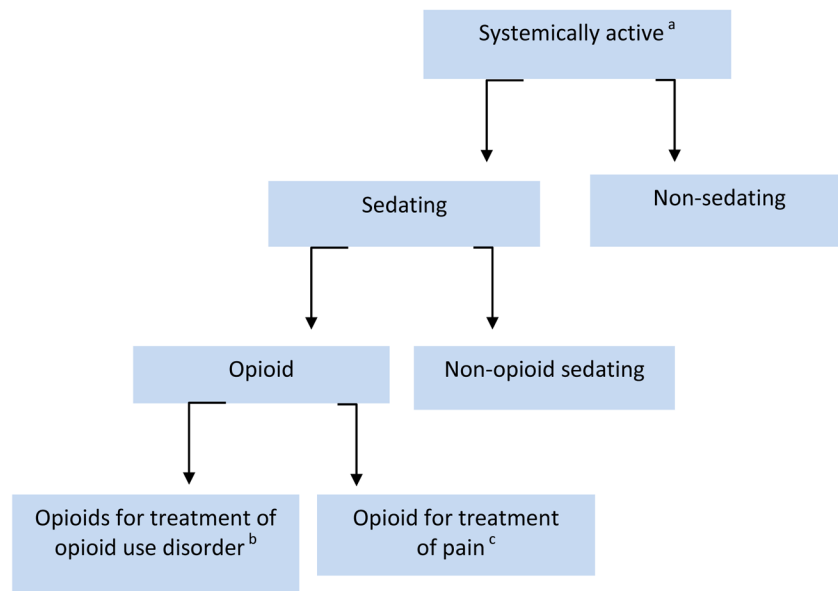
- People living with HIV are at risk of polypharmacy and overdose (OD)
- We assessed the effect of the number and type of medication on non-fatal OD
- The risk from polypharmacy was attributable to the number of sedating medications
- Research is needed whether reducing number of sedating medications lowers OD risk

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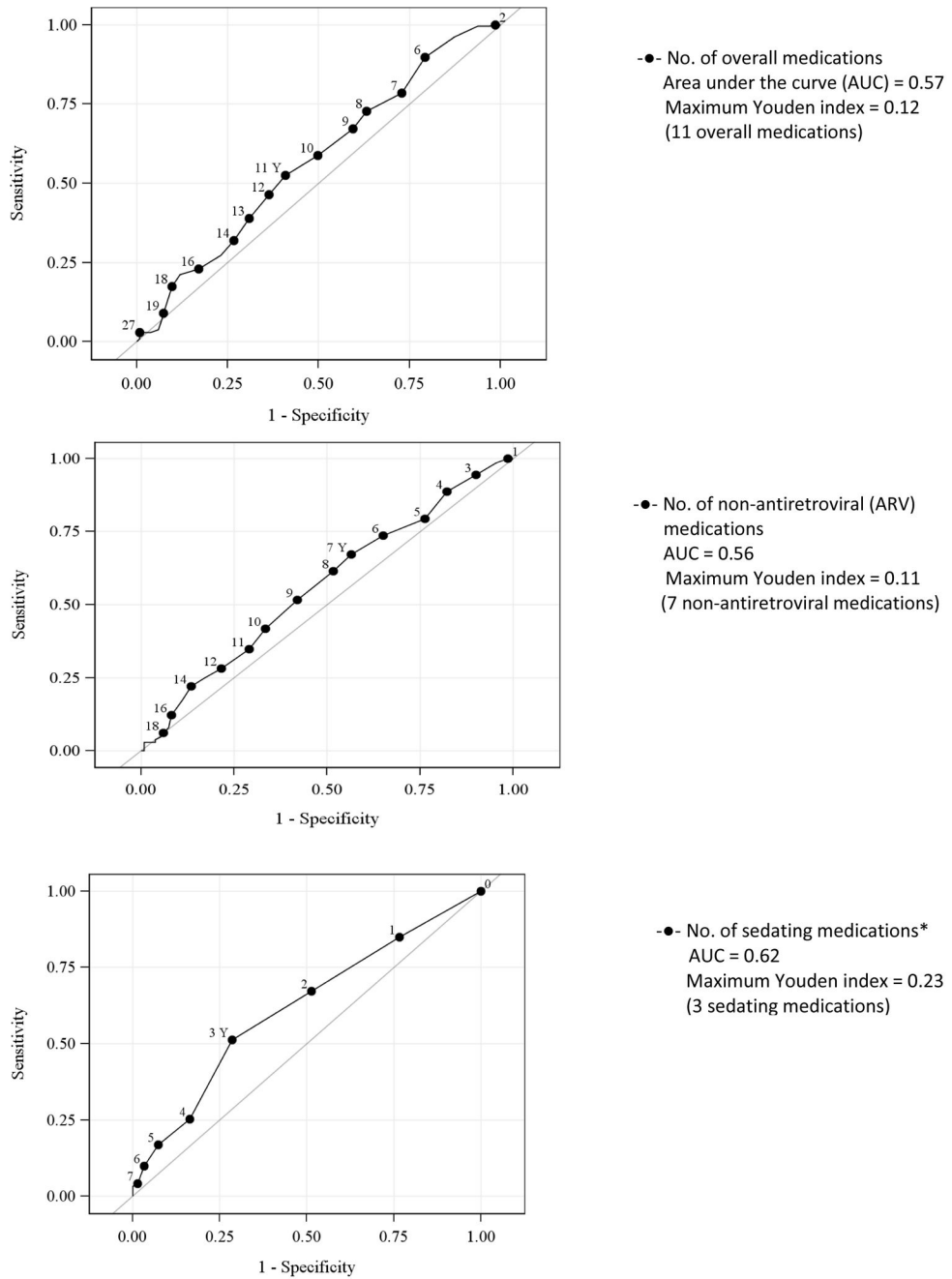
**Figure 1.**

