



HHS Public Access

Author manuscript

Water Res. Author manuscript; available in PMC 2020 September 15.

Published in final edited form as:

Water Res. 2019 September 15; 161: 171–180. doi:10.1016/j.watres.2019.06.003.

Long-term tracking of opioid consumption in two United States cities using wastewater-based epidemiology approach

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Abstract

Access to near-real time opioid use data is essential to the effective management of the U.S. opioid crisis. Current narcotic data collection methods are limited by time delay and would be complimented by a rapid data acquisition technique. Use of wastewater-based epidemiology (WBE) analysis may offer access to near real-time data on opioid consumption but application in the United States has been limited. From 2015–2017, monthly 24-hour time-weighted composite samples of municipal raw wastewater from two Midwestern U.S. cities were routinely analyzed using liquid chromatography-tandem mass spectrometry for morphine, codeine, oxycodone, heroin, fentanyl, and select opioid metabolites. Concentrations of opioids (ng/L) in raw wastewater from City 1 and 2, respectively, were: morphine (713 ± 38 ; 306 ± 29 ; detection frequency (DF): 100%), oxycodone (17.8 ± 1.1 ; 78 ± 6 ; DF: 100%), codeine (332 ± 37 ; 100 ± 27 ; DF: 93%), heroin (41 ± 16 ; 9 ± 11 ; DF: 81%), and fentanyl (1.7 ± 0.2 ; 1.0 ± 0.5 ; DF: 62%). Average opioid consumption rates estimated using WBE ranged between 9 to 2,590 mg/day/1,000 persons. Anticipated overdoses and overdose-deaths calculated from analyte concentrations in wastewater forecasted 200 opioid-related overdoses/year and 39 opioid related overdose-deaths/year across the

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6.0 Competing Interest Statement

The authors are not aware of any substantive or perceived competing interest concerning this work.

Declaration of interests

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

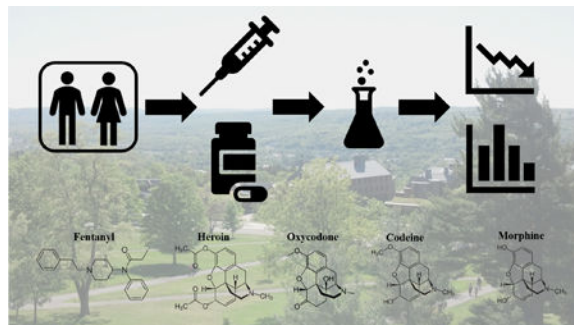
Author Agreement/Declaration

This certifies that all authors have seen and approved the final version of the manuscript titled “*Long-term tracking of opioid consumption in two United States cities using wastewater-based epidemiology approach*” for consideration of publication in the journal *Water Research*.

We warrant that the article is the authors' original work, hasn't received prior publication and is not under consideration for publication elsewhere.

two cities during the year 2016, which aligned well with observed coroner-reported opioid deaths. This long-term U.S. screening study of opioids in wastewater was the first to utilize wastewater epidemiological data to estimate the number of expected overdose and overdose-deaths, and to identify detectable levels of the powerful synthetic opioid fentanyl in wastewater.

Graphical Abstract



Keywords

Sewage Epidemiology; Heroin; Fentanyl; Opioid Overdose Estimation; Opioid Death Estimation

1. Introduction

The United States is in the midst of an unprecedented opioid epidemic that claims approximately 42,000 U.S. lives annually (Kounang 2017, Rudd 2016, Schuchat et al. 2017). Opioids were responsible for 67% and 63% of all drug overdose fatalities in 2014 and 2015, with death rate increases from 12.3 to 16.3 per 100,000 population being attributable to increased consumption of heroin (+21%) and the 50-times more powerful synthetic opioid, fentanyl (+72%) (Rudd 2016, Warner et al. 2016). In the U.S., 10.3 million residents reported using prescription opioids for nonmedical purposes in 2014, and a nine-fold increase of young adults using heroin has been observed from 2002 to 2014 (Martins et al. 2017). Positive correlations between non-medical opioid use and heroin use have also been observed (Compton et al. 2016). While exact percentages vary by study and city, studies cite that between 39% to 86% of heroin users admitted to nonmedical use of pharmaceutical opioids before beginning heroin use (Lankenau et al. 2012, Mateu-Gelabert et al. 2015, Peavy et al. 2012, Pollini et al. 2011, Siegal et al. 2003). Despite recent successful efforts by public health and medical professionals to curb opioid prescription rates (Dowell et al. 2016, Frieden and Houry 2016, Schuchat et al. 2017), drug related overdose deaths have continued to increase in the United States (Katz 2017).

With such widespread opioid use, obtaining relevant information related to opioid consumption is vital to developing effective substance abuse prevention strategies. Current data analysis involves a combination of population surveys, crime statistics, medical records and narcotic seizure data (Zuccato et al. 2008), but these methods are often costly, cumbersome, and may be subject to bias. Wastewater-based epidemiology (WBE) was first proposed in 2001 as a method for obtaining population health metrics by back-calculating

health metrics from concentrations of related biomarkers within composite wastewater samples (Daughton 2001). In 2005 it was tested as a complementary approach to current narcotic data collection methods of cocaine use (Zuccato et al. 2005), and since has experienced widespread use in Europe (Baker et al. 2014, Baz-Lomba et al. 2016, Gatidou et al. 2016, Kankaanpää et al. 2014, Lindberg et al. 2005, Postigo et al. 2011, Terzic et al. 2010, Van Nuijs et al. 2011b, Vuori et al. 2014, Zuccato et al. 2008, Zuccato et al. 2005), Asia (Kim et al. 2015, Lai et al. 2013), Africa (Archer et al. 2018) and Australia (Lai et al. 2016, Tscharke et al. 2016) in order to obtain anonymous prescription and illicit narcotic consumption data in near-real time. The WBE approach has been further expanded under the umbrella of urban metabolism metrology (UMM) (Halden 2016), which studies multiple process flows within the natural and built water environment to obtain diagnostic information on activities, sustainability and the health statistics for a human population. Analysis composited raw sewage samples obtained from wastewater treatment plant (WWTP) may provide important epidemiological insights as usage prevalence statistics could theoretically be obtained for any commonly consumed product within a population (Dove 2006). The validity of this technique has been demonstrated through the comparison of wastewater epidemiological analysis of therapeutic drugs and known amounts consumed by the population (Heberer and Feldmann 2005, Lindberg et al. 2005).

