

# High-Risk Geographic Mobility Patterns among Young Urban and Suburban Persons who Inject Drugs and their Injection Network Members

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Abstract Young people in the USA who inject drugs, particularly those at a risk of residence instability, experience the highest incidence of hepatitis C (HCV) infections. This study examined associations between geographic mobility patterns and sociodemographic, behavioral, and social network characteristics of 164 young (ages 18-30) persons who inject drugs (PWID). We identified a potential bridge sub-population who reported residence in both urban and suburban areas in the past year (crossover transients) and higher-risk behaviors (receptive syringe sharing, multiple sex partners) compared to their residentially localized counterparts. Because they link suburban and urban networks, crossover transients may facilitate transmission of HIV and HCV between higher and lower prevalence areas. Interventions should address risk associated with residential instability, particularly among PWID who travel between urban and suburban areas.

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### Introduction

In the USA, alarming increases in injection drug use (IDU) [1, 2] and hepatitis C virus (HCV) infection incidence [3–7] are occurring among young persons who inject drugs (PWID) from non-urban communities [4, 8–14]. IDU is a well-established risk factor for HIV and the primary mode of HCV transmission in developed countries [15]. Until recently, young PWID from non-urban areas, a population predominantly composed of non-Hispanic (NH) whites, generally exhibited low to modest incidence and prevalence of HIV and HCV infection [16-18], despite engaging in high levels of risky injection practices [4, 5, 9, 10, 12, 19]. This disjunction between risk behavior and HIV/HCV infection status was likely due to social and environmental factors that minimized the likelihood of having an infected partner [16]. Recent trends suggest that these protections are eroding, particularly for hepatitis C, with high incidence and outbreaks of HCV infection are now common among non-urban PWID, with the highest rates observed among those aged 20-29 years [3-5]. High levels of risky injection and sexual behaviors [20, 21] and sexually transmitted infections (STIs) [22] are also common among PWID, who report more sex partners, greater likelihood of trading sex for money or drugs, and less consistent condom use than their nondrug-using counterparts [23]. Understanding the individual, social, and geographic factors that promote high-risk partner contact is imperative for developing targeted HIV/HCV interventions for the emerging population of young PWID.

Geographic mobility has important implications for HIV/HCV risk and prevention among PWID. Previous studies have examined various aspects of mobility, including homelessness, residential transience (i.e., having multiple residences over a short period), and travel distances (e.g., to drug markets) on HIV/HCV risk. Studies have consistently linked residential instability with high-risk behaviors (e.g., syringe sharing and exchanging sex for drugs or money) and HIV infection [24-28]. Residential instability may disrupt control of one's physical environment, fosters use of high-risk strategies to accomplish goals or acquire resources (e.g., injecting in public spaces, syringe sharing, and exchanging sex for drugs or money), and alters social networks (e.g., size, and member characteristics) over time. These factors are all plausible mechanisms for the link between residential instability, high-risk behaviors, and HIV/HCV infection. Among the emerging population of young, predominantly non-urban PWID, little is known about residential transience and directional movement between urban and suburban areas on HIV/ HCV risk. Residential transience could conceivably augment HIV/HCV transmission by bridging populations (e.g., older infected and younger uninfected) and regions of high and low prevalence (e.g., urban and suburban). Thus, understanding patterns of residential transience and associated risk is important to develop effective interventions targeted to this population.

Our study seeks to characterize mobility patterns, including residential transience and directional movement, and their association with sociodemographic, behavioral, and injection network characteristics and behaviors of young PWID from both urban and surrounding suburban areas of Chicago, Illinois, USA.

# Methods

#### Subjects and Recruitment

We conducted a cross-sectional personal (egocentric) network study of 164 young PWID and their injection, social support, and sexual networks. Detailed descriptions of sample recruitment, study design, and data collection methods are previously described [29, 30].

Briefly, we recruited participants via flyers posted at four standalone field sites in Chicago located near major heroin and cocaine markets that attract both urban and suburban drug users, as well as at other venues that provide services to PWID in these areas. All individuals responding to posted flyers were directed to on-site research staff for eligibility screening during regular hours of operation between September 2012 and June 2013. Most participants were registered members of a large Chicago syringe services program (SSP) that operated out of the four field sites and a mobile unit. To be eligible for the study, individuals had to be between the ages of 18 and 30 and have injected drugs at least once in the past 30 days.

