

INTRODUCTION

Disparities related to race and ethnicity in receipt of kidney transplantation in the United States are well known.¹⁻¹² Indeed, one priority of the 2014 modifications to the national Kidney Allocation System was to improve the opportunity for transplantation among underserved populations, including racial/ethnic minorities.¹³ Nevertheless, a recent analysis showed little, if any, such improvement across the past 2 decades.¹⁴ Black, Hispanic, and other minority patients remain at a disadvantage relative to non-Hispanic White patients; these disparities persist even when differences in patients' medical statuses are taken into account.^{3-10,14} Moreover, the disparities cannot be ascribed solely to differences in referral patterns because they are also observed after referral and evaluation for transplantation.^{3,5,8,10,12,15,16}

We hypothesized that race/ethnicity disparities may be further heightened when coupled with a similarly potent factor that can affect likelihood of kidney transplantation: substance use, including tobacco use, heavy alcohol consumption, or illicit substance use. Ongoing substance use is generally a contraindication to candidacy,¹⁷⁻²⁴ based on important concerns that pretransplant substance use increases patients' risk for poorer posttransplant outcomes²⁵⁻³²; however, some studies fail to find such effects.^{27,31,33-38} In addition, consistent with candidate selection recommendations,¹⁷⁻²⁴ data show that, if active substance users demonstrate abstinence (eg, via any of an array of effective interventions^{20,26,31}), they can have successful posttransplant outcomes.^{20,23,34,39-41} Despite such data, growing evidence indicates that active substance use substantially reduces patients' chances for kidney transplantation, raising difficult concerns about equity in the transplantation process.^{32,42-44}

The same psychosocial factors that may help to explain race/ethnicity disparities in kidney transplantation (eg, barriers to receipt of health care in general, fewer social and financial resources to support health, clinician bias^{4,5,8-10,15,45,46}) also reduce the likelihood of substance use treatment.⁴⁷⁻⁴⁹ As a result, racial/ethnic minorities under consideration for transplantation may not obtain adequate care for substance use problems or meet transplant candidacy requirements for abstinence. Furthermore, it has been proposed that individuals who belong to multiple groups facing health- and healthcare-related disparities (here, racial/ethnic minorities and substance users) are by far the most disadvantaged: this "double jeopardy hypothesis"⁵⁰⁻⁵² would therefore also suggest that minority patients who use substances may be especially unlikely, compared with non-Hispanic White patients, to receive kidney transplants.

Given a dearth of evidence on the combined impact of race/ethnicity with substance use, we examined a cohort of individuals undergoing evaluation for kidney transplantation to achieve several goals. First, we sought to examine whether patterns and types of substances used varied by race/ethnicity. Second, we evaluated whether likelihood (ie, probability) of transplantation could be predicted by the unique combination of patients' race/ethnicity and whether they used any substances. To do this, we examined overall incidence of transplantation and then examined its 2 components: whether patients were waitlisted for transplant and, among waitlisted patients, whether they

received transplants. Finally, to better understand predictive effects of race/ethnicity in combination with substance use, we explored these effects on outcomes separately for specific types of substances used.

MATERIALS AND METHODS

Study Design and Patients

We examined a cohort of 1152 patients previously enrolled at the time of their transplant evaluation in a prospective investigation of social factors predicting kidney transplantation.^{12,53} Substance use data were not originally collected; we obtained these data for the present study from patients' electronic medical record (EMR).

Patients enrolled were aged ≥ 18 y and English-speaking, had not received a previous kidney transplant, and underwent transplant evaluations between March 2010 and October 2012 at the University of Pittsburgh Medical Center.⁵³ Among potential participants, 86% were enrolled (with no demographic differences between those enrolled versus not).⁵³

With University of Pittsburgh Institutional Review Board approval, participants provided informed consent for study interviews and EMR reviews.

Measures

Race/Ethnicity, Other Demographics, and Clinical Characteristics at Transplant Evaluation

Based on the original study's research interviews with patients using standardized questioning,⁵³ we classified patients as non-Hispanic White (hereafter referred to as White), non-Hispanic Black (Black), or under the category "Other race/ethnicity." (There were too few individuals in the latter category to create additional groups.)

Other demographics were obtained during the research interviews, and clinical characteristics were extracted from the EMR (Table 1). We calculated the Charlson Comorbidity Index score from EMR information.⁵⁴⁻⁵⁶

Substance Use

Transplant Team Assessments of Substance Use and Data Extraction for Present Study

We used patients' transplant evaluations, reported in the EMR, to determine substance use. As part of the medical assessment, patients received a psychosocial evaluation by a clinical social worker. It covered psychosocial history and current status based on a semistructured patient interview plus collateral information from their primary family caregiver. The psychosocial evaluation followed a template specifying areas required to be examined and described in the evaluator's report, including current and past tobacco, alcohol, and illicit substance use; periods of abstinence; and amount and duration of current use. We also retrieved EMR reports from all other medical components of the transplant evaluation, including assessments by nephrologists, surgeons, nurse coordinators, and pharmacists. (During the study enrollment period, toxicology screening was not performed as part of the evaluation. Advanced kidney disease renders urine screening [the most common strategy] difficult or impossible to use.⁵⁷)

From these data, we determined whether study participants (a) smoked tobacco, (b) engaged in heavy alcohol consumption, or (c) used any illicit substances. Table 2 defines these categories of substance use. For each, we identified

TABLE 1.**Study participants' demographic and clinical characteristics at evaluation for kidney transplantation, stratified by participant race/ethnicity**