Compared to European and Asian countries, WBE analysis in the United States has seen limited use (Subedi and Kannan 2014). Studies which have examined U.S. wastewaters for drug use prevalence have primarily focused on United States Drug Enforcement Agency (US DEA) schedule I and II narcotics (Banta-Green et al. 2009, Gerrity et al. 2011, Subedi and Kannan 2014). Some U.S. based studies have screened wastewater for prescription and illicit parent opioids and/or metabolites, with positive detections of morphine (Heuett et al. 2015, Subedi and Kannan 2014), codeine (Heuett et al. 2015), oxycodone (Chiaia et al. 2008, Heuett et al. 2015), and heroin (Heuett et al. 2015) being recorded. Despite the recent drastic increase in fentanyl-related deaths (CDC and University 2017), U.S. studies on the occurrence in wastewater of fentanyl are thus far lacking. Furthermore, small U.S. communities have been significantly impacted by the opioid crisis due to additional circumstances which do not impact larger communities, such as: outdated substance abuse infrastructure, shortages in emergency medical technician (EMT) personnel, long travel times of the same, lack of regional coordination, lack of physicians administering programs on substance abuse and medication-assisted treatment, and various administrative barriers (Hancock et al. 2017). Some of these locations have also been identified as areas with strikingly high opioid prescription rates compared to the number of residents within the service area (Whitaker 2017). Therefore, the goal of the present study was to examine opioid abuse trends in two moderately sized (<200,000 population) cities in the American Midwest, a U.S. region that has experienced the highest percentage increase of reported fentanyl abuse from 2014–2015 (CDC 2016). Opioid and metabolite compounds were selected due to their potential for misuse and include: morphine, morphine-3-glucuronide, codeine, norcodeine, oxycodone, noroxycodone, fentanyl, norfentanyl, heroin, and 6-acetylmorphine. Specific objectives of the study were to: (i) obtain the first wastewater monitoring data for U.S. cities to determine city-wide chemical-based fentanyl consumption estimations, (ii) to generate for participating municipalities wastewater-based data on opioid use prevalence for informed

decision making, and (iii) to use wastewater epidemiological data as a tool to forecast expected opioid related overdose and overdose-deaths.

2. Materials and Methods

2.1 Study locations and wastewater sampling methods

Influent from centralized wastewater treatment plants in two Midwestern U.S. cities was collected in 24-hour time-weighted composites using automated samplers by WWTP personnel from March 2015 to March 2017. The WWTP of City 1 serves an approximate 130,000 residents, while that of City 2 serves an approximate 45,000 residents. Demographic data was obtained from the U.S. Census Bureau (SI Table S1) (USCB 2010). Both cities feature a sewer system designed to separate municipal wastewater from stormwater inputs. Both climate range and reported water use per resident were similar across both participating cities. Sampling occurred on one day per month during the 24-month study period; the day of collection varied and was entirely at the discretion of sampling personnel. Samples were stored in polyethylene terephthalate (PET) bottles and shipped to Arizona State University in Styrofoam shipping containers containing either ice or dry ice. Upon receipt, samples were stored at -20°C until analysis.

2.2 Target analytes

Five parent opioids and their respective metabolites were monitored in raw wastewater. The investigated opioids were morphine (MOR), its major metabolite morphine-3-glucuronide (M3G), codeine (COD), its major metabolite norcodeine (NCOD), oxycodone (OXY), its major metabolite noroxycodone (NOXY), fentanyl (FENT), its major metabolite norfentanyl (NFENT), heroin (HER), and its minor but exclusive metabolite 6-acetylmorphine (6-AM). High purity ($>97\%$) standard solutions of the target compounds originated from Sigma Aldrich (Milwaukee, WI) and were prepared by Cerilliant (Round Rock, TX, USA) as solutions in methanol or acetonitrile. Five deuterated compounds, one for each of the parent opioid target compounds were also purchased from Cerilliant for use as internal standards for quantification: heroin- d_9 (HER- d_9), morphine- d_6 (MOR- d_6), codeine- d_6 (COD- d_6), oxycodone- d_3 (OXY- d_3), and fentanyl- d_5 (FENT- d_5).

2.3 Isotope dilution liquid chromatography tandem mass spectrometry (ID-LC-MS/MS)

Briefly, 200 mL of WWTP composite influent was loaded onto Oasis HLB 150 mg solid phase extraction (SPE) cartridges (Waters, Barcelona, Spain) at a rate of 1.5 mL/min using automated extraction with a Dionex Autotrace 280 (Sunnyvale, CA, USA). Prior to extraction, all composite influent samples were spiked with a mixture of the deuterated compounds at a concentration of 5 ng/mL for HER- d_9 , MOR- d_6 , COD- d_6 , OXY- d_3 , and FENT- d_5 . Following sample loading, cartridges were washed with water at a rate of 5 mL/min for five minutes and dried under a stream of nitrogen gas for 10 minutes. Drip-wise elution of analytes from the SPE cartridges was accomplished using 4 mL of a 50:50 mixture of acetone and methanol containing 0.5% formic acid.

Mass spectrometric analyses were carried out on an API 4000 instrument (Applied Biosystems, Framingham, MA, USA), in series with a Shimadzu Prominence HPLC

(Shimadzu Scientific Instruments, Inc., Columbia, MD, USA) that was controlled by Analyst 1.5 software (Applied Biosystems, Framingham, MA, USA). Chromatographic separation was attained with a Symmetry C₁₈ 3.5 μm by 6.4 mm by 75 mm analytical column preceded by a guard column of the same material, both supplied by Waters (Massachusetts, USA), and a mobile phase consisting of gradient methanol/water with 0.2% formic acid at a 0.35 mL/min flow rate. Samples were introduced into the mass spectrometer using an electrospray ionization probe operating in positive mode. Multiple reaction monitoring (MRM) was used for qualitative analysis (SI Table S2).

