

BMJ Open Financial incentives to discontinue long-term benzodiazepine use: a discrete choice experiment investigating patient preferences and willingness to participate

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ABSTRACT

Objectives Investigate the acceptability of financial incentives for initiating a medically supervised benzodiazepine discontinuation programme among people with long-term benzodiazepine use and to identify programme features that influence willingness to participate.

Methods We conducted a discrete choice experiment in which we presented a variety of incentive-based programs to a sample of older adults with long-term benzodiazepine use identified using the outpatient electronic health record of a university-owned health system. We studied four programme variables: incentive amount for initiating the programme, incentive amount for successful benzodiazepine discontinuation, lottery versus certain payment and whether partial payment was given for dose reduction. Respondents reported their willingness to participate in the programmes and additional information was collected on demographics, history of use and anxiety symptoms.

Results The overall response rate was 28.4%. Among the 126 respondents, all four programme variables influenced stated preferences. Respondents strongly preferred guaranteed cash-based incentives as opposed to a lottery, and the dollar amount of both the starting and conditional incentives had a substantial impact on choice. Willingness to participate increased with the amount of conditional incentive. Programme participation also varied by gender, duration of use and income.

Conclusions Participation in an incentive-based benzodiazepine discontinuation programme might be relatively low, but is modifiable by programme variables including incentive amounts. These results will be helpful to inform the design of future trials of benzodiazepine discontinuation programmes. Further research is needed to assess the financial viability and potential cost-effectiveness of such economic incentives.

INTRODUCTION

Benzodiazepines are frequently used to treat insomnia and anxiety disorders. In 2013, 8.6% of Americans age 65 or above filled

Strengths and limitations of this study

- This study is the first to provide evidence on the acceptability of financial incentives for benzodiazepine discontinuation in older adults with a history of long-term benzodiazepine use.
- It provides insights into the preferences of this group of patients and will be helpful to inform the design of future trials of benzodiazepine discontinuation programmes.
- Our findings are limited by the relatively small number of participants and the focus on one study site.
- As we are using a stated preferences method, it is not clear whether patients would make the exact same choices when faced with the real-life decision.

one or more benzodiazepine prescription.¹ While short-term use for panic disorder and insomnia are supported by some clinical practice guidelines,²⁻⁴ long-term use is associated with serious risks, including overdose,¹ misuse and use disorder,⁵ falls,⁶ motor vehicle crashes,⁷ cognitive impairment⁸ and dementia,⁹ particularly in older adults. Despite known risks associated with long-term use, discontinuing therapy with benzodiazepines can be very difficult because of physiological dependence as well as the potential for return of the symptoms that prompted benzodiazepine initiation.⁵ While withdrawal symptoms can be mitigated in part by a slow taper,¹⁰ many patients are resistant to initiation of the taper.¹¹ Strategies such as providing patient education about the risks of benzodiazepine use have proven only modestly effective in encouraging discontinuation of therapy.¹²

In this context, giving people monetary incentives conditional on achieving

reduction in use and discontinuation might be a useful approach. Standard economic theory suggests that giving people monetary incentives conditional on achieving a specific health-related goal can make the net benefits of behavioural change positive, immediate and more tangible for some individuals, and therefore increase the likelihood of seeing the target population adopt healthier behaviours.¹³ While this type of strategy is increasingly used and has been shown effective in several contexts,^{14–19} no studies have explored the use of incentives in benzodiazepine use. Besides setting a monetary value that rewards a well-defined outcome, incentive design entails a careful consideration of a variety of features, especially in the case of behaviours involving repeated choices whose long-term consequences are likely to be underweighted in the decision-making process and can lead to persistent unhealthy habits. Characteristics of payments such as their frequency (regular versus one-off),²⁰ certainty (guaranteed payments versus lotteries),²¹ or their nature (cash versus vouchers), must be considered as they can influence take-up and success. Also, individuals often exhibit decision-making biases such as loss aversion, present bias²² or the overweighting of small probabilities and previous work has shown that financial incentives designed around these biases are particularly effective in influencing behaviours.²³ However, relatively little is known about the influence of incentive design on the willingness to participate in incentive-based programs and how to adapt the design to different populations/behaviours to maximise take-up, especially in the case of older adults. Previous work in this population group has shown that even small incentives are likely to increase stated uptake of a physical activity programme and that cash incentives were preferred over vouchers.²⁴ A recent UK study on acceptability of financial incentives targeted a range of behaviours showed that lottery-based incentives were not deemed acceptable and that older people preferred programmes with no incentives.²⁵ Identifying effective incentives becomes even more challenging when considering compulsive and potentially harmful behaviours that may be perceived as acceptable and safe such as the use of physician-prescribed drugs in general and benzodiazepine use in particular. Thus, there is a clear gap in knowledge about optimal incentive structure to present to older individuals to induce programme participation for healthy behavioural change. This study presents a unique opportunity to narrow this gap by focusing on patients with long-term prescription benzodiazepine use.