Trained research staff conducted personal interviews with participants to collect sociodemographic information, self-reported HIV and HCV status, drug and sexual behaviors for the past 6 months, and geographic data on the location and characteristics of places where they resided, purchased drugs, injected drugs, and met sex partners in the past year. Participants also provided similar data on each of their core injection network members, defined as up to 10 individuals they injected most often with in the past 6 months. All participants provided written informed consent. The study was approved by the Institutional Review Board of the University of Illinois at Chicago.

# Measures

*Sociodemographic Measures* These included gender, age, race/ethnicity, education, employment, place of birth, and homelessness, defined as living on the street or in a shelter at any time during the past 6 months.

Drug use, Sexual Behaviors, and HIV/HCV Infection Status Participants reported on drug use type (e.g., heroin, crack), mode of administration (e.g., smoking, snorting, injection), and length of drug use (e.g., years injecting drugs). Participants also reported on injectionrelated risk practices, including frequency of injections per day, injecting with others, sharing syringes or injection paraphernalia (e.g., cotton, cooker, rinse water), syringe-mediated sharing (backloading), and source of syringes (e.g., SSP, street). Participants also provided data on their sexual behaviors, including number, gender, and type (e.g., steady or casual) of sexual partners, condom use with steady and casual sex partners, and exchanging sex for drugs or money. Participants selfreported HIV and HCV infection status, many of whom reported getting tested in the prior year as part of an onsite free service provided to all PWID, regardless of participation in the study.

Geographic Measures Participants provided the locations (cross-streets, town, state) of all places where they resided, purchased drugs, injected drugs, and met sex partners in the past year. Informed by a substantive body of research among Chicago PWID in the past 30 years [16, 29, 31–35] along with published data on heroin and cocaine police arrest locations for Illinois [36], we used conservative street boundaries to define the three primary drug market areas located within Chicago city limits. We named these the West, South, and Southeast drug markets to correspond to the region of the city where each was located. We assessed movement distance for subjects with multiple residences in the past year, defined as the average distance between residences. For the primary outcome, we constructed three measures of geographic mobility. First, a binary measure of residential transience, defined as having more than one residence in the past year, regardless of location. Second, a threecategory indicator variable termed residential movement that assessed whether PWID remained within the same geographic boundaries (urban or suburban Chicago), regardless of number of residences, or moved between geographic areas in the past year. For residential movement, participants were grouped into (i) urban, i.e., having  $\geq 1$  residence exclusively within the Chicago city limits (referent category); (ii) suburban, i.e., having  $\geq 1$ residence exclusively in suburban areas surrounding Chicago; or (iii) crossover, i.e., having  $\geq 1$  residence in urban and  $\geq 1$  residence in suburban areas in the past year. Third, among participants who reported transience (n = 96), we assigned a variable termed *bridging tran*sience that compared localized transience (i.e., having multiple residences in the same type of area) to crossover transience (i.e., category iii in residential movement).

*Injection Network Measures* Participants also provided data by proxy on their core injection network (i.e., those they injected most often with in the past 6 months), including sociodemographic characteristics, risk behaviors, residential transience, residential movement, bridging transience, homelessness, and perceived HIV and HCV infection status. In addition, participants reported on their relationship with each network member, including engagement in injection-related (e.g., syringe sharing) and sexual behaviors. Summary network measures (e.g., size, proportion reporting syringe sharing) were calculated by summarizing across all injection partnerships reported by the participant.

# Statistical Analysis

We compared sociodemographic characteristics, injection practices, and network features by residential movement using Pearson chi-square tests for categorical variables and Kruskal-Wallis tests for continuous variables. We used multivariable logistic regression to identify factors associated with residential transience and bridging transience and multinomial logistic regression to examine factors associated with residential movement. For all models, we entered all variables that were p < 0.2 in univariable analysis as well as those deemed conceptually important in multivariable models and removed non-significant variables one by one in an iterative process to build a parsimonious final model. We included gender, age, and race/ ethnicity in all multivariable models regardless of statistical significance to compare to prior studies and to control for residual confounding. We conducted inferential statistical analyses using STATA/SE version 14 for Windows (STATA Corp, College Station, TX).