2.4 Calculation of opioid mass loadings

Parent opioid compounds were selected as indicators of drug consumption in samples collected over the course of the sampling campaign, lasting from March 2015 to March 2017. Starting in June 2016, metabolite compound concentrations also were tracked as indicators of drug consumption until the end of the monitoring program in March 2017. Opioid mass loadings to the WWTP were calculated from influent wastewater flow and corresponding concentration using equation 1:

$$Mass\ Load\left(\frac{mg}{day}\right) = Influent\ Concentration\left(\frac{ng}{L}\right) * Influent\ WW\ Flow\left(\frac{L}{d}\right) * \left(\frac{1\ mg}{1,000,000\ ng}\right)$$

Eq. 1

2.5 Estimation of mass and dose per-capita opioid consumption

To determine population normalized mass and dose consumption values (Table 1), the following equations were used:

$$M.C. \cdot \left(\frac{mg}{day * 1,000\ persons}\right) = M.L. \cdot \left(\frac{mg}{day}\right) * \left(\frac{1,000}{Population}\right) * C.F. \quad Eq. 2$$

$$D.C. \cdot \left(\frac{dose}{day * 1,000\ persons}\right) = M.C. \cdot \left(\frac{mg}{day * 1,000\ persons}\right) * Dose\left(\frac{dose}{mg}\right) \quad Eq. 3$$

Where *M.C.* refers to mass consumption, *D.C.* refers to dose consumption, *M.L.* refers to mass load, and *C.F.* refers to the analyte correction factor. Wastewater epidemiological data was then compared to opioid consumption and excretion data obtained from peer-reviewed literature to estimate the number of opioid users. The number of estimated opioid abusers were then compared to national opioid use statistics. Per the National Drug Intelligence Center's report on Heroin Consumption in the United States (NDIC 2000), average daily use of pure heroin mass was assumed to equal 50 mg/day per user. Prescription opioid mass use was obtained from Mayo Clinic prescription guidelines at an ingestion rate of two doses per day, equaling 60 mg/day for morphine, 60 mg/day for codeine, and 20 mg/day for

oxycodone (Mayo 2017). Since unknown exposure to fentanyl is thought to drive the increase in fentanyl use (CDC and University 2017) it is difficult to estimate the average dose a recreational user may receive. Therefore, fentanyl was omitted from dose consumption analysis.

The following assumptions were factored into every portion of the study analysis: (i) no sewage loss due to leaks or pipe degradation; (ii) no transformation or degradation within sewer lines; and (iii) no direct drug addition to the sewer system (Zuccato et al. 2008). In most cases, the major drug metabolite was selected as the consumption indicator – morphine-3-glucuronide was selected to estimate morphine consumption, noroxycodone was selected to estimate oxycodone consumption, norcodeine was selected to estimate codeine consumption, and norfentanyl was selected to estimate fentanyl consumption. The major metabolite of heroin is morphine, but occurrence of morphine in wastewater can be the result of a number of occurrences and doesn't necessarily indicate heroin consumption, therefore the minor but human specific heroin metabolite, 6-acetylmorphine, was used to estimate heroin consumption (Postigo et al. 2011).

2.6 Overdose-death and black-market value estimates

In order to estimate the number of overdose-deaths from wastewater data, data provided from state dashboards related to opioid abuse, overdoses, and deaths was compiled into a spreadsheet, and ratios between opioid related overdose deaths and overdoses (SI Table S3) were computed (AZDHS 2017, CCPDAP 2017, MNDH 2017, OHA 2017, RIPO 2017, VDH 2017). The average of this ratio (5.35 overdoses/death) was then compared to data related to overall U.S. opioid abuse prevalence (heroin: 3.8 million persons (Martins et al. 2017); prescription opioids: 11.5 million persons (Thompson 2017)) in order to estimate the ratio of opioid-related deaths and overdoses compared to a single opioid user in the United States. This ratio of opioid users to opioid-related overdoses and fatalities was then compared to the estimated number of heroin and fentanyl users computed from the original opioid consumption indicator compound concentrations observed in wastewater to estimate the number of overdoses and overdose deaths from the chemical measurements. These estimated opioid-related overdoses and deaths were then compared to coroner data from the two cities for opioid-related overdose deaths to check for method accuracy – opioid-related overdose information was not available for either city so this comparison could not be attempted. The black-market value of heroin was calculated by comparing the observed mass load of heroin to its street value (NBC 2017).

2.7 Statistical analysis

Statistical analysis of the data was performed with a combination of Microsoft Office suite products, Analyst 1.5 software (Applied Biosystems, Framingham, MA, USA), JMP Pro 12.1.0 (SAS, Phoenix, Arizona), and IBM SPSS 25 (IBM, Armonk, NY). Normality of the datasets was determined through two analyses run in IBM SPSS 25; (1) an analysis of skewness and kurtosis z -values, and (2) the Shapiro-Wilk test for normality. Following previously outlined WBE statistical testing (Brewer et al. 2016, Tschärke et al. 2016), two-tailed t -tests were used for comparison of parent-metabolite excretion rates, as well as opioid concentrations in raw wastewater between study locations.

3. Results and discussion

3.1 Method performance

Method detection limits (MDLs) for the various opioids and metabolites ranged between 0.3 and 1.1 ng/L (SI Table S4, Figures S1–S11), data that were in line with previous U.S. studies (Heuett et al. 2015, Subedi and Kannan 2014). All MDLs were determined based on EPA guidelines described in 40 CFR 136, Appendix B (EPA 1986). Potential loss of opioids and metabolites from wastewater during sample extraction was corrected for by using labeled internal standards and the isotope dilution method. Absolute and relative recoveries from 10-sample matrix spike experiments for the various analytes averaged 85% (range: 66%–104%) and 114% (range: 91%–139%) (SI Table S5), respectively. Analysis precision expressed as relative percent difference (RPD) for non-blinded duplicates of composite wastewater samples averaged $\pm 30\%$ (range: 1%–200%). A detailed explanation of procedures to experimentally determine recovery rates is available in the supporting information (Section S-1.1).

