Discontinuation of Chronic Benzodiazepine Use Among Adults in the United States



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BACKGROUND: Guidelines recommend most benzodiazepine (BZD) treatment be short-term, though chronic BZD use is increasing.

OBJECTIVE: Determine the rate of BZD discontinuation among chronic users and identify patient- and provider-level factors associated with discontinuation.

DESIGN, SETTING, AND PARTICIPANTS: A retrospective cohort study using nationwide insurance claims data from 2014 to 2016 of US adults \geq 18 years old with chronic BZD use (i.e., > 120 days) during the baseline year.

MAIN OUTCOMES AND MEASURES: The primary outcome was BZD discontinuation among chronic users after 1 year of follow-up. A series of multilevel logistic regression models examined the association of BZD discontinuation with patient and provider characteristics. Covariates included patient sociodemographics, medical and psychiatric comorbidity, co-prescribed opioids and other psychotropics, and characteristics of the prescribed BZD. **KEY RESULTS:** Of 141,008 chronic BZD users, 13.4% discontinued use after 1 year. Females had lower odds of discontinuation (AOR 0.83, 99% CI 0.79-0.87), while African-American patients had higher odds (AOR 1.12, 99% CI 1.03-1.22). Those prescribed a high-potency BZD had lower odds of discontinuation (AOR 0.51, 99% CI 0.47-0.54), as did those prescribed an opioid (AOR 0.94, 99% CI 0.89–0.99). After adjusting for patient- and provider-level factors, differences between providers accounted for 5.8% of variation in BZD discontinuation (p < 0.001). The median odds ratio for provider was 1.54, an association with discontinuation larger than almost all patient-level clinical variables.

CONCLUSIONS: A small minority of patients prescribed chronic BZD in a given year are no longer prescribed BZDs 1 year later. There is significant variation in the likelihood of discontinuation accounted for by non-clinical factors such as race, geography, and a patient's provider, which had a stronger association with the odds of discontinuation than almost every other patient-level variable.

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Received September 12, 2018 Revised April 11, 2019 Accepted May 9, 2019 Published online June 25, 2019 Provider-facing elements of interventions to reduce BZD prescribing may be critical.

KEY WORDS: benzodiazepine; older adults; pharmacology; psychiatry.

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INTRODUCTION

Benzodiazepine (BZD) use is common and growing in the USA, with a prescription filled by 5.6% of adults in the USA annually, including 8.6% of those \geq 65. Clinical guidelines and expert opinion recommend that BZDs should primarily be prescribed on a short-term basis.²⁻⁵ vet chronic BZD use (i.e., > 120 days⁶) is common—ranging from 14.7% among those 18-35 who are prescribed a BZD to 31.4% among adults $\geq 65^7$ —and increasing.^{1, 8} While concern about the potential harms associated with BZDs typically focuses on older adults,9, 10 there are risks associated with use for all ages, such as increased motor vehicle accident risk—actually highest among younger patients 11—and short-term memory effects for all ages. 12 In addition, BZDrelated overdose deaths have been rising for all age groups,¹ and co-prescribing BZDs with opioids increases the risk of opioid-related overdose mortality. 1, 13 As chronic BZD use continues and grows, increasing numbers of adults in the USA will accumulate time at risk for these BZD-related harms.

Chronic BZD use is particularly challenging to address because of both the physiological and potential psychological dependence that may develop. 14 Cook et al. explored BZD-related beliefs in older adults that had been regularly prescribed a BZD. 15 Confronted with the prospect of a taper, one patient said, "I see no reason [to] put myself through hell." In a companion paper focused on physician attitudes, physicians cited a variety of reasons for continuing BZDs for their older adult patients, such as assuming patients would be resistant to change, anticipating a taper would cause distress for patients, and believing that BZDs were more effective than available alternatives. 16 A small group of studies have examined the transition to chronic use among new BZD users and found that

non-clinical factors such as gender, days prescribed, and provider are important predictors.^{17, 18} However, less is known about the factors among chronic BZD users associated with stopping BZD therapy—or even whether these patients ever stop.

To understand more about patients with chronic prescription BZD use and which patients discontinue use, we evaluated 2014–2016 healthcare claims from a large US health insurer. The objectives of this study were to (1) determine the rate of BZD discontinuation among chronic users; (2) identify which patient clinical characteristics predict discontinuation; (3) determine whether non-clinical characteristics (e.g., geography, provider) are associated with discontinuation; and (4) determine the contribution of these patient- and provider-level factors to BZD discontinuation.

