

Advancing Colorectal Cancer Detection with Blood-Based Tests: A Qualitative Study & Discrete Choice Experiment to Elicit Population Preferences

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Advancing Colorectal Cancer Detection with Blood-Based Tests: A Qualitative Study & Discrete Choice Experiment to Elicit Population Preferences

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Abstract

Background: Colorectal cancer (CRC) is a significant cause of mortality globally. Despite the availability of screening tests, their uptake remains suboptimal. Blood-based tests that look for signs of cancer-specific markers in the body are however increasingly available as an alternative for more invasive tests for cancer. Compared to existing tests, benefits of blood-based tests for CRC include not needing pre-test preparation, stool handling, and dietary or medication restrictions.

Objective: This study aims to explore the population's preferences for CRC screening tests, with a focus on blood-based tests, and investigate the factors influencing test uptake.

Methods: The study employed a mixed-methods approach, combining semi-structured interviews and a discrete choice experiment (DCE) survey. Interviews were analysed using thematic analysis to identify salient attributes for CRC screening tests. These attributes informed the design of the DCE survey. The DCE data were analysed using mixed-logit (MXL) and mixed-mixed multinomial logit (MMML) models.

Results: Qualitative findings from 30 participants revealed that participants preferred blood-based tests due to their perceived low risk, minimal pain, and ease of sample collection. However, concerns about the test's lower accuracy were also expressed. The DCE survey was completed by 1,189 participants. In the MXL model, participants demonstrated a stronger preference for blood-based tests over a 2-day stool-based test. The MMML model identified two classes, strong supporters for CRC screening and weak supporter for CRC screening. Weak supporters, but not strong supporters, had a higher preference for blood-based tests. Women, ethnic Chinese, and people aged 40 to 60 years were more likely to be weak supporters. Both models highlighted the high influence of cost and test sensitivity on participants' preferences. Transitioning from a 2-day stool-based test to a blood-based test, assuming a national screening program at a base price of SGD\$5, was estimated to have the potential to increase the relative uptake by 5.9% [CI=3.6%, 8.2%].

Conclusions: These findings contribute to our understanding of CRC screening preferences and provide insights into the factors driving test uptake. The study highlights the perceived advantages of blood-based tests and identifies areas of concern regarding their accuracy. Further research is needed to determine the actual increase in uptake rate when blood-based tests are made available.

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Original Manuscript

Advancing Colorectal Cancer Detection with Blood-Based Tests: A Qualitative Study & Discrete Choice Experiment to Elicit Population Preferences

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Abstract

Background: Colorectal cancer (CRC) is the second most deadly cancer, inducing an estimated 1.9 million incidence cases and 0.9 million deaths worldwide in 2020. Despite the availability of screening tests, their uptake remains suboptimal. Blood-based tests that look for signs of cancer-specific markers in the body are however increasingly available as an alternative for more invasive tests for cancer. Compared to existing tests, the benefits of blood-based tests for CRC include not needing pre-test preparation, stool handling, and dietary or medication restrictions.

Objective: This study aims to explore the population's preferences for CRC screening tests, with a focus on blood-based tests, and investigate the factors influencing test uptake.

Methods: The study employed a mixed-methods approach, combining semi-structured interviews and a discrete choice experiment (DCE) survey. Interviews were analysed using thematic analysis to identify salient attributes for CRC screening tests. These attributes informed the design of the DCE survey. The DCE data were analysed using mixed-logit (MXL) and mixed-mixed multinomial logit (MMML) models.

Results: Qualitative findings from 30 participants revealed that participants preferred blood-based tests due to their perceived low risk, minimal pain, and ease of sample collection. However, concerns about the test's lower accuracy were also expressed. The DCE survey was completed by 1,189 participants. In the MXL model, participants demonstrated a stronger preference for blood-based tests over a 2-day stool-based test. The MMML model identified two classes, strong supporters for CRC screening and weak supporters for CRC screening. Weak supporters, but not strong supporters, had a higher preference for blood-based tests. Women, ethnic Chinese, and people aged 40 to 60 years were more likely to be weak supporters. Both models highlighted the high influence of cost and test sensitivity on participants' preferences. Transitioning from a 2-day stool-based test to a blood-based test, assuming a national screening program at a base price of SGD5, was estimated to have the potential to increase the relative uptake by 5.9% [CI=3.6%, 8.2%].

Conclusion: These findings contribute to our understanding of CRC screening preferences and provide insights into the factors driving test uptake. The study highlights the perceived advantages of blood-based tests and identifies areas of concern regarding their accuracy. Further research is needed to determine the actual increase in uptake rate when blood-based tests are made available.

(374 words)

Keywords: blood-based test; colorectal cancer screening; mixed-method research; discrete choice experiment

Introduction

Colorectal cancer (CRC) is the second most deadly cancer, inducing an estimated 1.9 million incidence cases and 0.9 million deaths worldwide in 2020 [1]. Regular screening for CRC, through methods like colonoscopy and faecal immunochemical testing (FIT), helps detect CRC earlier, reduces the incidence and mortality of CRC, and brings about cost savings compared to not undergoing any screening [2]. Despite the availability of screening as a preventive intervention for the early detection of CRC, screening rates are suboptimal, even within developed countries [3-5]. Factors that hamper screening include not just individual characteristics, but characteristics of the screening tests as well [6].

The emergence of blood-based early cancer detection tests has the potential not only for detecting multiple cancers but also for improving patient compliance and acceptance [7]. The discovery of circulating and cell-free tumour DNA in the blood has ushered in new possibilities for the blood-based detection of CRC as well [8]. *Epi proColon* – a *SEPT9* DNA methylation assay – remains the only U.S. Food & Drug Administration (FDA) approved test [9]. There are however at least five other blood-based tests in various stages of development, with tests ranging from CRC-specific tests to multi-cancer early detection tests. Some candidate analytical targets include cell-free DNA (cfDNA), methylated circulating tumour DNA (ctDNA) and a combination of methylated DNA and proteins [10]. Compared to existing tests, the benefits of blood-based tests for CRC include not needing pre-test preparation, stool handling, and dietary or medication restrictions [9].

Challenges to the implementation of blood-based tests for screening include lower specificity relative to one-time faecal immunochemical test (FIT) [11] and inferior sensitivity compared to next-generation FIT-DNA tests [12]. As a result, blood-based tests for CRC are not recommended for the general population in the health guidelines of the USA, Europe and China [13-16]. While there exist several clinical disadvantages to blood-based tests, it may serve as an alternative for patients refusing screening by colonoscopy, or patients self-excluded from stool-based tests due to bleeding conditions such as haemorrhoids radiation proctitis [17]. In fact, the *SEPT9* test was found to be more effective and cost-effective compared with no screening [18]. By making screening easier, blood-based tests have the potential to improve uptake if the benefits outweigh the downside of this screening modality [19]. Studies are required to understand how the population will make trade-offs between different procedures and their attributes.

In a randomised controlled trial (RCT) involving average-risk adults offered blood-based tests and FIT in a clinical setting, higher screening participation rates were observed in the blood-based test arm [20]. The blood-based test was also found to be effective in increasing screening rates among

medically underserved populations [19]. However, another RCT reported no statistically significant improvement in the uptake among the population familiar with FIT if a blood-based test was offered upfront as an option [21]. Conversely, studies offering the blood-based test as a "rescue" option for those who declined colonoscopy and stool-based tests showed an increase in participant rates [21-23].

Building on the existing literature, at least four questions are deserving of further investigation. Firstly, what is the population's inclination towards blood-based tests if the accuracy of blood-based tests can be improved to satisfactory levels, akin to the FIT-DNA test? This insight can help assess the potential value of further investment in the test and inform the design of a target product profile [24, 25]. Secondly, what is the general population's preference for using the blood-based test in routine CRC screening? Results from RCTs may not be generalisable to the general population given the differences in the characteristics between the study participants and the general population. Thirdly, considering heterogeneous preferences for blood-based tests, can we profile the population based on their preferences? Such profiling efforts can inform the crafting of targeted screening programmes to cater to the heterogeneous preferences across different groups. Fourthly, many preference studies were done in Western countries and very few in Asia [26, 27]. Cultural and social norms could influence decision-making and outcomes. Studies understanding the acceptance of blood-based CRC tests in Asia are needed.