3.2 Concentrations of opioids and metabolites in raw wastewater

Opioid parent compounds were identified in composite wastewater samples for each city once per month from March 2015 to April 2017 (SI Table S6). Ratios of concentrations in raw wastewater (in ng/L) of the parent drug and its metabolite compounds were observed to be similar across both cities (Figure S12). Morphine concentrations in raw wastewater were determined to be 713 ± 38 ng/L (City 1) and 306 ± 29 ng/L (City 2), and morphine-3-glucuronide concentrations in raw wastewater were determined to be 7.0 ± 2.5 ng/L (City 1) and 7.6 ± 1.8 ng/L (City 2). Morphine presence in wastewater can be attributed to consumption of morphine (Hasselström and Säwe 1993), consumption of heroin (Cone et al. 1993), consumption of codeine (Vree and Wissen 1992), or as result of narcotic disposal (Daughton and Ruhoy 2009). Further analyte degradation (Skopp et al. 2001) and metabolization in the sewer system is likely and may influence parent-metabolite ratios (O'Brien et al. 2017). The discrepancy between the morphine parent and metabolite concentrations in raw wastewater suggest that the morphine concentrations are influenced by one of the alternative sources of morphine occurrence in wastewater and could suggest illicit drug use. Average concentrations in raw wastewater of codeine were determined to be 322 ± 37 ng/L (City 1) and 100 ± 27 ng/L (City 2); average concentrations in raw wastewater of oxycodone were determined to be 17.8 ± 1.1 ng/L (City 1) and 78 ± 6 ng/L (City 2); the codeine metabolite norcodeine concentrations were determined to be 162 ± 27 ng/L (City 1) and 48 ± 8 ng/L (City 2); observed noroxycodone concentrations were determined to be 73 ± 5 ng/L (City 1) and 105 ± 7 ng/L (City 2). Both codeine and oxycodone showed similar detection frequencies for both parent and metabolite compounds.

Average concentrations in wastewater of heroin were determined to be 41 ± 16 ng/L (City 1), and 19 ± 11 ng/L (City 2), and observed fentanyl concentrations were found to be 1.7 ± 0.2 ng/L (City 1) and 1.0 ± 0.5 ng/L (City 2). The corresponding fentanyl metabolite norfentanyl concentrations were found to be 30 ± 2 ng/L (City 1) and 48 ± 2 ng/L (City 2), and 6-acetylmorphine concentrations were found to be 43 ± 15 ng/L (City 1) and 21 ± 3 ng/L (City 2). Both of these metabolites were detected at a higher frequency than their

respective parent compounds (Table 2). In both cities, concentrations of the fentanyl metabolite norfentanyl were significantly larger (2-times and 48-times) than the corresponding concentrations of parental fentanyl, a finding that potentially could be due to the previously observed rapid *in vivo* degradation and transformation of fentanyl following administration (Labroo et al. 1997).

Most opioids show a relatively consistent concentration pattern when compared over the two-year period. An exception of this is the dataset obtained for City 2 codeine concentrations from March 2015 – January 2016 where concentrations varied from 260 ng/L to below the method detection limit. This variation was not observed from June 2016 to March 2017 for City 2, but this observation lacks a definitive explanation. The concentration data was then converted to mass load data for further analysis outlined in the subsequent sections of this manuscript (Table S7, Figure S13).

3.3 Estimated opioid consumption

Opioid consumption (in mg/day/1,000 persons) was estimated from opioid mass loads (Table 3) and determined to be stable throughout the sampling campaign for all opioids (SI Table S8) aside from City 1's oxycodone consumption which showed a statistically significant increase (565%, p -value: <0.01) from the March 2015 – Jan 2016 to the June 2016 – March 2017 sampling periods. In order to compare estimated opioid consumption rates between the two cities, two tailed t-tests were computed for all available estimated opioid mass loads normalized to the contributing population at the $\alpha=0.05$ confidence interval. Population normalized mass loads for morphine in City 1 were found to be statistically higher (p -value = 0.048) than those observed in City 2, and this observation was also mirrored by the population-normalized mass load data for morphine-3-glucuronide data (p -value = 0.016). Population normalized mass loads for codeine in City 1 were also statistically higher (p -value = 0.0002) than those calculated for City 2, which was also mirrored by the metabolite norcodeine population normalized mass loads (p -value = 0.023). Calculated oxycodone mass loads normalized to the contributing population were determined to be statistically higher in City 2 (p -value = 0.00002) than those computed for City 1, which was again mirrored in the data computed for the metabolite noroxycodone (p -value = 0.0006). Interestingly, neither parent fentanyl (p -value = 0.734), the fentanyl metabolite norfentanyl (p -value = 0.155), nor the heroin metabolite 6-acetylmorphine (p -value = 0.629) showed any statistical differences between the two cities, which may inform on the possible uniformity of usage patterns of these black market specific narcotics within these two cities.

Estimated morphine consumption values ($2,590 \pm 157$ mg/day/1,000 persons, $1,970 \pm 255$ mg/day/1,000 persons) were in-line with other WBE values from a New York study (range: 1,610–2,240 mg/day/1,000 persons) (Subedi and Kannan 2014) but higher than international consumption estimates (range: 13.8–310 mg/day/1,000 persons) (Baker et al. 2014, Baz-Lomba et al. 2016, Tscharke et al. 2016, Vuori et al. 2014, Zuccato et al. 2008). Estimated morphine consumption from morphine-3-glucuronide (26 ± 8 mg/day/1,000 persons, 3.8 ± 1 mg/day/1,000 persons) was lower than estimated consumption values from the New York study, but in line with international studies conducted. Morphine excretion as a result of

codeine (0–15%) (Thorn et al. 2009) or heroin (7%) (Yeh et al. 1976) consumption likely influenced wastewater morphine concentrations (Cone et al. 1993, Cone et al. 1991), and suggest that a stable morphine specific metabolite would be preferable for morphine consumption estimations.