METHODS

Data Source/Study Cohort

We used the Optum© Clinformatics® Data Mart, which is derived from health claims of a large national health insurance company in the USA, including commercially insured and Medicare Advantage beneficiaries. While patients and their providers are de-identified, they are uniquely represented within the data, which allows patients to be grouped by shared providers. The study cohort was drawn from adults ≥ 18 who were continuously enrolled from January 2014 to June 2016. We defined chronic BZD use as any patient who possessed > 120 days of BZD supply^{6, 7} during the 12 months between April 2014 and March 2015 (referred to as "baseline"). We identified the number of BZD days a patient held based on claims beginning January 1, 2014; claims from the three prebaseline months (i.e., January through March 2014) were included to ensure that our baseline year accounted for BZD days from prescriptions dispensed before April 1, 2014. For example, a 90-day supply dispensed on March 1, 2014, contributed 59 days (i.e., 90 days dispensed-31 days prescribed in March) towards the chronic BZD criteria of > 120 days during baseline.

BZD Discontinuation

We considered a patient to be a BZD discontinuer if they had no BZD supply at the end of the follow-up year, which ended on March 31, 2016. To ensure a patient was not misclassified as a discontinuer due to a gap in their prescriptions, we extended the no-coverage window 3 months before and after this final day (i.e., a discontinuer had 0 days' supply between January 1 and June 30, 2016).

Patient and Provider Covariates

We derived patient sociodemographic characteristics including age, gender, race, education, and location (limited by Optum to US Census division). We used ICD-9-CM codes from clinical encounters during the baseline year to compute

the Charlson Comorbidity Index score and specific indicators for pain, insomnia, and mental health conditions including anxiety disorders, substance use disorders, and depression (online eTable 1). We also determined use of opioids and non-BZD psychotropic medications during baseline.

Baseline BZD consumption was used to derive several additional variables, including use of a long-acting BZD or high-potency BZD.^{17, 19} Additionally, we computed average daily BZD consumption in lorazepam-equivalent doses²⁰ as well as if a patient's BZD was prescribed by > 1 distinct providers during the baseline year.

We assigned patients to the provider that prescribed the greatest number of BZD days during baseline. Only chronic users whose provider saw at least 3 chronic users were included to achieve more reliable provider-level average discontinuation rates. Baseline chronic users whose provider saw at least 3 patients received their BZDs from a total of 22,063 prescribers. The number of patients per prescriber ranged from three to 182; the median number of patients per provider was five. Provider specialty was determined using provider taxonomy and classification information provided by Optum and included physicians, physician assistants, and nurse practitioners.

Statistical Analysis

First, we identified the most commonly prescribed BZDs among chronic users at baseline, categorized by potency. Next, we summarized characteristics of discontinuers and continuers using descriptive statistics. Due to our large sample size, standardized differences were used to compare characteristics between patients who discontinued BZDs and those who continued use.²² An absolute standardized difference < 0.1 was considered negligible.²³

Multilevel logistic regression was used to examine the patient and provider characteristics associated with BZD discontinuation (1 = discontinue; 0 = continue). A provider-level random intercept was included in all models to adjust for correlation among patients with the same provider and estimate the amount of variation in BZD cessation attributable to provider. After estimating bivariate associations, we fit the following models to meet our study objectives: Model 1 included patient age and clinical diagnoses-i.e., the characteristics that should guide the clinical decision to discontinue a BZD; model 2 added characteristics of the prescribed BZD (e.g., potency, half-life, days' supply during baseline); model 3 included non-age sociodemographic characteristics that should not influence prescribing but are nonetheless associated (e.g., race, gender); finally, model 4 added provider specialty. A null model was also fit to estimate overall variation in BZD cessation due to provider.

To assess the relative importance of the characteristics added in successive models, we conducted likelihood ratio tests and examined the Akaike information criterion (AIC) and area under the receiver operating characteristic curve (*C*-

statistic) across the series of models. The *C*-statistic was computed using predicted probabilities derived assuming an average provider effect. To examine variation in discontinuation attributable to provider, we computed the intraclass correlation (ICC) across the series of models using Merlo et al. latent response formulation.²⁴ Finally, to place the provider-level effect into perspective, we calculated the median odds ratio (MOR) for each model, which is the median value of the odds ratio between a provider whose patients were highly likely to discontinue versus a provider whose patients were less likely to discontinue when randomly selecting two providers from our sample.²⁵

In sensitivity analysis, we examined if findings were consistent when reclassifying patients with brief and episodic use of BZD (i.e., < 14 days supplied over the follow-up year) as discontinuers.