We also performed geographic analyses using Python (Python Software Foundation, Beaverton, OR) and R version 3.2 using the spatstat package. We geocoded geographic locations for analysis using the Google Geocoding API with GeoPy (Google, Mountainview, CA) and categorized them based on whether they were within the Chicago city limits (urban) or in the surrounding areas (suburban), and according to whether or not they were within the boundaries of the largest drug market area (West Side). We created maps to visualize relationships among residence, drug market areas, injection, and sex partner meeting locations (Fig. 1). We used logistic regression models with generalized estimating equations (GEE) to compare injection and sex partner meeting locations (urban/suburban and within the West Side drug market) by residential movement status.

# Results

Participant characteristics by residential movement status are shown in Table 1. Among those who reported residence for the past year (n = 163,



**Fig. 1 a–c** Places where young **a** urban (n = 59), **b** suburban (n = 60), and **c** crossover (n = 44) PWID resided, purchased drugs, injected drugs, and met sexual partners in the past year. Urban was defined as having  $\geq 1$  residence(s) exclusively within the Chicago city limits; suburban was defined as having  $\geq 1$  residence(s)

exclusively in the suburban areas surrounding Chicago; and crossover was defined as having  $\geq 1$  residence(s) in urban and  $\geq 1$ residence(s) in suburban areas in the past year. Maps include multiple locations per person

99.4%), 37.0% were suburban (i.e., having  $\geq 1$  residence exclusively in the suburban areas surrounding Chicago), 27.0% were urban (i.e., having  $\geq 1$  residence exclusively within the Chicago city limits), and 36.0% were crossover (i.e., having  $\geq 1$  residence in Chicago and  $\geq 1$  residence in Chicago suburbs). Compared to urban and suburban PWID, crossover participants were significantly more likely to report, in the past 6 months, homelessness (81.4%), smoking crack (70.5%), backloading (42.9%), receptive syringe

sharing (45.2%), and having 2 or more sex partners (54.6%) (p < 0.05 for all comparisons). Crossover participants were also significantly more likely than their localized counterparts to report sharing syringes with their network (p < 0.01). Compared to others, urban participants were significantly (p < 0.05) more likely to be older and to report an urban place of birth and least likely to report injecting with others, receptive syringe sharing, and syringe sharing with their network (Table 1).