Codeine consumption estimated from parent codeine was 2-times higher in City 1 (204 ± 13 mg/day/1,000 persons) compared to City 2 (102 ± 21 mg/day/1,000 persons), and oxycodone consumption estimated from parent oxycodone was nearly 8-times higher in City 2 (556 ± 89 mg/day/1,000 persons) compared to City 1 (72 ± 12 mg/day/1,000 persons). When compared to a multi-regional U.S. study, oxycodone consumption estimates for City 1 were in-line with other U.S. consumption estimates (U.S. range: 8–170 mg/day/1,000 persons) (Chiaia et al. 2008), but estimates for City 2 were significantly higher than previously reported values. When compared to international studies, oxycodone consumption estimates were higher across both cities (international range: 20–50.5 mg/day/1,000 persons) but codeine consumption estimates were in-line with international studies (international range: 164–927 mg/day/1,000 persons) (Tscharke et al. 2016, Vuori et al. 2014). Using norcodeine for consumption estimation purposes resulted in higher codeine consumption estimations across both cities (8-times higher) compared to parent codeine which resulted in U.S. consumption estimation exceeding international values. This observation was not mirrored with the noroxycodone:oxycodone relationship, as both values provided similar results (RPD: 53–60%).

Heroin consumption estimates obtained from the metabolite 6-acetylmorphine ($1,294 \pm 296$ mg/day/1,000 persons, $1,127 \pm 163$ mg/day/1,000 persons) were between 10 to 281 times higher than other estimated consumption values obtained from literature (range: 4.6–115 mg/day/1,000 population) (Heuett et al. 2015, Tscharke et al. 2016). This suggests that heroin consumption within these two midwestern cities may exceed both international and U.S. estimated use rates. While only one study has reported positive detection of fentanyl and its metabolite in U.S. wastewater (Gushgari et al. 2018), the estimated consumption unearthed by this analysis from both fentanyl (10 ± 1.2 , 9 ± 2.7 mg/day/1,000 persons) and norfentanyl (18 ± 7 , 47 ± 18 mg/day/1,000 persons) are still higher than data published in a Southwestern campus study (REF and range) and the average fentanyl consumption (0.5 mg/day/1,000 persons) estimated by WBE data from Adelaide, South Australia (Tscharke et al. 2016). While fentanyl concentrations were consistently the lowest of any analyte detected in this study, any detectable presence of synthetic fentanyl or its analogs should be considered significant due to the strength of the opioid (Donner et al. 1996), its prevalence in opioid-related fatalities (CDC and University 2017), and its ties to the illicit drug trade (CDC 2016). Furthermore, this study has identified the first frequent detections of fentanyl (DF: 62%) and norfentanyl (DF: 100%) in U.S. wastewater which is necessary for comparison purposes of future U.S. opioid-related wastewater epidemiological work. Population normalized mass load data was then converted to dose-estimated data for further data analysis of user count and estimated overdose-deaths (Table S9).

3.4 User count, estimated overdose-deaths, and monetary black-market contribution

The number of heroin addicts within the two study locations were estimated at 3,400 (city 1) and 1,000 (city 2) persons. Considering the national average of 0.21% current habitual heroin users (SAMHSA 2013) these values are 1,135% and 982% higher than the calculated expectancy. These values were 61% and 41% higher than the national average of lifetime heroin use of 1.6% (Martins et al. 2017). The number of codeine users were determined to be 3,600 (city 1) and 600 (city 2) persons. Oxycodone users were determined to be 800 (city 1) and 660 (city 2) persons. Number of morphine users estimated from parent morphine were determined to be 5,600 (city 1) and 1,500 (city 2) persons but does not account for morphine occurrence due to heroin or codeine consumption. A cost estimate for black-market heroin consumption was also attempted for the two cities, with the average street value of heroin estimated to be \$240/gram (NBC 2017). This analysis resulted in annual black-market contributions of \$1.14 million (city 1) and \$990 thousand (city 2) from heroin users. These estimates may be overly conservative, as a city with 100,000 individuals and a 0.21 addict rate could theoretically exceed an annual black-market contribution of 11.5 million USD from heroin alone. Cost estimations for the remainder of the opioids were not attempted due to uncertainties with rates of medical vs. nonmedical use, and uncertainties in pharmaceutical vs. black market costs.

For the first time in literature wastewater epidemiological data was used to forecast the number of opioid-related overdose and deaths expected given the concentrations of opioid consumption indicator compounds observed. The number of estimated heroin users were compared to state opioid overdose death data to estimate the number of expected heroin and prescription opioid overdoses. Data obtained from state opioid dashboards suggested that on average one thousand estimated daily heroin users translated to an estimated 3.4 heroin overdose deaths and 18.3 heroin related overdoses. Consequently, one thousand estimated daily synthetic opioid users translated to an estimated 1.8 synthetic opioid overdose deaths and 9.4 synthetic opioid related overdoses.

From this analysis 12 heroin attributable deaths, 62 attributable heroin overdoses, 18 synthetic opioid attributable deaths, and 94 synthetic opioid attributable overdoses were estimated for City 1. City 2 was estimated to incur 4 heroin attributable deaths, 18 attributable heroin overdoses, 5 synthetic opioid attributable deaths, and 26 synthetic opioid attributable overdoses. When compared to reported coroner data, the estimated attributable death counts of both cities were within 30% of the true number identifying a similarity between the statistics unearthed through this analysis and municipal data. The estimated opioid-related overdose deaths calculations performed here considered the opioids heroin and fentanyl, which could have contributed to the lower estimation across both communities. This suggests that WBE data may also be used as a tool to forecast overdoses and deaths based upon narcotic indicators found in wastewater, furthering the value of wastewater analytical data to government and health personnel.

