BMJ Open Discrete choice experiment to evaluate preferences of patients with cystic fibrosis among alternative treatmentrelated health outcomes: a protocol

Charlie McLeod,[•]^{1,2} Richard Norman,³ Andre Schultz,⁴ Steven Mascaro,⁵ Steve Webb,^{6,7} Tom Snelling^{1,8}

ABSTRACT

Introduction Clinical decision-making is a complex

desirable health states should inform treatment and is

critical to agreeing on goals of therapy. Cystic fibrosis

(CF) is a common, inheritable multisystem disorder for

which the major manifestation is progressive, chronic

lung disease. Intermittent pulmonary exacerbations are

a hallmark of disease and these drive lung damage that

make assumptions, most likely implicit assumptions, about

identify and quantify the preferences of patients with cystic

Methods and analysis We will develop a discrete choice

experiment (DCE) in collaboration with people with CF and

their carers, and evaluate how patients make trade-offs

between different aspects of health-related status when

Ethics and dissemination Ethics approval for all aspects of this study was granted by the Western Australia Child and Adolescent Health Service Human Research Ethics

Committee [RGS903]. Weighted preference information

instrument as a measure of treatment success in the

upcoming Bayesian Evidence-Adaptive Trial to optimise

from the DCE will be used to develop a multiattribute utility

management of CF. Dissemination of results will also occur

through peer-reviewed publications and presentations to

relevant stakeholders and research networks.

results in premature death. We suspect that clinicians

outcomes that are desired by patients who are treated

for pulmonary exacerbations. The aim of this study is to

fibrosis regarding treatment outcomes.

considering treatment options.

process. Patient preference information regarding

To cite: McLeod C. Norman R. Schultz A, et al. Discrete choice experiment to evaluate preferences of patients with cystic fibrosis among alternative treatment-related health outcomes: a protocol. BMJ Open 2019;9:e030348. doi:10.1136/ bmjopen-2019-030348

 Prepublication history and additional material for this paper are available online. To view these files, please visit the journal online (http://dx.doi. org/10.1136/bmjopen-2019-030348).

Received 10 March 2019 Revised 08 July 2019 Accepted 12 July 2019



C Author(s) (or their employer(s)) 2019. Re-use permitted under CC BY-NC. No commercial re-use. See rights and permissions. Published by BMJ.

For numbered affiliations see end of article.

Correspondence to

Dr Charlie McLeod; charlie.mcleod@health.wa. gov.au

INTRODUCTION

Medical decision-making is a complex process. In the clinical setting, this should be a shared, iterative process between clinicians and patients (and their carers if appropriate). Each group brings differing needs and perspectives. Understanding patient preferences regarding health outcomes is critical to informing treatment choices and agreeing to goals of therapy.¹ In addition to being desired by patients, these goals must also be considered achievable by clinicians.

Strengths and limitations of this study

- This will be the first discrete choice experiment (DCE) conducted in patients with cystic fibrosis (CF) to examine preferred health outcome states.
- Attributes selected for inclusion in the DCE will be determined in consultation with people affected by CF (patients and carers).
- The DCE presents individuals with hypothetical choice tasks, asking patients to choose between different treatment options and alternative health states, and in doing so make trade-offs between different aspects of health-related status.
- Recruitment for this study will predominantly occur within Australia, which may limit the generalisability of findings to other CF populations.
- Weighted preference information is intended to be incorporated into a multiattribute utility instrument for use as a measure of treatment success in trials of treatments for CF pulmonary exacerbations.

Cystic fibrosis (CF) occurs in 1:2000 to 1:3500 births and is an inheritable multisystem disorder for which the major manifestation is progressive, chronic lung disease.² Survival improved dramatically during the latter part of the 20th century but has more recently slowed with average survival approximately 50 years.^{3–5} The disease is characterised by intermittent pulmonary exacerbations which drive lung damage. Minimising the decline in lung function that accompanies pulmonary exacerbations (one in four patients do not recover their baseline function) is thought to be key to improving survival and quality of life.⁶ Management of pulmonary exacerbations generally involves a combination of antimicrobial, anti-inflammatory and mucolytic agents, physiotherapy and optimisation of nutrition.⁷⁻¹² However, there is no consensus between centres regarding a standardised approach due to the paucity of evidence available to guide therapy.¹²

BMJ



Figure 1 Research stages. CF, cystic fibrosis; DCE, discrete choice experiment.