Analyses were conducted in SAS version 9.4 (SAS Institute, Cary, NC) using the glimmix procedure and adaptive Gauss-Hermite quadrature. The C-statistic was computed using the "rms" package in R version 3.4.0 (The R Foundation for Statistical Computing, 2017). Due to our large sample size, statistical significance was set at $\alpha = 0.01$.

This retrospective study of de-identified secondary data was exempt from review by the University of Michigan Medical School IRB and informed consent was waived.

RESULTS

Characteristics of Chronic BZD Users Overall and Discontinuers

We identified a total of 141,008 adults with chronic BZD use at baseline whose providers saw at least 3 chronic BZD users. Alprazolam accounted for the most days prescribed among chronic users (39.0%), followed by clonazepam (21.9%) and lorazepam (18.8%), all high-potency BZDs. The overall study population had a mean age of 63 (standard deviation [SD] 14.6) and the majority were female (66.3%) and white (72.4%) (Table 1). 44.8% of chronic BZD users had an anxiety or adjustment disorder diagnosis, while 56.8% received prescription opioids during baseline. 31.0% received their BZD from more than one provider. The majority of patients received their prescriptions from primary care providers (70.5%), 20.7% from a psychiatrist.

Of chronic BZD users, 13.4% discontinued BZD by the end of the following year (i.e., 0 days of BZD supply between January 1, 2016 and June 30, 2016). Patient and provider characteristics by BZD discontinuation status are provided in Table 1 (with row percentages provided in online eTable 2). The largest standardized differences between patients who did and did not discontinue their BZDs were based on the characteristics of their prescribed BZD: patients who discontinued their BZD had fewer BZD days prescribed during baseline and were prescribed lower daily doses. The next largest difference

was by patient geography, which had a larger standardized difference than any clinical characteristic.

Variation in Discontinuation Attributable to Patient and Provider

Along with the null model, we fit 4 separate multilevel logistic regression models to characterize the relationship between patient and provider characteristics and BZD discontinuation (Table 2). Model 1, which included only age and clinical characteristics—the factors that would be expected to predict discontinuation—correctly classified discontinuation among 57.6% of patients. Each successive model improved the ability to predict discontinuation and improved model fit, but the largest incremental gain in predictive ability occurred with model 2, which added characteristics of the prescribed BZD (likelihood ratio test comparing models 1 and 2: $\chi^2 = 5915.4$; df = 5, p < 0.001). In the final model, after adjusting for all patient characteristics, provider-level variation remained significant and accounted for 5.8% of the residual variation in BZD discontinuation (p < 0.001). As the model including all patient and provider characteristics (i.e., model 4) was the best-fitting model, interpretation of associations will focus on model 4.

Patient and Provider Characteristics Associated with Discontinuation

In adjusted analyses, BZD discontinuation was less likely among patients aged 45–64 than both younger and older patients (Table 3). Female patients were less likely to discontinue, while African-American patients were more likely. The effect of geography on discontinuation was larger than most patient-level variables. Patients in the mid-Atlantic Census division (New Jersey, New York, and Pennsylvania) had the lowest odds of discontinuation while patients in the Pacific (Alaska, California, Hawaii, Oregon, and Washington) had the highest.

Patients with bipolar disorder and anxiety disorders were significantly less likely to discontinue BZDs during the follow-up year, as were those with prescription opioid use. Patients with insomnia and dementia were more likely to discontinue. The characteristics of the prescribed BZD were significantly associated with discontinuation: use of high-potency BZD markedly decreased the odds of discontinuation.

Patients that received their BZD from a primary care provider were no more likely to have their BZD discontinued than those prescribed to by a psychiatrist. Patients with their BZDs prescribed by more than one provider had higher odds of discontinuation. At 1.54, the median odds ratio derived from the fully adjusted model suggests that the provider seen had a stronger association with the odds of discontinuation than a large number of patient-level variables.

In sensitivity analyses, findings did not change when we expanded the definition of discontinuers to those with < 14 days' supply of BZD at the end of the follow-up year.

