

Exploring Consumer Preferences for Cannabis Vaping Products to Support Public Health Policy: A Discrete Choice Experiment

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Abstract

Background Phase two of cannabis legalisation in Canada brought cannabis vaping products to the market. This decision was controversial due to an outbreak of vaping cannabis use-associated lung injury. This resulted in three provinces banning the sale of cannabis vaping products causing inequitable access. This study sought to explore consumer preferences for cannabis vaping products to inform cannabis policy.

Methods We used a discrete choice experiment to explore consumer preferences for attributes of cannabis vaping products. Attributes included type of device, price, tetrahydrocannabinol (THC) potency, vape liquid content, product recommendations and Health Canada regulation. Participants lived in Canada, were aged \geq 19 years, and had purchased a cannabis vape in the last 12 months. A multinomial logit (MNL) model was used for the base model, and latent class analysis to assess preference sub-groups.

Results In total, 384 participants completed the survey; the MNL model showed that price and potency were the most important attributes. A three-group latent class model showed that $\sim 40\%$ of the sample was driven primarily by Health Canada Regulation and were willing to pay \$56 more for a product that was regulated compared to one that was not. About 33% of the sample was driven by price, and 26% was driven by type of device.

Conclusion While regulated status by Health Canada was most important to some consumers ($\sim 40\%$), nearly 60% of the sample were willing to make trade-offs in regulated status for products with a lower price. Therefore, policymakers need to consider the broader public health implications of banning cannabis vapes in some regions.

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Key Points for Decision Makers

While about 40% of consumers are willing to pay more for vaping products knowing they come from a regulated source, the remaining 60% (who are also the more frequent consumers), will trade-off the regulated status for products at a lower price, and/or those with a higher THC content.

To encourage more consumers to purchase cannabis vapes from regulated sources and reduce overall public health risks, policymakers need to consider the regulations that may be preventing this transition. In particular regulations that (1) restrict access and (2) limit package THC content.

1 Introduction

Phase two of cannabis legalisation in Canada, in October 2019, brought cannabis vaping and other alternative cannabis products like edibles and topicals to the market [1]. Smoking dried flower remains the most common method of consumption in Canada; however, the use of edibles and topicals is expanding. National survey data demonstrated that individuals vaporising with vape pen or e-cigarette jumped from 24% in 2020 to 28% in 2021 [2].

While the variety and availability of dried flower available on the licensed market closely mirrors that of the unlicensed market, the same cannot be said for vape pens and cartridges. Health Canada approved cannabis vaping products for sale; however, some provinces, including Quebec (QC), Prince Edward Island (PE) and, until recently, Newfoundland and Labrador (NL), do not allow the sale of vaping products in provincially licensed stores. Vaping products are only available to residents of these provinces through licensed medical producers using medical authorisation, which creates inequitable access across the country. These decisions were due to the emergence of a condition known as E-cigarette or vapingassociated lung injury (EVALI) that was identified in the summer of 2019 [3]. It is an acute respiratory illness that can lead to hospitalisation or death. In the months leading up to the legalisation of vaping products in Canada, it was still unknown what was causing this condition.

Between June 2019 and February 2020, there were more than 2800 hospitalisations and 68 fatalities from EVALI in the USA; however, cases of EVALI appeared to drop off after this time period [4]. Cases were seen in other countries [5–7], and as of 2020, 20 cases were identified in Canada including 16 hospitalisations [8]. Mounting evidence has shown a strong linkage between vitamin E acetate and EVALI, which is commonly found in illegal and unregulated tetrahydrocannabinol (THC)-containing vaping products [8]. As a result, vitamin E additives have been banned from cannabis vape cartridges and pens in Canada [1] and many US states as recommended by the US Centre for Disease Control [9]. However, only vaping products that are sold through licensed markets are regulated and tested to ensure they are meeting these standards. It is possible that vapes sold through unlicensed channels may still use Vitamin E as a thickening agent or to dilute THC content.