Characteristic	Total sample N = 1152	Race/ethnicity			3-group comparison	
		Non-Hispanic White n = 789	Non-Hispanic Black n = 267	Other ^a n = 96	Test ^b	P
Demographic						
Age, M (SD)	56.0 (13.3)	56.9 (13.4)	53.8 (12.4)	54.0 (13.8)	7.03	0.001
Sex, % (n) female	38.8 (447)	38.3 (302)	39.0 (104)	42.7 (41)	0.71	0.622
Education, % (n) high school or less	47.8 (551)	45.5 (359)	51.3 (137)	57.3 (55)	6.46	0.040
Marital status, % (n) married or partnered	51.1 (589)	57.9 (457)	33.0 (88)	45.8 (44)	50.92	<0.001
Employed, % (n) yes	25.5 (294)	28.8 (227)	17.6 (47)	20.8 (20)	14.30	0.001
Occupation, % (n) blue collar/manual ^c	51.8 (587)	47.3 (373)	62.2 (166)	60.4 (58)	20.83	<0.001
Health insurance, % (n) public only (vs any private coverage)	36.8 (424)	29.7 (234)	52.8 (141)	51.0 (49)	55.10	<0.001
Clinical						
Primary indication for transplant, % (n)						
Diabetes	40.5 (467)	39.4 (311)	43.4 (116)	41.7 (40)	63.22	<0.001
Hypertension	20.1 (232)	15.5 (122)	33.0 (88)	22.9 (22)		
Glomerulonephritis	12.8 (147)	13.2 (104)	12.0 (32)	6.3 (22)		
Other	26.6 (306)	31.9 (252)	11.6 (31)	29.2 (28)		
Diabetes, % yes (n) ^d	44.5 (513)	43.2 (341)	47.6 (127)	46.9 (45)	1.76	0.415
Hypertension, % yes (n) ^d	32.5 (374)	26.0 (205)	51.3 (137)	33.3 (32)	58.41	<0.001
On dialysis, % yes (n)	65.6 (756)	60.3 (476)	80.0 (214)	68.8 (66)	35.19	<0.001
If on dialysis, duration, % ≤6 mo (n)	49.2 (372)	51.9 (247)	45.8 (98)	40.9 (27)	4.19	0.123
BMI, kg/m ² , M (SD)	29.5 (6.2)	29.6 (6.2)	29.5 (6.5)	29.0 (5.8)	0.44	0.642
Other comorbidities						
Charlson Comorbidity Index, M (SD) ^e	4.2 (1.7)	4.1 (1.7)	4.4 (1.9)	4.2 (1.5)	3.27	0.038
Heart disease (CAD, valvular disease, cardiomyopathy, heart failure), % yes (n)	54.7 (630)	53.7 (424)	57.7 (154)	54.2 (52)	1.26	0.532
Peripheral vascular disease, % yes (n)	32.5 (374)	31.3 (247)	35.2 (94)	4.4 (33)	1.56	0.459
Chronic pulmonary disease, % yes (n)	29.1 (355)	28.6 (563)	32.2 (181)	24.0 (23)	2.56	0.278
History of medical nonadherence, % yes (n) ^f	14.5 (167)	12.7 (100)	18.7 (50)	17.7 (17)	6.77	0.034
Have possible living donor to be tested, % yes (n)	51.2 (590)	51.7 (408)	49.4 (132)	52.1 (50)	0.44	0.801
If waitlisted for transplant (n = 656),						
Waitlisted before KAS in 2014, % yes (n)	94.4 (619)	96.7 (470)	87.3 (103)	88.5 (46)	–	<0.001
Waitlisted before smoking cessation was required for listing (2013), % yes (n) ^g	25.0 (164)	21.4 (104)	37.3 (44)	30.8 (16)	13.79	<0.001
Study outcomes by end of follow-up, % yes (n)						
Outcome 1: Received transplant	36.0 (415)	38.9 (307)	28.5 (76)	33.3 (32)	–	–
Competing risk: Death	44.0 (507)	44.0 (34.7)	42.7 (114)	47.9 (46)		
Censored: Alive, no transplant	20.0 (230)	17.1 (135)	28.8 (77)	18.8 (18)		
Case closed, incomplete evaluation	(109)	(57)	(46)	(6)		
Team declined patient for transplant	(72)	(50)	(16)	(6)		
Patient choice to withdraw from process	(38)	(24)	(11)	(3)		
Patient on waitlist at end of study	(11)	(4)	(4)	(3)		
Outcome 2: Waitlisted	56.9 (656)	61.6 (486)	44.2 (118)	54.2 (52)	–	–
Competing risk: Death	29.7 (342)	27.8 (219)	33.3 (89)	35.4 (24)		
Censored: Alive, not waitlisted	13.4 (154)	10.6 (84)	22.5 (60)	10.4 (10)		
Case closed, incomplete evaluation	(109)	(57)	(46)	(6)		
Team declined patient for waitlisting	(27)	(18)	(8)	(1)		
Patient choice to withdraw from process	(18)	(9)	(6)	(3)		

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TABLE 1. (Continued)

Characteristic	Total sample N = 1152	Race/ethnicity			3-group comparison	
		Non-Hispanic White n = 789	Non-Hispanic Black n = 267	Other ^a n = 96	Test ^b	P
Outcome 3: If waitlisted, received transplant	63.3 (415)	63.2 (307)	64.4 (76)	61.5 (32)	–	–
Competing risk: Death	25.2 (165)	26.3 (128)	21.2 (25)	23.1 (12)		
Censored: Alive on waitlist, no transplant	11.6 (76)	10.5 (51)	14.4 (17)	15.4 (8)		
Team declined patient for transplant	(45)	(32)	(8)	(5)		
Patient choice to withdraw from process	(20)	(15)	(5)	(0)		
Patient on waitlist at end of study	(11)	(4)	(4)	(3)		

^aIncludes Hispanic (n = 21), Asian/Pacific Islander (n = 15), Native American (n = 8), and multiracial (n = 52).

^bF test for means; χ^2 test for proportions. When P values but no test values are reported, Fisher exact tests were used because of small expected frequencies in some cells. For study outcomes, groups' simple proportions cannot be statistically compared because patients vary in time to the events⁵⁸; see Table 4 for relevant comparisons.

^cBased on the Hollingshead occupational classification.⁵⁹

^dBy convention, includes all cases, no matter whether the condition was the primary indication for transplantation or whether the condition was listed as a comorbidity in patients' medical record.⁶⁰

^eThe index is a count of 19 conditions, spanning several hundred ICD diagnosis and procedure codes, weighted by severity (total possible score range, 0–33).^{54,56} Although the index includes peripheral vascular disease (PVD), chronic pulmonary disease, and some diagnoses related to heart disease (reflecting myocardial infarction and congestive heart failure), we also separately considered PVD, chronic pulmonary disease, and an expanded range of heart diseases in the cohort given the importance of these conditions in the end-stage kidney disease population.

^fBased on data from the psychosocial evaluation for transplantation. The evaluator used a template requiring collection of information on nonadherence to medications, dialysis, clinic appointments/testing, and fluid/dietary restrictions. These data were gathered by the evaluator from the patient as well as from collateral sources (primary family caregiver, medical records).

^gSee Methods section for description of transplant program approach to substance use and waitlisting for transplant. Beginning in 2013, no active smokers were listed for transplantation. Heavy alcohol use and illicit substance use were absolute contraindications to transplant across the entire study period (2010–2020).

BMI, body mass index; CAD, coronary artery disease; KAS, Kidney Allocation System; PVD, peripheral vascular disease.

participants engaging in current use or past (but not current) use or having no history of use. We also extracted other characteristics of participants' usage history (see Table 3).

Two coauthors (R.N.D. and M.A.D. blinded to study outcomes) coded all EMR information. They first independently reviewed 10 patients' transplant psychosocial and medical evaluations, reconciled any discrepancies, and coded 10 additional evaluations to establish reliability (intraclass r or $\kappa > 0.90$). Remaining patients' data were then coded by one of these coauthors, with periodic double coding by both to reduce any coding drift. One author (M.A.D.) then reviewed coding for all patients to ensure final coding accuracy.

Transplant Team Approach to Substance Use

Heavy alcohol use and any illicit substance in the categories listed above are absolute contraindications to transplantation. Until 2013, smoking was a relative

contraindication, as was typical in most US kidney transplant programs^{66,67}; however, all patients were strongly encouraged to quit and were educated on smoking risks in relation to transplantation. Smoking did not preclude waitlisting and transplantation in the absence of diagnosed lung disease and poor lung function test results, especially if patients were light smokers (≤ 5 cigarettes/d^{168,69}). Beginning in 2013, active smokers were not waitlisted or transplanted. Across the entire study period (2010–2020), active substance users were seen by a behavioral health specialist (psychiatrist or psychiatric nurse) who identified and made referrals for cessation intervention. Individuals found to drink heavily or use illicit substances at evaluation for transplantation were required to undergo random blood testing for toxicology screening and to achieve ≥ 3 negative tests before waitlisting. Determination of smoking cessation was based on the patient and collateral (primarily family member) report. Although 6 mo of abstinence

TABLE 2.