Table 1 Demographic and Clinical Characteristics of Chronic Benzodiazepine Users at Baseline

	Chronic BZD use N(%)	Continued use $N(\%)$	Discontinued N (%)	Standardized difference
Overall ^a	141,008 (100.0)	122,101 (86.6)	18,907 (13.4)	
Patient demographic characteristics				
Age (years)				
18–44	17,002 (12.1)	14,291 (11.7)	2711 (14.3)	0.14
45–64	52,805 (37.4)	46,778 (38.3)	6027 (31.9)	
65+	71,201 (50.5)	61,032 (50)	10,169 (53.8)	
Gender	, , , , , , , , , , , , , , , , , , , ,	,,,,,	, ()	
Female	93,508 (66.3)	81,521 (66.8)	11,987 (63.4)	-0.07
Male	47,500 (33.7)	40,580 (33.2)	6920 (36.6)	
Race/ethnicity	.,,,,,,,,	10,000 (001-)	**=* (****)	
Asian	1686 (1.2)	1423 (1.2)	263 (1.4)	0.04
Black	10,132 (7.2)	8708 (7.1)	1424 (7.5)	0.0 .
Hispanic	16,522 (11.7)	14,209 (11.6)	2313 (12.2)	
White	102,026 (72.4)	88,576 (72.5)	13,450 (71.1)	
Census division	102,020 (72.1)	00,570 (72.5)	13, 130 (71.1)	
East North Central	16,589 (11.8)	14,677 (12)	1912 (10.1)	0.22
East South Central	6578 (4.7)	5773 (4.7)	805 (4.3)	0.22
Middle Atlantic	4985 (3.5)	4425 (3.6)	560 (3)	
Mountain	16,011 (11.4)	13,353 (10.9)	2658 (14.1)	
New England	4047 (2.9)	3571 (2.9)	476 (2.5)	
Pacific	18,349 (13)	15,067 (12.3)	3282 (17.4)	
South Atlantic	44,758 (31.7)	39,700 (32.5)	5058 (26.8)	
West North Central	9140 (6.5)	8136 (6.7)	1004 (5.3)	
West South Central	20,551 (14.6)	17,399 (14.2)	3152 (16.7)	
Patient clinical characteristics	20,331 (14.0)	17,399 (14.2)	3132 (10.7)	
Depression	47.211 (22.5)	40.802 (22.5)	6210 (22.4)	0
Bipolar disorder	47,211 (33.5)	40,893 (33.5) 8974 (7.3)	6318 (33.4)	-0.03
	10,239 (7.3) 63,154 (44.8)		1265 (6.7) 7861 (41.6)	- 0.03 - 0.07
Anxiety and adjustment disorders		55,293 (45.3)		
Suicidality	1695 (1.2)	1346 (1.1)	349 (1.8)	0.06
Dementia	6429 (4.6)	4989 (4.1)	1440 (7.6)	0.15
Insomnia	24,693 (17.5)	20,670 (16.9)	4023 (21.3)	0.11
Substance use disorder ^b	8134 (5.8)	6846 (5.6)	1288 (6.8)	0.05
Alcohol use disorder	3620 (2.6)	3016 (2.5)	604 (3.2)	0.04
Medication use during baseline	00.140 (56.0)	(0, (01, (57,1)	10.450 (55.0)	0.04
Opioid use ^c	80,140 (56.8)	69,681 (57.1)	10,459 (55.3)	-0.04
Non-BZD anxiolytic use	29,540 (20.9)	25,367 (20.8)	4173 (22.1)	0.03
Characteristics of baseline BZD ^d	100 511 (05 5)	107 110 (05 1)	4.5.00.5 (50.0)	o 4=
High potency	120,544 (85.5)	105,449 (86.4)	15,095 (79.8)	-0.17
Baseline daily BZD dose in lorazepam-equivalent	2.2 (2.4)	2.3 (2.5)	1.4 (1.6)	-0.43
mg/day, mean (SD)				
BZD days prescribed during baseline year, mean (SD)	299 (125.1)	307.2 (126.4)	245.9 (101.1)	-0.54
Number of unique BZD prescribers				
1	97,270 (69)	84,521 (69.2)	12,749 (67.4)	0.04
>1	43,738 (31)	37,580 (30.8)	6158 (32.6)	
Provider characteristics				
Specialty/discipline				
Primary care	99,352 (70.5)	85,777 (70.3)	13,575 (71.8)	0.08
Psychiatry	29,226 (20.7)	25,780 (21.1)	3446 (18.2)	
Surgeon	877 (0.6)	744 (0.6)	133 (0.7)	
Other provider	11,553 (8.2)	9800 (8)	1753 (9.3)	