3.5 Study Limitations

While narcotic use and trend data collection via wastewater monitoring has been shown a viable tool both domestically and internationally (Baker et al. 2012, Kankaanpää et al. 2014,

Subedi and Kannan 2014), there are shortcomings which factor in a level of uncertainty within the analysis. The most robust data that can be obtained from wastewater monitoring are analyte concentrations in raw wastewater (mass per volume) and daily mass loads (mass per day). These sources of data are subject to the smallest source of possible error mainly stemming from analyte degradation in-sewer and during sample collection but also limit the knowledge that can be obtained from the dataset without further analysis. Previous literature has reported WBE data through usage statistics (in mass or doses per day per population) (Lai et al. 2013, Zuccato et al. 2008), monetary units (black market or overall economic impact) (Zuccato et al. 2011), and health statistics (attributable users, overdoses, or overdose deaths) (Terzic et al. 2010), but these analyses likely increase the associated error. Variations in individual narcotic mass usage (Harocopos et al. 2016, Warner et al. 2016), pharmacokinetic metabolization and narcotic excretion rates (Andes and Craig 2002, Cone et al. 1993, Jenkins et al. 1994, Schwartz 2003), and the extent of in-sewer analyte degradation and/or metabolization/hydrolyzation by fecal bacteria present in untreated wastewater (Postigo et al. 2011) can have a marked effect on estimating drug use statistics from WBE data. This phenomenon has been thoroughly proven with respect to morphine-3-glucuronide (van Nuijs et al. 2011a), and may account for the low concentrations observed with respect to observed morphine concentrations at both locations. It should also be noted that the use of 6-Acetylmorphine for estimation of heroin consumption has been shown to produce higher values of estimated heroin consumption, and therefore the results presented in this manuscript for heroin consumption may constitute overestimations (EMCDDA 2016). While these observations certainly have an impact on results obtained through this method, the alternative use of morphine as an indicator compound is also associated with certain limitations which factor a great deal of uncertainty into WBE analyses. Therefore, instead of abandonment of 6-AM as a heroin indicator compound, it would be more advantageous for the field to fine-tune the parameters used in 6-AM estimations in order to make estimations from this compound more robust. Analysis of specific narcotics with various limiting factors such as low urinary and fecal excretion profiles or rapid *in/ex vivo* degradation may provide additional challenges for the quantification of certain narcotics in wastewater.

The use of time-weight samplers and the sampling frequency used in this study also constitutes limitations. The use of time-weighted sampling will not account for the diurnal wastewater flow patterns which could result in an underrepresentation of narcotic concentrations in raw wastewater. Due to budgetary constraints participating WWTP operators opted to sample for one randomly selected weekday 24-hour period per month. While this frequency of sampling can provide insights into long-term trends, annual averages, and baseline usage patterns obtaining more intricate trend analyses of the data (i.e. variation in weekly use trends) is not possible. An ideal study would sample for a set number of consecutive days throughout a longer timeframe to obtain data for both short and long-term drug use trends, and administration of self-reporting surveys for comparison purposes (Heuett et al. 2015, Moore et al. 2014). Similar to previous wastewater-based epidemiology studies the particulate phase of collected wastewater was not analyzed for narcotic indicators which could result in the underestimation of observed total consumption within these communities. Large relative percent differences observed for some samples as well as increase in parent oxycodone observed for City 1 between the two sampling

campaigns could have been impacted by analyte sorption on storage containers and sampling equipment, in-sewer analyte degradation, matrix interference, and analysis system losses - but the lack of analyte detection and internal standard loss within process and method blanks suggest this is unlikely. While these factors contribute a level of uncertainty in this analysis data derived from these methods should still be considered a powerful analytical tool and considered alongside additional viable methods of data collection that are currently implemented within municipal communities.

4.0 Conclusion

The results of this study indicate that the observed higher opioid consumption in the United States is reflected in opioid analyte concentrations observed in U.S. wastewaters, which have produced some of the highest opioid consumption estimations presented in WBE literature. Implementing WBE monitoring within a community requires minimal adjustment to wastewater infrastructure but would result in pertinent information related to opioid use. This study also provides the first reported U.S. occurrence of fentanyl and its metabolite norfentanyl in wastewater in published literature. Screening for fentanyl and its metabolites should be viewed as a mandatory practice in future U.S. WBE studies due to the association between fentanyl and the rise in opioid-related fatalities in the United States (Warner et al. 2016). This study has also shown that WBE results could be further used to forecast opioid-related overdose and deaths attributable to a measurable concentration of drug analyte within wastewater. While the WBE process may be subject to some uncertainty the technology remains a valuable analytical tool to be used alongside current data acquisition approaches by providing location specific wastewater-based epidemiological data in near real-time.

With the continued increase in national overdose-deaths due to the ongoing opioid crisis, and other health related crises such as the resurgence of methamphetamine consumption, the value of wastewater-based epidemiological data to cities and communities has never been higher. In order to make true change within our communities, community leaders and stakeholders need access to the most up-to-date and pertinent information possible – a need which can be, in part, fulfilled through routine wastewater monitoring for chemical and biological indicators of public health concern. This sentiment has started to be reflected through municipal action, most notably through the recent partnership between the City of Tempe and Arizona State University (Pineda 2019), but the vast majority of municipalities within the United States still do not employ this valuable technology. If WBE were to experience national implementation, public health officials and stakeholders would be able to understand the impact of their decisions on the community much quicker than currently possible, and would also be able to address shortcomings of said education and policy implementation – reducing the significant time and monetary input normally associated with these campaigns, ultimately leading to a healthier community and more lives saved.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

Acknowledgements

The authors of this study would like to thank the participating municipalities for their participation.

7.0 Funding Source Disclosure

This project was supported in part by Award Number R01ES020889 from the National Institute of Environmental Health Sciences (NIEHS) and by award LTR 05/01/12 of the Virginia G. Piper Charitable Trust. The content is solely the responsibility of the authors and does not necessarily represent the official views of the sponsors.

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Highlights

- Two-year WBE study of opioid use in the American Midwest.
- Analysis of cities with known and identified opioid abuse problems.
- First estimation of overdoses and deaths from WBE data.
- First routine detection of fentanyl and norfentanyl in U.S. wastewater.

