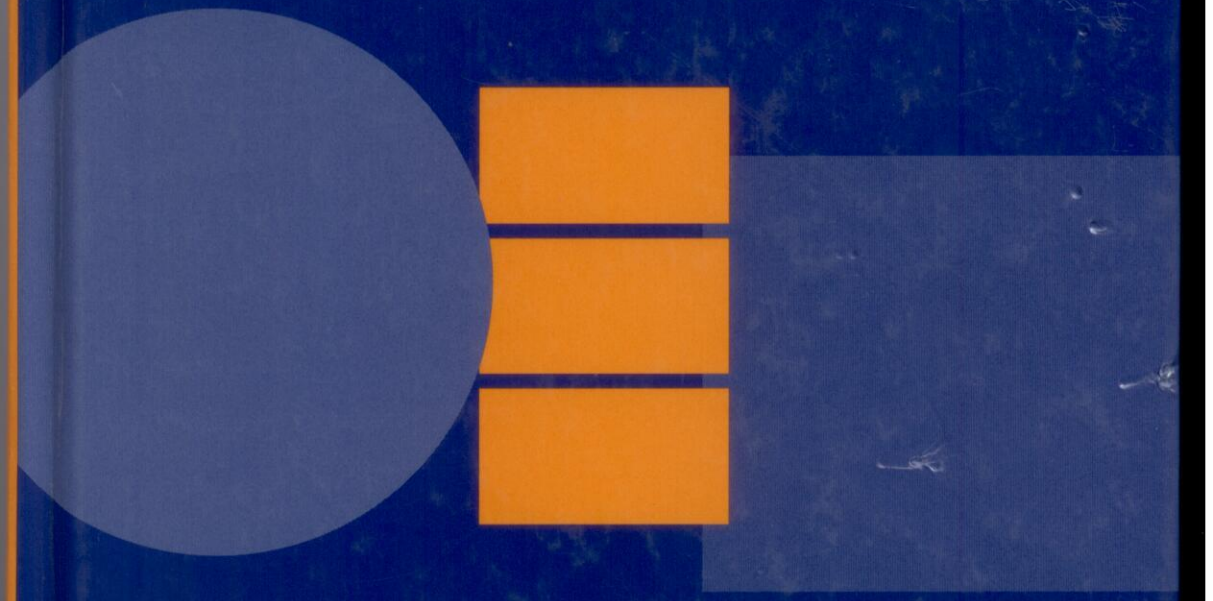
Measuring Efficiency in Health Care

Analytic Techniques and Health Policy



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Contents

List of figures *page* viii

List of tables x

Preface xiii

Acknowledgements xv

List of abbreviations xvi

1 Efficiency in health care 1

1.1 Introduction 1
1.2 The demand for efficiency analysis in health care 2
1.3 Organisational efficiency 4
1.4 Analytic efficiency measurement techniques 10
1.5 Experience with efficiency analysis in health care 12
1.6 This book 13

2 The components of an efficiency model 17

2.1 Introduction 17
2.2 Unit of analysis 19
2.3 What are outputs in health care? 21
2.3.1 Health outcomes 22
2.3.2 Health care activities 27
2.4 Valuing health care outputs 28
2.5 Specifying inputs 29
2.5.1 Labour inputs 30
2.5.2 Capital inputs 31
2.5.3 Summary 33
2.6 Environmental constraints 33
2.7 Practical challenges 37
2.8 Conclusions 39

3 Stochastic frontier analysis of cross-sectional data 41

3.1 Introduction 41
3.2 Considerations in stochastic frontier analysis 42
3.2.1 Whether to estimate a production or a cost function 42
3.2.2 Whether to transform variables 43

3.2.3 *Whether to estimate a total or an average function* 44
3.2.4 *Which explanatory variables to include* 47
3.2.5 *How to model the residual* 50
3.2.6 *How to extract the efficiency estimates* 57
3.3 Application to acute hospitals in England 58
3.4 Conclusions 65

4 Stochastic frontier analysis of panel data 69
4.1 Introduction 69
4.2 Time-invariant efficiency 70
4.2.1 *Empirical application* 73
4.3 Time-varying efficiency 79
4.3.1 *Empirical application* 81
4.4 Unobserved heterogeneity 82
4.4.1 *Empirical application* 84
4.5 Summary and sensitivity analysis 86
4.6 Conclusions 89

5 Data envelopment analysis 91
5.1 Introduction 91
5.2 The DEA methodology 91
5.2.1 *Input-oriented efficiency* 92
5.2.2 *Output-oriented efficiency* 94
5.2.3 *DEA formulation* 96
5.3 Considerations in data envelopment analysis 100
5.3.1 *Whether to assume constant or variable returns to scale* 101
5.3.2 *Whether to assume an input or an output orientation* 105
5.3.3 *Whether to apply weight restrictions* 106
5.3.4 *Dealing with 'slacks'* 109
5.3.5 *Model specification and judging the quality of a DEA model* 111
5.3.6 *How to adjust for environmental factors* 115
5.4 Application to acute hospitals in England 117
5.4.1 *The methods and data* 117
5.4.2 *Model specifications* 118
5.4.3 *Results* 118
5.5 Conclusions 127

6 The Malmquist index 129
6.1 Introduction 129
6.2 The Malmquist methodology 130
6.2.1 *A graphical illustration* 130
6.2.2 *The general form of the Malmquist index* 133
6.3 Considerations in using the Malmquist index 137
6.4 Previous literature on the Malmquist index in health care 138
6.5 Application to acute hospitals in England 139
6.5.1 *The methods and data* 139

