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Multilevel Modelling for Public Health and Health Services Research

Health in Context

Contents

Part I Theoretical, Conceptual and Methodological Background

1	Introduction	3
	Importance of MLA for Research in Health and Care	4
	The Scope of Public Health and Health Services Research	4
	Research and Policy	7
	Conclusion	11
	References	11
2	Health in Context	13
	Relationships Between the Macro and Micro Levels	14
	Micro Level: Behaviour of Patients and Providers	18
	The Behaviour of Healthcare Providers	19
	The Behaviour of Patients	19
	Patient–Provider Interaction	20
	From Macro to Micro Level	21
	What Contexts Are Relevant?	22
	From Micro to Macro Level	24
	The Use of “League Tables”	24
	Conclusion	25
	References	26
3	What Is Multilevel Modelling?	29
	Methodological Background	30
	Why Use Multilevel Modelling?	32
	Aggregate Analysis	32
	Individual Analysis	32
	Separate Individual Analyses Within Each Higher Level Unit	33
	Individual-Level Analysis with Dummy Variables	33

What Is a Multilevel Model?	34
What Is a Level?	36
How Many Units Do We Need at Each Level?	38
Hypotheses That Can Be Tested with Multilevel Analysis	39
Hypotheses About Variation	40
Individual-Level Hypotheses	43
Context Hypotheses	43
Cross-Level Interactions	45
Conclusion	46
References	46
4 Multilevel Data Structures	49
Strict Hierarchies: The Basic Model	50
Multistage Sampling Designs	51
Evaluating Community Interventions and Cluster Randomised Trials	52
Designs Including Time	53
Multiple Responses	54
Non-hierarchical Structures	56
Cross-Classified Models	56
Multiple Membership Model	57
Correlated Cross-Classified Model	58
Other Multilevel Models	59
Pseudo-levels	62
Incomplete Hierarchies	63
Conclusion	64
References	65
Part II Statistical Background	
5 Graphs and Equations	71
Ordinary Least Squares (Single-Level) Regression	72
Random Intercept Model	73
Random Slope Model	77
Three-Level Model	81
Heteroscedasticity	82
Fixed Effects Model	83
Rankings and Institutional Performance	85
Conclusion	86
References	88
6 Apportioning Variation in Multilevel Models	89
Variance Partitioning for Continuous Responses	90
Variance Partitioning for Multilevel Logistic Regression	90
Variance Partitioning for Models with Three or More Levels	91

Interpretation of Variances	92
Zero Variance	94
Multilevel Power Calculations	96
Software for Multilevel Power Calculations	99
Population Average and Cluster-Specific Estimates	100
Omitting a Level	100
Conclusion	102
References	103

Part III The Modelling Process and Presentation of Research

7 Context, Composition and How Their Influences Vary	107
Context or Composition?	108
Using Multilevel Modelling to Investigate Compositional and Contextual Effects	109
Model M0: Null Model	110
Model M1: Individual Social Capital	111
Model M2: Neighbourhood Social Capital	112
Model M3: Individual and Neighbourhood Social Capital	113
Model M4: Individual and Neighbourhood Social Capital and Their Interaction	114
Random Slopes and Cross-Level Interactions	115
Impact of Compositional and Contextual Variables on the Variances	116
Model Specification and Model Interpretation	118
Sources of Error Affecting the Estimation of Contextual Effects	119
Lack of Variation in the Contextual Variable	119
Precision of Estimates and Study Design	120
Selection Bias	120
Confounding	120
Information Bias	121
Model Specification	121
Conclusions	121
References	122
8 Econometrics: Using MLA to Construct Contextual Variables from Individual Data	123
Problems with Simple Aggregation	124
Single Variables	125
Composite Variables: The Traditional Method	126
Composite Variables: A Simple Multilevel Model	127
Econometric Approach	130
Application of the Econometric Approach	132
Comparison of the Traditional and Econometric Approach	134