Despite the limited access in some areas of the country, there still is demand for vape pens and cartridges. Public health policy makers should consider the fact that even with restricted sales through licensed channels, consumers can still access these products. Understanding the purchase decision-making process can help refine policies that meet both the preferences of consumers and protect public health. Choice modelling studies help to break down the factors that contribute to decision making. For example, discrete choice experiments (DCE) are used as a means to measure the strength of consumer preferences for the various attributes that contribute to decisions via a survey-based approach. This method is grounded in the multi-attribute utility theory [10]. Participants are asked to make a choice between two hypothetical alternatives, each described by a set of attributes. After repeated choice tasks where the attribute descriptions are altered, the relative importance of each attribute can be quantified.

Knowledge of the trade-offs that consumers make for cannabis products is key to creating and modifying policies that encourage the uptake of regulated products, especially in this new and evolving legalised market. The purpose of this study was to quantify consumer preferences for attributes of cannabis vaping products and measure the trade-offs consumers make between attributes.

2 Methods

2.1 Study Design

We used a survey that included four unique DCE questions to solicit preferences from cannabis consumers across Canada in October 2021. These include product profiles for dried flower cannabis, edible cannabis and cannabis vapes, and one question that profiles retailer characteristics. Details here pertain to the DCE question that focused on preferences for attributes of cannabis vaping products. A full detailed protocol can be found in a Supplementary Appendix 1. This study is part of a series of studies that explored consumer preferences for different types of cannabis products and cannabis retail stores. Earlier work by our team includes a systematic review to identify attributes of importance for cannabis consumers [11] and focus groups and interviews with cannabis consumers [12]. Results from the systematic review, focus groups and interviews were used to prioritise a list of attributes and levels relevant to consumers and policymakers. These included the type of device; price; amount of THC; flavour; product recommendations; and if the product was regulated by Health Canada. The type of device relates to the packaging, as vape liquids are available as disposable pens or cartridges that can be used with reusable pens or vaporisers. Levels for price and concentration of THC were selected based on available options on both the licensed and unlicensed market. Compared to those who purchase dried flower, vape consumers tend to focus more on the flavour profile as vape products come in a variety of options that either profile or mask the traditional cannabis smell. Participants in our preliminary qualitative work indicated that they rely on recommendations from a variety of sources, including retailer, family/friend, and online reviews. A complete list of attributes and levels used can be found in Table 1.

Each participant was randomised to one of 300 versions of the survey. The DCE question was prefaced by a description of a scenario to help frame the choice which the consumer was asked to make. The scenario read "You are purchasing a 0.5 g cannabis vape product with THC of your preferred variety (sativa, indica, hybrid). Which of the following products would you choose? While some options may not seem possible, assume both options are available as presented"

The DCE choice task included two unlabelled alternatives, where alternative were presented as "Option A" and "Option B", and not with a description that held meaning (e.g., legal, illegal, etc.) [13]. A sample choice task is presented in the Supplemental Appendix. A fractional factorial design was used and a total of eight choice tasks were presented to each participant, which allowed for a standard error below the threshold of 0.05 of the main effect in the design test. Additional questions including sociodemographic (e.g., age, province, sex, gender), cannabis consumption and purchasing history were also collected.

Participants were eligible to complete the survey if they lived in Canada, were aged ≥ 19 years and reported having purchased cannabis within the last 12 months. Among those eligible for the survey, participants were asked to complete the cannabis vape DCE if they had purchased a vape product in the last 12 months. An online research company (Angus Reid) used email solicitation to recruit a sample from their proprietary panel. The sample of cannabis consumers was

chosen over a representative sample of the general public, since approximately 75% of the Canadian population does not consume cannabis, and inclusion of non-consumers would reduce the ability to understand choice patterns of the current market. Given their lack of experience, it is also likely that the general population would not fully understand the attributes described, and we suspect that if the general population did display preferences, they would be more likely to prefer regulated products. Data from respondents who were eligible for the vape product DCE and had completed the full survey were included in the analysis.