6.5.2 *Model specifications* 139
6.5.3 *Results* 139
6.6 Conclusions 149

7 A comparison of SFA and DEA 151
7.1 Introduction 151
7.2 Why SFA and DEA produce different efficiency estimates 151
7.3 Other differences between SFA and DEA 154
7.4 Comparison of different methodologies 156
7.4.1 *The methods and data* 156
7.4.2 *Model specifications* 156
7.4.3 *Results* 159
7.5 Conclusions 164

8 Unresolved issues and challenges in efficiency measurement 167
8.1 Introduction 167
8.2 Output weights 167
8.3 Modelling the production process 171
8.4 Environmental constraints 174
8.5 Dynamic effects 177
8.6 Conclusions 178

9 Some alternative approaches to measuring performance 179
9.1 Introduction 179
9.2 Multilevel modelling 180
9.3 Generalised statistical modelling 187
9.3.1 *Illustrative example* 192
9.4 Seemingly unrelated regression (SUR) in a multilevel context 197
9.4.1 *Illustrative example* 199
9.5 Conclusions 204

10 Conclusions 207
10.1 Introduction 207
10.2 Output weights 208
10.3 Partitioning unexplained variation 209
10.4 Unresolved technical issues 211
10.5 For policy makers and regulators 213

Appendix: Data description 215

References 219

Author index 233

Subject index 237

Figures

1.1 Efficiency measurement under constant returns to scale *page 5*
1.2 The case of two outputs 6
1.3 The case of two inputs 6
1.4 Allocative efficiency with two inputs 8
1.5 Allocative efficiency with two outputs 8
1.6 Technical and allocative inefficiency 9
1.7 Economies of scale 10
2.1 The naïve model of organisational performance 18
2.2 Change in health status: before and after intervention 25
2.3 Change in health status: with and without intervention 25
2.4 The dynamic nature of organisational performance 32
2.5 The broader context of efficiency analysis 38
3.1 Linear and logarithmic functional forms 44
3.2 Illustration of heteroscedastic data 46
3.3 Illustration of an OLS regression and COLS frontier 52
3.4 Illustration of a stochastic frontier 54
3.5 Histograms showing (a) the residual from the OLS model; (b) the inefficiency term from the half-normal model; (c) the inefficiency term from the truncated model; (d) the inefficiency term from the exponential model 56
4.1 Mean changes in costs and activity over time 77
5.1 Technical and allocative efficiency under an input orientation 93
5.2 Technical and allocative efficiency under an output orientation 95
5.3 Constant and variable returns to scale 102
5.4 Input and output orientation 106
5.5 Efficiency measurement and input slacks 110
5.6 Efficiency measurement and output slacks 110

5.7 Distribution of efficiency scores for five DEA models 123
6.1 Illustration of productivity change with one input and one output 131
6.2 Mean expenditure and activity, 1994/95–1997/98 142
6.3 Malmquist TFP indices 145
6.4 Decomposition of Malmquist index for Model 2 146
8.1 The production possibility frontier: different preferences lead to different weights 168
8.2 Composite scores indicated by the lines C_1C_1 and C_2C_2 169
8.3 Observed performance of five systems with identical expenditure and environment 170
9.1 Performance ranking using aggregate organisational data 181
9.2 Changes in performance ranking based on hierarchical structure 182
9.3 Hierarchical data structure 183
9.4 The production possibility frontier with two performance indicators 188
9.5 Multivariate hierarchical data structure 201
9.6 Waiting time for routine surgery – sensitivity analysis of health authority effects 204

Tables

3.1 Calculating individual efficiency estimates for each organisation *page* 57
3.2 Descriptive statistics 60
3.3 Regression results for average cost function 63
3.4 Correlations across average cost specifications 65
3.5 Regression results for total cost function 66
3.6 Correlations across total cost specifications 68
3.7 Correlations across average and total cost specifications 68
4.1 Summary of time-invariant SF panel data models 74
4.2 Descriptive statistics 75
4.3 Estimates from time-invariant SF models 78
4.4 Estimates from time-varying SF models 82
4.5 Estimates from 'true' SF models 85
4.6 Comparison of estimates from different models 87
4.7 Sensitivity analysis of mean efficiency 88
5.1 DEA model variables, 1997/98 119
5.2 DEA model specifications 121
5.3 DEA model specifications and efficiency results 122
5.4 Correlations between efficiency scores 123
5.5 Correlations between efficiency ranks 124
5.6 Individual hospital scores and rankings under various specifications 125
5.7 Data for Models 1 and 2 of DEA specifications for ten hospitals 126
5.8 Tobit Model of DEA efficiency scores regressed against a single environmental factor 127
6.1 Mean values for Malmquist model variables 140
6.2 Malmquist model specifications 143
6.3 Malmquist TFP results 144
6.4 Correlations between Malmquist TFP scores 145

6.5 Individual hospital scores and rankings for each year for Model 2 147
6.6 Data for Model 2 of Malmquist specification for hospital I 148
7.1 Comparison of SFA and DEA 154
7.2 Model variables, 1997/98 157
7.3 Model specifications 159
7.4 Model 1 efficiency scores 160
7.5 Correlations of SFA and DEA efficiency scores for Model 1 160
7.6 Individual hospital scores and rankings for Model 1 161
7.7 Descriptive statistics for SFA and DEA efficiency scores 162
7.8 Individual hospital scores and rankings under various specifications 163
9.1 Socio-demographic data used in needs index 184
9.2 Three-level random intercept model to explain proportion of variability in performance indicators attributable to regional and district health authorities 186
9.3 OLS and SUR results for three performance indicators 194
9.4 Correlations of OLS residuals 197
9.5 Performance indicators and socio-economic variables 200
9.6 Correlation of health authority effects from the multivariate multilevel model 202