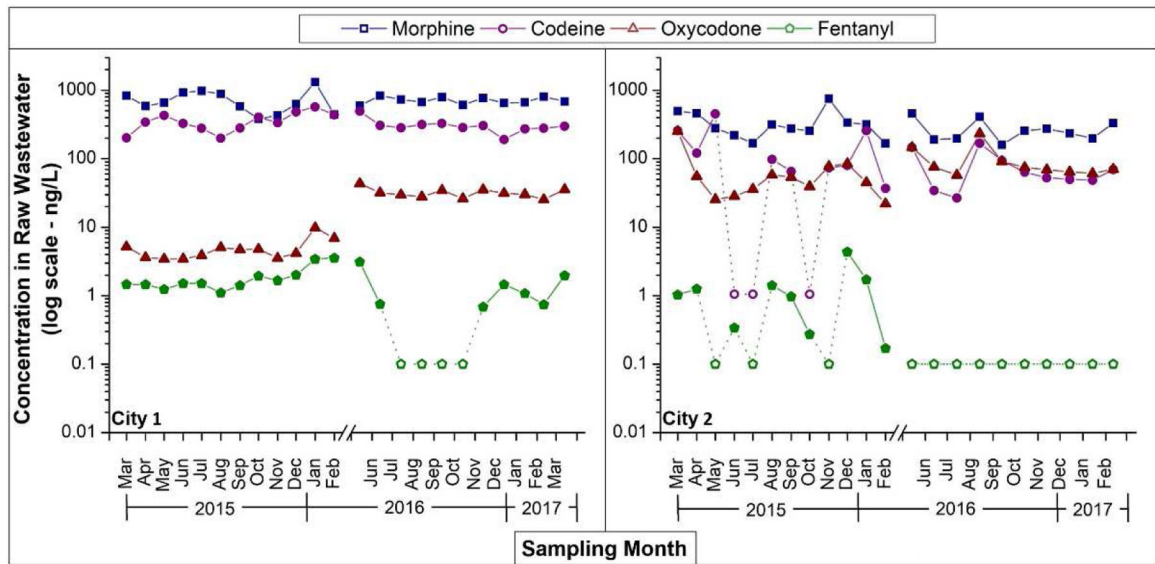


Figure 1. Parent opioid concentrations determined in 24-hour time-weighted composite wastewater samples for the two cities over the sampling campaign from March 2015 to April 2017. Non-detects are represented by empty symbols within the graph. Months within the sampling campaign where samples were not received are not represented.

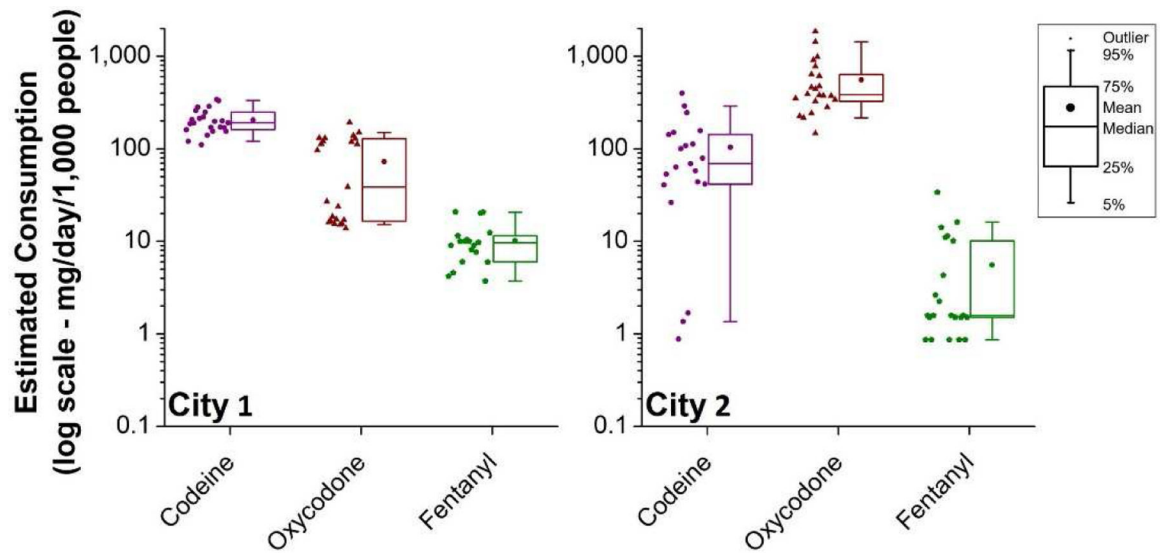


Figure 2.

Estimation of per-capita consumption values for codeine, oxycodone and fentanyl derived from opioid parent compound analysis. Populations were estimated by population served by the wastewater treatment plants, and correction factors used are listed in Table 1. Per-capita consumption estimations are a factor of the observed concentration, wastewater flow, estimation of number of contributing residents, and correction factors based upon excretion rates and pharmacokinetic data.