Summary of Medication Categories Used in Analyses

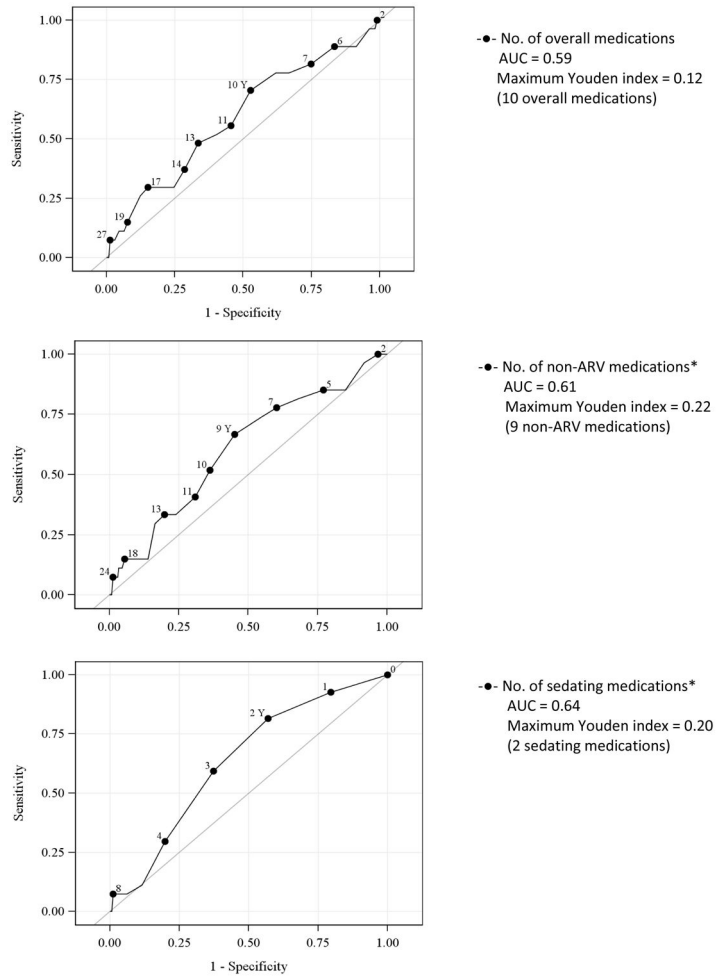
<sup>a</sup>Medications not systemically active includes emollients, irrigation solutions, vitamins (except for vitamin D), peritoneal solutions, eye drops, rectal or vaginally administered medications, complementary and alternative medications.

<sup>b</sup>Buprenorphine, methadone

<sup>c</sup>All other opioid medications



**Figure 2.** Receiver operating characteristic curves for the association of the number of medications overall and risk of lifetime overdose  
 \* p< 0.05 statistically significant association



**Figure 3.** Receiver operating characteristic curves for the association of the number of medications and risk of past-year overdose  
\*  $p < 0.05$  statistically significant association



**Table 1**

Baseline characteristics of participants with HIV infection and substance dependence (n=250)

Characteristic	% (n)
Age, median (IQR)	50 years (44, 56)
Female	37% (93)
Race/ethnicity	
Hispanic	24% (62)
Black	50% (125)
White	20% (51)
Employed	16% (40)
Health insurance	99% (248)
Depressive symptoms <sup>a</sup>	30% (74)
Anxiety symptoms <sup>b</sup>	45% (112)
Current tobacco	78% (195)
Ever injected drugs	19% (47)
DSM-IV Substance Dependence <sup>c</sup> , past year	
Both alcohol and drug dependence	51% (127)
Drug dependence only	21% (53)
Alcohol dependence only	9% (23)
No dependence <sup>d</sup>	19% (47)
Alcohol use, <sup>e</sup> past 30 days	
Heavy alcohol use	51% (127)
Non-heavy alcohol use	16% (40)
No alcohol use	33% (83)
Past month drug use, past 30 days <sup>f</sup>	
Any illicit opioid use <sup>g</sup>	23% (58)
Any illicit sedative use	9% (22)
Any cocaine use	30% (76)
Prescribed antiretroviral medications	88% (220)
HIV viral load < 200 copies	72% (178)
Prescribed medications	
Number of overall medications, median (IQR)	10 (7,14)
Number of overall medications excluding ARV, median (IQR)	8 (5, 11)
Five or more overall medications	91% (227)
Sedating medication, any	80% (201)
Number of sedating medications, median (IQR)	2 (1,3)
Type of sedating medication:	
Opioid medication, any	50% (124)
Non-opioid sedating medication, any	72% (179)
Co-prescribed opioid and non-opioid sedating medications	41% (102/250)
Opioid only (no non-opioid sedating), any	9% (22)