Acknowledging these gaps, we have designed a mixed-method study to delve into the population's preference for blood-based testing modalities in Singapore, a multi-racial Asian society, and to understand their decision-making process when choosing between blood-based tests and other existing screening methods. A discrete choice experiment (DCE) was used to construct hypothetical scenarios, (e.g. higher accuracy for the blood-based test). Furthermore, we intend to undertake subgroup analyses to examine potential variations in the preference for blood-based tests within distinct segments of the population, as highlighted by the mixed results of the RCTs. Our investigation will also delve into whether specific screening methods, such as the blood-based test, might positively impact participation rates, particularly in subpopulations identified with lower anticipated adherence based on prevailing screening recommendations.

Methods

This is a mixed-method study with interviews and a survey that incorporated a DCE. The methods for the qualitative and quantitative components will first be outlined, and subsequently, the qualitative and quantitative results will be presented. The study was approved by the National Healthcare Group Domain Specific Review Board (2021/00753) before data collection. Participants of the DCE were from an online cohort and their participation in research was approved by the National University of

Singapore (NUS) institutional review board (NUS-IRB: H-18-011)

Qualitative Component: Methods

Participant & Sampling

The recruitment and interview of participants for the qualitative component took place between December 2021 and March 2022. Convenience sampling was undertaken to include the Singapore population aged 40 or above with varied engagement with CRC screening services. Recruitment was conducted via the NUS social media platforms and its email blast services, as well as other participant recruitment channels and word of mouth. Interested potential participants contacted the researchers, who verified their eligibility before taking informed consent.

Conducting the Interview

The interviews took place either online via a video-conferencing application or in a quiet room within the NUS that was convenient for recording. The interviews adopted a semi-structured format using a topic guide. Each interview lasted approximately 30–45 minutes, and was conducted in English.

Analysis of Interviews

The interviews were transcribed verbatim, and the data were analysed using thematic analysis. A preliminary codebook with emerging themes of relevance from the first five transcripts was developed upon full familiarisation of the transcripts. A deductive and semantic approach was used in the clustering of codes into meta-codes and categories of interest. The coding framework was subsequently applied to the remaining transcripts. The identified themes were also further reviewed to ensure their usefulness and accuracy in representing the data.

Quantitative Component: Methods

Discrete choice experiment

DCEs have increasingly become a popular method for investigating and eliciting patient and population preferences for healthcare [28]. The method is based on consumer choice theory [29], which posits that respondents make choices between hypothetical products or scenarios comprising of two or more alternatives based on the importance they place on the characteristics of these attributes. In a DCE, a product or scenario is described with a fixed number of attributes with varying combinations of levels. Per this paradigm, in choosing the ideal product or scenario, the respondent evaluates the overall desirability of the alternatives, and makes trade-offs amongst the attributes. From the respondents' choice, their preferences are indirectly revealed, determining the attributes that drive the respondents' preferences, as well as the way variations of the attributes and levels may affect the

respective preferences [30].

Selection of Attributes and Levels

The selection of attributes and levels must be relevant to the policy process and the study population, while being consistent with the random utility theoretical foundation of DCEs [31]. An initial set of attributes and levels for the DCE was based on scoping review of the existing literature, which yielded 13 attributes. During the aforementioned qualitative interviews, participants were asked to rank three attributes that they valued the most, and the weighted preferences of all participants helped shortlist the final attribute list for the DCE. Following that, a quantitative survey with eligible healthcare professionals (n=11), who had at least one-year working experience with CRC patients and/or CRC screening, was conducted to ensure the validity of the selected attributes and their corresponding levels. After these iterative processes, six attributes were identified and ultimately used in the DCE: (i) procedure, (ii) pain level, (iii) sensitivity, (iv) recommendation, (v) out-of-pocket cost, and (vi) risk of test. Each attribute was assigned various levels based on the best information available. Blood-based test was one level of the procedure attribute.

To optimise the choice sets, a pilot study was conducted with 12 participants. Adjustments were then made to the text for the attributes and levels to improve clarity for the participants. The final set of six attributes and levels is presented in Table 1.

Table 1. Attributes and levels in the DCE

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Experimental Design

The DCE questionnaire was designed using Sawtooth Lighthouse Studio 9.13.2, and a two-stage design was used. For each task, participants firstly selected the preferred choice from two test profiles, and then were asked to choose between taking the test or opting out of it in real life. Correspondingly, the parameter labelled ‘Opt-Out’ represents the utility associated with declining the preferred test in the first stage. A negative value thus indicates participant’s preference for undergo the screening test. The questionnaire was designed using the random task generation method provided by Sawtooth. The DCE included a total of 20 blocks with 10 choice sets each. Each study participant saw one block of choice sets, consisting of 10 choice sets, from the 20 blocks. To test for internal validity, one fixed choice set offering two alternatives is common across all blocks, of which one is intended to be strictly dominant over the other.

The levels of cost were selected to reflect the costs of different procedures in reality. Participants in qualitative interviews also demonstrated a similar perception regarding the cost of the tests. Certain within-concept prohibitions were also specified to provide combinations of attributes that were realistic. This included prohibiting high out-of-pocket payment costs and the presence of mild pain for stool-based tests. However, we allowed the blood-based test to appear together with a higher cost given that commercial companies may set higher prices [32]. The coverage matrix of the DCE design was examined using Sawtooth Lighthouse Studio 9.13.2 to ensure all the parameters can be estimated. In addition, considering the large range of costs, we treated cost as discrete variables rather than a continuous variable in our analysis. An example of a DCE choice task is presented in Figure 1.

Participants reported any familial history of colorectal cancer, and if they had gone for any type of CRC screening in the past. Various sociodemographic information was also collected. All variables were coded as categorical variables, and some variables were subsequently recoded as binary or ternary variables to form meaningful sub-groups for analyses. Psychosocial inventories — the Zimbardo Time Perspective Inventory (ZTPI-R) [33], the Intolerance of Uncertainty Scale (IUS-12) [34], the Duke UNC Functional Social Support Questionnaire (DUFSS-5) [35] — were also included to measure participants’ degree of present orientation, intolerance of uncertainty and social support respectively.

Participant & Sampling

This study was conducted as a web-based survey hosted on REDCap from 19 May 2022 to 28 May

2022. The target population for this study were Singapore citizens and Permanent Residents (PR) aged 40 years old and above. The survey was sent to the participants from Singapore Population Health Studies (SPHS) online panel. This online panel consists of a cohort that is broadly representative of the general Singapore population. Participants gave their implicit consent by participating in the survey, and were reimbursed with S\$10 (~US\$7.50) for every successful completion of the survey.

In calculating the minimum sample size, we made use of Johnson and Orme's [36] proposed formula of $n > 500 * c / (t * a)$, where 500 is a fixed variable, c demotes the largest number of levels for a certain attribute, a indicates the number of DCE choice sets per block of questionnaire, and t refers to the number of alternatives per DCE choice set (excluding "Opt-out"). Accordingly, the sample size required for this study should be more than 125 participants ($500 \times 5 / (2 \times 10) = 125$). Additionally, Lancsar and Louviere suggested 20 responses per block/questionnaire [30], which led to a minimum sample size of 400. Considering that the DCE may be relatively difficult to answer, we expected a relatively high non-response rate of 20% to 30%. Hence, we set the target sample size to be 600. We subsequently tested the sample size using simulation functions with Sawtooth Lighthouse Studio 9.13.2, which deemed the sample size of 600 as sufficient. Owing to the overwhelming response, our final sample size of 1,189 participants not only meets the minimum required sample size but also allows for the possibility of conducting flexible subgroup analyses.

Statistical analysis

Two models were tested: a mixed-logit model (MXL) and a mixed-mixed multinomial logit model (MMML) [37]. The MXL was selected to account for the correlation introduced by the repeated observations from each participant and to relax the assumptions of independence from irrelevant alternatives [38]. This model assumes that the choices made by the same participant are correlated and preference heterogeneity exists across the population sample. The interpretation of the mean preference weights is made in relation to the chosen base level, and the standard deviation of each level indicates the variability in the mean preference weights. The MMML model was also selected as it incorporates both MXL and the latent class logit model (LCL). Unlike LCL where a homogeneous fixed preference is assumed within each latent class, a distribution of random coefficients is specified in the MMML model. Within each class, preference weights and the average probability of each demographic within each class can be derived. The number of classes was chosen by examining the Bayesian Information Criteria (BIC).

In addition, the conditional relative importance (CRI) for a given attribute, defined as the difference between the highest preference weight of the attribute level and the lowest preference weight of the attribute level, was reported. A higher conditional relative importance indicates the attribute is more

important in designing the CRC screening programme. Profile-based normalisation was then applied to normalise the sum of CRI of all the attributes to 1.