The James Lind Alliance, in partnership with healthcare providers and people with CF from 23 countries, has recognised treatment of pulmonary exacerbations as a research priority¹³ and specific knowledge gaps in this area have been recently identified.¹⁴

Determining the value of different treatment options depends on the value patients place on the consequences of each treatment decision. A variety of methods exist to elicit patient preference information. These include revealed preference and stated preference methods.¹⁵ Revealed preferences are based on observed choices made by individuals in real-life scenarios. Stated preferences are derived from decisions made by individuals when confronted with realistic, hypothetical choice scenarios, such as in a discrete choice experiment (DCE).¹⁶

DCE involves administration of a choice-based questionnaire that presents clinical vignettes and asks respondents to make trade-offs between different aspects of health-related status.¹⁷ The core theory informing DCE design is that the value of an option depends on the value of its attributes.^{16 18} Attributes are characteristics of treatments or services that may be processes (factors related to the delivery of care), structures (such as the setting in which healthcare occurs) and/or health outcomes,^{17 19} which are defined as the effects to health resulting from a treatment intervention.²⁰

DCEs differ from other stated preference methods because, by assigning different levels to attributes (contrasting results for each characteristic), they force participants to weigh their relative importance (such as drug benefit vs toxicity), compared with other techniques which simply rank or rate them.¹⁶ DCEs can also capture some of the dependencies between attributes.²¹ These dependencies can be investigated more thoroughly when coupled with a causal model.²² The major limitation of DCEs is that to maximise statistical and response efficiency,²³ the number of attributes selected for evaluation must be restricted, meaning the most important attributes must be known prior to construction. The range of attributes reported in the literature ranges from 2 to >10, with a mean of 5.

Guidance about the best approach for structuring DCE is provided by the International Society for Pharmacoeconomics and Outcomes Research (ISPOR).^{23–25} Since DCE's vary in terms of their objective(s), no single design will uniformly yield optimal results.²³ Accordingly, DCEs will vary with respect to their statistical efficiency and response burden.²⁶

This study presents a protocol for DCE designed to quantify how people with CF make trade-offs between different aspects of health status. In this case, attributes will be outcomes associated with treatment of pulmonary exacerbations that capture how a person feels, functions or survives, which are considered most important to people living with disease. Weighted patient preference information from the DCE will be incorporated into a multiattribute utility instrument (MAUI), which will generate a score as a measure of success in pulmonary exacerbation trials, including the planned Bayesian Evidence-Adaptive Trial to optimise management of CF (BEAT-CF). We expect recruitment for this study will largely occur within Australia, which may limit the generalisability of findings to other CF populations.

Aims

The aims of this study are (1) to identify and prioritise health outcomes of importance to people affected by CF, (2) to map these outcomes to consensus-derived causal models of CF pulmonary exacerbations and (3) to examine how patients make trade-offs between different aspects of health-related status when considering treatment decisions.

METHODS AND ANALYSIS

Overview of approach and consumer involvement

Consumer involvement is critical to this work which will comprise four stages (figure 1): (1) key health outcome elicitation and prioritisation from the perspective of people affected by CF, (2) mapping of these outcomes to a consensus-derived causal model of the disease processes, (3) selection of outcomes for inclusion in the DCE taking into consideration orthogonality and (4) development and administration of DCE to weigh the relative importance of outcomes from the perspective of patients. This study commenced in October 2018 and completion is expected in May 2020. Study progression at each stage is contingent on completion of the preceding research stage.

Key health outcome elicitation by CF consumers

Elicitation of key health outcomes from consumers will occur using two methods: (1) preliminary consumer workshops and (2) online health outcomes surveys. Patient preference information is expected to vary between individuals but also according to age and stage of disease. To help elucidate these differences, and because young people may be less inclined to contribute in a group where older participants are present, workshops will be conducted separately for the following groups: young people with CF (13–25 years), adults with CF (\geq 25 years) and persons who identify as carers for people with CF (including parents).