In this study, we used a discrete choice experiment (DCE) to investigate the acceptability of financial incentives for initiating a medically supervised benzodiazepine discontinuation programme among long-term benzodiazepine users and to identify programme features that influence the willingness to participate. More specifically, we randomly presented a variety of incentive-based programs that differed according to a set of key features (eg, incentive amount, lottery versus certain payment)

to a sample of older adults (age 50+ years) with long-term benzodiazepine use. We then asked respondents to report their willingness to participate in the programmes and collected additional information on demographics, history of use and anxiety symptoms. We used discrete choice modelling to investigate the trade-offs that individuals make between programme features as well as patient factors that affect willingness to participate.

METHODS

Data collection

We identified potential subjects from the patient population of the primary care and behavioural health outpatient practices of a university-owned health system. Eligible participants were aged 50 or older, with an anxiety diagnosis at any point as an outpatient or with anxiety listed on their active problem list within the electronic health record. Additionally, eligible participants must have had at least three benzodiazepine prescription orders in the previous 12 months, with the most recent prescription within 90 days of our initial screening for study participants. Those with a history of a seizure disorder were excluded. Before contacting any participants, we reached out to each provider to give them the opportunity to opt-out any of their patients who they did not wish to participate in the study.

We contacted the remaining eligible participants over phone from May 2015 to August 2015. Contacted individuals who were no longer taking their benzodiazepine medication(s) were excluded as ineligible. Research staff obtained verbal consent over phone and subsequently randomised each participant to either version A or B of the study questionnaire (see Design of the choice experiment section). Stamped and addressed envelopes were provided with the questionnaires for participants to easily return the surveys. On sending back the survey, all participants were mailed a retail gift card worth US\$20. The study was considered exempt from institutional review board oversight under exemption category 2 (ie, research involving the use of educational tests (cognitive, diagnostic, aptitude, achievement), survey procedures, interview procedures or observation of public behaviour, and was deemed exempt by the University of Pennsylvania Institutional Review Board (protocol 820106) as (1) no information obtained is recorded in such a manner that human subjects can be identified, directly or through identifiers linked to the subjects and (2) no disclosure of the human subjects' responses outside the research could reasonably place the subjects at risk of criminal or civil liability or be damaging to the subjects' financial standing, employability or reputation). All survey responses were securely stored and all identifying information was destroyed once the surveys were returned.

Design of the choice experiment

DCEs have been used extensively to value goods and services for which there is no formal market or only

Table 1 Attributes and levels

Attributes	Levels	Levels used for the 'opt-out' option
Cash reward to start the programme (take-up)	US\$0, US\$10, US\$20, US\$50	US\$0
Incentive received conditional on successful discontinuation	US\$200, US\$400, US\$600, US\$1500	US\$0
Half of the incentive received if use is cut in half	Yes, No	No
Incentive format	Certain cash amount, lottery with a 1 in 10 chance of winning	Certain cash amount

incomplete markets.²⁶ In health and healthcare, these techniques have been applied to address a wide variety of research questions including the elicitation of patients' preferences, the valuation of health outcomes and the trade-offs between health and non-health benefits of specific.²⁶⁻²⁸ Importantly, recent studies have used DCEs to investigate the design of financial incentive programmes.^{24 29-31} DCEs rely on random use theory and are based on the assumption that the value of goods or services is best described by the sum of its attributes (or characteristics) and that people's choices are driven by the relative value of these characteristics. By presenting respondents with a series of choices between alternatives and by experimentally varying the characteristics of these alternatives, one is able to assess the trade-offs respondents make between product/service characteristics and to measure their influence on choices. A DCE consists of several interdependent steps: defining the attributes and their levels, experimental and survey design, data collection and statistical modelling.²⁶