A left-specific constant was included in each regression, with a statistically significant coefficient indicating a left-right bias in the study [39]. Participants in DCE may take shortcuts and use simplifying heuristics when answering DCE questions, which can introduce an unintended source of variability in the data. When using reading order heuristic, study participants may tend to choose the choice on one side [40]. Incorporating a variable indicating the position of the choice in the regression can disentangle the associated bias [41, 42].

All levels were coded as dummy variables. Reference levels were selected based on the current recommendation for CRC screening for the average-risk adult population. We however intentionally designated 'No Recommendation' as the reference level for the "Recommendation" attribute to investigate the nuanced preferences arising from diverse recommendations made by different individuals. Continuous psychological variables were de-median by subtracting the median value from each data point, resulting in a centred distribution. As for the classification of the continuous sociodemographic variables, age bands were set according to the definition of senior citizen locally, which is at the age of 60 and above. Household income was grouped to ensure a sufficient sample size in both groups.

Statistical significance was set at $p < 0.05$. All quantitative data analyses were carried out using the statistical software R 4.2.1 [43].

Results

Qualitative Component

Sample Characteristics

30 participants completed the interview. A summary of their sociodemographic characteristics is presented in Supplementary Material. Of these participants, 14 had undergone a colonoscopy, 20 had taken a stool test, and six had taken a blood-based test. Five participants had not undergone any screening for CRC. Five main themes that elucidated the participants' motivations and important attributes of CRC screening were identified: (i) accuracy, (ii) cost, (iii) perceived risk and pain, (iv) convenience of the test, and (v) the method of sample collection.

Accuracy

When it came to blood-based tests, many participants were uncomfortable with its inferior accuracy

relative to other tests. They saw it as “pointless”, due to its possibility of giving rise to many false positives and negatives:

“...half the chance of being accurate, then why waste my blood?” (P6, Female)

“If [accuracy is] too low, then it defeats the purpose already...you want to know whether you have cancer or not, you see.” (P24, Female)

For participants who felt that they had no symptoms, the level of accuracy of the stool-based tests provided sufficient assurance that they felt a colonoscopy was unnecessary. Many cited an approach of escalation – to undergo a colonoscopy only in the event of a positive stool-based test:

“I’m not in the high-risk category...I’ll go for the FIT first, and then based on [the results], I’ll go for the colonoscopy”. (P22, Female)

“If I have concerns, colonoscopy will be the best. But if it’s more like a routine check, then I think stool-based would be better.” (P25, Male)

Participants who had undergone invasive tests like colonoscopy either (i) were diagnosed with haemorrhoids, or (ii) had discovered blood in their stools. They had opted for the colonoscopy under their doctor’s or friend’s advice, seeing that a colonoscopy was a more “comprehensive” or “complete” test. Many felt that the relatively higher accuracy of the colonoscopy provided them greater ease of mind:

“[Colonoscopy] gives a more accurate reading, because you’re able to see...what’s inside.” (P19, Female)

“[Colonoscopy] is not so comfortable, but it’s comfortable to the mind.” (P30, Male)

Perceived Risk & Pain

The stool-based and blood-based tests were more favourable to most participants as the process was “simple” and “pain-free”. Furthermore, many who had undergone a blood-based test did so as part of their annual comprehensive health check-up, and saw little extra risk or pain in doing it:

“It’s less traumatic to the patient. That kind of [needle] pain is bearable...no issue.” (P1, Female)

“If it’s part of the blood works, might as well, right? Since they are already drawing blood? I don’t mind testing for [colorectal cancer] as well.” (P17, Female)

Many of these participants who had no prior experience undergoing colonoscopy were more likely to express fear of the risk of colon perforation from the procedure. Due to its invasive nature, many were also “scared” and “uncomfortable” with the pain the procedure might induce:

“I don’t know how big the scope is...how difficult is it to insert? Will it damage anything permanently?” (P11, Male)

“The sort that comes with pain...[I] may get cold feet.” (P17, Female)

Interestingly, most participants who had undergone colonoscopy had little qualms about the risk and pain of the procedure. Instead, many expressed difficulties adhering to the bowel preparation instead:

“The agony part was the bowel preparation. I can’t finish the 4 litres...I gave up at 2 litres.” (P14, Male)

Method of Sample Collection

While being relatively easy to conduct, some participants shared reservations about the collection of stool samples. They saw the process as “dirty”, “disgusting” and/or “troublesome”, especially when two separate stool samples were required. While some complained about the uncomfortable experience of stool collection, some expressed personal concerns about improper collection:

“...because you have to do it on your own, especially when you have to dig the stool, I’m not sure whether we are doing correctly or not.” (P28, Male)

Nevertheless, participants who have done it across many years expressed little of such concerns, seeing it as a routine exercise that was necessary:

“You’ve done it once and then you make it an annual exercise...it’s not a big deal.” (P10, Female)

Convenience of Test

As colonoscopies and blood-based tests require medical professionals to perform them, some participants felt that the need to arrange a doctor’s appointment was time-consuming. This was especially true for colonoscopies, where a referral from a primary care physician is required in order

to receive a subsidised rate for the colonoscopy:

“...you have to go to the [primary care] polyclinic and then get a referral, see the specialist and then wait for the appointment...you know, so it’s a bit more cumbersome.” (P25, Male)

However, participants shared that stool-based tests were relatively more accessible, with kits being easily obtained at pharmacies or mailed to them on request. Even when returning stool samples, some participants shared that mailing services to the lab were available, which saved them the shame and hassle of dropping them off at a clinic:

“[It’s] kind of a deterrent because you have to book an appointment...compared to FIT test, you can just drop by any of the pharmacies...it’s a lot more convenient.” (P20, Female)

Cost

Many participants were aware of the stark difference in cost between a colonoscopy and a stool-based or blood-based test. While many participants, especially those younger and working, had employer and private insurances to subsidise a colonoscopy procedure, they highlighted that out-of-pocket cost was still substantially higher. Many cited that a higher willingness to pay must come in tandem with either higher accuracy, and/or lower frequency of testing:

“If the colonoscopy is 70–80% [accurate], and the other tests are also 70–80% [accurate], of course I will choose the simple one. No point to go for a colonoscopy...pay so much, go through the hassle...” (P24, Female)

“[If] you do this scope, one time, last you for 10 years, [because then you] don’t have to collect stool sample at the next medical check-up.” (P29, Male)

Quantitative Component

Sample Statistics

A total of 1,189 participants completed the study. Amongst these 1,189 participants, 127 participants (10.7%) did not have complete sociodemographic information, while 44 participants (3.7%) failed the fixed choice task. This led to 168 participants (14.1%) dropping out, leaving a sample of 1021 participants for analysis. The demographic characteristics of all participants are presented in the Supplementary Materials.

Mixed Logit Model

The main results of the MXL model are presented in Table 2.

All mean coefficients were significant at $p < 0.05$. On average, participants exhibited a higher preference for blood-based tests relative to a 2-day stool-based test (Coefficient=0.40, CI=[0.24, 0.55]). Participants also exhibited a higher preference for a 1-day stool-based test relative to a 2-day stool-based test (Coefficient=0.27, CI=[0.10, 0.45]). The preference for these two procedures were however not statistically different from each other (Coefficient=0.12, CI=[-0.04, 0.29]).

The profile-based normalised CRI of the six attributes based on the MXL model is presented in Figure 2. Ranking the attributes, participants were most concerned with the cost and sensitivity of the screening test. This is followed by the procedure type, the risk level, the pain level and ultimately the recommendation received for the screening test.