Table 1	Participant cha	racteristics by	residential	movement	status in	the past year
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	Suburban <i>n</i> = 60 (37.0%)	Crossover <i>n</i> = 44 (27.0%)	Urban <i>N</i> = 59 (36.0%)	p value <sup>a</sup>
Age				
18–24 25–30	25 (41.7) 35 (58.3)	16 (36.4) 28 (63.6)	12 (20.3) 47 (79.7)	0.037
Gender				
Male Female	37 (61.7) 23 (38.3)	28 (63.6) 15 (34.1)	40 (69.0) 18 (31.0)	0.494
Transgender	0 (0.0)	1 (2.3)	0 (0.0)	
Race/ethnicity				
NH White Hispanic	45 (75.0) 9 (15.0)	33 (75.0) 7 (15.9)	39 (66.1) 9 (15.3)	0.587
NH Black/other	6 (10.0)	4 (9.1)	11 (18.6)	
Educational attainment				
Less than high school High school diploma	20 (33.3) 20 (33.3)	9 (20.5) 20 (45.5)	15 (25.4) 30 (50.9)	0.278
Any college	20 (33.3)	15 (34.1)	14 (23.7)	
Place of birth <sup>c</sup>				
Urban Chicago Suburban Chicago	4 (9.8) 31 (75.6)	5 (19.2) 19 (73.1)	22 (59.5) 10 (27.0)	<0.001
Out of state	6 (14.6)	2 (7.7)	5 (13.5)	
Regular job	29 (48.3)	21 (47.7)	22 (37.3)	0.411
Homeless in past 6 months	19 (32.2)	35 (81.4)	30 (50.9)	< 0.001
Self-reported HCV positive	5 (8.3)	7 (15.9)	3 (5.1)	0.164
Years injecting, median (IQR)	5.5 (3-8)	5.5 (3-8.5)	6 (3–9)	0.423
Drug and sexual risk behaviors, past 6 months				
Smoked crack	21 (35.0)	31 (70.5)	26 (44.1)	0.001
Poly-injection drug use	18 (30.0)	19 (44.2)	17 (29.3)	0.224
Backloading	13 (21.7)	18 (42.9)	11 (19.0)	0.016
Receptive syringe sharing	18 (30.0)	19 (45.2)	11 (19.0)	0.018
Injected daily	46 (76.7)	33 (75.0)	51 (86.4)	0.272
Injections per day				
1	3 (5.0)	1 (2.3)	2 (3.4)	0.443
2-4	45 (75.0)	27 (61.4)	41 (69.5)	
≥5	12 (20.0)	16 (36.4)	16 (27.1)	
Frequency of injection with others	<i>c</i> (10.0)			0 0 <b>/</b> <del>-</del>
Never	6 (10.0) 26 (43 3)	5 (11.4) 30 (68 2)	10(17.0) 31(525)	0.047
Offen	28 (46 7)	9 (20 5)	18 (30.5)	
Exchanged sex for drugs or money	10 (16.7)	11 (25.0)	9 (15.3)	0.410
Total sex partners	10 (10.7)	11 (20.0)	) (10.5)	0.110
0	8 (13.3)	5 (11.4)	10 (17.0)	0.033
1	27 (45.0)	15 (34.1)	35 (59.3)	01022
≥2	25 (41.7)	24 (54.6)	14 (23.7)	
Geographic variables				
Total residences in the past year, median (IQR)	1 (1.0–2.0)	3 (2.5–4.5)	1 (1.0–3.0)	< 0.001
Purchased drugs $\geq 1$ on West Side	54 (94.7)	39 (95.1)	49 (87.5)	0.899

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#### Table 1 (continued)

	Suburban <i>n</i> = 60 (37.0%)	Crossover <i>n</i> = 44 (27.0%)	Urban <i>N</i> = 59 (36.0%)	p value <sup>a</sup>
Purchased drugs in multiple drug market areas	14 (24.6)	10 (24.4)	13 (23.2)	0.984
Inject in multiple locations	19 (33.3)	15 (35.7)	11 (20.0)	0.167
Inject drugs ≥1 in West Side drug market area	32 (56.1)	37 (88.1)	36 (65.5)	0.003
Proportion of total injection episodes in West Side drug market area	39.0%	62.8%	50.9%	<0.01
Average stay in days <sup>c</sup> , Median (IQR); <i>n</i>	310.3 (184–776.5); 25	160.3 (100.2–301.5); 39	232.2 (153.4–341.5); 28	0.004
Average movement distance in miles <sup>b</sup> , median (IQR); n	11.1 (3.1–46.8); 25	24.2 (13.1–64.3); 38	5.4 (2.7–568.0); 28	0.079
Change in distance from drug market <sup>b</sup> , median (IQR)	0 (-3.5, +2.5)	0.24 (-3.1, +5.7)	-0.12 (-2.2, +0.32)	0.718
Injection network variables				
Core injection network size, median (IQR) (n)	3 (2–5) [56]	3.5 (1–7.5) [40]	3 (2–5) [51]	0.599
Mean age of network members, median (IQR) $(n)$	27.3 (25.1–30.1) [56]	29.4 (24.3–33.0) [40]	30.7 (27–35.8) [51]	0.003
Proportion of network members homeless, median (IQR) ( <i>n</i> )	0 (0–0) [56]	0 (0–13%) [40]	0 (0–33%) [51]	0.079
Proportion of network members NH white race, median (IQR) ( <i>n</i> )	100% (69–100%) [56]	68% (45–100%) [40]	80% (50–100%) [51]	0.105
Any network member is crossover	11 (19.6)	15 (37.5)	19 (37.3)	0.077
Any network member is suburban	50 (89.3)	19 (47.5)	13 (25.5)	< 0.001
Any network member is homeless	7 (12.5)	14 (35.0)	17 (33.3)	0.015
Any member is HCV positive	12 (21.4)	7 (17.5)	10 (19.6)	0.892
Shared syringes with an injection network member	18 (32.1)	21 (52.5)	11 (21.6)	0.008