Definition of each of 3 types of substance use

Type of substance	Definition of use
Tobacco smoking	Continuous, active daily or intermittent smoking with no period of abstinence ^{61,62}
Heavy alcohol consumption	Either: <ul style="list-style-type: none"> meeting standard criteria for heavy drinking^{61,63} (men: >14 drinks/wk or >4 drinks/occasion; women: >7 drinks/wk or >3 drinks/occasion) or referral or participation in alcohol treatment or rehabilitation.
Illicit substance use	Using any illegally obtained substance, including misuse of prescribed substances (ie, use of prescriptions that are not one's own or use not directed by healthcare providers), ⁶⁴ including <ul style="list-style-type: none"> marijuana (not legal in Pennsylvania or surrounding states for any purpose at the time of transplant evaluations) stimulants opioids hallucinogens sedatives

TABLE 3.
Characteristics of tobacco, alcohol, and illicit substance use in the cohort

Characteristic ^a	Total sample N = 1152	Race/ethnicity			3-group comparison	
		White n = 789	Black n = 267	Other n = 96	Test ^b	P
Tobacco use						
Smoking status, % (n)					16.76	0.002
Current smoker	17.6 (203)	14.8 (117)	25.8 (69)	17.7 (17)		
Former smoker	46.7 (538)	48.2 (380)	42.7 (114)	45.8 (44)		
Never smoked	35.7 (411)	37.0 (292)	31.5 (84)	36.5 (35)		
In smokers, products ever used						
Cigarettes, % (n) yes	97.7 (724)	97.4 (484)	97.8 (179)	100.0 (61)	–	0.671
Cigars, % (n) yes	7.0 (52)	7.0 (35)	7.1 (13)	6.6 (4)	–	1.000
Pipes, % (n) yes	1.9 (14)	2.4 (12)	0.5 (1)	1.6 (1)	–	0.314
Current cigarette packs/d, median (IQR) ^c	0.50 (0.30–1.00)	0.50 (0.35–1.00)	0.50 (0.25–0.80)	0.50 (0.35–1.00)	3.54	0.170
In all lifetime smokers, years smoked, M (SD)	24.8 (13.8)	24.7 (14.1)	24.3 (12.9)	26.6 (13.8)	0.58	0.561
In former smokers, time abstinent					–	0.050
<6 mo	5.9 (31)	4.8 (18)	8.0 (9)	9.5 (4)		
≥6 mo–5 y	23.3 (123)	21.2 (79)	25.9 (29)	35.7 (15)		
>5 y	70.8 (373)	74.0 (276)	66.1 (74)	54.8 (23)		
Ever used other nicotine products, % (n) yes ^d					16.23	<0.001
Chewed tobacco or snuff	6.9 (80)	8.7 (69)	1.5 (4)	7.3 (7)	–	0.007
Electronic cigarettes	0.2 (2)	0.0 (0)	0.0 (0)	2.1 (2)		
Alcohol use						
Heavy drinking, % (n)					–	<0.001
Current heavy drinker	2.6 (30)	2.4 (19)	3.7 (10)	1.0 (1)		
Former heavy drinker	19.8 (228)	17.0 (134)	28.8 (77)	17.7 (17)		
Never drank heavily	77.6 (894)	80.6 (636)	67.4 (180)	81.3 (78)		
Current heavy drinkers, drinks/d, median (IQR)	5.5 (3.5–7.0)	5.5 (3.5–7.0)	5.5 (5.5–8.0)	3.5 (–)	2.49	0.288
In former heavy drinkers, time abstinent from heavy drinking, % (n)					–	0.619
<6 mo	2.3 (5)	2.4 (3)	2.9 (2)	0.0 (0)		
≥6 mo–5 y	39.6 (88)	36.5 (46)	43.1 (31)	52.9 (9)		
>5 y	58.1 (129)	61.7 (82)	54.2 (39)	47.1 (8)		
In former heavy drinkers, % (n) abstinent from any alcohol	54.4 (124)	55.2 (74)	51.9 (40)	58.8 (10)	0.36	0.834
Illicit substance use						
Substance use status, % (n)					–	<0.001
Current user	4.6 (53)	2.9 (23)	7.9 (21)	9.4 (9)		
Former user	26.0 (300)	21.8 (172)	39.0 (104)	25.0 (24)		
Never used substances	69.4 (799)	75.3 (594)	53.2 (142)	65.6 (63)		
In substance users, products ever used						
Marijuana, % (n)	89.5 (316)	95.4 (186)	82.4 (103)	81.8 (27)	–	<0.001
Stimulants (eg, cocaine, amphetamines), % (n)	34.0 (120)	25.6 (50)	46.4 (58)	36.4 (12)	–	0.001
Opioids (eg, heroin, oxycodone), % (n)	12.5 (44)	8.2 (16)	18.4 (23)	15.2 (5)	–	0.019
Hallucinogens (eg, LSD, mescaline), % (n)	3.4 (12)	5.1 (10)	0.8 (1)	3.0 (1)	–	0.093
Other/unspecified polydrug use ^e	4.8 (17)	4.1 (8)	6.4 (8)	3.0 (1)	–	0.648
In substance users, products ever used, % (n)					–	<0.001
Only marijuana	61.5 (217)	70.8 (138)	48.8 (61)	54.5 (18)		
Only other substances	10.5 (37)	4.6 (9)	17.6 (22)	18.2 (6)		
Both marijuana and other substances	28.0 (99)	24.6 (48)	33.6 (42)	27.3 (9)		

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TABLE 3. (Continued)

Characteristic ^a	Total sample N = 1152	Race/ethnicity			3-group comparison	
		White n = 789	Black n = 267	Other n = 96	Test ^b	P
In former users of any substance, time since quit, % (n)					–	0.006
<6 mo	3.8 (10)	2.7 (4)	6.5 (6)	0.0 (0)		
≥6 mo–5 y	18.0 (48)	11.4 (17)	25.8 (24)	29.2 (7)		
>5 y	78.2 (208)	85.9 (45)	67.7 (63)	70.8 (17)		

^aThe following variables had missing cases: current number of cigarettes/d, 7 cases (4 White, 3 Black); years smoked, 79 cases (52 White, 18 Black, 9 Other); duration of smoking abstinence, 20 cases (11 White, 7 Black, 2 Other); duration of alcohol abstinence, 6 cases (1 White, 5 Black); and duration of substance use abstinence, 34 cases (23 White, 11 Black).

^bF test for means, Kruskal-Wallis test for medians, and χ^2 test for proportions. For variables for which no test is reported, Fisher exact test was used because of small expected frequencies in some cells.

^cCigar and pipe smoking was converted to equivalent cigarette use based on approximate equivalents in grams of smoked tobacco: 1 cigar = 4 cigarettes, 1 pipe = 3.5 cigarettes.⁶⁵

^dPack-years could not be calculated because historical information on usage patterns was not sufficiently detailed.

^eIllicit use of sedatives (eg, benzodiazepines, barbiturates) was combined with all other remaining substances because of low prevalence.

IQR, interquartile range; LSD, d-lysergic acid diethylamide.

TABLE 4.

Predictors of kidney transplantation and waitlist-related outcomes, multivariable (competing risk) analysis and resulting subdistribution hazard ratios