2.2 Analysis

Sawtooth Software (Lighthouse Studio) was used for the analysis of DCE data. Counts analysis was used to explore attribute dominance, significance of the impact on choice, and to explore two-way attribute interactions for all attribute combinations. Two regression models, including a multinomial logit (MNL) model and a latent class model were used to quantify preference weights.

The MNL model was used for the base analysis. This model calculated average preferences across the full sample. Effects coding was used for each attribute except for price where continuous coding was used to allow for interpretable willingness to pay (WTP) values. Using the least desirable level from each attribute as a reference, odds ratios (ORs) were calculated. Willingness to pay was calculated by estimating the marginal rate of substitution (MRS) by taking the ratio of two coefficients, with the linear cost estimate used for the comparison attribute.

Table 1 Attributes and levels cannabis vaping products	Attribute	Levels
	Type of device	Pre-filled cartridge
		Disposable pen
	Price (CAD)	\$30, \$40, \$50, \$60
	Amount of THC	70%
		80%
		90%
	Contents	Full spectrum with cannabis taste and terpenes
		Distillate with no cannabis taste or terpenes
		Distillate with non-cannabis flavours (e.g., fruit)
	Product recommendation	Recommended by person selling
		Recommended by family or friend
		Recommended in online reviews
		Self-selected without input from others
	Regulated by Health Canada	Yes
		No
		Unknown

CAD Canadian dollar, THC tetrahydrocannabinol

The latent class model was used to explore preference patterns within sub-groups of the sample. The number of segments with the best fit was determined by selecting the solution with the lowest CAIC (Consistent Akaike Information Criterion) and BIC (Bayesian Information Criterion) values [14, 15]. Segment membership probabilities estimated by Sawtooth Software were used to explore differences in participant characteristics between the groups. Specifically, we were interested to see if key demographic characteristics (i.e., age, sex, income, or province [due to different provincial regulations]) as well as cannabis use behaviours (i.e. purchase frequency, consumption amount and frequency, reason for use, length of use) influenced preference patterns. Chi-squared tests were used to assess significant differences.

2.3 Ethical Considerations

This study was carried out in accordance with the Tri-Council Policy Statement and approval by the Memorial University Interdisciplinary Committee on Ethics in Human Research (File #20210143).

3 Results

A total of 1626 individuals were eligible to participate. The survey consisted of demographic, cannabis use questions and four unique DCE questions. Not all participants were eligible for each question. The findings here represent the sample of 385 participants who completed the DCE focused on cannabis vape product purchase decisions. Approximately half of the sample identified as men, and about one-third were aged between 30 and 39 years. The vast majority (87.2%) had at least some post-secondary education (Tables 2, 3).

The counts analysis demonstrated that no attribute level dominated choices, with level selection ranging from 37.0 to 64.7%. No significant between-attribute interactions were found. The MNL model showed that all attributes significantly influenced choice, with the exception of product recommendations (p < 0.05 for within attribute chi-squared test). The MNL model showed that price was the most important consideration in purchase decisions, followed by THC potency and Health Canada regulation. Product recommendations was the least relevant attribute (Table 4). The odds of selecting a profile that consisted of pre-filled cartridge with 90% THC, and full spectrum cannabis flavour that was from a regulated source were 2.39 times greater compared to the same product from an unlicensed source (Supplementary Appendix).

The three-group latent class model demonstrated the best fit (Table 5). Group 1, representing 40% of the sample, was