One individual was missing residence data; analysis based on n = 163

<sup>a</sup> Pearson chi-square or Wilcoxon rank-sum test

<sup>b</sup> Place of birth was only available for representative sample (n = 104; 63%)

<sup>c</sup> Among those with multiple residences

# Predictors of Residential Transience, Residential Movement, and Bridging Transience

In multivariable logistic regression, controlling for age, race/ethnicity, gender, and education, residential transience was associated with homelessness in the past 6 months, (adjusted odds ratio (aOR) = 9.67; 95% CI 3.81-24.5), self-reported HCV positivity (aOR = 5.41; 95% CI 1.18-24.7), receptive syringe sharing (aOR = 1.74; 95% CI 1.07-2.84), exchanging sex for drugs or money (aOR = 9.30; 95% CI 1.65-52.4), and having any network members that met the definition for crossover in the past year (aOR = 3.69; 95% CI 1.15-11.8) (Table 2).

Table 3 reports on factors associated with residential movement in multinomial regression and shows that, compared to urban participants, crossover participants were more likely to report receptive syringe sharing (aOR = 2.03; 95% CI 1.02–4.01), having 2 or more sex partners (aOR = 5.11; 95% CI 1.52–17.3), injecting at locations within the West Side drug market area (aOR = 6.05; 95% CI 1.24–29.5), and having at least one suburban network member (aOR = 1.95; 95% CI 1.12–3.38). Individuals with exclusively suburban versus exclusively urban residence were significantly younger, less likely to report homelessness in the past past 6 months, and more likely to have suburban network members(p < 0.05 for all comparisons).

Among those reporting residential transience (n = 96), we examined the potential association between factors listed on Table 2 and bridging transience. In univariable analysis, crossover transients were more likely than localized transients to report having been born in the suburbs (OR = 3.12; 95% CI: 1.00–9.70) and, in the past year, homelessness (OR = 2.74; 95% CI: 1.05–7.15), smoking crack (OR = 2.91; 95% CI: 1.24–

Table 2 Results of univariable and multivariable logistic regression: factors associated with residential transience, $n =$	147
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	Univariable OR (95% CI)	p value	Multivariable OR (95% CI)	p value
Age 25–30 vs. 18–24	0.72 (0.37–1.42)	0.346	0.95 (0.35–2.62)	0.925
Male gender	0.91 (0.47-1.77)	0.785	3.17 (1.08-9.32)	0.036
NH white race	1.23 (0.62–2.44)	0.556	0.89 (0.32-2.45)	0.820
Education (ref = less than HS)				
High school diploma	1.53 (0.71-3.30)	0.274	1.76 (0.45-6.86)	0.418
Any college	2.96 (1.25-7.01)	0.014	4.91 (1.25–19.3)	0.023
Suburban born <sup>a</sup>	0.99 (0.45-2.17)	0.975	_	_
Regular job	1.11 (0.59–2.08)	0.748	_	_
Homeless in past 6 months	6.42 (3.19–12.9)	< 0.001	9.67 (3.81-24.5)	< 0.001
Self-reported HCV positive	5.09 (1.10-23.5)	0.037	5.41 (1.18-24.7)	0.029
Years injecting	0.99 (0.91-1.07)	0.779	_	_
Drug and sexual risk behaviors, past 6 months				
Smoked crack	2.30 (1.21-4.39)	0.011	_	_
Poly-injection drug use	1.99 (0.99-4.01)	0.053	_	_
Backloading	2.76 (1.24-6.14)	0.013	_	_
Receptive syringe sharing	3.25 (1.50-7.01)	0.003	1.74 (1.07–2.84)	0.025
Injected daily	0.59 (0.26-1.35)	0.211	_	-
Injections per day (ref = $1$ )				
2–4	1.15 (0.22-6.00)	0.865	_	_
≥5	2.75 (0.48-15.6)	0.254	_	_
Frequency of injection with others (ref = never)				
Sometimes	2.37 (0.89-6.33)	0.086	_	_
Often	3.16 (1.11-8.98)	0.030	_	_
Exchanged sex for drugs or money	4.61 (1.66–12.8)	0.003	9.30 (1.65-52.4)	0.011
$\geq$ 2 Sex partners past 6 months	3.06 (1.53-6.11)	0.002	_	_
Geographic variables				
Drug markets in multiple places	1.63 (0.75-3.57)	0.218	_	_
Inject in multiple locations	1.88 (0.88–3.98)	0.101	_	_
Inject ≥1 in West side drug market area	1.06 (0.53-2.12)	0.870	_	_
Injection network variables				
Core injection network size	1.14 (1.01–1.28)	0.039	_	_
Any network member is suburban	0.94 (0.82-1.09)	0.434	_	_
Percent network NH white	0.45 (0.15-1.31)	0.141	-	_
Mean age of network members	0.99 (0.94-1.05)	0.761	-	_
Any network member is homeless	4.31 (1.66–11.2)	0.003	-	_
Any network member is crossover	5.02 (2.04–12.3)	< 0.001	3.69 (1.15–11.8)	0.028
Any network member reports syringe sharing	2.93 (1.34-6.41)	0.007	_	_
Any network member is HCV positive	2.23 (0.88-5.65)	0.090	-	-