	Kidney transplantation in total cohort	Process toward kidney transplantation	
		Waitlisted for transplant	Among waitlisted patients, received transplant
No. of incident events/total no. of patients ^a	415/1152 ^b	656/1152	415/656
Multivariable analysis	HR (CI), P	HR (CI), P	HR (CI), P
Race/ethnicity by current substance use groups ^c			
White, no substance use (referent)	–	–	–
Black, no substance use	0.76 (0.56–1.02), 0.070	0.73 (0.58–0.91), 0.005	0.99 (0.74–1.32), 0.949
Other, no substance use	1.00 (0.70–1.43), 0.980	0.79 (0.55–1.13), 0.199	0.96 (0.68–1.35), 0.804
White, current substance use	0.73 (0.50–1.06), 0.094	0.55 (0.42–0.72), <0.001	1.09 (0.77–1.53), 0.633
Black, current substance use	0.45 (0.23–0.85), 0.014	0.32 (0.22–0.47), <0.001	0.76 (0.47–1.25), 0.288
Other, current substance use	0.33 (0.13–0.84), 0.021	0.60 (0.37–0.99), 0.049	0.69 (0.26–1.79), 0.448
Covariates			
Age, y	0.97 (0.97–0.98), <0.001	0.98 (0.98–0.99), <0.001	0.97 (0.97–0.98), <0.001
Employment status, unemployed	0.69 (0.55–0.86), 0.001	0.74 (0.62–0.88), 0.001	0.68 (0.55–0.84), <0.001
Health insurance, public only (vs any private coverage)	0.75 (0.58–0.96), 0.022	0.71 (0.59–0.86), 0.001	0.78 (0.60–0.99), 0.048
BMI	0.98 (0.96–0.99), 0.013	0.99 (0.98–1.00), 0.076	0.98 (0.97–1.00), 0.056
Hypertension, yes	1.17 (0.93–1.47), 0.180	1.10 (0.92–1.31), 0.317	1.13 (0.91–1.41), 0.272
On dialysis, yes	0.80 (0.65–0.98), 0.035	0.62 (0.52–0.73), <0.001	0.83 (0.68–1.01), 0.065
Charlson Comorbidity Index, ^d higher score = worse	0.27 (0.15–0.50), <0.001	0.30 (0.19–0.49), <0.001	0.39 (0.22–0.69), <0.001
Chronic pulmonary disease, yes	0.84 (0.65–1.09), 0.185	0.83 (0.70–0.99), 0.034	0.95 (0.73–1.23), 0.705
History of medical nonadherence, yes	0.82 (0.59–1.13), 0.226	0.80 (0.63–1.02), 0.067	0.90 (0.65–1.24), 0.522
Waitlisted before 2014 implementation of KAS ^e	0.80 (0.77–0.83), <0.001	–	0.78 (0.43–1.40), 0.398
Improvement in model fit over null model: χ^2 (df), P	284.7 (15), <0.001	255.0 (14), <0.001	124.0 (15), <0.001

^aFor each outcome, patients were followed until the event of interest or until censoring due to death (competing risk) or other reasons (see Table 1 for numbers of patients by reasons for censoring). Only 11 patients (<1% of all patients; <2% of those waitlisted) were censored because the study observation period ended; they had been waitlisted and were on the waitlist at study's end. They were followed in the study for median of 8.4 y (IQR, 8.1–8.8) and had been on the waitlist for a median of 6.5 y (IQR, 3.9–7.9).

^bOf the 415 patients receiving transplants, 134 received living donor transplants. Numbers of outcome events are too small to examine race/ethnicity by substance use groups as predictors separately for living vs deceased donor transplants.

^cWe chose to compare groups defined by the combination of race/ethnicity and substance use, with the referent group of non-Hispanic White patients, because of the ease of displaying and interpreting specific disparities in the outcomes. An alternative for evaluating our hypothesis (ie, that the 2 groups of racial/ethnic minority patients who used substances would show particularly great disadvantage on outcomes) is to test a planned contrast using contrast weights to capture the notion of synergistic effects. The statistical tests and P levels associated with evaluating this planned contrast within competing risk models were $z = 2.99$, $P = 0.003$ for the outcome of kidney transplantation; $z = 4.95$, $P < 0.001$ for waitlisting; and $z = 1.34$, $P = 0.182$ for transplant among waitlisted patients. (Note that decomposing this planned contrast into its component parts, ie, separately testing main effects for race/ethnicity and substance use and an interaction effect, would provide only a piecemeal evaluation of our hypothesis rather than a focused test of it. Planned contrasts give greater power and precision than piecemeal testing when specific hypotheses such as those pertaining to synergy are proposed.^{86,87})

^dLog transformed before analysis.

^eIncluded as a time dependent covariate in analysis of time to transplant in full cohort.

CI, confidence interval; HR, hazard ratio; IQR, interquartile range; KAS, Kidney Allocation System.

from all substances was desirable before waitlisting and transplantation, abstinence duration was considered in the context of medical urgency.

Outcomes

We followed the cohort through August 2020 for 3 outcomes. Our main outcome was time to kidney transplantation. We then decomposed this outcome into time to placement on the active waitlist and, among patients waitlisted, time from waitlisting to transplantation.

Statistical Analysis

We examined descriptive data on demographic, clinical, and substance use characteristics across the 3 race/ethnicity groups using standard tests for continuous and categorical variables.

To examine whether particular combinations of race/ethnicity and substance use predicted study outcomes, we cross-classified race/ethnicity by patients' use of any (versus no) substances at the time of the transplant evaluation, yielding 6 groups: White patients with and without current use (ie, past use only or never used substances); Black patients with and without current use; and Other race/ethnicity patients with and without current use. We targeted current use for predictive analyses because it is most relevant for transplant candidate selection decisions.¹⁷⁻²⁴

Primary Multivariable Analyses

We used time-to-event analyses (Fine-Gray competing risk models, with death as a competing event)^{70,71} to examine the cumulative incidence of study outcomes across the study groups defined by race/ethnicity in combination with any substance use. A separate model was fit for each outcome. These analyses controlled for demographic and clinical covariates that showed at least small associations (effect sizes) with (a) 1 or more study outcomes (ie, subdistribution hazard ratios [HRs] >1.50) as well as (b) the race/ethnicity-substance use predictor groups (ie, Cramér's $V \geq 0.10$ for categorical covariates, Cohen's $f \geq 0.10$ for continuous covariates).⁷²⁻⁷⁴

We adopted a competing risk approach because, given our observational data, we sought to identify predictors of the likelihood (ie, probability) of outcomes rather than test causal relationships. Fine-Gray models are superior to other approaches when prediction, rather than cause, is the goal.^{70,75-79} In the presence of a competing risk, conventional models (eg, Cox models) would not allow our study goals to be achieved: they permit neither unbiased estimation of variables' predictive effects on the cumulative incidence of outcomes nor accurate estimation of the probability of outcomes during the period of observation.^{70,71}

Nevertheless, it can be useful to also fit conventional Cox models to provide a more complete understanding of the role of a putative risk factor on occurrence of a given outcome.^{75,79,80} Although Cox models cannot address cumulative incidence or the probability of the outcome (our chief interest), such models consider the impact of the risk factor on the instantaneous rate of occurrence of the outcome in individuals who are currently event free.^{70,80}

Ancillary Competing Risk Analyses

For any outcome for which race/ethnicity-substance-use group differences emerged, we explored whether use of particular categories of substances might play a role. We examined (a) race/ethnicity cross-classified by current smoking and (b) race/ethnicity cross-classified by current use of any other substances (heavy alcohol use or illicit substances; these categories had too few cases to consider separately). Thus, for each outcome, we fit an additional Fine-Gray model with the predictor of interest (race/ethnicity by smoking or race/ethnicity by heavy alcohol/any illicit substance use) and the covariates. To control for false discovery in these exploratory analyses, we applied the Benjamini-Hochberg method to set the allowable false-positive rate to 0.05.^{81,82} This approach has greater power than traditional multiple comparison adjustments.⁸¹