Further Ecometric Properties of the Scale	135
Conclusions	137
References	137
9 Modelling Strategies	139
Define the Data Structure	140
Measurement Level and Distribution of the Dependent Variable	142
The Baseline Model	142
Exploratory Research and Hypothesis Testing	143
Context and Composition	145
Modelling the Effects of Higher Level Characteristics	145
Random Effects at Higher Levels	146
Interpreting the Results in the Light of Common Assumptions	147
Conclusions	149
References	149
10 Reading and Writing	151
Critical Reading	151
What Is the Research Question?	153
Which Levels Can Be Distinguished Theoretically?	154
What Is the Structure of the Actual Data Used?	155
What Statistical Model Was Used?	157
What Was the Modelling Strategy?	158
Does the Paper Report the Intercept Variation at Different Levels?	159
Cross-Level Interactions	160
What Are the Shortcomings and Strong Points of the Article?	161
Writing Up Your Own Research	161
The Introduction or Background Section	161
The Methods Section	162
The Results Section	163
The Conclusion and Discussion Section	165
Conclusions	167
References	167

Part IV Tutorials with Example Datasets

11 Multilevel Linear Regression Using MLwiN: Mortality in England and Wales, 1979–1992	173
Introduction to the Dataset	174
Research Questions	174
Introduction to MLwiN	174
Opening a Worksheet	174
Names Window	175

Data Window	176
Graph Window	177
Closing Windows	179
Model Specification	180
Creating New Variables	180
Equations Window	181
Fitting the Model	185
Variance Components	187
A 2-Level Variance Components Model	187
Sorting the Data	189
The Hierarchy Viewer	192
Adding a Further Level	193
Interpreting the Model	197
Residuals	197
Predictions Window	202
Model Building	211
Adding More Fixed Effects	211
Intervals and Tests Window	217
Random Coefficients	221
Random Slopes	221
Variance Function Window	225
Higher-Level Residuals	229
Complex Level 1 Variation	230
A Poisson Model: Introduction	235
Setting Up a Generalised Linear Model in MLwiN	236
The Offset	239
Non-linear Estimation	240
Model Interpretation	241
Predictions and Confidence Envelopes	248
References	254
12 Multilevel Logistic Regression Using MLwiN:	
Referrals to Physiotherapy	255
Multilevel Logistic Regression Model	256
Example: Variation in the GP Referral Rate to Physiotherapy	256
The Data	259
Model Set-Up	260
Non-linear Settings	262
Model Interpretation and Model Building	263
A Note on Estimation	267
Further Exercises	268
References	269

13 Untangling Context and Composition	271
The Data	272
Structure of the Analysis	273
Estimating the Null Model	276
Fixed Effects	280
Additional Models	280
References	280
Index	283

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Multilevel Modelling for Public Health and Health Services Research

Health in Context

This open access book is a practical introduction to multilevel modelling or multilevel analysis (MLA) – a statistical technique being increasingly used in public health and health services research. The authors begin with a compelling argument for the importance of researchers in these fields having an understanding of MLA to be able to judge not only the growing body of research that uses it, but also to recognise the limitations of research that did not use it.

The volume guides the analysis of real-life data sets by introducing and discussing the use of the multilevel modelling software MLwiN, the statistical package that is used with the example data sets. Importantly, the book also makes the training material accessible for download – the datasets used within the book can be accessed along with a freeware version of MLwiN enabling readers to replicate the analyses.

The book's practical review of MLA comprises:

- Theoretical, conceptual, and methodological background
- Statistical background
- The modelling process and presentation of research
- Tutorials with example datasets

Multilevel Modelling for Public Health and Health Services Research: Health in Context is a practical and timely resource for public health and health services researchers, statisticians interested in the relationships between contexts and behaviour, graduate students across these disciplines, and anyone interested in utilising multilevel modelling.

“Leyland and Groenewegen’s wealth of teaching experience makes this book and its accompanying tutorials especially useful for a practical introduction to multilevel analysis.”

– Juan Merlo, Professor of Social Epidemiology, Lund University

“Comprehensive and insightful. A must for anyone interested in the applications of multilevel modelling to population health”.

– S. (Subu) V. Subramanian, Professor of Population Health and Geography, Harvard University

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