Workshops for patients will occur via teleconference, owing to infection control restrictions which preclude direct contact among this patient population. Carer workshops will be conducted in-person at the Telethon Kids Institute (Perth, Australia) with teleconference dial-in facilities available if requested.

Follow-up workshops

Outcomes identified through the consumer engagement activities detailed above will be collated with any additional potentially important health outcomes identified from review of the literature. Prioritisation of outcomes will occur during a series of follow-up workshops with each of the consumer groups. A combined workshop will also be conducted to derive a consensus list of prioritised outcomes relating to treatment of pulmonary exacerbations from the perspective of patients >13 years.

Consensus causal diagram

A consensus causal model (in the form of a Bayesian network) which links outcomes to causal disease processes for pulmonary exacerbations will be developed by a group of clinicians and other subject domain experts and people with lived experience of the disease. This process will be moderated by external facilitators using expert knowledge elicitation methods.^{27 28} The purpose of this is to guide selection of outcomes for inclusion in the DCE by choosing those that are likely to be important while minimising the inclusion of multiple attributes that measure the same outcome. The causal model will also aid in identifying probable combinations of attributes to ensure they are covered by the DCE, as well as helping to rule out improbable attribute combinations. Finally, the model will identify dependencies between attributes that need to be controlled for or otherwise handled during the analysis.

DCE design

The first step in designing the DCE is the identification of the important attributes (characteristics) for evaluation, and the assignment of possible levels to these attributes.^{16 29}

Attributes and levels

Attributes and levels will be selected according to guidance provided by ISPOR.²⁴ Only attributes that are identified as important to people with CF that map to causal disease pathways will be considered for inclusion. Levels (which may be categorical, continuous or probabilities) will be assigned in consultation with consumer representatives based on those that patients can relate to and consider meaningful which best represent the spectrum of possibilities that are clinically encountered.

Code to generate design

An experimental design will be constructed chiefly by RN in Ngene, software widely used in DCE development.²³ The principles underpinning our design is that it will (1) consist of a pool of choice tasks, divided into blocks to which respondents will be randomly allocated, (2) maximise efficiency in terms of the precision of the coefficients (ie, D-efficiency)³⁰ and (3) account for the ordered nature of the parameters under consideration by employing small non-zero priors in Ngene. As described below, the design may be updated following qualitative review of the initial design.

DCE questionnaire

The questionnaire will contain background information explaining the study rationale and potential risks and benefits of participating. Attributes and levels will be clearly defined. Sociodemographic data (age, sex, postcode) will be collected to assess if these factors influence stated preferences.

The draft DCE will be administered to a convenience sample of consumers (see figure 2 for DCE choice task example). If the tasks are too difficult or present implausible combinations of levels, we will define a candidate set of acceptable choice sets, and regenerate the design with a fixed amount of level overlap.^{31 32} Feedback about other design elements, including the length, layout, specific wording and comprehensibility will also be obtained. Suggestions for improvement will be considered and the final model agreed by consensus.

Sampling and recruitment strategy

There are 3422 people registered on the National CF database in Australia.³³ Our research population comprises patients ≥ 13 years with CF and individuals who identify as carers for person(s) living with CF.

Recruitment from the sampling pool for stages 1 and 3 of this study will occur through a variety of means including through outpatient clinics and inpatient wards at Sir Charles Gairdner Hospital (adult tertiary hospital facility) and Perth Children's Hospital (children's tertiary hospital facility) and by advertising through consumer and research networks, including the Western Australia CF consumer reference group, CF Australia and CF Western Australia, including through electronic and social media bulletins and communiqués. Interested persons will contact a member of the study team by phone or email to register their interest. Patient information and consent forms will be provided for the workshop (electronically via email attachment or wet signature for in-person workshop attendees) and survey participants (online). Participants aged between 13 and 18 years will additionally require guardian consent. Links for the online CF-related health outcomes survey and DCE questionnaire will be sent via email once consent forms are received.

Workshops will proceed if two or more consumers register to attend. For the combined workshop, we aim to recruit a minimum of two young people and two adults with CF.

There is no consensus regarding DCE sample size requirements for applications in healthcare. ISPOR guidance remarks that statistical precision increases at sample -

Please consider the following two options for treatment of a CF exacerbation versus the
option to have no treatment. The different treatment options could have a different effect on
your lung function and how you are feeling, and there may be side-effects resulting from
treatment.