Characteristic	% (n)
Non-opioid sedating only (no opioid), any	32% (77)
Type of opioid medication	
Buprenorphine or methadone, any	27% (68)
Other opioid medications, any	25% (62)
Overdose, any lifetime	45% (111)
Overdose, past 12 months <sup>h</sup>	7% (18)

<sup>a</sup>Patient Health Questionnaire-2 (PHQ-2) score = 3

<sup>b</sup>Overall Anxiety Severity and Impairment Scale (OASIS) score = 8

<sup>c</sup>Mini International Neuropsychiatric Interview (MINI) 6.0 DSM IV criteria

<sup>d</sup>patients with no past year history of substance dependence were eligible for the study if s/he had a lifetime history of injection drug use

<sup>e</sup>for women: more than 7 drinks on average in a week or 4+ drinks in a day; for men more than 14 drinks on average in a week or 5+ drinks in a day in the past 30 days

<sup>f</sup>from the Addiction Severity Index

<sup>g</sup>includes use of medications without a prescription or more than prescribed

<sup>h</sup>Reported at study entry. At the 12-month follow-up study interview, 9 participants reported non-fatal overdose in the previous 12 months.

**Table 2**Association of number (by type) of medications and risk of lifetime and past-year non-fatal overdose<sup>a</sup>

Medication type	Lifetime Overdose OR (95%CI)	p-value	Past-year Overdose OR (95%CI)	p-value
Each additional overall medication	1.05 (1.00, 1.10)	0.06	1.06 (0.99, 1.14)	0.12
Each additional non-antiretroviral medication	1.05 (1.00, 1.10)	0.08	1.07 (1.00, 1.15)	0.048
Each additional sedating medication <sup>b</sup>	1.26 (1.08, 1.46)	0.003	1.18 (1.00, 1.39)	0.049
Each additional non-sedating medication <sup>b</sup>	0.99 (0.94, 1.06)	0.84	1.02 (0.92, 1.14)	0.67

<sup>a</sup>Results of separate unadjusted logistic regression models examining the association of the number of medications in each category and each type of overdose. Lifetime non-fatal overdose analyses included 249 observations. (One participant declined to respond to the question about overdose). Past-year overdose analyses were generalized estimating equations logistic regression models using 482 observations: 249 at baseline and 233 at 12 months. Results of adjusted models were not substantially different (Appendix).

<sup>b</sup>Results of one model "number of sedating medications" and "number of non-sedating medications"

**Table 3**

Association of type of sedating medication and risk of lifetime and past-year non-fatal overdose

Medication type	Lifetime Overdose OR (95%CI)	p-value	Past-year Overdose OR (95%CI)	p-value
Any opioid medication <sup>a</sup>	2.31 (1.37, 3.90)	0.002	2.23 (0.93, 5.35)	0.07
Any non-opioid sedating medication <sup>a</sup>	1.18 (0.66, 2.13)	0.57	1.99 (0.66, 5.94)	0.22
Any opioid agonist treatment medication <sup>b</sup>	4.79 (2.53, 9.08)	<0.001	2.73 (1.20, 6.19)	0.01
Any opioid medication for pain <sup>b</sup>	1.11 (0.59, 2.10)	0.74	0.81 (0.27, 2.45)	0.71
Any non-opioid sedating medication <sup>b</sup>	1.18 (0.66, 2.13)	0.57	1.99 (0.66, 5.94)	0.22

<sup>a</sup>Results of one unadjusted logistic regression model that included "any opioid medication" and "any non-opioid sedating medication"

<sup>b</sup>Results of one unadjusted logistic regression model that included "any opioid agonist treatment medication" (buprenorphine or methadone), "any opioid medication for pain (all other opioid medications)" and any non-opioid sedating medication.

**Table 4**Association of co-prescribed sedating medications and risk of lifetime and past-year non-fatal overdose<sup>a</sup>

Type of sedating medication	Lifetime Overdose OR (95%CI)	Global p-value	Past-year Overdose OR (95%CI)	Global p-value
Co-prescribed opioid and non-opioid sedating medications	2.54 (1.25, 5.16)	0.01	0.81 (0.27, 2.45)	0.14
Opioid only	1.57 (0.56, 4.37)	---	2.23 (0.93, 5.35)	---
Non-opioid sedating medication only	0.96 (0.45, 2.04)	---	4.42 (0.98, 19.99)	---

<sup>a</sup>Results of one logistic regression model. Referent group is no sedating medication.

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