Table 2. Mixed Logit Analysis

	Mean Coefficient			Standard Deviation		
	Coefficient	95%-CI ^a	p-value	Coefficient	95%-CI	p-value
Left	0.13	(0.06, 0.12)	<0.001			
Opt-Out	-1.74	(-1.93, -1.55)	<0.001	3.86	(3.67-4.05)	<0.001
Procedure						
Colonoscopy	-0.73	(-0.90, -0.57)	<0.001	0.98	(0.85, 1.12)	<0.001
CT Colonoscopy	-0.75	(-0.91, -0.60)	<0.001	0.65	(0.51, 0.80)	<0.001
Stool-Based (2 Days)	0.00	Reference	-	0.00	Reference	-
Stool-Based (1 Day)	0.27	(0.10, 0.45)	<0.001	0.93	(0.71, 1.16)	<0.001
Blood-Based	0.40	(0.24, 0.55)	<0.001	0.91	(0.76, 1.05)	<0.001
Pain Level						
No Pain	0.00	Reference	-	0.00	Reference	-
Mild Pain	-0.54	(-0.64, -0.45)	<0.001	0.26	(0.11, 0.40)	<0.001
Sensitivity						
100%	1.63	(1.52, 1.75)	<0.001	0.09	(-0.05, 0.24)	0.19
95%	0.70	(0.59, 0.82)	<0.001	0.02	(-0.13, 0.18)	0.79
80%	0.00	Reference	-	0.00	Reference	-
60%	-1.26	(-1.43, -1.08)	<0.001	1.74	(1.53, 1.95)	<0.001
Recommendation						
Health Promotion Board	0.88	(0.77, 1.00)	<0.001	0.11	(-0.04, 0.25)	0.16
Doctors	0.68	(0.56, 0.80)	<0.001	0.01	(-0.14, 0.17)	0.86
Family & Friend	0.35	(0.23, 0.48)	<0.001	0.21	(0.05, 0.36)	0.008
Neither	0.00	Reference	-	0.00	Reference	-
Cost						
SGD0	0.00	Reference	-	0.00	Reference	-
SGD5	-0.35	(-0.50, -0.19)	<0.001	0.38	(0.16, 0.59)	<0.001
SGD30	-0.81	(-0.93, -0.69)	<0.001	0.08	(-0.09, 0.25)	0.35
SGD400	-2.39	(-2.53, -2.25)	<0.001	0.46	(0.30, 0.62)	<0.001
SGD1000	-3.88	(-4.07, -3.68)	<0.001	1.53	(1.33, 1.73)	<0.001
Risk of Test						
No Risk	0.00	Reference	-	0.00	Reference	-
1% Risk of Adverse Event	-0.74	(-0.86, -0.62)	<0.001	0.05	(-0.11, 0.21)	0.53
Log-likelihood	-8353					
AIC ^b	16777					
BIC ^c	17054					

^aCI: Confidence interval

^bAIC: Akaike information criteria

^cBIC: Bayesian information criteria

Note: Mean coefficient refers to the population mean. Standard deviation measures the individual preference heterogeneity. A significant value means that the preference for the corresponding level is heterogeneous at the individual levels.

Mixed-Mixed Multinomial Logit Model – Preference Analysis

The results from the MXL model suggested preference heterogeneity across the participants, with the standard deviations of several preferences begin statistically significant. Thus, we ran an MMML model while also estimating the posterior class membership probabilities. A two-class MMML model was the most appropriate based on the BIC. The classes were labelled post hoc as (i) strong supporters, and (ii) weak supporters, based on the coefficient value for “None”. A more negative coefficient value means people are more willing to take the screening test in real life. The class shares for strong supporters and weak supporters are 38%, and 62% respectively. The main results of the MML model are presented in Table 3.

Strong supporters did not exhibit a higher preference for blood-based tests relative to a two-day stool-based test. However, weak supporters had a higher preference for blood-based tests compared to a two-day stool-based test (Coefficient=0.66, CI=[0.44, 0.88]). Similar to the results in the MXL, strong and weak supporters were most concerned with the cost and sensitivity of the screening test. Weak supporters were more likely than strong supporters to be concerned with the procedure, pain level and risk of test. Compared to an existing national screening programme that is two-day stool-based, has no pain, 80% sensitivity, recommended by the government’s Health Promotion Board, costs S\$5, and has no risk, the relative uptake rate of a blood-based screening test with all else constant will increase by 0.2% [CI=-1.2%, 1.6%] for strong supporters and increase by 5.9% [CI=3.6%, 8.2%] for weak supporters.

Table 3. Mixed-mixed Multinomial Logit Analysis

	Class 1: Strong Supporters			Class 2: Weak Supporters		
	Coefficient	95%-CI*	p-value	Coefficient	95%-CI	P-value
Mean Coefficient						
Left	0.28	(0.15, 0.42)	<0.001	0.08	(-0.02, 0.18)	0.13
None	-5.13	(-5.79, -4.46)	<0.001	-0.86	(-1.10, -0.61)	<0.001
Procedure						
Colonoscopy	-0.35	(-0.71, 0.02)	0.07	-1.05	(-1.28, -0.81)	<0.001
CT Colonoscopy	-0.53	(-0.87, -0.18)	<0.001	-1.01	(-1.23, -0.78)	<0.001
Stool-Based (2 Days)	0.00	Reference	-	0.00	Reference	-
Stool-Based (1 Day)	-0.20	(-0.57, 0.16)	0.27	0.63	(0.39, 0.87)	<0.001
Blood-Based	0.06	(-0.27, 0.49)	0.70	0.66	(0.44, 0.88)	<0.001
Pain Level						
No Pain	0.00	Reference	-	0.00	Reference	-
Mild Pain	-0.25	(-0.46, -0.04)	0.02	-0.84	(-0.98, -0.70)	<0.001

Sensitivity						
100%	2.92	(2.61, 3.24)	<0.001	1.25	(1.10, 1.41)	<0.001
95%	1.58	(1.29, 1.87)	<0.001	0.42	(0.25, 0.58)	<0.001
80%	0.00	Reference	-	0.00	Reference	-
60%	-1.65	(-2.04, -1.27)	<0.001	-0.96	(-1.19, -0.72)	<0.001
Recommendation						
Health Promotion Board	1.24	(0.99, 1.49)	<0.001	0.79	(0.62, 0.96)	<0.001
Doctors	0.89	(0.64, 1.14)	<0.001	0.67	(0.50, 0.83)	<0.001
Family & Friend	0.17	(-0.08, 0.43)	0.18	0.40	(0.22, 0.58)	<0.001
Neither	0.00	Reference	-	0.00	Reference	-
Cost						
SGD0	0.00	Reference	-	0.00	Reference	-
SGD5	-0.67	(-1.02, -0.32)	<0.001	-0.33	(-0.55, -0.11)	<0.001
SGD30	-0.97	(-1.24, -0.70)	<0.001	-0.83	(-0.99, -0.66)	<0.001
SGD400	-2.24	(-2.55, -1.94)	<0.001	-2.93	(-3.14, -2.72)	<0.001
SGD1000	-4.00	(-4.41, -3.59)	<0.001	-4.46	(-4.75, -4.18)	<0.001
Risk of Test						
No Risk	0.00	Reference	-	0.00	Reference	-
1% Risk of Adverse Event	-0.60	(-0.85, -0.35)	<0.001	-1.04	(-1.21, -0.87)	<0.001
Standard Deviation						
None	5.46	(4.85, 6.07)	<0.001	2.87	(2.69, 3.06)	<0.001
Procedure						
Colonoscopy	0.68	(0.40, 0.96)	<0.001	1.05	(0.86, 1.23)	<0.001
CT Colonoscopy	1.09	(0.81, 1.37)	<0.001	0.45	(0.24, 0.66)	<0.001
Stool-Based (2 Days)	0.00	Reference	-	0.00	Reference	-
Stool-Based (1 Day)	0.44	(-0.01, 0.89)	0.06	0.62	(0.30, 0.94)	<0.001
Blood-Based	0.46	(0.16, 0.75)	<0.001	1.10	(0.92, 1.28)	<0.001
Pain Level						
No Pain	0.00	Reference	-	0.00	Reference	-
Mild Pain	0.04	(-0.22, 0.29)	0.79	0.48	(0.31, 0.64)	<0.001
Sensitivity						
100%	0.46	(0.19, 0.73)	<0.001	0.30	(0.12, 0.48)	<0.001
95%	0.01	(-0.30, 0.32)	0.96	0.18	(-0.01, 0.38)	<0.001
80%	0.00	Reference	-	0.00	Reference	-
60%	0.98	(0.49, 1.46)	<0.001	1.59	(1.35, 1.83)	<0.001
Recommendation						
Health Promotion Board	0.50	(0.24, 0.77)	<0.001	0.07	(-0.10, 0.25)	0.40
Doctors	0.60	(0.32, 0.89)	<0.001	0.08	(-0.11, 0.27)	0.43
Family & Friend	0.10	(-0.18, 0.37)	0.50	0.19	(-0.01, 0.39)	0.07
Neither	0.00	Reference	-	0.00	Reference	-
Cost						
SGD0	0.00	Reference	-	0.00	Reference	-
SGD5	1.25	(0.86, 1.63)	<0.001	0.14	(-0.15, 0.42)	0.35
SGD30	0.13	(-0.15, 0.42)	0.36	0.02	(-0.18, 0.22)	0.86
SGD400	0.68	(0.38, 0.98)	<0.001	0.62	(0.43, 0.82)	<0.001
SGD1000	2.08	(1.73, 2.43)	<0.001	1.37	(1.11, 1.63)	<0.001
Risk of Test						
No Risk	0.00	Reference	-	0.00	Reference	-
1% Risk of Adverse Event	0.28	(-0.01, 0.56)	0.06	0.26	(0.05, 0.47)	<0.001
Class Membership						
Gender						
Female				0.19	(0.11, 0.27)	<0.001
Male				0.00	Reference	-
Ethnicity						
Chinese				0.52	(0.41, 0.63)	<0.001
Non-Chinese				0.00	Reference	-
Age						
40 years to 60 years				0.00	Reference	-
61 years and above				-0.52	(-0.61, -0.42)	<0.001
Household Income Level						
High Income (\$6,000 and above)				-0.13	(-0.22, -0.05)	<0.001
Lower Income (\$5,999 and below)				0.00	Reference	-
Marital Status						