We developed an initial list of potential attributes and levels of the tapering programme via a review of the literature on the design of financial incentives for behavioural change.³² We then refined this list in a series of team meetings and through analysis of pilot data. In the final survey, we described hypothetical tapering programmes using four characteristics: cash reward to start the programme, the incentive amount received conditional on successful discontinuation, whether the conditional incentive was given in the form of a certain cash payment or via a lottery and whether unsuccessful participants would still be rewarded for only cutting their use by half. These attributes and their respective levels are presented in [table 1](#). The next step consisted of combining attributes to form choice sets used to reveal patients' preferences. Because it would be infeasible to show respondents all possible combinations of attributes and levels (in our case, this would mean $4^2 \times 2^2 = 64$ possible combinations), we generated a fractional factorial design using the N-gene software to obtain a reasonable number of choice sets (ie, 12) that is sufficient to estimate

Which program do you prefer?

Program features	Program A	Program B
Reward for starting the program	\$100 in cash	\$50 in cash
Reward if you are able to <u>completely stop</u> using antianxiety medications by the end of the program	You enter a lottery and have a 1 in 10 chance of winning \$4000 in cash	\$600 in cash
Reward if you are unable to completely stop using antianxiety medications but still achieve to <u>cut your use in half</u> by the end of the program.	You enter a lottery and have a 1 in 10 chance of winning \$2000 in cash	You don't receive any reward
Please mark which program you prefer (MARK ONLY ONE):	<input checked="" type="checkbox"/>	<input type="checkbox"/>

Would you enroll in the program you picked above if you had the opportunity?

YES

NO

Figure 1 Example of choice question.