RESULTS

Sample Description

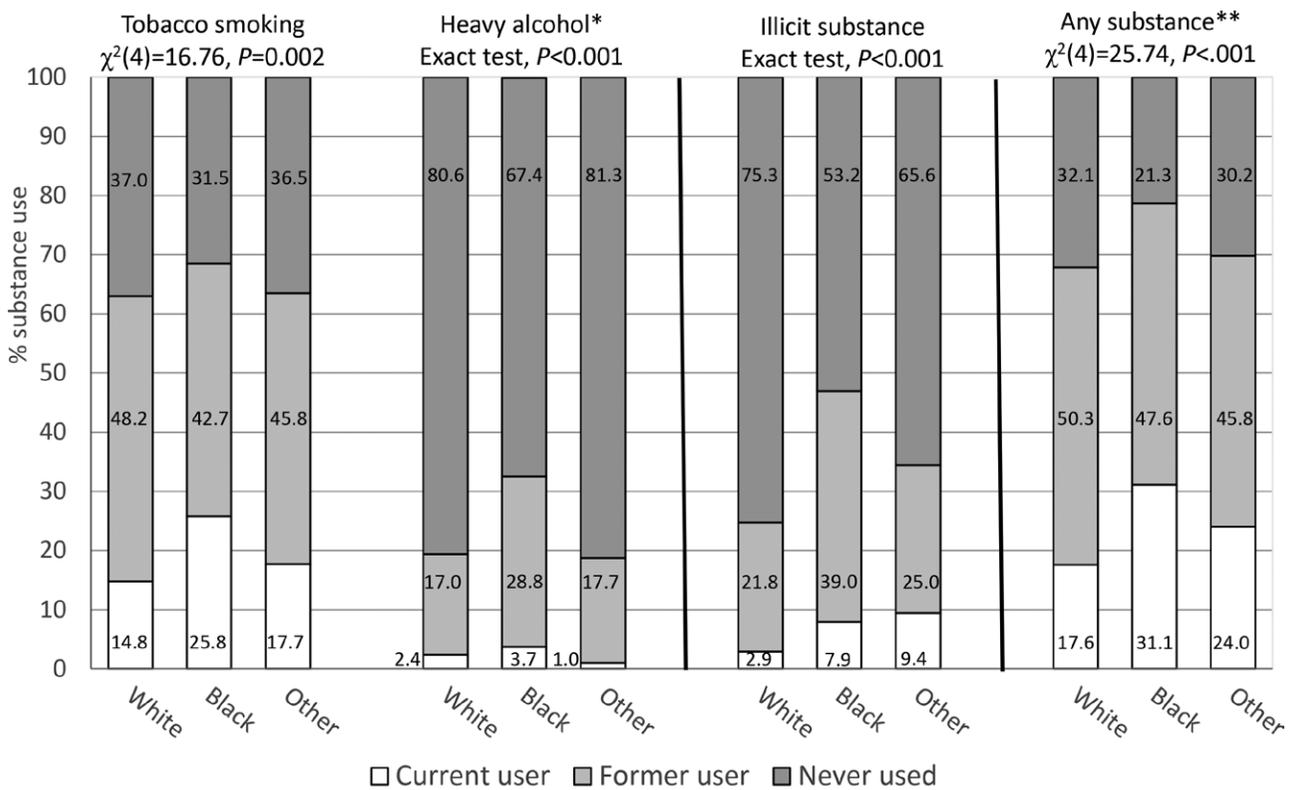
Among the 1152 patients, 789 (68.5%) were White, 267 (23.2%) were Black, and 96 (8.3%) were in the Other race/ethnicity group (consisting mostly of individuals identifying as multiracial; see Table 1, footnote a). White patients were more educated, more likely to be married and employed, and less likely to have held blue collar/manual occupations or rely solely on public health insurance. They were older, but group differences were small. On clinical characteristics, Black patients were more likely to have hypertension (as the primary indication for transplantation or as a comorbid diagnosis) and receive dialysis. They had higher Charlson Comorbidity scores, but group differences were small; mean scores resembled those in other end-stage renal disease populations.⁸³⁻⁸⁵ There were no differences in history of heart disease, peripheral vascular disease, or pulmonary disease. White patients were less likely to have histories of medical nonadherence. Given that transplant evaluations occurred from 2010 to 2012, most waitlisted patients were waitlisted before Kidney Allocation System implementation.

Table 1 also lists the numbers of patients experiencing study outcomes and reasons for censoring. We used these data in time-to-event analyses addressing study aims.

Substance Use Patterns and Progression Toward Transplantation

Figure 1 shows the race/ethnicity groups' distribution on current, past, and no lifetime tobacco smoking, heavy alcohol use, illicit substance use, and use of any of these types of substances. Smoking (current or past) was the most common type of substance use. The groups differed significantly in their distributions of use of each type of substance, as well as on the composite variable reflecting any substance use (see Figure 1 for statistical tests).

We also performed more focused comparisons (controlling the false discovery rate) to examine specifically whether rates of current use (versus past/no use) differed by race/ethnicity. There were differences on current smoking ($\chi^2(2) = 16.67, P < 0.001$), with the highest percentage among Black patients. The groups differed on current illicit substance use (Fisher exact test, $P < 0.001$), and current use of any substances ($\chi^2(2) = 22.07, P < 0.001$): Black



*See Methods for definition. **Any tobacco smoking, heavy alcohol use or illicit substance use.

FIGURE 1. Distribution of substance use in patients undergoing kidney transplantation stratified by patients' race/ethnicity (N=1152).

and Other race/ethnicity patients were most likely to currently use illicit substances and to be current users of any substances. There were no differences on current heavy alcohol use (Fisher exact test, $P=0.346$)

Table 3 presents additional descriptive information on the groups' substance use patterns. Cigarettes were the most commonly smoked tobacco. The vast majority of past smokers had ≥ 6 mo of abstinence. The only significant differences were that Black participants were less likely to have chewed tobacco and electronic cigarette use was reported only by Other race/ethnicity patients.

There were no significant differences by race/ethnicity on alcohol use characteristics. Most past heavy drinkers had abstained from heavy use for ≥ 6 mo; a majority abstained from all alcohol use.

The race/ethnicity groups differed on multiple parameters of illicit substance use. In patients ever using illicit substances, marijuana was most common, especially among White patients. Black patients were more likely to have ever used stimulants or opioids and to have lifetime histories of combined use of marijuana and other substances. Among all past illicit substance users, most had been abstinent for ≥ 6 mo. White patients were most likely to have long periods of abstinence.

Finally, we characterized patterns of co-occurrence of tobacco, heavy alcohol, and illicit substance use among current users, as well as these patients' progression toward abstinence and transplantation (Figure 2). As shown in Figure 2A, tobacco smoking most often occurred alone; only 19% ($23 + 1 + 14 = 38$) of 203 smokers also used illicit substances or drank heavily. In contrast, 49% ($26/53$) of

those using illicit substances also drank heavily or smoked, and 57% ($17/30$) of heavy alcohol users used illicit substances or smoked. There was no significant difference in distribution across these patterns by race/ethnicity (Fisher exact test, $P=0.079$).

Figure 2B depicts the 245 substance users' progress toward possible transplantation. Their "final dispositions" are detailed in the lowermost boxes in the figure. For example, 45 patients abstinent from all substances at waitlisting underwent transplantation, whereas 25 patients abstinent at waitlisting did not receive transplants for the reasons listed (see also Figure 2B footnotes). Twenty-nine patients smoked at waitlisting (before smoking became an absolute contraindication), and 19 underwent transplantation. Among 146 patients never waitlisted, waitlisting decisions were initially delayed for 7 patients because of substance use. In 139 remaining patients, there was no indication in the EMR that lack of waitlisting was due to substance use.

Because patients varied in time to the events in Figure 2B, statistical comparisons (including any differences by race/ethnicity) cannot be made.⁵⁷ Time-to-event analyses, described below, must be used to examine differences in likelihood of study outcomes.