Married	-0.06	(-0.16, 0.04)	0.21
Single/Divorced/Widowed/Separated	0.00	Reference	-
Education Level			
Primary & Secondary	0.08	(-0.02, 0.19)	0.13
Pre-University	0.00	Reference	-
University and above	0.02	(-0.22, -0.05)	0.61
Housing Type			
Public Housing	0.00	Reference	-
Private Housing	-0.47	(-0.60, -0.35)	<0.001
Working Status			
Currently working	-0.24	(-0.34, -0.14)	<0.001
Not working/retired/student	0.00	Reference	-
Family History of CRC			
Yes	-0.74	(-0.85, -0.63)	<0.001
No	0.00	Reference	-
CRC Screening History			
Yes	-0.52	(-0.60, -0.44)	<0.001
No	0.00	Reference	-
Perceived Safety of Test Score	-0.16	(-0.17, -0.14)	<0.001
Social Support Score	-0.03	(-0.05, -0.02)	<0.001
Present Orientation	-0.03	(-0.05, -0.02)	<0.001
Intolerance of Uncertainty	-0.01	(-0.02, -0.01)	<0.001
Log-likelihood	-8041		
AIC ^b	16257		
BIC ^c	16955		

^aCI: Confidence interval

^bAIC: Akaike information criteria

^cBIC: Bayesian information criteria

Note: Mean coefficient refers to the population mean. Standard deviation measures the individual preference heterogeneity. A significant value means that the preference for the corresponding level is heterogeneous at the individual levels.

Mixed-Mixed Multinomial Logit Model –Analysis of Demographic Information

Weak supporters were more likely to be women, ethnic Chinese, and people aged 40 to 60 years old. Strong supporters were however more likely to be working, have higher income levels, and live in private housing. Strong supporters were also more likely to have a family history of CRC and to have gone for CRC screening in the past. Compared to weak supporters, strong supporters were also found to have higher scores for the perceived safety of CRC screening tests, social support, present orientation and intolerance of uncertainty.

Discussion

For every screening programme to be successful, it is important to identify patterns in the population's choice for CRC screening test to encourage uptake. By employing a sequential exploratory mixed-method design and using an online cohort that is designed to be representative of the general Singapore population, our study is able to identify salient attributes of screening amongst participants to inform our understanding of the population's preference. Furthermore, controlling for some of the

salient attributes in our DCE allows for a better interpretation of the preference of specific procedures, which is likely to encompass the value of convenience and method of sample collection that is otherwise not considered in the DCE.

Our DCE results suggest that most participants preferred a blood-based test over a two-day stool-based test and colonoscopy after accounting for the other attributes (e.g. sensitivity). A blood-based test was perceived to be pain-free, with a method of sample collection that was relatively simpler, compared to a colonoscopy. This pattern of aversion to aspects of pain and risk that comes with colonoscopy is supported by several studies [44, 45]. Furthermore, studies have also supported the convenience and ease of the blood-based tests as compared to colonoscopy, as no preparation is involved [44, 46]. Stool-based tests were regarded as unpleasant and disgusting to some participants in line with studies from the US [47], Australia [48] and Germany [49] wherein participants expressed a preference for blood over stool sampling. However, comparing a blood-based test with a one-day stool-based test, the utility for a blood-based test was not statistically significantly higher. This suggests that the requirement of testing twice was a key contributor to the perceived inconvenience and disutility of a stool-based test.

One advantage of DCE is its ability to profile the population, and understand the preference and estimate the uptake in different subpopulations. We profiled the population into two classes, the strong supporters for CRC screening who were indifferent between the two-day stool-based test and blood-based test, and the weak supporters for CRC screening who preferred the blood-based test over the two-day stool-based test. Our results suggest that the sensitivity of tests was a key consideration of participants. For example, a two-day stool-based test with a sensitivity of 80% was preferred by both strong supporters and weak supporters compared to a blood-based test with a sensitivity of 60%. Unfortunately, the shortcoming of existing blood-based tests lies in the relatively inferior sensitivity and specificity [11, 12], which was a concern for participants based on the qualitative interviews as well. In reality, while the procedure of blood-based tests itself is preferred, the low sensitivity and/or specificity rate is unlikely to appeal to the masses. However, if blood-based tests can achieve the same sensitivity as two-day stool-based tests, by offering blood-based tests to weak supporters, there is a potential to increase the relative CRC screening uptake by approximately 6%. The impact is likely to be significant as weak supporters make up approximately 62% of the population. Hence, further investment in research and development to improve the accuracy of blood-based tests could be beneficial to society.

The weak supporters identified in the study were less likely to do CRC screening in real life, but showed a higher preference for blood-based tests. Several observable demographic factors were

associated with being weak supporters, including being female, ethnic Chinese, younger and having lower income. The government may thus employ targeted information campaigns when blood-based tests become a feasible screening option. The convenience of the blood-based test needs to be highlighted to weak supporters. However, one concern identified from the interview was the need for healthcare providers to draw blood. Strategies and logistic arrangements to reduce waiting time for taking the blood-based test need to be designed. For strong supporters, relative to the testing procedure, they cared more about the sensitivity of the test compared to weak supporters. Blood-based tests itself are not attractive to them. Information campaigns to strong supporters should focus on better accuracy, (e.g. a blood-based test with high accuracy). Both strong supporters and weak supporters valued the recommendation from the Health Promotion Board [50] most, the governmental agency driving preventive care under the Ministry of Health in Singapore.

While DCEs can inform patients' preferences on specific tests, a proper health technology assessment should be performed on whether blood-based tests are appropriate in each country. Unfortunately, cost-effectiveness studies on *SEPT9* were rarely included in systematic reviews of the cost-effectiveness of CRC screening strategies [51, 52]. All found studies that included *SEPT9* as a screening strategy discovered that an annual *SEPT9* screening was more cost-effective than no screening [18, 53, 54]. Two studies that relied on test characteristics of the earlier version of *SEPT9* found that annual screening with FIT dominated the *SEPT9* strategy [18, 54] meaning that using FIT provided superior outcomes at a lower cost compared to using *SEPT9*. However, a more recent study using test characteristics of the improved version of *SEPT9* with higher sensitivity and specificity found that the strategy resulted in higher QALYs gained, CRC cases averted, and CRC deaths averted compared to other screening strategies [53]. Nevertheless, the strategy of using *SEPT9* remained more costly than FIT as it resulted in a 63% higher referral for colonoscopy than FIT, increasing the cost by 26%. As a result, the strategy of FIT was still more cost-effective than *SEPT9*. These conclusions were however based on perfect adherence of strategies. Based on our findings, the blood-based tests like *SEPT9* are more likely to have higher adherence than stool-based tests like FIT if similar accuracy can be achieved. Indeed, two studies that considered imperfect uptake found that when the uptake rate of FIT fell below 70% relative to that of *SEPT9*, FIT was no longer more cost-effective than *SEPT9* [18, 54]. Thus, the possibility of *SEPT9* being more cost-effective than FIT likely hinges on (i) an improved version of *SEPT9* with higher sensitivity and specificity, and (ii) a significantly higher uptake for *SEPT9* over FIT.