+10% (good	$\pm 5\%$ (a little better)	0% (no change)	
(incompany)		0/0 (no change)	
mprovement)		,	
Excellent	Fair	Fair	
Moderate increase in	Stomach cramps and	None	
dry cough during,	watery diarrhoea up		
and for up to 15	to 4 times per day		
minutes after each			
nebuliser			
Able to return to	Unable to return to	Unable to return to	
school/ work at 50%	school/ work for 2	school/ work for 3	
capacity after 1	weeks, the return to	weeks, the return to	
week, then 75% for	school/ work at 50%	school/ work at 50%	
4 weeks, then 100%.	capacity for 2	capacity for 2	
	weeks, then 100%.	weeks, then 100%.	
0	0	0	
0	0	0	
	Improvement) Excellent Moderate increase in dry cough during, and for up to 15 minutes after each nebuliser Able to return to school/ work at 50% capacity after 1 week, then 75% for 4 weeks, then 100%. 0 0	Improvement/FairExcellentFairModerate increase in dry cough during, and for up to 15 minutes after each nebuliserStomach cramps and watery diarrhoea up to 4 times per dayAble to return to school/ work at 50% capacity after 1 week, then 75% for 4 weeks, then 100%.Unable to return to school/ work at 50% capacity for 2 weeks, then 100%.00	



Figure 2 Discrete choice experiment choice task example. CF, cystic fibrosis

sizes above 150 and levels out over 300 observations.²³ Lancsar *et al* suggests a minimum of 20 observations per choice set is required to achieve a reliable model,¹⁸ while Marshall provides a rough rule of thumb based on the number of tasks, alternatives per choice set and levels.³⁴ DCE will remain open until 200 responses are received and 4 months have elapsed since commencement. This target sample size represents a compromise between the desire for an accurate tool (one that reflects the average preferences for consumers) and the practical consideration that, at most, we aspire for roughly 1 in 10 patients to contribute from the sample pool of approximately 2000 people >13 years with CF.³³

Given our recruitment strategy, participants are expected to predominantly reside in Australia, although it is possible that some participants living overseas may participate, depending on the reach of our consumer and research networks. As a robustness check, analyses will be conducted with and without any non-Australia-based respondents.

Participant reimbursement

Participants will not be paid to take part in any aspect of this study. Parking reimbursement for those who attend the in-person caregiver workshops will be provided.

Patient and public involvement

BEAT-CF will focus on evaluating optimal treatment(s) for pulmonary exacerbations, which has been identified by the James Lind Alliance as a research priority for people affected by CF.¹³ Consumer advocates have been involved in elements of trial design, and patients will be involved at all stages of the research process. Patients are not officially involved in participant recruitment, although promotion of research activities is expected to occur by word-of-mouth. Results will be disseminated to participants involved in this study and broadly via peer-reviewed presentations and by consumer research networks and CF advocacy organisations.

Data collection

Workshops will be approximately 2 hours in duration. Outcome elicitation (preliminary workshops) will occur using nominal group technique.³⁵ Key aspects of this approach include clarification of the purpose of the session, allowing time for participants to formulate individual responses, and then asking participants to present one idea aloud, in turn to the group until saturation occurs, that is, until no new outcomes are identified.³⁵ Results for these sessions will be collated on Excel spreadsheets and remain visible to participants throughout the session. Discussion

of individual ideas will be permitted to allow clarification, rather than to resolve differences. A facilitator will ensure discussion is equally balanced among all ideas and between individuals. Prioritisation of outcomes (follow-up workshops) will occur by collating results from participants asked to rank outcomes at the follow-up workshops.

The online CF-related health outcomes survey will present consumers with the same two open-ended questions as those posed at the preliminary workshops (Appendix 1). This is being performed to ensure broad capture of CF-related health outcomes. The survey will be advertised and remain open for a 4-week period from commencement.

Data collection instruments and technologies

Workshops will be audio-recorded to enable playback, which is necessary to ensure the validity of data by minimising investigator recall bias.