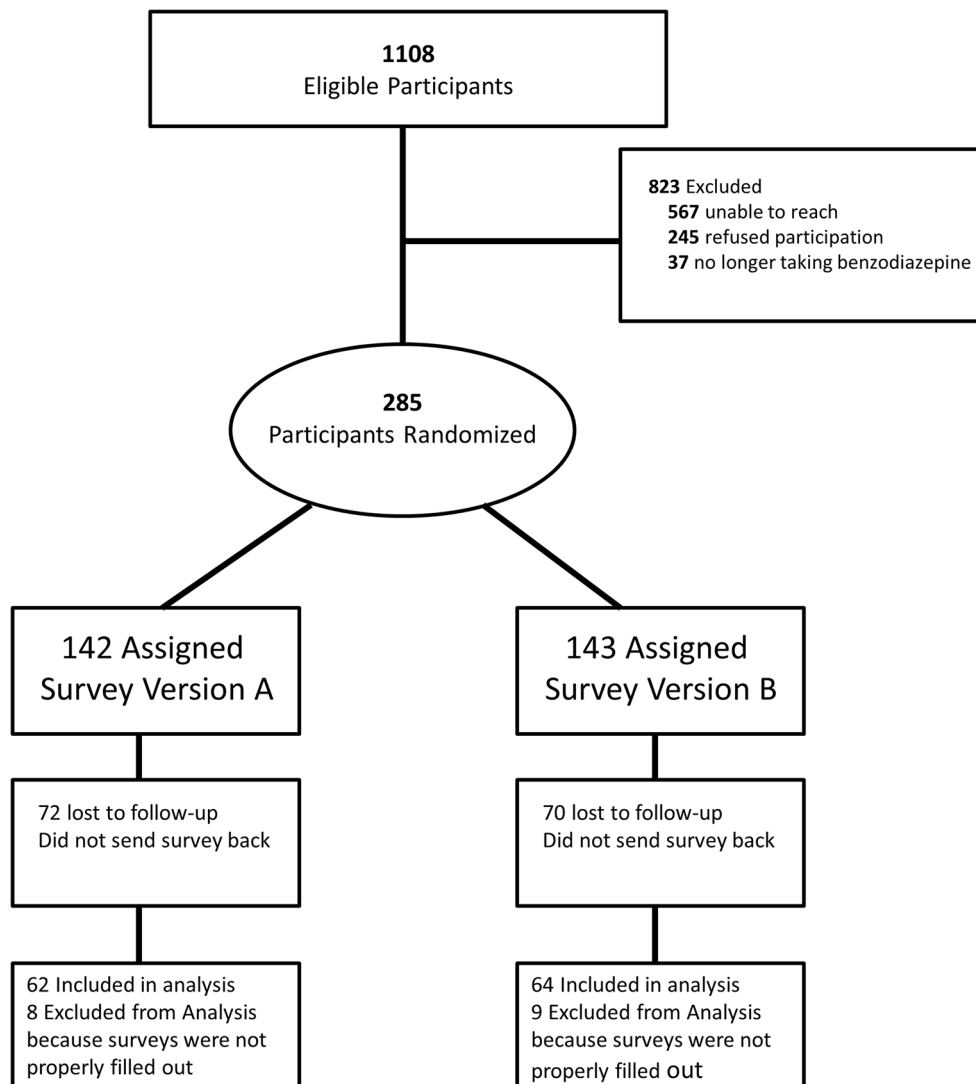


Figure 2 Sample flow chart.

the main effects of interest. We then divided the 12 choice sets into two blocks of 6 choice sets to reduce respondent fatigue, giving rise to two versions of the questionnaire (ie, A and B). While the number of choice sets was not found to be detrimental to DCE data quality,³³ we had concerns that this could be an issue in older adults. In each choice set, respondents were asked (1) to choose their preferred tapering programme and (2) to state whether or not they would enrol if such a programme were available to them. As a simple validity check, we also asked respondents if they wanted to be contacted if a similar programme started and gave them the opportunity to provide their contact information. An example of choice set is displayed in figure 1. We also collected information on demographics (ie, age, gender, education, income and household size), history of benzodiazepine use and current level of anxiety (measured using the Generalized Anxiety Disorder 7-Item (GAD-7) scale).³⁴

Statistical modelling

We started by describing our patient population and respondents' choice patterns. We then estimated simple

conditional logit models to assess the trade-offs made by individuals between the various programme characteristics, that is, to assess the relative importance of these characteristics when making choices. We jointly modeled programme choice and take-up by including an alternative-specific constant (ASC) for the opt-out option. Due to the limitation of the conditional logit model, which assumes homogeneous preferences in the population, we then estimated more flexible latent class logit models that identify a set of unobserved 'classes' or groups of individuals based on observed choice patterns. Separate parameter vectors (and variances) are estimated for each class, which allows for preference heterogeneity across the classes.^{35–38} Our preferred model, based on the Akaike Information Criteria, included two classes. A feature of the latent class model is that, while we cannot directly observe a respondent's class membership, we can model the likelihood of class membership as a function of individual characteristics to understand the composition of population classes. We complemented our analyses by predicting programme take-up among survey respondents for a range of incentive amounts for successful

Table 2 Respondent characteristics (n=126)

Variables	Mean (IQR)
Demographic characteristics	
Age	63.4 (57–69)
Male	38%
Education: high school or less	27%
Income: less than US\$25 000/year	14%
Use of BZD	
No of years of use	9.8 (4–15)
Frequency of use	
Once per week or less	19%
1–3 times per week	18%
Almost every day	13%
Every day	33%
Multiple times per day	16%
Ever tried to stop using BZD	45%
Anxiety (GAD-7)	
Minimal (>4)	30%
Mild (4–9)	33%
Moderate (10–14)	21%
Severe (≥15)	16%
Choice patterns	
Would you enrol?	
Always ‘yes’	49%
Always ‘no’	29%
Average no of ‘yes’ (out of 6)	3.67
Proportion of ‘yes’ (in all choice situations)	67%
Validity check	
Would you like to be contacted if such programme started?	
‘Yes’ in the full sample	45%
‘Yes’ among those who answered always ‘no’ to the question ‘Would you enrol?’	15%
‘Yes’ among those who answered ‘yes’ at least once to the question ‘Would you enrol?’	57%