 Table 2
 Sample characteristics

Characteristic	Number (%) N = 385
Sex	
Female	167 (43.4)
Male	217 (56.4)
Prefer not to say	1 (0.3)
Gender	
Woman	165 (42.9)
Man	211 (54.8)
Other	8 (2.0)
Prefer not to say	1 (0.3)
Age	
19–29	97 (25.2)
30–39	139 (36.1)
40–49	65 (16.9)
50–59	44 (11.4)
≥ 60	40 (10.4)
Race	
Black	6 (1.6)
East/Southeast Asian	13 (3.4)
Latino	4 (1.0)
Middle	3 (0.8)
South Asian	11 (2.9)
White	344 (89.4)
Other (please specify)	26 (6.8)
Province	
British Columbia	56 (14.5)
Alberta	68 (17.7)
Saskatchewan	51 (13.2)
Manitoba	39 (10.1)
Ontario	57 (14.8)
Quebec	21 (5.5)
New Brunswick	25 (6.5)
Nova Scotia	39 (10.1)
Prince Edward Island	3 (0.8)
Newfoundland and Labrador	23 (6.0)
Territories	3 (0.8)
Education	
Did not complete high school	9 (2.3)
High school diploma	40 (10.4)
Some post-secondary school	59 (15.3)
College/trade/technical/vocational training completed	134 (34.8)
Undergraduate degree	104 (27.0)
Graduate degree	39 (10.1)
Employment	
Full-time student	37 (9.6)
Part-time student	7 (1.8)
Unemployed, but seeking employment	13 (3.4)
Unemployed by choice	7 (1.8)
Unemployed due to disability	13 (3.4)
Employed part-time	28 (7.3)

Table 2 (continued)

Characteristic	Number (%) N = 385
Employed full-time	228 (59.2)
Self employed	28 (7.3)
Retired	35 (9.1)
Other (please specify)	16 (4.2)
Income (CAD)	
< \$25,000	28 (7.3)
\$25,000-\$49,999	61 (15.8)
\$50,000-\$74,000	66 (17.1)
\$75,000-\$99,999	68 (17.7)
\$100,000 or more	137 (35.6)
Prefer not to say	25 (6.5)

CAD Canadian dollar

Tab	le 3	Sample	cannabis	use	characte	eristics
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Characteristic	Number (%) N = 385
Frequency of cannabis purchase in last 12 months	
< 1 per month	106 (27.5)
1–2 times per month	164 (46.2)
3 or more times per month	115 (29.9)
Cannabis consumption frequency	
Less than once per month	32 (8.3)
At least once per month, less than once per week	38 (9.9)
At least once per week	85 (22.1)
Once per day	86 (22.3)
Multiple times per day	140 (36.4)
Prefer not to answer	4 (1.0)
Reason for cannabis use	
Medical (self-prescribed)	26 (6.8)
Medical (authorised)	21 (5.5)
Non-medical	122 (31.7)
Both medical and non-medical	210 (54.5)
Other	6 (1.6)
Initiation of cannabis use	
Since legalisation	47 (12.2)
Used in the past then started again since legalisation	95 (24.7)
Regular user prior to legalisation	243 (63.1)
Cannabis purchase location	
Licensed in-person store	327 (84.9)
Licensed online store	174 (45.2)
Licensed medical dispensary	54 (14.0)
Unlicensed in-person store	66 (17.1)
Unlicensed online stores	113 (29.4)
Unlicensed connection in the community	106 (27.5)
Other	12 (3.1)

driven primarily by Health Canada Regulation, followed by price and type of device (preference for disposable pens). This group were willing to pay \$56 more, with an odds ratio (OR) of 2.59, for a regulated product compared to a nonregulated one. Group 2, representing 33% of the sample, was driven by price, followed by potency and contents (preferred a full spectrum cannabis flavour). They were willing to pay \$20 more, with an OR of 9.49, for a product with 90% THC compared to 70% THC. Finally, Group 3, representing 26% of the sample, was driven by type of device (prefer pre-filled cartridges), followed by potency and price. They had an OR of 8.25 for selecting a pre-filled cartridge over a disposable pen, and an OR of 2.97 for selecting a product with 90% THC over 70% THC (Table 6). Probability for membership in each of the three groups is mapped in a Ternary plot (Fig. 1).

The distribution of group membership demonstrated that individuals who purchased and consumed cannabis vapes more frequently (p values 0.005 and < 0.001, respectively), and who consumed greater quantities (p value 0.003) were significantly more likely to be in Group 2, followed by Group 3. Age, sex, province or income were not significant predictors of group membership (Table 7). Bar plots of group membership analysis included in the Supplementary Appendix 2.