CF-related health outcomes survey will be built using a REDCap online database, which will be hosted on a secure server at the Telethon Kids Institute. DCE will be built by a commercial provider. Both surveys will be conducted anonymously and will collect non-identifiable data only. Participants can exit from the online surveys at any time prior to submission of their responses. After this time, it will not be possible to withdraw their responses, as all items are non-identifiable.

Data processing

Workshop and causal diagram data files will be stored as password protected Excel or word documents. The non-identifiable CF-related health outcomes results data set will be downloaded from REDcap. The non-identifiable DCE data set will be sent as a password protected file by the commercial provider.

All data files will be stored securely on a password protected computer, which will be backed up on the Telethon Kids Institute server. Hard copy consent forms will be stored securely in a fireproof, locked filing cabinet at Telethon Kids Institute. The Institute is protected by highlevel security and requires swipe card access for entry to the building and individual work areas. Data and research records will be retained for a minimum of 5 years after the date of last publication or until the youngest subject turns 25 years of age (whichever occurs later).

Data analysis

Analysis for the DCE will be performed in STATA V.13 using a range of regression approaches. For initial analysis, we will conduct a conditional logit. This will be used to understand the treatment preferences and trade-offs made by patients when considering outcomes relating to treatment of pulmonary exacerbations. For conditional logit analysis, the functional form is specified as:

$$U_{isj} = \beta x_{isj} + \varepsilon_{isj}$$

which represents the utility of option *j* in choice set *s* for survey respondent *i*, where x_{isj} is a vector of dummy variables representing the levels of the health state presented

in option *j*, β is a vector of utility weights associated with each level and ε_{isj} is the error term.³⁶

Second, we will use a mixed logit model to evaluate preference heterogeneity among respondents:

$$U_{isj} = (\beta + n_i) x_{isj} + \varepsilon_{isj}$$

where β represents population mean preferences and n_i is the individual deviation around those mean preferences.³⁶

Additionally, we will run exploratory analyses using a generalised multinomial logit, which considers both scale and preference heterogeneity.^{37 38} However, this will not be the prespecified primary outcome as there is concern about its ability to converge with a relatively small sample size. An exploratory analysis on DCE responses will also be conducted using causal Bayesian networks.³⁹ Causal Bayesian networks are a generalisation of the path models of structural equation modelling,²² which have been recently applied in DCE analysis to provide greater insight into choice processes.²¹

ETHICS AND DISSEMINATION

Ethics approval for all aspects of this study was granted. Deviations from this protocol will not occur without prior approval. This study will be conducted in accordance with the International Council for Harmonisation of technical requirements for pharmaceuticals for human use (ICH) guidelines for Good Clinical Practice.⁴⁰

Participant information sheets will be provided to workshop and survey participants. Asking consumers to consider health-related outcomes may result in distress. Participants will be warned about this risk, and patients will be recommended to contact their general practitioner, CF clinic or Lifeline if this occurs.

Data obtained from workshop sessions or survey responses will remain confidential. Data will be reported in such a way that it will not be possible to identify individuals or their contributions.

Dissemination will occur through peer-reviewed publications and presentations to relevant stakeholders and research networks. DCE results will be reported according to the Guidance for Reporting Involvement of Patients and the Public checklist.⁴¹ This is a consensus reference document agreed by international representatives, which provides guidance about how to report patient and public involvement in health-related and social research.

Author affiliations

¹Infectious Diseases, Perth Children's Hospital, Nedlands, Western Australia, Australia

²School of Medicine, University of Western Australia, Nedlands, Western Australia, Australia

³School of Public Health, Curtin University, Bentley, Western Australia, Australia ⁴Respiratory Medicine, Perth Children's Hospital, Nedlands, Western Australia, Australia

⁵Clayton School of IT, Monash University, Clayton, Victoria, Australia ⁶Intensive care, St John of God Hospital, Subiaco, Western Australia, Australia ⁷School of Population Health and Preventive Medicine, Monash University, Melbourne, Victoria, Australia ⁸Wesfarmers Centre of Vaccines & Infectious Diseases, Telethon Kids Institute, West Perth, Western Australia, Australia

Acknowledgements The authors thank consumer advocates Mitch Messer and Kate Spaapen for their valued involvement in facilitating the consumer engagement activities relating to this body of work.