It is inevitable that the next frontier of cancer screening will be the adoption of blood-based tests [8]. Multiple such tests are being evaluated/studied currently [7]. Hence, it is no longer far-fetched that policymakers need to decide whether and how to include blood-based tests in the national cancer

screening programme. In the overall landscape of cancer screening, different stakeholders have different views on the matter. Patients and clinicians alike will want any patient with cancers to be diagnosed earlier, while developers and manufacturers of the test will ultimately focus on monetary returns as a primary consideration. Policymakers and government agencies have to determine the cost-effectiveness of such tests and be mindful of all the additional subsequent more invasive and expensive tests that would be performed in the presence of a positive test result, all of which can compound healthcare costs. Aside from the financial aspect, the other downsides of screening, such as patient anxiety and lead-time bias will all need to be considered seriously. Most of the existing studies examining the attitude and preference for blood-based CRC tests were conducted in Western societies [26, 27]. Preference of the technology in Asia is understudied. Studying preferences in Singapore, with its mix of East, South and Southeast Asian cultures, therefore provides a valuable addition to the literature.

Screening test only serves as the first step – follow-up diagnostic tests are required to complete the process. The gaps between stool-based tests and follow-up colonoscopies have been documented in the literature [55, 56], which compromises the benefit of the screening programme. Nonetheless, blood-based tests give policymakers another option to improve CRC screening. While blood-based tests in themselves may result in higher colonoscopy referral rates, blood-based tests may be combined with the existing screening methods, rather than replacing them. This potentially improves on current CRC screening programme by reducing the burden of colonoscopy through a two-step screening approach that triages positive stool-based test patients [57] and serve as an alternative for people who reject stool-based tests [22]. Additional research is required to address these practical issues and understand the value brought by blood-based tests before advocating for the inclusion of blood-based cancer screening tests into the national guidelines.

We acknowledge several limitations in our current study. Firstly, the DCE could not encompass the entirety of decision attributes pertinent to CRC screening, potentially limiting the comprehensive representation of individual decision matrices. We however prioritised the most salient attributes of the population through qualitative interviews. Moreover, the qualitative interviews help furnished and provided supplementary perspectives beyond the finalised attributes. Secondly, it is imperative to note that our study was conducted within a relatively affluent nation, thereby limiting the generalisability of economic considerations such as income sensitivity and trade-offs to settings with lower income levels. Additionally, the availability, accessibility, and quality perception of essential infrastructure, services, and resources may be influenced by local contexts, and their differential manifestations in various settings could yield disparate research conclusions.

Nevertheless, this study advances our understanding of the preferences of the population for CRC screening tests with respect to the type of procedure. The quantified value of the population's preferences can help in the design of more targeted policies to promote optimal screening behaviour and improve screening rates. Given the constrained available resources, more resources can be allocated in the short-term to (i) increase the awareness of non-invasive tests, (ii) increase the accessibility of non-invasive tests. Given that stool-based tests are nationally recommended in Singapore, efforts addressing the emotional barriers of embarrassment and disgust of stool collection should be promoted, to encourage the collection of stool as something fundamental and un-shameful. In the long-run, policymakers should consider investing in research and development to improve the accuracy of blood-based tests, since they are generally preferred over invasive tests and may lead to greater uptake. With an improved blood-based test that yields higher sensitivity and specificity rates, institutionalising CRC screening alongside other routine blood works is likely to be widely acceptable.

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Data Availability

Data is available upon request, subject to the approval of the review boards.

Conflict of Interest

The authors declare no competing interest.

Abbreviations

CRC: Colorectal cancer

CRI: Conditional relative importance

DCE: Discrete choice experiment

FIT: Faecal immunochemical test

LCL: Latent class logit

MXL: Mixed-logit

MMML: Mixed-mixed multinomial logit

NUS: National University of Singapore

SGD: Singapore dollar

USD: United States dollar

REFERENCES

1. Xi Y, Xu P. Global colorectal cancer burden in 2020 and projections to 2040. *Transl Oncol*. 2021 Oct;14(10):101174. PMID: 34243011. doi: 10.1016/j.tranon.2021.101174.
2. Shaukat A, Mongin SJ, Geisser MS, Lederle FA, Bond JH, Mandel JS, et al. Long-term mortality after screening for colorectal cancer. *N Engl J Med*. 2013 Sep 19;369(12):1106-14. PMID: 24047060. doi: 10.1056/NEJMoa1300720.
3. Moutel G, Duchange N, Lièvre A, Orgerie MB, Jullian O, Sancho-Garnier H, et al. Low participation in organized colorectal cancer screening in France: underlying ethical issues. *Eur J Cancer Prev*. 2019 Jan;28(1):27-32. PMID: 29176350. doi: 10.1097/cej.0000000000000417.
4. Kim A, Gitlin M, Fadli E, McGarvey N, Cong Z, Chung KC. Breast, Colorectal, Lung, Prostate, and Cervical Cancer Screening Prevalence in a Large Commercial and Medicare Advantage Plan, 2008-2020. *Prev Med Rep*. 2022 Dec;30:102046. PMID: 36531096. doi: 10.1016/j.pmedr.2022.102046.
5. Chan TK, Tan LWL, van Dam RM, Seow WJ. Cancer Screening Knowledge and Behavior in a Multi-Ethnic Asian Population: The Singapore Community Health Study. *Front Oncol*. 2021;11:684917. PMID: 34476210. doi: 10.3389/fonc.2021.684917.
6. de Bekker-Grob EW, Donkers B, Veldwijk J, Jonker MF, Buis S, Huisman J, et al. What Factors Influence Non-Participation Most in Colorectal Cancer Screening? A Discrete Choice Experiment. *Patient*. 2021 Mar;14(2):269-81. PMID: 33150461. doi: 10.1007/s40271-020-00477-w.
7. Schrag D, Beer TM, McDonnell CH, 3rd, Nadauld L, Dilaveri CA, Reid R, et al. Blood-based tests for multicancer early detection (PATHFINDER): a prospective cohort study. *Lancet*. 2023 Oct 7;402(10409):1251-60. PMID: 37805216. doi: 10.1016/s0140-6736(23)01700-2.
8. Wang CP, Miller SJ, Shaukat A, Jandorf LH, Greenwald DA, Itzkowitz SH. Blood-based colorectal cancer screening: are we ready for the next frontier? *Lancet Gastroenterol Hepatol*. 2023 Oct;8(10):870-2. PMID: 37482062. doi: 10.1016/s2468-1253(23)00188-7.
9. Epigenomics Inc. Epi priColon. 2016; Available from: <https://www.labcorp.com/tests/related-documents/EpiPatient>.
10. Shaukat A, Levin TR. Current and future colorectal cancer screening strategies. *Nat Rev Gastroenterol Hepatol*. 2022 Aug;19(8):521-31. PMID: 35505243. doi: 10.1038/s41575-022-00612-y.
11. Johnson DA, Barclay RL, Mergener K, Weiss G, König T, Beck J, et al. Plasma Septin9 versus fecal immunochemical testing for colorectal cancer screening: a prospective multicenter study. *PloS one*. 2014;9(6):e98238. doi: <https://doi.org/10.1371/journal.pone.0098238>.
12. Ahlquist DA, Taylor WR, Mahoney DW, Zou H, Domanico M, Thibodeau SN, et al. The stool DNA test is more accurate than the plasma septin 9 test in detecting colorectal neoplasia. *Clinical*

Gastroenterology and Hepatology. 2012;10(3):272-7. doi: 10.1016/j.cgh.2011.10.008.

13. U.S. Preventive Services Task Force. Colorectal Cancer: Screening. 2021; Available from: <https://www.uspreventiveservicestaskforce.org/uspstf/recommendation/colorectal-cancer-screening>.

14. Digestive Cancers Europe. Colorectal Cancer (Bowel Cancer) Symptoms, Screening and Diagnosis. 2020; Available from: <https://digestivecancers.eu/colorectal-screening/>.

15. National Cancer Centre Singapore. Cancer Screening. 2021.

16. Chen H, Lu B, Dai M. Colorectal Cancer Screening in China: Status, Challenges, and Prospects - China, 2022. China CDC Wkly. 2022 Apr 15;4(15):322-8. PMID: 35548454. doi: 10.46234/ccdcw2022.077.

17. Symonds EL, Cock C, Meng R, Cole SR, Fraser RJL, Young GP. Uptake of a colorectal cancer screening blood test in people with elevated risk for cancer who cannot or will not complete a faecal occult blood test. European Journal of Cancer Prevention. 2018;27(5):425-32. PMID: 00008469-201809000-00001. doi: 10.1097/cej.0000000000000352.