BZD benzodiazepine

DISCUSSION

In this nationwide sample of adults prescribed chronic BZD, 13% discontinued use by the end of the following year. A prescription opioid was prescribed to 57% of chronic BZD users, a more common "comorbidity" among chronic BZD users than any clinical disorder, including insomnia or anxiety. Non-clinical factors such as the type of BZD prescribed were strongly associated with odds of discontinuation (AOR associated with taking a high-potency BZD 0.51 [99% CI 0.47–

0.54]), while the effect of geography exceeded most clinical variables (e.g., AOR associated with the Pacific division vs. the mid-Atlantic 1.85 [99% CI 1.61–2.13]). Finally, the particular provider a patient saw was significantly associated with whether or not they discontinued their BZD (ICC 5.8%, p < 0.001).

The high percentage of chronic BZD users also prescribed opioids is concerning. In light of the increased risk of overdose among patients co-prescribed both medications, ^{26, 27} this is

^aOverall BZD use is reported as row percentage; unless otherwise indicated, all other results reflect column percentage

^bIncludes substance use disorders other than alcohol and tobacco use disorders

^cMedication variables reflect use during baseline year

^dChronic benzodiazepine users (n = 141,008) at baseline were prescribed 42,155,326 days. The most commonly prescribed medications included alprazolam (39.0%), clonazepam (21.9%), lorazepam (18.8%), temazepam (10.4%), and diazepam (7.6%)

Table 2 Variation in Benzodiazepine Discontinuation Explained by Patient Characteristics and Provide	Table 2 Variation in Be	enzodiazenine Discontinuat	ion Explained by Patient	Characteristics and Provider
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	Null model	Model 1: age + clinical characteristics ^a	Model 2: M1 + prescribed BZD ^b	Model 3: M2 + patient demographics ^c	Model 4: M3 + provider type ^d
Variance estimate	0.2585	0.2517	0.2452	0.2064	0.2018
PCV (%)	Reference	-2.62	-5.14	-20.14	-21.94
ICC	0.073	0.071	0.069	0.059	0.058
MOR	1.62	1.61	1.60	1.54	1.54
Model fit					
-2LL	_	109.419.7	103,504.3 ^e	102.928.2 ^f	102,889.4 ^g
AIC	_	109,463.7	103,558.3	103,012.2	102,979.4
C-statistic	_	0.576	0.688	0.696	0.696

ICC intraclass correlation, PCV proportional change in variance, MOR median odds ratio, -2LL log likelihood, AIC Akaike information criterion Model 1: adjusted for age and patient clinical characteristics

arguably the patient population most at risk from continued BZD use.²⁸ Therefore, it is concerning that those coprescribed opioids had slightly lower odds of having their BZD discontinued in the following year.

Among the other clinical characteristics considered, it was unexpected that patients with insomnia were more likely to stop BZD use. This is potentially positive news in light of studies demonstrating that chronic use of BZD for insomnia can lead to worse sleep outcomes, including increased number of nighttime awakenings as compared with non-users.²⁹ BZD discontinuation was more likely among patients with suicidality, substance use disorders, and dementia, all of whom are potentially high-risk populations for use. 30, 31 The lower odds of discontinuation among patients with anxiety disorders may reflect limited access to alternative treatments such as cognitive behavioral therapy or their use for treatmentresistant disorders. In addition, patients with anxiety may be more likely to interpret physiological symptoms of BZD withdrawal as the return of the symptoms of their anxiety disorder,³² which may make discontinuation for these patients difficult.

The likelihood of BZD discontinuation was strongly related to characteristics of the prescribed BZD at baseline, including potency, half-life, and the number of days supplied. Patients prescribed a high-potency BZD had half the odds of discontinuation relative to those prescribed low-potency options, which is unfortunate because the top three most widely prescribed BZDs were high-potency. Our findings mirror prior analyses considering the factors that influence which new users become chronic users. We recently found that among new BZD users, an initial prescription with 10 additional days' supply nearly doubled the odds of chronic BZD use 1 year later. 18 Simon et al. also demonstrated that the specific medication and size of the initial fill also predicted chronic use. 17 Providers starting a BZD should "begin with the end in mind", as features of the prescribed BZD are associated with both the

likelihood of becoming a chronic user and then being able to discontinue.