BZD, benzodiazepine; GAD-7, Generalized Anxiety Disorder 7-Item scale.

discontinuation. This was done by calculating the choice probabilities of each option, including the opt-out, using the latent class model. All analyses were performed using Stata 12.

RESULTS

We identified 1108 potentially eligible participants. Of those, we could not reach 567 (reasons included being opted out by provider, invalid phone number, and not answering the phone after three attempts), 245 refused to participate and 37 were ineligible as they were no

longer taking benzodiazepines (figure 2). We mailed the survey to the 285 remaining individuals and 143 returned their survey, giving rise to a 28.4% overall response rate (143÷(1108–567–37)) and a 50.2% response rate to the mailed survey among those who provided consent, which is in line with other DCE studies in health using postal surveys.³⁹ We further excluded 17 respondents due to incomplete responses to the choice questions. Therefore, 126 respondents provided complete and usable survey responses.

The majority of respondents were women (62%) and the average age of respondents was 63 years old (table 2). On average, respondents have been taking benzodiazepines for 10 years, with history of use ranging from 1 to 50 years. The majority of people took benzodiazepines daily or almost daily; only 19% took benzodiazepines once per week or less. Interestingly, 45% of respondents had previously tried to stop taking benzodiazepines. Most respondents (63%) had only minimal or mild anxiety as measured by the GAD-7 scale.

As an initial investigation of respondents’ preferences, we summarised their general choice patterns. As explained above and shown in figure 1, respondents were first asked to choose their preferred programme and then asked to state their willingness to enrol if such a programme were available. Responses to this second questions provided insight into the general willingness to enrol in incentive programme in this population. Results showed that about 50% of respondents always (ie, in all six choice sets presented) answered ‘yes’ to the question ‘Would you enrol in the programme you picked above if you had the opportunity?’ Conversely about 30% of respondents always answered ‘no’ to that question. On average, the proportion of ‘yes’ responses across all respondents and choice sets was 67%, which reflects a fairly high potential enrolment rate among survey respondents. Interestingly, 57% of respondents who answered ‘yes’ to the question ‘Would you enrol in the programme you picked above if you had the opportunity?’ at least once expressed an interest in being contacted if such programme started, and shared their contact information.

The results from the conditional logit models shown in table 3 suggest that all studied attributes had an influence on choices. More precisely, as we would expect, the higher the monetary amount for both incentives (start and completion), the higher the probability the respondent would choose that programme. We also observed that respondents tended to favour programmes that offer a reward even if complete discontinuation was not achieved. Finally, respondents in our sample were more likely to choose a programme that offers a cash reward rather than a lottery with equal expected value. While we did not include any choice set aimed at testing respondents’ rationality, we formally investigated attribute dominance (ie, whether for some respondents, choices were driven by a single attribute).⁴⁰ We identified three respondents who systematically chose the programme with the highest incentive, but have decided not to