<sup>a</sup> Place of birth was only available for representative sample (n = 104; 63%)

6.84), and injecting within the West Side drug market area (6.40; 95% CI: 2.15–19.1). However, in a multi-variable model that controlled for age, race/ethnicity, and gender (all p > 0.05), only two strong predictors of

bridging transience remained statistically significant: smoking crack (aOR = 3.62; 95% CI 1.16–11.3) and injecting within the West Side drug market area (aOR = 8.78; 95% CI 2.23–34.6).

	Suburban vs. urban aOR (95% CI)	p value	Crossover transient vs. urban aOR (95% CI)	p value
Age 25–30 vs. 18–24	0.27 (0.09–0.82)	0.021	0.42 (0.13–1.37)	0.151
Male gender	0.86 (0.29–2.57)	0.786	1.43 (0.44-4.64)	0.553
NH white race	2.06 (0.68-6.21)	0.200	1.22 (0.34-4.31)	0.763
Homeless in past 6 months	0.26 (0.08-0.82)	0.022	2.74 (0.79–9.47)	0.111
Receptive syringe sharing past 6 months	1.52 (0.84–2.75)	0.171	2.03 (1.02-4.01)	0.043
$\geq 2$ sex partners past 6 months	2.45 (0.82-7.31)	0.109	5.11 (1.52–17.3)	0.009
Inject drugs $\geq 1$ in West Side drug market area	0.63 (0.22-1.80)	0.387	6.05 (1.24–29.5)	0.026
Any network member is suburban	2.53 (1.51-4.24)	< 0.001	1.95 (1.12–3.38)	0.018

Table 3Multinomial logistic regression: factors associated with residential movement (including core drug-using network variables),N = 147

Estimates are adjusted for other variables presented. Models exclude one transgender individual. Seventeen observations were excluded due to missing data

aOR adjusted odds ratio

#### Geographic Analyses

Overall, the median number of residences in the past year was significantly (p < 0.05) higher among crossover (3) compared to suburban (1) and urban (1) PWID (Table 1). Crossover participants also reported shorter stays (median days) at each residence (160.3 days) compared to those who exclusively resided in suburban (310.3 days) or urban (232.2 days) areas. As expected, among PWID reporting transience, crossover PWID reported slightly larger median residential movement distances (24.2 miles) compared to suburban (11.1 miles) and urban (5.5 miles) PWID (p < 0.1). Locations where participants resided, purchased drugs, injected drugs, and met sex partners over the past year by residential movement status are shown in Fig. 1a-c for Chicago (shaded) and surrounding suburban areas. Most young PWID purchased drugs within the urban West Side drug market area. As expected, most urban PWID (94.6%) reported injecting in urban areas at least once in the past year (Fig. 1a); however, a significant proportion of crossover (88.1%) (Fig. 1c) and a substantial number of suburban PWID (43.2%) (Fig. 1b) also reported injecting in urban areas. Specifically, crossover PWID were significantly (p < 0.01) more likely (88.1%) compared to urban (65.5%) and suburban PWID (56.1%) to inject in the large outdoor West Side drug market area at least once in the past year. Additionally, the proportion of total injection episodes performed in this urban drug market was also significantly (p < 0.01)higher among crossover (62.8%) compared to urban (50.9%) and suburban (39.0%) only residents. Crossover (45.3%) and urban (53.4%) PWID were also more likely than suburban PWID (11%) to meet sex partners in urban Chicago (p < 0.01); crossover PWID were more likely (21%) to meet sex partners within the West Side drug market boundaries compared to urban (12%) and suburban (2%) PWID (p = 0.06). Exchange sex was associated with meeting sex partners in Chicago (p < 0.01) and specifically with meeting sex partners within the West Side drug market boundaries (p < 0.01).