Contributors TS was responsible for the overall study concept. TS, CM, RN, AS, SM and SW elaborated the study protocol. CM drafted the manuscript. All authors revised and approved the final manuscript. All authors meet the ICMJE criteria for authorship.

Funding This work was supported by the Perth Children's Hospital Foundation (New Investigator grant; 2017). Fellowship support was provided by the NHMRC (GNT1150996), the Wesfarmers Centre (top-up grant) and the Perth Children's Hospital (Top-up grant).

Competing interests None declared.

Patient consent for publication Not required.

Ethics approval All aspects of this study were approved by the Child and Adolescent Health Service Human Research Ethics Committee [RGS903].

Provenance and peer review Not commissioned; externally peer reviewed.

Data availability statement There are no data in this work.

Open access This is an open access article distributed in accordance with the Creative Commons Attribution Non Commercial (CC BY-NC 4.0) license, which permits others to distribute, remix, adapt, build upon this work non-commercially, and license their derivative works on different terms, provided the original work is properly cited, appropriate credit is given, any changes made indicated, and the use is non-commercial. See: http://creativecommons.org/licenses/by-nc/4.0/.

REFERENCES

- Webb SAR, Litton E, Barned KL, et al. Treatment goals: health care improvement through setting and measuring patient-centred outcomes. Crit Care Resusc 2013;15:143–6.
- Organisation WH. Genes and human disease: cystic fibrosis: World health organisation, 2019. Available: https://www.who.int/genomics/ public/geneticdiseases/en/index2.html [Accessed 2 Mar 2019].
- Burgel P-R, Bellis G, Olesen HV, et al. Future trends in cystic fibrosis demography in 34 European countries. Eur Respir J 2015;46:133–41.
- 4. Elborn JS. Cystic fibrosis. Lancet 2016;388:2519-31.
- Stephenson AL, Sykes J, Stanojevic S, et al. Survival comparison of patients with cystic fibrosis in Canada and the United States: a population-based cohort study. Ann Intern Med 2017;166:537–46.
- Sanders DB, Bittner RCL, Rosenfeld M, et al. Failure to recover to baseline pulmonary function after cystic fibrosis pulmonary exacerbation. Am J Respir Crit Care Med 2010;182:627–32.
- Balfour-Lynn IM, Welch K. Inhaled corticosteroids for cystic fibrosis. Cochrane Database Syst Rev 2016;(8).
- Hurley MN, Forrester DL, Smyth AR. Antibiotic adjuvant therapy for pulmonary infection in cystic fibrosis. *Cochrane Database Syst Rev* 2013;(6).
- Hurley MN, Prayle AP, Flume P. Intravenous antibiotics for pulmonary exacerbations in people with cystic fibrosis. *Cochrane Database Syst Rev* 2015;(7):CD009730.
- Southern KW, Barker PM, Solis-Moya A, et al. Macrolide antibiotics for cystic fibrosis. Cochrane Database Syst Rev 2012;11.
- 11. Wark P, McDonald VM. Nebulised hypertonic saline for cystic fibrosis. *Cochrane Database Syst Rev* 2018;9.
- Yang C, Montgomery M. Dornase alfa for cystic fibrosis. Cochrane Database Syst Rev 2018;9.
- Rowbotham NJ, Smith S, Leighton PA, et al. The top 10 research priorities in cystic fibrosis developed by a partnership between people with CF and healthcare providers. *Thorax* 2018;73:388–90.
- Rowbotham NJ, Smith S, Prayle AP, *et al.* Gaps in the evidence for treatment decisions in cystic fibrosis: a systematic review. *Thorax* 2019;74:229–36.
- Ali S, Ronaldson S. Ordinal preference elicitation methods in health economics and health services research: using discrete choice experiments and ranking methods. *Br Med Bull* 2012;103:21–44.