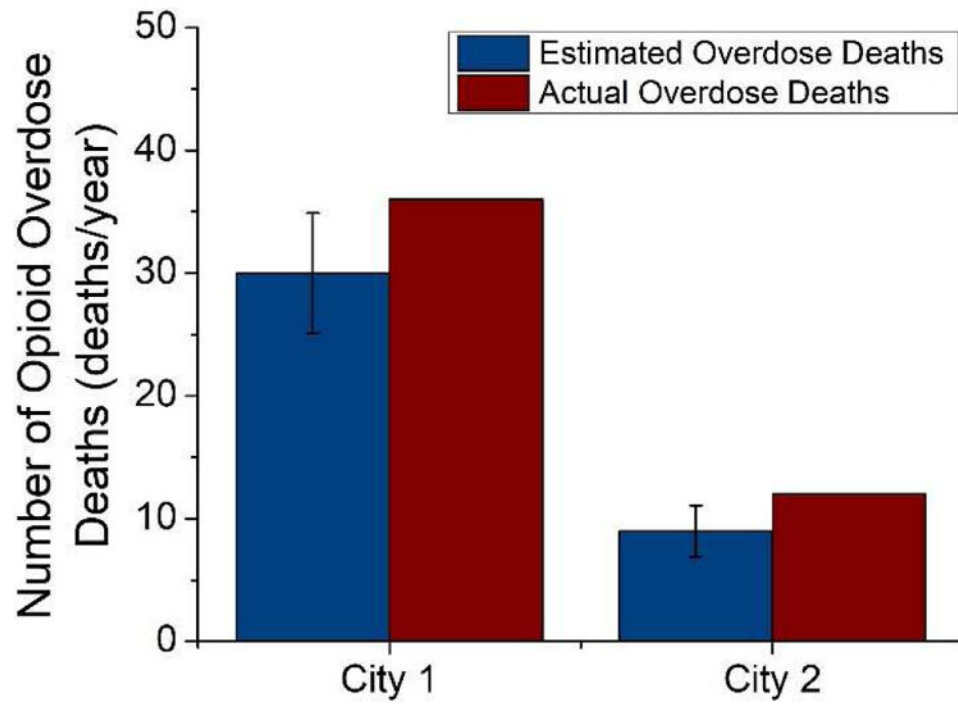


Figure 3. Estimated and actual opioid-related overdose deaths for the two cities. Actual overdose statistics were obtained from state coroner data for confirmed opioid-related fatalities.

Table 1 -

Opioid narcotics, respective consumption indicator compounds, excretion rate of respective consumption indicators, correction factors used for each consumption indicator, and average prescribed oral dose per opioid per Mayo Clinic doctor guidelines.

Drug	Consumption Indicator	Excretion Rate (%)	Correction Factor	Average Dose (mg)
Morphine	Morphine	10 ^a	10.0	30 ^g
	Morphine-3-Glucuronide	75 ^a	0.8	
Codeine	Codeine	57.5 ^b	1.7	30 ^g
	Norcodeine	3.77 ^c	27.8	
Oxycodone	Oxycodone	8.9 ^d	11.2	10 ^g
	Noroxycodone	22.1 ^d	4.7	
Fentanyl	Fentanyl	6 ^e	16.7	0.1 ^g
	Norfentanyl	91.08 ^e	1.6	
Heroin	Heroin	n/a	n/a	30 ^g
	6-Acetylmorphine	1.3 ^f	86.8	

^aHasselström, Jan, and Juliette Säwe. "Morphine pharmacokinetics and metabolism in humans." *Clinical pharmacokinetics* 24.4 (1993): 344–354.

^bThai, Phong K., et al. "Refining the excretion factors of methadone and codeine for wastewater analysis—Combining data from pharmacokinetic and wastewater studies." *Environment international* 94 (2016): 307–314.

^cLafolie, Pierre, et al. "Urine and plasma pharmacokinetics of codeine in healthy volunteers: implications for drugs-of-abuse testing." *Journal of analytical toxicology* 20.7 (1996): 541–546.

^dLalovic, Bojan, et al. "Pharmacokinetics and pharmacodynamics of oral oxycodone in healthy human subjects: role of circulating active metabolites." *Clinical pharmacology & therapeutics* 79.5 (2006): 461–479.

^eLabroo, Rita B., et al. "Fentanyl metabolism by human hepatic and intestinal cytochrome P450 3A4: implications for interindividual variability in disposition, efficacy, and drug interactions." *Drug Metabolism and Disposition* 25.9 (1997): 1072–1080.

^fPostigo, Cristina, Miren López de Alda, and Damià Barceló. "Evaluation of drugs of abuse use and trends in a prison through wastewater analysis." *Environment international* 37.1 (2011): 49–55.

^gMayo Clinic Guidelines

Table 2 -

Detection frequency, average analyte concentrations in raw wastewater \pm standard deviations (SD), and concentration range per opioid consumption indicator of all sample concentrations.

Consumption Indicator	Frequency of Detection (%)	Concentration (ng/L)	
		Average \pm SD	Range
Morphine	100 (<i>n</i> =45)	514 \pm 268	159 – 1,310
Morphine-3-glucuronide	90 (<i>n</i> =21)	7.3 \pm 6.6	<MDL - 26
Codeine	93 (<i>n</i> =45)	218 \pm 154	<MDL - 571
Norcodeine	95 (<i>n</i> =21)	107 \pm 90	<MDL - 397
Oxycodone	100 (<i>n</i> =45)	47 \pm 52	3 – 251
Noroxycodone	100 (<i>n</i> =21)	88 \pm 34	47 – 171
Fentanyl	62 (<i>n</i> =45)	1 \pm 0.9	<MDL - 4.4
Norfentanyl	100 (<i>n</i> =21)	38 \pm 49	11 – 198
Heroin	81 (<i>n</i> =21)	27 \pm 30	<MDL - 120
6-Acetylmorphine	100 (<i>n</i> =21)	32 \pm 28	7 – 115

Table 3 -

Average \pm standard error, minimum, and maximum analyte population normalized mass load consumption across the two cities.

City 1			
Analyte	Average Concentration	Minimum Concentration	Maximum Concentration
	<i>all concentration in mg/day/1,000 population</i>		
Morphine	2,590 \pm 157	1,170	4,603
Oxycodone	72 \pm 12	14	192
Codeine	204 \pm 13	111	341
Fentanyl	10 \pm 1.2	4	21
Morphine-3-Glucuronide	26 \pm 8	<MDL	103.8
Noroxycodone	124 \pm 6	105	171
Norcodeine	1,630 \pm 284	169	4,169
Norfentanyl	18 \pm 7	7	87
6-Acetylmorphine	1,294 \pm 296	441	3,257
City 2			
Analyte	Average Concentration	Minimum Concentration	Maximum Concentration
	<i>all concentration in mg/day/1,000 population</i>		
Morphine	1,970 \pm 255	974	6,754
Oxycodone	556 \pm 89	147	1,859
Codeine	102 \pm 21	0.9	398
Fentanyl	9 \pm 2.7	0.9	34
Morphine-3-Glucuronide	3.8 \pm 1	<MDL	11.5
Noroxycodone	300 \pm 35	128	487
Norcodeine	790 \pm 180	<MDL	1,726
Norfentanyl	47 \pm 18	10	191
6-Acetylmorphine	1,127 \pm 163	404	1,844