# Discussion

Our study reports novel patterns of residential instability and associated HIV/HCV risk among predominantly non-urban young PWID in the USA. We identified a subgroup of young PWID (crossover transients) with higher-risk behaviors than their more residentially localized (urban or suburban) counterparts.

Our study results are consistent with prior studies in this region showing that young PWID are predominantly NH-whites from the suburban areas surrounding the city of Chicago (59–82%) [16, 18, 37]. Most young PWID who either reported living exclusively in the suburban (76%) or in both urban and suburban (73%) areas in the past year were born in the suburbs, compared to only 27% of those who reported urban only residence during that period. In Illinois, as with many states, HIV and HCV prevalence in urban [38] areas is dramatically higher than in surrounding suburbs [39].

Homelessness was consistently associated with all high-risk mobility patterns we found in our study. Prior studies have shown homelessness [40-43] and unstable housing [44, 45], including transience [24, 25], to be associated with HIV and HCV risk among PWID. Our study further shows a link between homelessness and high-risk mobility patterns. First, we show that residential transience (Table 2) and residential movement (Table 3) were both strongly associated with homelessness in the past 6 months in multivariable analysis. Moreover, for our bridging transience outcome, crossover transients were also significantly (p < 0.05) more likely to be homeless than localized urban or suburban transients (bridging transience, OR = 2.74; 95% CI 1.05–7.15); although this was only significant in univariable analysis.

Future research and interventions focused on homeless PWID populations should consider the role of mobility, particularly among crossover transients who may serve as potential "bridges" between areas. Bridge populations play a key role in the spread of infectious disease by linking subgroups that would otherwise not have been linked, thereby facilitating disease transmission [46, 47]. Because they link suburban and urban injection and sexual networks, crossover transients may facilitate transmission of HIV/HCV from higher (urban) to lower (suburban) HIV/HCV prevalence settings. In addition, compared to young PWID who reported transience within a localized area in our study, those reporting crossover transience were more likely to smoke crack and inject at locations within the West Side drug market area, suggesting that they are a distinct population with potentially elevated risk due to behavioral and geographic factors. The linkage between HIV/ HCV high and low prevalence areas and the elevated risk practices of crossover transients may help explain why increases in HIV and HCV have been observed among suburban PWID populations where prevalence previously was low. Identifying bridging populations is important, therefore, because they represent a potentially significant intervention target.

Among all PWID, centralized urban outdoor drug market areas were key settings for activities beyond drug purchase, including injecting and meeting injection and sexual network partners. Proximity to and activities within urban areas may be key to understanding the evolution of HCV risk among young suburban PWID. Targeted harm reduction intervention in these areas might have a significant impact on HCV transmission risk over time. Our study showed that young PWID, particularly crossover transients, often have interactions (residences and sexual relations) both within drug market areas, which are higher risk, and outside of these areas, which is typically lower risk, and thus act as bridges in spreading the disease to new regions (Fig. 1a). Our geographic analyses provide support for potential bridging-related HIV/HCV transmission between areas of high and low HIV/HCV prevalence. Both urban and crossover PWID performed most injections in Chicago, though only approximately half of their reported sex partner meeting locations were in Chicago. While most suburban PWID reported meeting sex partners outside of Chicago, a substantial proportion of injection episodes (43%) among suburban PWID occurred in Chicago, and of these, the majority (83%) were within the West Side drug market area.