- 16. Wong SF, Norman R, Dunning TL, *et al.* A protocol for a discrete choice experiment: understanding preferences of patients with cancer towards their cancer care across metropolitan and rural regions in Australia. *BMJ Open* 2014;4:e006661.
- de Bekker-Grob EW, Ryan M, Gerard K. Discrete choice experiments in health economics: a review of the literature. *Health Econ* 2012;21:145–72.
- Lancsar E, Louviere J. Conducting discrete choice experiments to inform healthcare decision making: a user's guide. *Pharmacoeconomics* 2008;26:661–77.
- Harrison M, Milbers K, Hudson M, et al. Do patients and health care providers have discordant preferences about which aspects of treatments matter most? Evidence from a systematic review of discrete choice experiments. *BMJ Open* 2017;7:e014719.
- Group F-NBW. Best (biomarkers, endpoints, and other tools) resource. silver spring (MD): food and drug administration (US), 2016.
 Durge CM. Coste IV Learning the based
- 21. Rungie CM, Coote LV, Louviere JJ. Latent variables in discrete choice experiments. *Journal of Choice Modelling* 2012;5:145–56.
- 22. Judea P. The book of why: the new science of cause and effect. Basic Books, 2018.
- Reed Johnson F, Lancsar E, Marshall D, et al. Constructing experimental designs for discrete-choice experiments: report of the ISPOR conjoint analysis experimental design good research practices Task force. Value Health 2013;16:3–13.
- 24. Bridges JFP, Hauber AB, Marshall D, *et al.* Conjoint analysis applications in health--a checklist: a report of the ISPOR Good Research Practices for Conjoint Analysis Task Force. *Value Health* 2011;14:403–13.
- Hauber AB, González JM, Groothuis-Oudshoorn CGM, et al. Statistical methods for the analysis of discrete choice experiments: a report of the ISPOR conjoint analysis good research practices Task force. Value Health 2016;19:300–15.
- Vanniyasingam T, Daly C, Jin X, et al. Investigating the impact of design characteristics on statistical efficiency within discrete choice experiments: a systematic survey. *Contemp Clin Trials Commun* 2018;10:17–28.
- 27. Korb KNA. Bayesian artificial intelligence. 2nd ed. CRC Press, 2010.
- Neil M, Fenton N, Neilson L. Building large-scale Bayesian networks. Knowl Eng Rev 2000;15:257–84.
- 29. Coast J, Horrocks S. Developing attributes and levels for discrete choice experiments using qualitative methods. *J Health Serv Res Policy* 2007;12:25–30.
- 30. Street DBL. *The construction of optimal stated choice experiments: theory and methods.* New Jersey: Wiley, 2007.
- Jonker MF, Donkers B, de Bekker-Grob E, *et al.* Attribute level overlap (and color coding) can reduce task complexity, improve choice consistency, and decrease the dropout rate in discrete choice experiments. *Health Econ* 2019;28:350–63.
- Norman R, Viney R, Aaronson NK, et al. Using a discrete choice experiment to value the QLU-C10D: feasibility and sensitivity to presentation format. Qual Life Res 2016;25:637–49.
- 33. Ruseckaite RAS, Ranger T, Tacey M, et al. The Australian cystic fibrosis data registry annual report, 2016.
- Marshall D, Bridges JFP, Hauber B, et al. Conjoint Analysis Applications in Health - How are Studies being Designed and Reported?: An Update on Current Practice in the Published Literature between 2005 and 2008. *Patient* 2010;3:249–56.
- Boers M, Kirwan JR, Wells G, et al. Developing core outcome measurement sets for clinical trials: OMERACT filter 2.0. J Clin Epidemiol 2014;67:745–53.
- King MT, Viney R, Simon Pickard A, *et al.* Australian utility weights for the EORTC QLU-C10D, a Multi-Attribute utility instrument derived from the cancer-specific quality of life questionnaire, EORTC QLQ-C30. *Pharmacoeconomics* 2018;36:225–38.
- Fiebig DG, Keane MP, Louviere J, et al. The generalized multinomial Logit model: accounting for scale and coefficient heterogeneity. *Marketing Science* 2010;29:393–421.
- Y HA G, Knox S. Fitting the generalized multinomial logit model in Stata. Stata J 2013;13:382–97.
- Pearl J. Causality: models, Reasoning and interference. New York: Cambridge University Press, 2000.
- ICHAOTRIPH U. International Council for harmonisation of technical requirements for pharmaceuticals for human use (ICH guideline) for good clinical practice, 2016.
- Staniszewska S, Brett J, Simera I, et al. GRIPP2 reporting checklists: tools to improve reporting of patient and public involvement in research. BMJ 2017;358:j3453.