Utility function	Model 1: conditional logit			Model 2: latent class logit					
				Class 1 (non-traders)			Class 2		
	Coefficient	95% CI		Coefficient	95% CI		Coefficient	95% CI	
Opt-out ASC*	0.6064	0.3274 to 0.8855		5.4439	3.2462 to 7.6417		-1.8744	-2.4692 to -1.2797	
Incentive for enrolling	0.0044	0.0016 to 0.0072		0.0126	-0.0103 to 0.0356		0.0049	0.0018 to 0.0081	
Incentive for successful benzodiazepine cessation	0.0004	0.0002 to 0.0006		0.0007	-0.0008 to 0.0022		0.0005	0.0003 to 0.0007	
Half incentive for reducing dose by half	0.3576	0.1623 to 0.5529		0.8525	-1.2748 to 2.9798		0.3947	0.1825 to 0.6070	
Cash rather than lottery	0.7207	0.5213 to 0.9200		1.0786	-0.9806 to 3.1378		0.7362	0.5208 to 0.9517	
Probability of class 1 membership									
Age in years (continuous)				-0.0098	-0.0485 to 0.0288				
Years of use (continuous)				0.0418	0.0002 to 0.0739				
Gender (male)				-0.7132	-1.6357 to -0.0093				
Education: high school or less				0.2782	-0.5978 to 1.1541				
Income: less than US\$25 000/year				-0.6573	-1.8428 to -0.0528				
Anxiety: severe				-0.0789	-0.0848 to 0.6900				
				Class share:	0.355			0.645	
N	126								

*Alternative-specific constant.

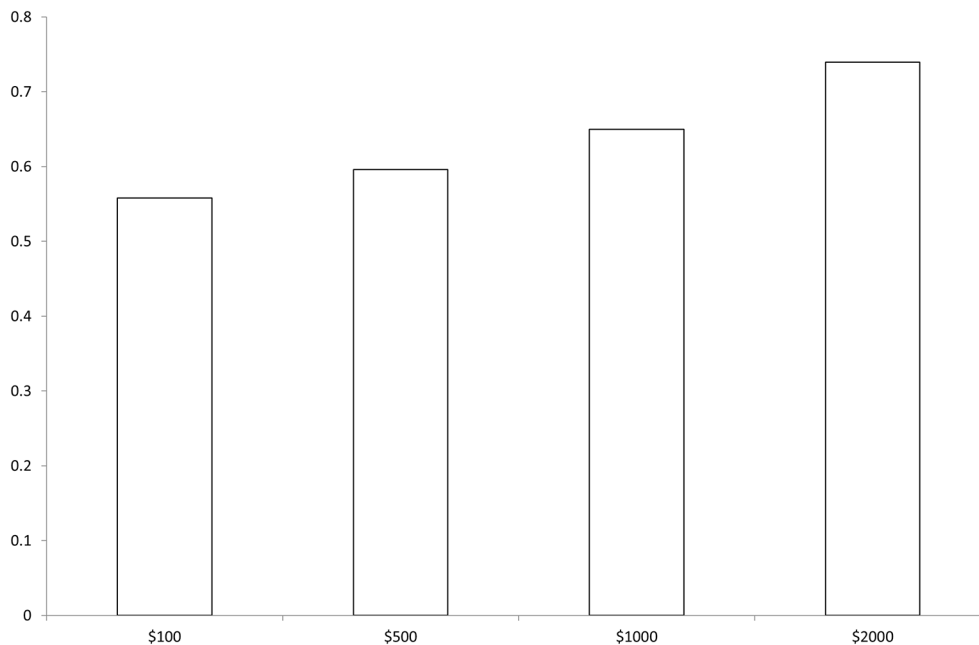


Figure 3 Predicted enrolment by incentive amount for successful discontinuation—Estimated choice probabilities obtained using model 2 in table 3.

exclude these as this does not necessarily reflect irrational behaviour.

When heterogeneity in preferences is investigated using the latent class model (model 2), we identify two distinct classes (or types) of respondents. Class 1 respondents have a high ASC, that is, a strong preference for opting-out—these individuals can be considered as ‘non-traders’ as it is highly unlikely that they will enrol. We don’t observe any significant impact of programme attributes in this group. These respondents represent 35.5% of the sample, which is in line with the observed rate of 30% in the choice patterns described above. Conversely, Class 2 respondents are responsive to all programme characteristics and are highly likely to choose to enrol. The attributes coefficients are of similar magnitude than in the conditional logit model. The latent class logit framework allows to model the likelihood of class membership as a function of individual characteristics. In other words, we model the probability for respondents to belong to the group of ‘non-traders’ (ie, class 1). We find that male and lower-income respondents were less likely to be non-traders (they are less likely to opt-out) and, perhaps not surprisingly, that respondents with a longer history of benzodiazepine use were more likely to opt-out. Figure 3 shows the predicted choices when the incentive amount for successful discontinuation is varied. The predicted enrolment rate among respondents was around 55.8% with an incentive of US\$200 and reached 74% when the incentive is set at US\$2000.

