

Broadening the Measurement and Valuation of Health and Quality of Life

Brendan Mulhern

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Centre for Health Economics Research and Evaluation

Faculty of Business

University of Technology Sydney

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CERTIFICATE OF ORIGINAL AUTHORSHIP

I, BRENDAN MULHERN declare that this thesis, is submitted in fulfilment of the requirements for the award of Doctor of Philosophy, in the Faculty of Business at the University of Technology Sydney.

This thesis is wholly my own work unless otherwise reference or acknowledged. In addition, I certify that all information sources and literature used are indicated in the thesis.

This document has not been submitted for qualifications at any other academic institution.

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THESIS FORMAT

This is a conventional thesis including seven chapters of content, references and further appendices. Two of the chapters (a literature review and empirical study) three empirical studies have resulted in published journal articles as described below.

PUBLISHED PAPERS RESULTING FROM THIS THESIS

1. **Mulhern B**, Norman R, DeAbreu Lourenco R, Street D, Malley J, Viney R. Investigating the relative value of health and social care related quality of life using a Discrete Choice Experiment. *Social Science and Medicine*. 2019; 233: 28-37.

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2. **Mulhern B**, Norman R, Street D, Viney R. One method, many methodological choices: A structured review of Discrete Choice Experiments for health state valuation. *Pharmacoeconomics*. 2019; 37(1):29-43.

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ABSTRACT

Economic evaluation is an important tool in health care resource allocation. Interventions are typically evaluated through a cost utility analysis (CUA) using the Quality Adjusted Life Year (QALY), a metric combining length of life and quality of life (QoL) into a single outcome. The quality aspect of the QALY is often provided by a preference-based measure (PBM) that includes a way of measuring health, and a preference-based value set. The most commonly used PBMs focus on health-related quality of life (HRQoL). However, there is a case for broadening what is measured and valued by including other aspects of QoL (such as social care related QoL) alongside HRQoL.

This thesis explores how methods for the measurement and valuation of health and QoL can be extended to inform the development of broader and more widely applicable instruments. This was investigated by first exploring how to incorporate QoL concepts into PBMs, and second by testing the further application of Discrete Choice Experiment (DCE) methods to value QoL. Three empirical studies were conducted

The first study assessed existing measures of health and QoL using Item Response Theory (IRT), and tested two ways in which PBMs could be broadened to incorporate wider QoL concepts. The results demonstrated overlap and divergence in what is measured. This informed where extra dimensions of QoL could broaden the information collected, and how the information collected within existing HRQoL frameworks could be extended.

The second study used DCE to understand respondent preferences for diverse dimensions of QoL. The results provided evidence respondents do trade across different concepts of QoL. This supports the need for broader measures, and also the use of DCE to value broader outcomes.

The third study focuses on DCE methods, and particularly on the construction of designs for DCEs. The results provided detailed information about different design strategies for the valuation of QoL outcomes.

The overall findings raise key issues about what should be captured in PBMs, and also provide novel information about methods that can be used to inform the assessment, development and valuation of future instruments. For example, the results inform how IRT can be used in PBM

development. They also suggest how DCE can be used to value diverse QoL concepts. This can inform the development and valuation of broader measurement systems of QoL outcomes that can increase the scope and enhance the applicability of QALY values used in resource allocation decision making.