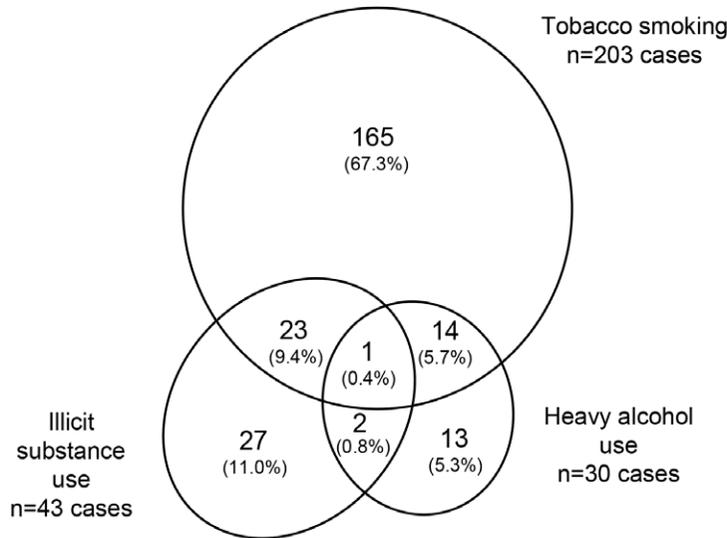
Prediction of Study Outcomes

Cumulative Incidence of Kidney Transplantation

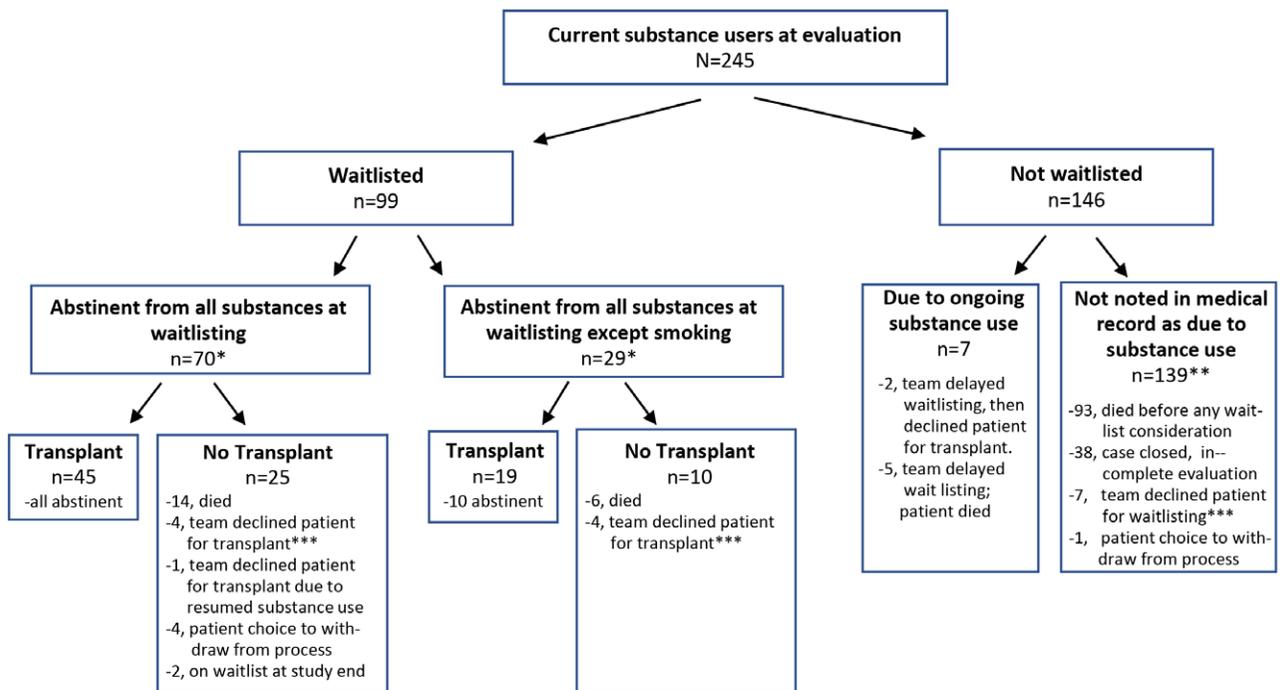
Primary Analysis

We first examined whether likelihood of transplantation varied across the groups defined by race/ethnicity in

A Co-occurrence of substance use in users of at least 1 of 3 substance categories at evaluation. Percentages reflect cases out of 245 using different combinations of substances, e.g., 67.3% (165/245 patients) used only tobacco; 9.4% (23/245 patients) used tobacco and illicit substances, and so on.



B Progression to waitlisting and transplantation: final dispositions for the 245 patients.



*4 of 70 abstinent cases had waitlisting delayed to ensure abstinence. Patients who smoked at waitlisting (or at transplant) were waitlisted or transplanted before cessation was a requirement. Abstinence duration was not routinely recorded in medical records. See Methods for description of transplant team approach to substance use before waitlisting/transplantation.

**Substance use status at death or case closure due to incomplete evaluations is unknown. In the 7 patients declined for waitlisting, 5 used substances when declined (4 smoked, 2 used illicit substances, 1 drank heavily). The patient who chose to withdraw continued to smoke.

***Due to ongoing or new medical conditions; substance use was not noted as a reason for declining these patients for waitlisting.

FIGURE 2. Substance use patterns and progression to waitlisting and transplantation in 245 study participants who currently used substances at the time of kidney transplantation evaluation.

combination with *any* (versus no) substance use (Table 4, first column). Compared with the referent group (White patients with no current substance use), Black patients who used any substances were significantly less likely to undergo transplantation (HR, 0.45), as were Other race/

ethnicity patients who used any substances (HR, 0.33). Neither White substance users nor Black nonusers differed significantly from the referent group, and Other race/ethnicity patients who were nonusers were identical to the referent group in likelihood of transplantation.

Figure 3 illustrates these findings. By the end of follow-up, 25% of White patients who did not use any substances received transplants, as did 26% of Other race/ethnicity nonusers. Slightly smaller percentages of White substance users and Black nonusers received transplants (20% of each). Only 14% and 9% of the 2 minority groups who used any substances received transplants.

Ancillary Analyses

Beyond consideration of any substance use (versus none), we explored whether current smoking appeared to account for these effects or whether current heavy alcohol/illicit substance accounted for these effects. Concerning *smoking*, Black smokers were less likely to undergo transplantation than the White nonsmoker referent group (HR, 0.37; 95% confidence interval [CI], 0.16-0.83; $P=0.016$), but this difference was not significant after controlling for the false discovery rate. For *heavy alcohol/illicit substance use*, there were no significant effects by race/ethnicity. In sum, we found effects for race/ethnicity in combination with *any* substance use but could not reliably pinpoint the specific role of smoking or of heavy alcohol/illicit substance use in this association.

Cumulative Incidence of Waitlisting

Primary Analysis

Compared with the referent group of White patients who did not use any substances, Black patients using any substances were significantly less likely to be waitlisted (HR, 0.32; Table 4, second column). White substance users (HR, 0.55), Other race/ethnicity-substance users (HR, 0.60), and Black nonusers (HR, 0.73) were also less likely to be waitlisted. Patients in the Other race/ethnicity group who were nonusers did not significantly differ from the referent group.

Figure 4A displays these findings. By the end of follow-up, 70% of White nonusers and 62% of Other race/ethnicity nonusers had been waitlisted. Remaining groups had lower incidence rates, especially Black substance users (32%).

Ancillary Analyses

We then separately explored current smoking across the race/ethnicity groups and current heavy alcohol/illicit substance across the race/ethnicity groups. For *smoking*, after controlling for the false discovery rate, Black smokers were significantly less likely to be waitlisted than the White nonsmoker referent group (HR, 0.31; 95% CI, 0.20-0.49; $P<0.001$). White smokers were also less likely to be waitlisted (HR, 0.49; 95% CI, 0.37-0.66; $P<0.001$), as were Black nonsmokers (HR, 0.69; 95% CI, 0.56-0.86; $P=0.001$). For *alcohol/illicit substance use*, both Black users and Other minority users were less likely to be waitlisted than the referent group (HR, 0.29; 95% CI, 0.16-0.53; $P<0.001$ and HR, 0.32; 95% CI, 0.14-0.75; $P<0.009$, respectively), as were Black nonusers (HR, 0.71; 95% CI, 0.57-0.87; $P=0.001$).