18. Ladabaum U, Allen J, Wandell M, Ramsey S. Colorectal Cancer Screening with Blood-Based Biomarkers: Cost-Effectiveness of Methylated Septin 9 DNA versus Current Strategies. Cancer Epidemiology, Biomarkers & Prevention. 2013;22(9):1567-76. doi: 10.1158/1055-9965.Epi-13-0204.

19. Ioannou S, Sutherland K, Sussman DA, Deshpande AR. Increasing uptake of colon cancer screening in a medically underserved population with the addition of blood-based testing. BMC Cancer. 2021 2021/08/28;21(1):966. doi: 10.1186/s12885-021-08678-8.

20. Liles EG, Coronado GD, Perrin N, Harte AH, Nungesser R, Quigley N, et al. Uptake of a colorectal cancer screening blood test is higher than of a fecal test offered in clinic: A randomized trial. Cancer Treatment and Research Communications. 2017 2017/01/01;10:27-31. doi: <https://doi.org/10.1016/j.ctarc.2016.12.004>.

21. Symonds EL, Hughes D, Flight I, Woodman R, Chen G, Ratcliffe J, et al. A Randomized Controlled Trial Testing Provision of Fecal and Blood Test Options on Participation for Colorectal Cancer Screening. Cancer Prev Res (Phila). 2019 Sep;12(9):631-40. PMID: 31266825. doi: 10.1158/1940-6207.Capr-19-0089.

22. Liang PS, Zaman A, Kaminsky A, Cui Y, Castillo G, Tenner CT, et al. Blood Test Increases Colorectal Cancer Screening in Persons Who Declined Colonoscopy and Fecal Immunochemical Test: A Randomized Controlled Trial. Clinical Gastroenterology and Hepatology. 2023 2023/10/01;21(11):2951-7.e2. doi: <https://doi.org/10.1016/j.cgh.2023.03.036>.

23. Coronado GD, Jenkins CL, Shuster E, Johnson C, Amy D, Cook J, et al. Blood-based colorectal cancer screening in an integrated health system: a randomised trial of patient adherence. Gut. 2024 Jan 17. PMID: 38176899. doi: 10.1136/gutjnl-2023-330980.

24. Cocco P, Ayaz-Shah A, Messenger MP, West RM, Shinkins B. Target Product Profiles for medical tests: a systematic review of current methods. BMC Medicine. 2020 2020/05/11;18(1):119. doi: 10.1186/s12916-020-01582-1.

25. Wang Y, Rattanavipapong W, Teerawattananon Y. Using health technology assessment to set priority, inform target product profiles, and design clinical study for health innovation. *Technological Forecasting and Social Change*. 2021 2021/11/01;172:121000. doi: <https://doi.org/10.1016/j.techfore.2021.121000>.
26. Ali O, Gupta S, Brain K, Lifford KJ, Paranjothy S, Dolwani S. Acceptability of alternative technologies compared with faecal immunochemical test and/or colonoscopy in colorectal cancer screening: A systematic review. *J Med Screen*. 2023 Mar;30(1):14-27. PMID: 36039489. doi: 10.1177/09691413221109999.
27. Brinkmann M, Fricke LM, Diedrich L, Robra BP, Krauth C, Dreier M. Attributes in stated preference elicitation studies on colorectal cancer screening and their relative importance for decision-making among screeners: a systematic review. *Health Econ Rev*. 2022 Sep 22;12(1):49. PMID: 36136248. doi: 10.1186/s13561-022-00394-8.
28. Ryan M, Gerard K, Amaya-Amaya M. Using discrete choice experiments to value health and health care: Springer Science & Business Media; 2007. ISBN: 1402057539.
29. Lancaster KJ. A new approach to consumer theory. *Journal of political economy*. 1966;74(2):132-57.
30. Lancsar E, Louviere J. Conducting discrete choice experiments to inform healthcare decision making. *Pharmacoeconomics*. 2008;26(8):661-77. doi: 10.2165/00019053-200826080-00004.
31. Coast J, Al-Janabi H, Sutton EJ, Horrocks SA, Vosper AJ, Swancutt DR, et al. Using qualitative methods for attribute development for discrete choice experiments: issues and recommendations. *Health Econ*. 2012 Jun;21(6):730-41. PMID: 21557381. doi: 10.1002/hec.1739.
32. Inadomi JM. Cost-Effectiveness of Blood-Based Biomarkers for Colorectal Cancer Screening—An Ounce of Prevention Is Worth a Pound of Cure. *JAMA Network Open*. 2023;6(11):e2343346-e. doi: 10.1001/jamanetworkopen.2023.43346.
33. Crockett RA, Weinman J, Hankins M, Marteau T. Time orientation and health-related behaviour: measurement in general population samples. *Psychol Health*. 2009 Mar;24(3):333-50. PMID: 20204997. doi: 10.1080/08870440701813030.
34. Carleton RN, Norton MA, Asmundson GJ. Fearing the unknown: a short version of the Intolerance of Uncertainty Scale. *J Anxiety Disord*. 2007;21(1):105-17. PMID: 16647833. doi: 10.1016/j.janxdis.2006.03.014.
35. Saracino R, Kolva E, Rosenfeld B, Breitbart W. Measuring social support in patients with advanced medical illnesses: An analysis of the Duke-UNC Functional Social Support Questionnaire. *Palliat Support Care*. 2015 Oct;13(5):1153-63. PMID: 25201170. doi: 10.1017/s1478951514000996.
36. Johnson R, Orme B. Getting the most from CBC. Sequim: Sawtooth Software Research Paper Series, Sawtooth Software. 2003.
37. Sarrias M, Daziano R. Multinomial Logit Models with Continuous and Discrete Individual Heterogeneity in R: The gmnL Package. *Journal of Statistical Software*. 2017 07/13;79(2):1 - 46. doi: 10.18637/jss.v079.i02.

38. McFadden D, Train K. Mixed MNL models for discrete response. *Journal of applied Econometrics*. 2000;15(5):447-70. doi: [https://doi.org/10.1002/1099-1255\(200009/10\)15:5<447::AID-JAE570>3.0.CO;2-1](https://doi.org/10.1002/1099-1255(200009/10)15:5<447::AID-JAE570>3.0.CO;2-1).
39. Veldwijk J, Marceta SM, Swait JD, Lipman SA, de Bekker-Grob EW. Taking the Shortcut: Simplifying Heuristics in Discrete Choice Experiments. *The Patient-Patient-Centered Outcomes Research*. 2023;1-15.
40. Johnson FR, Yang J-C, Reed SD. The internal validity of discrete choice experiment data: a testing tool for quantitative assessments. *Value in Health*. 2019;22(2):157-60.
41. Wang Y, Faradiba D, Del Rio Vilas VJ, Asaria M, Chen YT, Babigumira JB, et al. The Relative Importance of Vulnerability and Efficiency in COVID-19 Contact Tracing Programmes: A Discrete Choice Experiment. *International journal of public health*. 2022;67:1604958.
42. Ang IYH, Wang Y, Tyagi S, Koh GCH, Cook AR. Preferences and willingness-to-pay for a blood pressure telemonitoring program using a discrete choice experiment. *NPJ Digital Medicine*. 2023;6(1):176.
43. Team RC. R: A language and environment for statistical computing. 2013.
44. Xu Y, Levy BT, Daly JM, Bergus GR, Dunkelberg JC. Comparison of patient preferences for fecal immunochemical test or colonoscopy using the analytic hierarchy process. *BMC Health Serv Res*. 2015 Apr 23;15:175. PMID: 25902770. doi: 10.1186/s12913-015-0841-0.
45. Schroy PC, 3rd, Lal S, Glick JT, Robinson PA, Zamor P, Heeren TC. Patient preferences for colorectal cancer screening: how does stool DNA testing fare? *Am J Manag Care*. 2007 Jul;13(7):393-400. PMID: 17620034.
46. DeBourcy AC, Lichtenberger S, Felton S, Butterfield KT, Ahnen DJ, Denberg TD. Community-based Preferences for Stool Cards versus Colonoscopy in Colorectal Cancer Screening. *Journal of General Internal Medicine*. 2008 2008/02/01;23(2):169-74. doi: 10.1007/s11606-007-0480-1.
47. Taber JM, Aspinwall LG, Heichman KA, Kinney AY. Preferences for blood-based colon cancer screening differ by race/ethnicity. *American Journal of Health Behavior*. 2014;38(3):351-61. doi: 10.5993/AJHB.38.3.4.
48. Osborne J, Wilson C, Moore V, Gregory T, Flight I, Young G. Sample preference for colorectal cancer screening tests: blood or stool? *Open Journal of Preventive Medicine*. 2012;2(3). doi: 10.4236/ojpm.2012.23047.
49. Adler A, Geiger S, Keil A, Bias H, Schatz P, deVos T, et al. Improving compliance to colorectal cancer screening using blood and stool based tests in patients refusing screening colonoscopy in Germany. *BMC gastroenterology*. 2014;14(1):1-8. doi: <https://doi.org/10.1186/1471-230X-14-183>.
50. Health Promotion Board. Health Promotion Board. Available from: <https://hpb.gov.sg>.