4 Discussion

This study demonstrated that price and THC potency were the most important considerations for cannabis vape consumers. However, some Canadians placed a high level of importance on purchasing cannabis vaping liquids from regulated sources. This study was the first DCE to explore consumer preferences for cannabis vape liquids, and the first study to explore purchasing behaviours of cannabis vaping products specifically.

Unsurprisingly, for about 40% of our sample, decisions were driven primarily by regulated status. In light of the outbreak of ELAVI in late 2019 in the USA, consideration for product safety was at the forefront for many consumers. With the vast majority of cases resulting from use of unregulated products, choosing regulated products is an obvious safer choice. The same cannot be said for other cannabis product types like flower and edibles, where safety concerns from unregulated sources have not been as widely publicised in the media. While it would appear that the regulated market is meeting the preferences of this consumer segment, access is still banned in two Canadian provinces (QC, PE). Consumers living in these regions would need medical authorisation to obtain a regulated vape product. Despite this difference in access across the country, province of residence for the

Table 4 Multinomial logit model for cannabis vaping products

	Level	Part-worth utility (95% CI)	OR (95% CI)	WTP (CAD, 95% CI)
Price	Price	- 0.34 (- 0.39, - 0.30)	N/A	N/A
Type of device	Pre-filled cartridge	0.16 (0.12, 0.20)	1.38 (1.34, 1.42)	- 9.41 (- 9.45, - 9.37)
	Disposable pen	- 0.16 (- 0.20, - 0.12)	Ref	Ref
Amount of THC	70%	- 0.31 (- 0.38, - 0.24)	Ref	Ref
	80%	0.02 (- 0.05, 0.09)	1.39 (1.32, 1.46)	- 9.71 (- 9.77, - 9.64)
	90%	0.29 (0.22, 0.36)	1.82 (1.75, 1.89)	- 17.65 (- 17.71, - 17.58)
Contents	Full spectrum	0.12 (0.05, 0.19)	1.23 (1.17, 1.30)	- 6.18 (- 6.24, - 6.11)
	No cannabis taste	- 0.04 (- 0.11, 0.03)	1.05 (0.98, 1.12)	- 1.47 (- 1.54, - 1.40)
	Non-cannabis flavour	- 0.09 (- 0.16, - 0.02)	Ref	Ref
Product recommendations	Seller	- 0.07 (- 0.16, 0.02)	1.00 (0.91, 1.09)	0.00 (- 0.09, 0.09)
	Family/friend	0.08 (- 0.01, 0.17)	1.16 (1.08, 1.25)	- 4.41 (- 4.50, - 4.33)
	Online	0.06 (- 0.03, 0.15)	1.14 (1.05, 1.22)	- 3.82 (- 3.91, - 3.74)
	None	- 0.07 (- 0.16, 0.02)	Ref	Ref
Regulated by Health Canada	Yes	0.25 (0.18, 0.32)	1.57 (1.50, 1.63)	- 13.24 (- 13.30, - 13.17)
	No	- 0.20 (- 0.27, - 0.13)	Ref	Ref
	Unknown	- 0.05 (- 0.12, 0.02)	1.16 (1.10, 1.23)	- 4.41 (- 4.48, - 4.35)

CAD Canadian dollar, CI confidence interval, OR odds ratio, THC tetrahydrocannabinol, WTP willingness to pay

 Table 5
 Latent class model fit

 statistics

Groups	CAIC	BIC					
2	3975.24	3952.24					
3	3966.98	3931.98					
4	3990.85	3943.85					
5	4038.73	3979.73					
BIC B	ayesian	Information					
Criterion, CAIC Consistent							
Akaike Information Criterion							

participant was not a significant predictor of group membership in the latent class model for this current study.