Cumulative Incidence of Transplantation After Waitlisting

Primary Analysis

Compared with the referent group, there were no significant study group differences in likelihood of transplantation after waitlisting (Table 4, column 3). At the end of follow-up, 57% to 74% of patients in the study groups received transplants after waitlisting (Figure 4B). Given the lack of effects, ancillary analyses by substance type were not pursued.

Alternative Analyses: Cox Models Examining Race/Ethnicity in Combination With Any Substance Use in Predicting Outcomes

Compared with the competing risk models, although Cox model effects vary slightly in size (given that Cox models are not estimating exactly the same thing as competing risk models), Cox model results were virtually identical to those of our primary analyzes in terms of identifying statistically significant effects (Table S1, SDC, <http://links.lww.com/TP/C348>). Only 1 difference emerged: for the waitlist outcome, Other minority substance users did not significantly differ from the referent group in the Cox

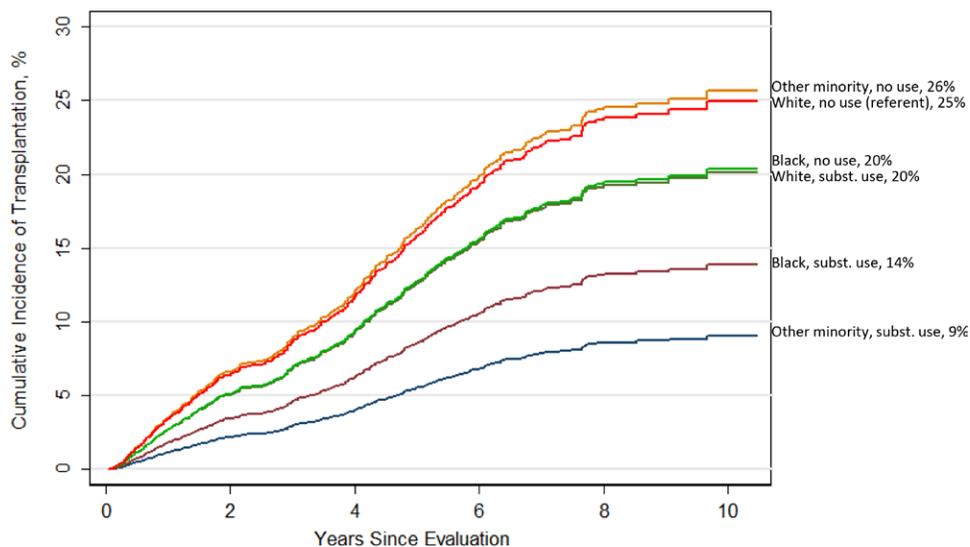


FIGURE 3. Cumulative incidence of kidney transplantation in 6 study groups defined by race/ethnicity in combination with use of any substances. See Table 4 for statistical comparisons between groups.

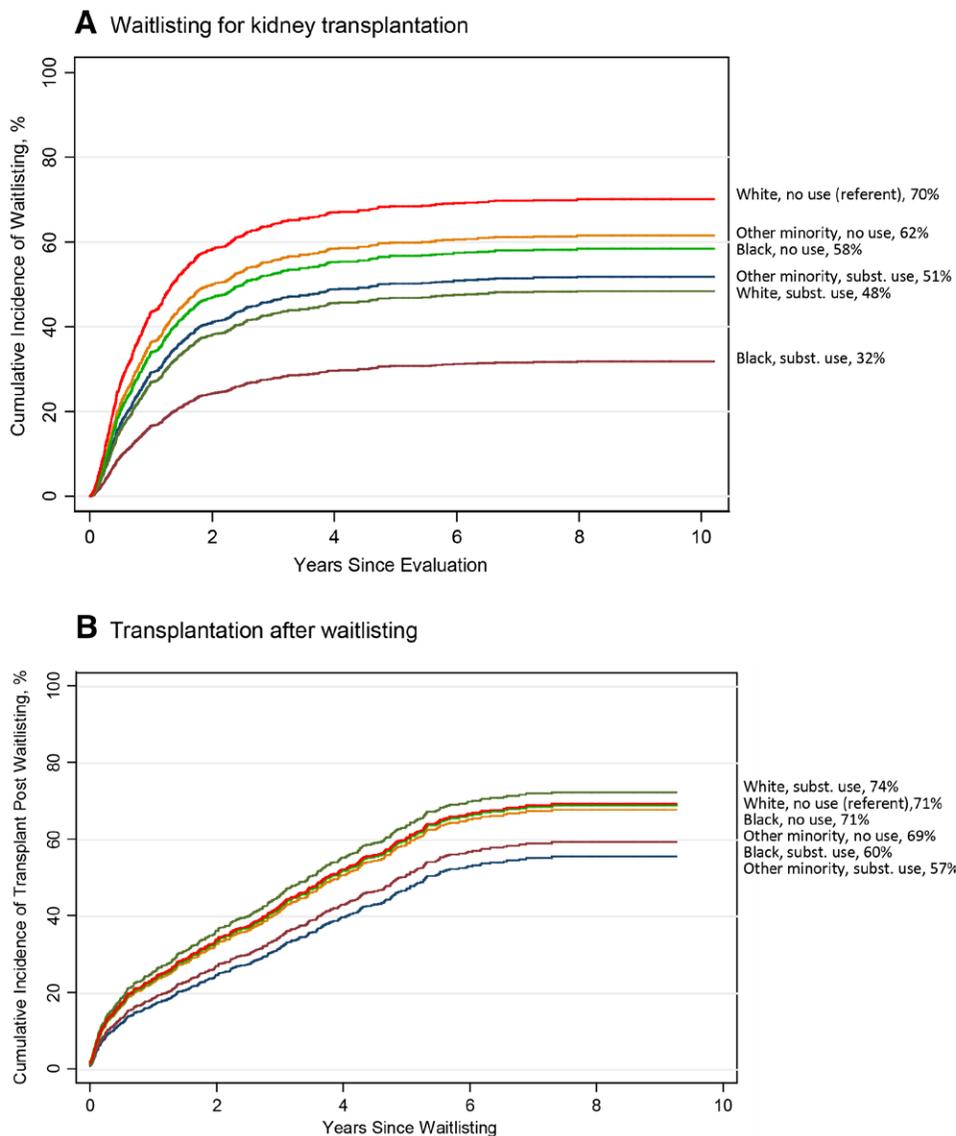


FIGURE 4. Cumulative incidence of waitlisting and of transplantation after waitlisting in 6 study groups defined by race/ethnicity in combination with use of any substances. See Table 4 for statistical comparisons between groups.

model (Cox HR, 0.63; 95% CI, 0.35-1.13; $P=0.120$ versus competing risk model HR, 0.60; 95% CI, 0.37-0.99; $P=0.049$).

DISCUSSION

We provide novel data on substance use in patients undergoing evaluation for kidney transplantation and on whether substance use characteristics varied by race/ethnicity. In addition, ours is the first study to examine whether racial/ethnic minority patients who used substances were uniquely disadvantaged in likelihood of transplantation.

We found noteworthy differences between race/ethnicity groups in prevalence of substance use. Black patients were most likely to currently smoke, and Black and Other minority patients were more likely than White patients to currently use illicit substances. The percentage of Black patients who smoked (26%) is similar to the national rate (25%),⁶⁴ whereas percentages of smokers among White and Other race/ethnicity minority patients (15% and 18%) were lower than national percentages (24% for White, 25%

for all non-Black races/ethnicities, weighted to reflect our sample's composition of other race/ethnicities). Percentages of current heavy alcohol use were lower in all our race/ethnicity groups (1%–4%) than national percentages (5%–8%), as were our sample's percentages of current illicit substance use (3%–9% versus 11%–13% nationally).