Injection and sexual risk behaviors (e.g., syringe sharing, exchange sex, multiple sex partners) were prevalent in our sample, particularly among crossover transient PWID, and thus mobility between urban and suburban areas could facilitate the spread of infections by linking networks of varying HIV/HCV prevalence. Additional research is warranted to understand the mechanisms by which mobility, and crossover transience in particular, may directly impact injection and sexual risk behavior and HIV/HCV transmission.

Residential instability likely leads to vulnerability by increasing the likelihood of injecting in riskier situations (e.g., injecting in public places or in drug markets) or with different and potentially higher-risk PWID networks. Prospective studies are needed to elucidate the temporal associations between housing instability, changes in network characteristics, and HIV/HCV risk among young, predominantly non-urban PWID. Future research should also focus on the evolution of interaction with drug market areas over the course of a PWID's injecting career. For example, among those who travel long distances to these areas to purchase drugs, what characteristics or behaviors predict who might be more likely to inject and eventually take up residence in these areas, and how does this relate to HIV/HCV risk over time? A better understanding of this progression could lead to early identification of risk-prone individuals for targeted intervention.

Our study results have other important implications for interventions, especially with HCV infection. In 2014, the Department of Health & Human Services (DHHS) set national goals for reducing viral hepatitis

by 2020 [48], including (i) increase the proportion of persons who are aware of their HCV infection from 45 to 66% and (ii) reduce by 25% the number of new HCV infections. In 2016, the National Academy of Sciences (NAS) examined the feasibly of HCV elimination in the USA, defined as cessation of viral transmission in this country [49]. In its phase one report, NAS determined that people at greatest risk for HCV are young PWID [49]. The recent availability of all oral direct-acting antivirals (DAAs) with high reported cure rates (e.g., >90% [50, 51]) that can prevent liver disease progression and HCV transmission [52, 53], combined with prevention and harm reduction strategies, make HCV elimination an attainable goal. However, barriers [50, 54–60], including the high cost of DAAs, poor linkage to care, low adherence to medication regimens, stigma, and possible reinfection, all warrant policy development and strategic planning to understand the factors that would most efficiently lead to HCV elimination among PWID. To address this need, we developed mathematical and low-dimensional agent-based models (ABMs) in our prior work to simulate HCV spread and treatment scale up among PWID in metropolitan Chicago [61, 62]. The current study provides important insights into strategies that might address key subpopulations that will inform the development of our future high-dimensional ABMs that would provide much more realistic predictions of how to design HCV elimination strategies.

Our study has several limitations. Small sample size limited our power for subgroup analyses and for testing of interactions and resulted in wide confidence intervals for some estimates. Second, the cross-sectional study design did not allow us to determine temporality of associations between individual and network characteristics and transience. Third, the study was limited to a single geographic region (i.e., metropolitan Chicago), and the majority of participants were recruited from a large urban SSP that attracts both urban and suburban PWID, which limits the generalizability of the findings to other populations of PWID. Fourth, data on participants were self-reported and collected through face-toface interviews and, therefore, are subject to socially desirable responding and recall errors. Fifth, proxy data from participants on their network members may be inversely related to the strength of the relationship with the network member. However, the median injection network size for the sample was three and highly reliable measures of network density and composition are expected for up to five network members [63]. Moreover, sociodemographic and risk behaviors were only collected for core drug-using network members and were not available for those with a casual drugusing network. We also used a fairly broad definition of transience (i.e., more than one residence in the past year), which may have resulted in diluted effects. Refining the definition and measurement of residential instability as a construct may help to pinpoint associations with specific risk behaviors and identify mechanisms of impact, as well as facilitating comparison across studies.

Our study reports on an under-studied population of young PWID primarily emerging from suburban areas. We found that high-risk behaviors are associated with residential instability among young suburban PWID that points to a need for further empirical research and theoretical modeling to understand the underlying mechanisms by which transience shapes HCV and HIV transmission among young PWID. The association of crossover transience with high-risk behavior has important implications for interventions targeting this population, particularly given the potential for disease transmission associated with bridging between areas of high and low HIV/HCV prevalence.

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