The 40% of participants whose decisions were driven primarily by regulated market status represent a smaller proportion of purchases. Group membership revealed that this group makes purchases less frequently and consumes less frequently in smaller quantities. This same group also had a higher preference towards disposable vape pens over cartridges, and market data have shown that in Canada

Table 6 Latent class model for cannabis vaping products

		Part- Worth Utility	OR	WTP (CAD)	Part- Worth Utility	OR	WTP (CAD)	Part- Worth Utility	OR	WTP (CAD)
	Segment Sizes	(Group 1 - 40.	3%	G	Group 2 - 33.2	2%	G	roup 3 - 26.4	1%
Price	Price	-0.17	N/A	N/A	-1.13	N/A	N/A	-0.18	N/A	N/A
Type of Device	Pre-filled cartridge	-0.16	0.73	18.70	0.04	1.08	-0.68	1.06	8.25	-114.68
	Disposable pen	0.16	Ref	Ref	-0.04	Ref	Ref	-1.06	Ref	Ref
Amount of THC	70%	-0.03	Ref	Ref	-1.15	Ref	Ref	-0.46	Ref	Ref
	80%	0.08	1.12	-6.49	0.05	3.33	-10.60	-0.18	1.32	-15.29
	90%	-0.05	0.99	0.79	1.10	9.49	-19.85	0.63	2.97	-59.21
Contents	Full Spectrum	0.17	1.31	-16.03	0.49	2.12	-6.62	-0.34	0.60	27.51
	No Cannabis Taste	-0.07	1.03	-1.91	-0.23	1.03	-0.25	0.17	1.00	0.08
	Non-Cannabis	-0.10	Ref	Ref	-0.26	Ref	Ref	0.17	Ref	Ref
	Flavor									
Product	Seller	-0.15	0.97	1.83	-0.03	0.98	0.16	0.07	1.49	-21.61
Recommendations	Family/Friend	0.15	1.31	-15.98	0.13	1.15	-1.26	0.17	1.65	-27.23
	Online	0.13	1.29	-15.08	-0.10	0.91	4.91	0.10	1.54	-23.45
	None	-0.12	Ref	Ref	-0.01	Ref	Ref	-0.33	Ref	Ref
Regulated by	Yes	0.55	2.59	-56.44	0.12	1.38	-2.84	0.01	1.18	-8.82
Health Canada	No	-0.40	Ref	Ref	-0.20	Ref	Ref	-0.16	Ref	Ref
	Unknown	-0.15	1.29	-15.07	0.08	1.32	-2.44	0.15	1.36	-16.78

CAD Canadian dollar, THC tetrahydrocannabinol, WTP willingness to pay

Fig. 1 Ternary plot. This ternary plot depicts individual survey participants on a threedimensional plane, represented in a triangle on a scale of 0-100%. The colour of the point represents the groups in which the participant is mostly likely to belong, with participants at points further from the vertex demonstrating a combination of behaviours of each of the groups



 Table 7
 Latent class significance of group membership by participant characteristic

Factor	Chi-squared	p value
Age	5.87	0.662
Sex	3.06	0.549
Province	26.70	0.223
Income	11.39	0.328
Cannabis use in the past 12 months	14.81	0.005
Frequency of cannabis use	32.30	0.000
Amount of cannabis use	19.48	0.003
Purpose of cannabis use	8.96	0.345
Use of cannabis pre-legalisation	9.26	0.055

disposable pens make up only 5% of the vape product market [16]. This means that the remaining 60% of our sample represent preferences for a population that make up a much greater proportion of vape purchases. This 60% placed a much lower level of importance on regulated status and expressed willing to make trade-offs to get their products for a lower price and/or higher THC content.

Policy makers need to consider the potential effects of banning access to vape products. According to a Headset report, vape products have the third largest market share in Canada at 17.4%, behind dried flower and pre-rolls [16]. With most of the market not generally concerned with regulated status, restricting sales does little to limit exposure

to cannabis vapes and the potential risks they possess. Rather, it is forcing consumers to purchase potentially unsafe products from unregulated sources.