A variety of non-clinical characteristics were associated with discontinuation. While African-American patients are less likely to be prescribed a BZD in the first place, 1, 33 we found they were also more likely to have their BZD stopped. The same clinician biases that limit prescribing of controlled substances to African-American patients³⁴ paradoxically leave them less exposed to the potential harms of BZD exposure. On the other hand, African-American patients who may benefit from BZD treatment may be less likely to receive it or have it stopped prematurely.³³ In contrast, females are more likely to be prescribed a BZD but were less likely to have their prescription discontinued. Finally, given that older adults have the highest rates of chronic BZD use, 7, 35 it was surprising that they also had higher odds of discontinuation. This suggests providers may recognize that their use is potentially inappropriate for older adults and reduce use where possible.^{9, 10}

The effect of patient geography on discontinuation was larger than nearly all other patient-level variables. Prior work has suggested significant regional variation in prescribing of controlled substances. 36, 37 Such variation may reflect characteristics of patients in those particular locations, the prescribing practice of the doctors they see, or community factors such as the availability of alternative non-pharmacologic treatment options such as psychotherapy. However, one possible explanation for at least some amount of geographic variation may be state medical marijuana laws. The Pacific division states, which had the highest odds of discontinuation, were among the first to allow both medical and recreational marijuana use.³⁸ There is some evidence that passage of medical marijuana laws may lead to lower use of medications for sleep and anxiety, such as BZDs.39

Finally—the specific provider seen had a stronger association with the odds of discontinuation than almost every other patient-level variable, adding to the few studies highlighting

bModel 2: adjusted for model 1 characteristics + characteristics of the prescribed BZD (half-life, days supplied during baseline, and receiving a BZD from > 1 provider)

Model 3: adjusted for model 2 characteristics + non-age sociodemographic characteristics (gender, race, education, and region)

^dModel 4: adjusted for model 3 characteristics + provider specialty

^eLikelihood ratio (LR) test comparing models 1 and 2: χ^2 = 5915.4; df = 5, p < 0.001 ^fLR test comparing models 2 and 3: χ^2 = 579.1; df = 17, p < 0.001 ^gLR test comparing models 3 and 4: χ^2 = 38.9; df = 4, p < 0.001

Table 3 Patient- and Provider-Level Characteristics Associated with Benzodiazepine Discontinuation Among Chronic Users (N=144,184)

	Unadjusted OR (99% CI) ^a	Adjusted OR (99% CI) ^{a,b}
Patient demographic characteristics		
Age (years)		
18–44	1.49 (1.39, 1.59)	1.40 (1.31, 1.50)
45–64	1 [Reference]	1 [Reference]
65+	1.29 (1.24, 1.36)	1.19 (1.13, 1.25)
Female	0.86 (0.82, 0.89)	0.83 (0.79, 0.87)
Race/ethnicity	(,,	(****, *****)
White	1 [Reference]	1 [Reference]
African-American	1.08 (1.00, 1.17)	1.12 (1.03, 1.22)
Hispanic	1.09 (1.02, 1.17)	0.95 (0.89, 1.02)
Asian	1.20 (1.00, 1.44)	1.00 (0.82, 1.20)
Census division	, , , , ,	(, , , , , , , , , , , , , , , , , , ,
East North Central	1.03 (0.90, 1.19)	1.14 (0.98, 1.32)
East South Central	1.10 (0.93, 1.30)	1.27 (1.07, 1.50)
Middle Atlantic	1 [Reference]	1 [Reference]
Mountain	1.59 (1.39, 1.83)	1.68 (1.45, 1.93)
New England	1.04 (0.86, 1.25)	1.18 (0.97, 1.42)
Pacific	1.74 (1.52, 1.99)	1.85 (1.61, 2.13)
South Atlantic	1.02 (0.90, 1.16)	1.16 (1.02, 1.33)
West North Central	0.98 (0.84, 1.15)	1.07 (0.91, 1.25)
West South Central	1.46 (1.27, 1.67)	1.54 (1.34, 1.77)
Patient clinical characteristics		
Depression	1.01 (0.97, 1.06)	1.01 (0.95, 1.06)
Bipolar disorder	0.92 (0.85, 1.00)	0.88 (0.80, 0.98)
Anxiety and adjustment disorders	0.86 (0.82, 0.90)	0.90 (0.86, 0.94)
Suicidality	1.76 (1.50, 2.07)	1.38 (1.15, 1.66)
Dementia	1.99 (1.83, 2.16)	1.87 (1.71, 2.06)
Insomnia	1.34 (1.27, 1.41)	1.29 (1.22, 1.37)
Substance use disorder	1.24 (1.14, 1.35)	1.32 (1.21, 1.45)
Alcohol use disorder	1.33 (1.18, 1.50)	1.19 (1.05, 1.36)
Medication use during baseline		
Opioid use	0.92 (0.89, 0.96)	0.94 (0.89, 0.99)
Non-BZD anxiolytics, sedatives, and hypnotic use	1.09 (1.03, 1.14)	1.01 (0.96, 1.07)
Characteristics of baseline BZD		
High-potency	0.62 (0.59, 0.65)	0.51 (0.47, 0.54)
Average daily strength of baseline BZD in lorazepam-equivalent doses ^d	0.74 (0.73, 0.75)	
Per additional 30 days' supply prescribed BZD during baseline year ^e	0.84 (0.84, 0.85)	0.84 (0.83, 0.84)
Obtained BZDs from > 1 provider	1.07 (1.02, 1.12)	1.14 (1.09, 1.19)
Provider characteristics		
Specialty/discipline		
Primary care	1.18 (1.11, 1.25)	1.04 (0.97, 1.12)
Psychiatry	1 [Reference]	1 [Reference]
Surgeon	1.35 (1.02, 1.79)	1.28 (0.97, 1.70)
Other physician	1.33 (1.21, 1.46)	1.23 (1.11, 1.36)
Median odds ratio	n/a	1.54