51. Ran T, Cheng CY, Misselwitz B, Brenner H, Ubels J, Schlander M. Cost-Effectiveness of Colorectal Cancer Screening Strategies-A Systematic Review. *Clin Gastroenterol Hepatol*. 2019 Sep;17(10):1969-81.e15. PMID: 30659991. doi: 10.1016/j.cgh.2019.01.014.
52. Gheysariyeha F, Rahimi F, Tabesh E, Hemami MR, Adibi P, Rezayatmand R. Cost-effectiveness of colorectal cancer screening strategies: A systematic review. *European Journal of Cancer Care*. 2022:e13673. doi: 10.1111/ecc.13673.
53. Peterse EFP, Meester RGS, de Jonge L, Omidvari AH, Alarid-Escudero F, Knudsen AB, et al. Comparing the Cost-Effectiveness of Innovative Colorectal Cancer Screening Tests. *J Natl Cancer Inst*. 2021 Feb 1;113(2):154-61. PMID: 32761199. doi: 10.1093/jnci/djaa103.
54. Ladabaum U, Alvarez-Osorio L, Rösch T, Brueggenuergen B. Cost-effectiveness of colorectal cancer screening in Germany: current endoscopic and fecal testing strategies versus plasma methylated Septin 9 DNA. *Endoscopy international open*. 2014;2(02):E96-E104. doi: 10.1055/s-0034-1377182.
55. Mohl JT, Ciemins EL, Miller-Wilson L-A, Gillen A, Luo R, Colangelo F. Rates of follow-up colonoscopy after a positive stool-based screening test result for colorectal cancer among health care organizations in the US, 2017-2020. *JAMA Network Open*. 2023;6(1):e2251384-e.
56. Escaron AL, Garcia J, Petrik AF, Ruiz E, Nyongesa DB, Thompson JH, et al. Colonoscopy following an abnormal fecal test result from an annual colorectal cancer screening program in a federally qualified health center. *Journal of Primary Care & Community Health*. 2022;13:21501319221138423.
57. Petersen MM, Kleif J, Jørgensen LN, Hendel JW, Seidelin JB, Madsen MR, et al. Optimizing screening for colorectal cancer: an algorithm combining fecal immunochemical test, blood-based cancer-associated proteins and demographics to reduce colonoscopy burden. *Clinical Colorectal Cancer*. 2023;22(2):199-210.

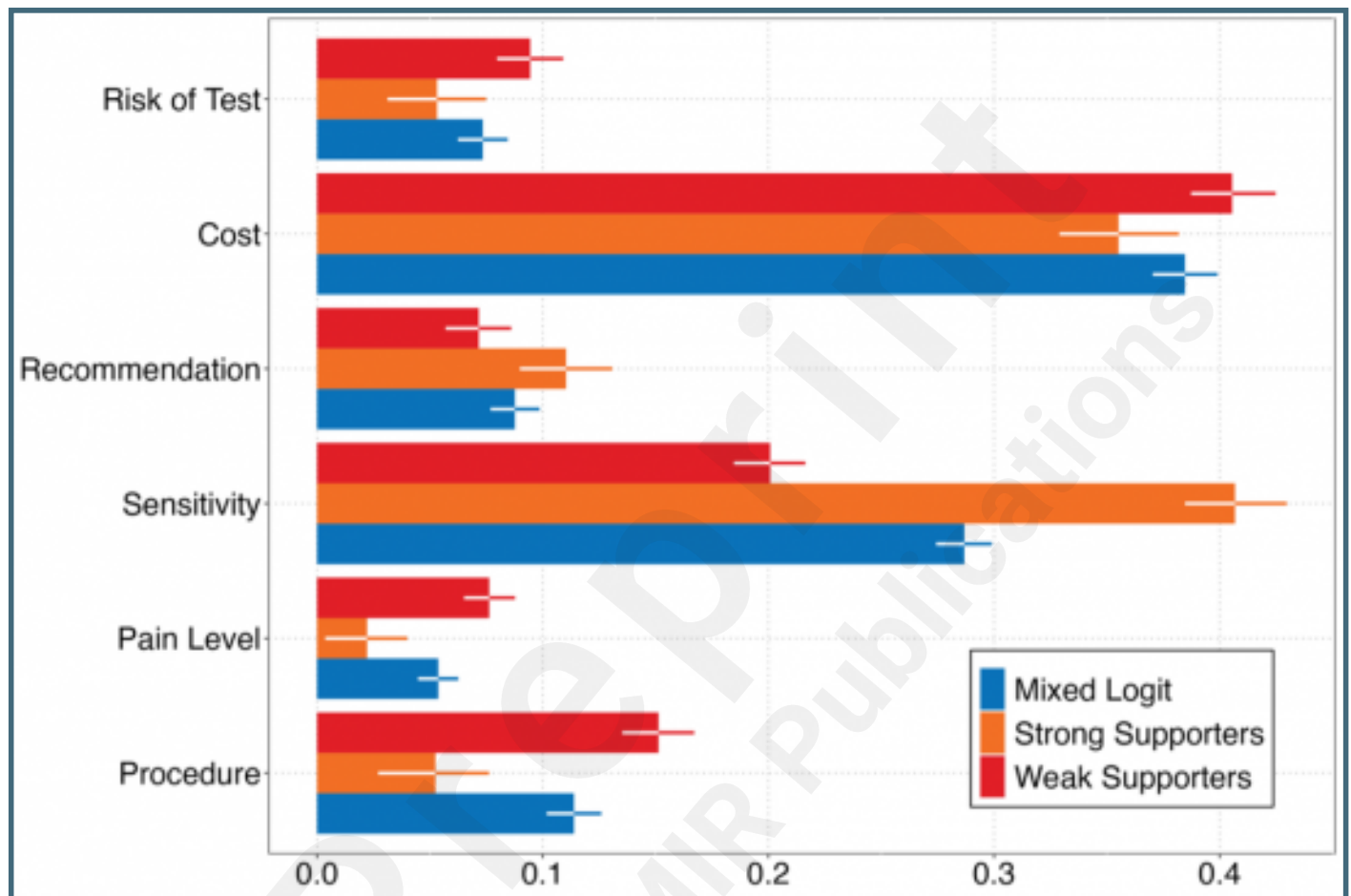
Supplementary Files

Figures

An example of a DCE choice task.

For the purpose of regular colorectal cancer screening, which of the tests below do you prefer?		
	Test A	Test B
Procedure	Collect a stool sample in a special container and return/ mail it to a designated address.	A small tube of blood will be taken.
Pain level	Mild pain	Mild pain
Sensitivity	90%	60%
Cost	SGD 1000	SGD 30
Risk of test	Positive risk of severe adverse event but less than 1%	No risk
My choice is:		
	Test A <input type="checkbox"/>	Test B <input type="checkbox"/>
Given your preferred choice above, will you really do it regularly in real life?		
My choice is:	Yes <input type="checkbox"/>	No <input type="checkbox"/>

Profile-based normalised CRI. Notes: CRI – Conditional relative importance Strong supporters and weak supporters are from mixed-mixed-multinomial logit model. Numbers on the x-axis represent the relative weight of each attribute in each model. The relative weights of each attribute within a model sums up to one. A higher value means the attribute is more important in decision making.



Multimedia Appendixes

Supplementary Material - Questionnaire.

URL: <http://asset.jmir.pub/assets/708991baf7b97476b04b27fa95fc712a.docx>

Attributes and levels of the DCE with total number of appearances and selections.

URL: <http://asset.jmir.pub/assets/d26b3b0c63f4da185f6e7229cc587dfd.docx>

Sociodemographic of participants from the qualitative survey and the DCE.

URL: <http://asset.jmir.pub/assets/e5ecf8b3f1d4f1b05de15e25a658e9e4.docx>