LIST OF ABBREVIATIONS

| Abbreviation | Description |
|--------------------|---|
| 15D | 15 Dimension |
| A | Anxiety (PROMIS dimension) |
| ABC | Assessment of Burden of COPD |
| AC | Accommodation (ASCOT dimension) |
| AD | Anxiety/Depression (EQ-5D dimension) |
| AIC | Akaike Information Criterion |
| ANOVA | Analysis of Variance |
| AQoL | Assessment of Quality of Life |
| AQoL-8D | Assessment of Quality of Life – 8 Dimension |
| ASCOT | Adult Social Care Outcomes Toolkit |
| BIC | Bayesian Information Criterion |
| BPI | Behaviour Problems Index |
| BWS | Best Worst Scaling |
| CAT | Computer Adaptive Testing |
| CBA | Cost Benefit Analysis |
| CF | Crawford Ferguson |
| CFA | Confirmatory Factor Analysis |
| CL | Cleanliness (ASCOT dimension) |
| CO | Control (ASCOT dimension) |
| COPD | Chronic Obstructive Pulmonary Disease |
| CREATE | Checklist for Reporting Valuation Studies |
| CTT | Classical Test Theory |
| CUA | Cost Utility Analysis |
| D | Depression (PROMIS dimension) |
| DCE | Discrete Choice Experiment |
| DCE _{TTO} | Discrete Choice Experiment including duration |
| DEMQOL | Dementia Quality of Life |
| DI | Dignity (ASCOT dimension) |
| DIF | Differential Item Functioning |
| EFA | Exploratory Factor Analysis |
| EORTC | European Organisation for Research and Treatment of Cancer |
| EQALY | Extended Quality Adjusted Life Year |
| FA | Fatigue (PROMIS dimension) |
| FD | Food and Drink (ASCOT dimension) |
| GDP | Gross Domestic Product |
| GH | General health (SF-36 dimension) |
| GMNL | Generalised Multinomial Logit model |
| HRQoL | Health-Related Quality of Life |
| HTA | Health Technology Assessment |
| HUI-2 | Health Utility Index – Mark 2 |
| HUI-3 | Health Utility Index – Mark 3 |
| ICECAP | ICEpop CAPability measure for Adults |
| ICER | Incremental Cost Effectiveness Ratio |
| IIA | Independence of Irrelevant Alternatives |
| ISPOR | International Society for Pharmacoeconomics and Outcomes Research |
| IRT | Item Response Theory |

| | |
|--------|--|
| LL | Log-Likelihood |
| LLR | Log-Likelihood Restricted |
| LLU | Log-Likelihood Unrestricted |
| LR | Likelihood Ratio |
| LT-TTO | Lead Time – Time Trade-Off |
| MAUI | Multi-Attribute Utility Instrument |
| MH | Mental Health (SF-36 and SF-6D dimension) |
| MH-RM | Metropolis–Hastings Robbins–Munro algorithm |
| MIC | Multi Instrument Comparison |
| MNL | Multinomial Logit |
| MO | Mobility (EQ-5D dimension) |
| NICE | National Institute for Health and Care Excellence |
| OC | Occupation (ASCOT dimension) |
| ONS-4 | Office of National Statistics – 4 |
| OPUS | Older Person's Utility Scale |
| PA | Pain (SF-36, SF-6D and PROMIS dimension) |
| PBAC | Pharmaceutical Benefits Advisory Committee |
| PBM | Preference-Based Measure |
| PD | Pain/Discomfort (EQ-5D dimension) |
| PF | Physical Functioning (SF-36, SF-6D and PROMIS dimension) |
| PICOS | Participants, interventions, comparisons, outcomes, and study |
| PRISMA | Preferred Reporting Items for Systematic Reviews and Meta-Analyses |
| PROMIS | Patient-Reported Outcome Measure Information System |
| PWI | Personal Wellbeing Index |
| QALY | Quality Adjusted Life Year |
| QoL | Quality of Life |
| RE | Role Emotional (SF-36 dimension) |
| RF | Role Functioning (SF-6D dimension) |
| RMSE | Root Mean Squared Error |
| RMSEA | Root Mean Squared Error of Approximation |
| RP | Role Physical (SF-36 dimension) |
| RUT | Random Utility Theory |
| SA | Safety (ASCOT dimension) |
| SAS | Statistical Analysis Software |
| SC | Self-Care (EQ-5D dimension) |
| SCRQoL | Social Care Related Quality of Life |
| SD | Standard Deviation |
| SF-6D | Short Form – 6 Dimension |
| SF-36 | Short Form – 36 |
| SF | Social Functioning (SF-36, SF-6D and PROMIS dimension) |
| SG | Standard Gamble |
| SL | Sleep (PROMIS dimension) |
| SP | Social Participation (ASCOT dimension) |
| SWLS | Satisfaction With Life Scale |
| TIF | Total Information Function |
| TTO | Time Trade-Off |
| UA | Usual Activities (EQ-5D dimension) |
| VAS | Visual Analogue Scale |

| | |
|--------|--|
| VNM | Von Neumann and Morgenstern |
| VT | Vitality (SF-36 and SF-6D dimension) |
| WEMWBS | Warwick and Edinburgh Mental Wellbeing Scale |
| WHO | World Health Organisation |