The smoking rate in Black patients appears unexpectedly high. In community samples, Black people who smoke have greater nicotine dependence (despite smoking less frequently) and are less successful in quitting than White individuals.^{48,88,89} Such factors may help explain our relatively large percentage of Black smokers. Although we could not examine mechanisms underlying observed smoking rates, our findings suggest that treatment and referral strategies may require expansion to address Black transplant candidates' potentially greater need for aggressive, tailored cessation interventions.

We found marked disparities in our main study outcome, overall incidence of kidney transplantation, for racial/ethnic minority patients using any substances at the time of transplant evaluation. The 2 minority groups of

substance users were 55% to 67% less likely to receive transplants than the referent group of White nonusers. In contrast, minority patient nonusers did not reliably differ from the referent group—indeed, nonusers in our Other race/ethnicity group were virtually identical to the referent group in likelihood of transplantation. Further, White substance users also did not differ significantly from the referent group.

Our findings of unique disparities in overall transplant rates for patients who were both racial/ethnic minorities and substance users are consistent with the notion of “double jeopardy”⁵⁰⁻⁵² and may have arisen for multiple reasons. First, beyond factors noted above that are associated with smoking in Black individuals, a growing literature shows that substance users in many racial/ethnic minority groups are less likely than White individuals to initiate or continue in cessation treatment, due at least partially to socioeconomic barriers.^{47,90,91} Although our analyses controlled for unemployment and health insurance status, which provide some indication of socioeconomic status and could have affected receipt of treatment, we did not have more direct socioeconomic status measures (eg, household per capita income, receipt of public assistance) that may have differentially affected patients’ ability to engage in treatment. Second, minorities are less likely to be referred for specialty care such as that required for substance use, suggesting clinician bias.^{92,93} In the context of kidney transplantation, lack of adequate cessation therapy may reduce patients’ prospects for receiving new organs. Substance users seen by our transplant program routinely received treatment recommendations and referrals; however, minority patients may have less often engaged in treatment and thus been less likely to achieve candidacy requirements for cessation. We could not investigate this because whether patients acted on treatment recommendations (or had the socioeconomic resources to do so) was not systematically documented in the EMR. In addition, reasons patients were declined for transplantation listed in the EMR focused on medical factors and rarely on substance use per se (Figure 2B).

Additional study findings suggest that the disparities we observed in receipt of kidney transplants in the cohort overall were largely explained by whether patients were waitlisted. Once patients were waitlisted, the combination of race/ethnicity and substance use did not predict who received a transplant: differences between minority groups using substances and the White nonuser referent group were the smallest for this outcome. This reduction in disadvantage does not mean that waitlisted minority patients who had used substances somehow became “advantaged” after waitlisting relative to the referent group in their chances for transplantation. Instead, they only became more similar to the referent group; their disadvantage was lessened, though not fully erased. In short, the overall differences in total rates of transplantation seem to have been driven by waitlisting differences because the disparities became smaller and nonsignificant after the waitlisting hurdle was achieved.

Furthermore, our analyses of differences in waitlisting suggest that the “double jeopardy” effect—although potentially important for both of our minority patient groups—may be most pronounced for Black substance users. They were the least likely of all study groups to be waitlisted.

This held true even when we separately considered tobacco use and heavy alcohol use/illicit substance use.

Results for our waitlist outcome also revealed that Black patients who did not use substances as well as White substance users were significantly less likely to be waitlisted than the referent group. Why, then, did these groups not reliably differ from the referent group on our main outcome of overall transplant rates in the entire cohort? Perhaps it was because, once waitlisted, they were at least as likely as the referent group to receive transplants (HRs from 0.99 to 1.09): in essence, they fully “caught up” with the referent group, leading to relatively small, nonsignificant differences overall when we examined total rates of transplant in the complete cohort.

Our study has noteworthy limitations. First, our data are observational and do not allow causal inferences about predictor-outcome relationships; however, from a practical, clinical perspective, one need not determine causality to develop risk-reduction interventions. Second, our cohort came from a single center, and generalizability is unknown. Third, although we prospectively collected outcomes data over a lengthy period and assessed important patient demographics in research interviews rather than relying on often incomplete EMR demographics,^{94,95} we determined substance use patterns retrospectively. A similar approach has been used previously.^{30,32,33,35,36,43,44} A retrospective strategy may be biased because the original evaluators may not have collected relevant information; however, psychosocial evaluators followed a protocol designed to promote consistent collection of psychosocial (including substance use) information. Fourth, patients may have underreported substance use in the psychosocial evaluation. Consequently, we marshaled additional data: although toxicology data were not collected at this evaluation, we retrieved corroborative information from family members and other transplant team members’ evaluations. Fifth, perhaps we did not observe between-group differences in transplant rates after waitlisting because of lower power (smaller sample size) than for other study outcomes; however, effect sizes from this analysis (HRs in Table 4) were small by conventional standards,^{78,79} whereas effects for significant differences on our other outcomes were generally considerably larger. Sixth, aside from Black patients, we could not perform finer-grained analyses examining other specific racial/ethnic minorities.

Another important limitation is that, although we could examine outcomes for our race/ethnicity groups in combination with use of *any* substances as well as in combination with tobacco use, we had limited to examining other specific types of substances: due to small numbers of cases, we could not explore heavy alcohol use separate from illicit substance use. In one recent report, alcohol use and illicit substance use were each independently associated with a significantly lower likelihood of transplantation³²; however, that study did not consider how the effects these substances may have varied by race/ethnicity. Moreover, illicit substance use is a heterogeneous category, but studies of impact on kidney transplant rates have largely focused only on any versus no illicit substance use.^{32,44} One study in a small sample with cannabis dependence disorders reported that greater disorder severity was related to lower likelihood of kidney transplantation, but other drug use was not predictive.⁴³ The role of race/ethnicity was not

examined, but clearly cannabis (marijuana) use requires additional attention, especially given its growing legalization for medicinal and recreational use.

Beyond study limitations, our findings have research and clinical care implications. Work to target and reduce disparities in kidney transplantation should consider that certain combinations of factors (including but perhaps not limited to minority race/ethnicity and substance use) may together be particularly strong contributors to disparities. In the case of substance use, we have noted that minority patients face barriers in receiving effective care and clinician bias in referral for such care. For example, clinicians may hold different assumptions about feasibility or effectiveness of substance use treatment for potential transplant candidates of different races/ethnicities and therefore may not inform them of all treatment options⁴⁵; however, there is a dearth of research identifying or intervening upon patient- or clinician-related barriers. Such work would be consistent with and extend the reach of research and educational agendas already proposed to address racism in transplantation.^{45,96}

From a clinical care perspective, heightened awareness among transplant teams that minority patients who use substances may face unique disparities in receipt of kidney transplants is essential. Substance use is an important contraindication to transplantation because ongoing use can adversely affect posttransplant clinical outcomes,²⁵⁻³² yet equity is threatened if racial/ethnic minority patients found to use substances at their initial transplant evaluation have a uniquely lower likelihood of transplantation than other patients. Greater awareness of this disparity could lead transplant teams to develop new strategies to (a) further improve care by facilitating and tracking patients' receipt of substance use interventions and (b) expand clinicians' cultural competence, including focused programs to educate clinicians about implicit biases they may hold about substance use in racial/ethnic minorities. Such efforts may facilitate progress toward ensuring that all patients receive equitable consideration for kidney transplantation.

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