OR odds ratio, CI confidence interval, BZD benzodiazepine

the role of individual providers in BZD prescribing. ^{17, 28, 40} This suggests that provider-facing elements may be important aspects of interventions to reduce BZD prescribing, such as used in recent studies to reduce potentially inappropriate antibiotic ⁴¹ and antipsychotic ⁴² prescribing. Providers should also be mindful that their prescribing choices, such as selecting a high-potency agent or providing more days of medication, may make discontinuation less likely. Somewhat surprisingly, patients with their BZDs prescribed by more than one provider had higher odds of discontinuation. However, this may reflect provider change, with a new provider that re-evaluates prescriptions.

Our work has several limitations. First, our analysis was based on prescription claims rather than actual medication consumption, so it is possible that the extent of regular use is overestimated. No data were available on the reason a specific BZD was prescribed, and we did not capture transitions between high- and low-potency BZDs among individual patients, which may influence discontinuation. While our analysis included provider specialty, other provider characteristics that may be associated with BZD discontinuation were not available, such as time in practice or gender. Lastly, local factors such as the availability of psychotherapy providers may also influence discontinuation, but the data set did not

^aModels included a random intercept for provider

^bThe adjusted model reported here is model 4 from Table 3 and includes all the variable rows above, including patient demographics, clinical characteristics, prescribed BZD characteristics, and provider specialty

^cIncludes the non-BZD central nervous system—active medications above (opioids, antidepressants, antipsychotics, non-BZD anxiolytics, and mood stabilizers) as well as central nervous system stimulants

^dNot included in adjusted model due to collinearity with days' supply of BZD at baseline

^eWe centered days' supply at baseline and divided by 30 so the OR corresponded to each additional 30 days prescribed during baseline. Because the relationship between days' supply at baseline and the log odds of discontinuing was non-linear, we included the term squared. In model 4, the OR for this term squared was 1.01

include geography at a more granular level than Census division.

CONCLUSIONS

The decision to prescribe and then discontinue a BZD—or any other medical treatment—should be driven by a clinical need. However, we found that a variety of non-clinical characteristics were associated with BZD discontinuation. In addition, a patient's specific provider had a stronger association with their odds of discontinuation than almost every other patient-level variable, which suggests interventions to successfully reduce chronic BZD prescribing may need to include a focus on individual clinicians. Finally, since chronic BZD use is rarely the goal when a new BZD is started, clinicians may increase the likelihood of discontinuation by selecting a low-potency option.

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Compliance with Ethical Standards:

This retrospective study of de-identified secondary data was exempt from review by the University of Michigan Medical School IRB and informed consent was waived.

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