While the risk of EVALI prompted consumers and policy makers to think about vape safety, it is not the only potential health risk to be considered. Some flavouring agents used to mask the sometimes unwanted cannabis flavour have been shown to contain several harmful and carcinogenic aerosols [17, 18], and many ingredients have not been tested for long-term safety [19]. This is a particular concern for youth who are often attracted to the flavoured products [19]. In 2021, the Government of Canada proposed that flavouring agents be banned from vape products (not limited to cannabis-containing vapes), with the exception of tobacco, mint and menthol flavours [20]. This has yet to be implemented. However, Nova Scotia already moved in this direction in 2019 [21].

The weighing of risks versus benefits of vaping flavouring agents has been debated by some experts as vaping has been shown to contain fewer toxins and be less risky than regular smoking [22, 23]. Vaporising has even been highlighted in Canada's "Lower Risk Cannabis Use Guidelines" as a safer, though not risk-free, alternative to smoking combusted cannabis [24]. For some, it could be considered a harm reduction strategy for moving consumers away from traditional smoking alternatives [25, 26]. However, the role that flavours play within that harm reduction strategy remains unclear. About 26% of the sample in our current study had a preference towards non-cannabis flavours; however, the relative importance of flavour ranked lower than device type, price and THC content.

4.1 Limitations

Inherent limitations known to be present in DCE studies include ordering effect, hypothetical bias and framing effect [27]. Methods used to mitigate these issues are described in the supplementary detailed methods. Our preliminary qualitative work found THC potency to be of importance to consumers, but issues around cartridge size (e.g., 0.5 g, 1 g, 2 g) were not discussed [12]. However, with larger cartridge sizes being available in the unregulated market (e.g., 4 g), that would have made an interesting attribute to explore as we know bulk purchasing options do play a role in decision making for other product types like dried flower and edibles [12]. We did not include an opt-out option within the choice tasks, as we felt the scenarios were realistic given the participants had purchased a cannabis vape product in the last 12 months. However, it is possible that some choice tasks presented two options of vapes that are not regulated by Health Canada. For someone opposed to purchasing anything not regulated, this could result in them being forced to select a product they would not purchase in reality. We anticipate the overall impact to be minimal given that respondents would still be making realistic trade-offs with the other attributes. Finally, we cannot be sure if our sample mirrors the general cannabis consuming population in Canada. We do know the sample has a greater proportion of higher income earners and higher levels of education than the general Canadian population. Additionally, our sample was predominantly Caucasian. Therefore, the data may not reflect the preferences of minority races, or those belonging to a lower socioeconomic status.

5 Conclusion

The use of cannabis vaping products, including pens and cartridges, is not without potential risks. However, they can be a safer alternative to smoking combustible cannabis, which remains the most common form of cannabis consumption. This is especially true for regulated vaping products that do not contain vitamin E acetate, which has been highly suspected as the cause of EVALI. Our study demonstrated that 60% of cannabis vape consumers in our sample, representing an even greater proportion of the vape market, place a low priority on their purchases being Health Canada-regulated products. With inequitable access

to vaping products across Canada, it is now time for policy makers to consider the broader public health impact of banning cannabis vaping pens and cartridges. For regions where regulated cannabis vapes are accessible, changes to other policies may be needed to encourage more purchases from licensed stores.

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Declarations

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Consent to participate All participants consented to participate in the study.

Consent for publication All participants consented to have their data included in publications.

Availability of data and material Data can be made available upon request, and with the approval of the Interdisciplinary Committee on Ethics in Human Research.

Code availability Not applicable.

Author contributions JD developed the research protocol, designed the survey, did the preliminary analysis of the data, and drafted the manuscript. KJ provided input in the discrete choice experimental design and conducted some of the analyses, and provided feedback on the manuscript. MC supported the literature search and drafted sections of the manuscript. MN supported the development of the protocol, supported the development of the protocol, supported the development of the protocol, survey design, data interpretations and manuscript review.

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