DISCUSSION

These results suggest that the enrolment rate among survey respondents for a behavioural economics trial

encouraging benzodiazepine taper and discontinuation might range from 56% if the incentive for successful discontinuation was US\$200 and up to 74% if the incentive were US\$2000. However, as only 28.4% of eligible patients agreed to participate and returned the survey, the real-world enrolment rate among eligible patients might be lower. The choice models indicate that all four studied programme characteristics (amount of cash incentive to start the programme, amount of incentive provided conditional on successful discontinuation, half of the incentive received if the dose is cut in half and incentive format) influenced the probability of choosing a given programme. The expectations regarding the design features of the incentive scheme were largely supported by the results. While higher incentives led to higher predicted uptake, the relationship was not linear, as found previously.²⁴ We also found that respondents strongly favoured cash incentives rather than lotteries of equal expected value and that offering an incentive for reducing the dose by half is likely to increase enrolment. Further, willingness to participate was higher among men and low-income respondents and lower for respondents with a longer history of benzodiazepine use.

We conducted this choice experiment following best practice guidelines⁴¹ and within the population of interest, that is, older adults taking benzodiazepines. While our study offers valuable insight into the acceptability and potential take-up of incentive programmes for benzodiazepine discontinuation, it has several limitations. First, while stated preferences surveys have been widely used in health services research, it is important to keep in mind that we are analysing hypothetical choices and therefore our results should be interpreted with caution, as

real-world decisions may differ, especially if the setting—in particular features of the health system—differs widely from the US context. Nevertheless, DCEs have been shown to provide relatively accurate predictions of behaviour, with 80% agreement found between stated and revealed preferences.^{42 43} Also, beyond predicting choices, DCEs are helpful in understanding the relative importance of the various characteristics of the product or service under study. Second, we had an overall response rate of only 28.4%, which may reflect reluctance of people with long-term benzodiazepine use to discontinue.¹¹ Third, as we opted for a paper-based survey, we cannot be certain that respondents did not receive support from friends or relatives to complete it. Finally, to keep the survey at a reasonable level of complexity and to reduce respondent burden, we did not state other potentially relevant features of an incentive programme, such as programme length, contacts with providers or formal record of behavioural change.

This study is the first to provide insight into the acceptability of financial incentives for benzodiazepine discontinuation. Knowing that potential participants are sensitive to the incentive amount for initiating the programme and for successful completion, prefer certain versus lottery payment and prefer partial payment for dose reduction will be helpful in informing the design of future trials. Naturally, even if the intervention were effective in bringing about benzodiazepine discontinuation or dose reduction in a substantial number of participants, the long-term effects on health outcomes such as falls, automobile crashes, cognitive decline and quality of life would need to be demonstrated. Further, an economic evaluation of such a programme would be helpful to assess its financial viability and the potential return on investment/cost-effectiveness. In other words, from a health system perspective, are the benefits to patients in terms of avoided healthcare costs and improved health outcomes from discontinuing benzodiazepines large enough to justify a monetary investment? Recent research has shown that the health benefits (quality of life gained) of some types of drugs are likely to be offset by an increase in future costs, even when limiting the analysis to one category of long-term costs (fall-related costs in this case).⁴⁴ A comprehensive cost-effectiveness modelling study might help to better understand the potential returns of such investments, both in terms of avoided future costs and increase long-term quality of life.

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Contributors JM and DM led the design of the choice experiment. MB, JF, MR and SH contributed to the design of the choice experiment. JM performed the statistical analyses and drafted the methods and results sections. MB drafted the introduction. All authors contributed to the interpretation of results and manuscript write-up, and read and approved the final version of the manuscript.

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Ethics approval University of Pennsylvania Institutional Review Board (protocol 820106).

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