Statistical Analyses for Language Assessment
THE CAMBRIDGE LANGUAGE ASSESSMENT SERIES

Series editors: J. Charles Alderson and Lyle F. Bachman

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Statistical Analyses for Language Assessment

Lyle F. Bachman
To Nida.
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Language testing is frequently associated with statistics in the mind of language educators. Often for that very reason, language teachers feel that language testing is a somewhat alien discipline. Language teachers have indeed often chosen their career in reaction against the scientific disciplines they experienced in their school years, feeling that the Arts and Humanities are more in tune with their own interests, inclinations and competences.

The Cambridge Language Assessment Series (CLAS) does not share that view of language testing, as all the volumes published in the series to date attest. The CLAS view of language testing is that what is central to the discipline is language: the constructs that the tests and assessment procedures are seeking to evaluate. A solid background in applied linguistics or a related discipline is in our view crucial for the development of appropriate measures. However, the reader should note the use of the word ‘measure’. Language tests are intended to measure, and without quantification they cannot measure. Quantification implies numbers and numbers imply statistics. And so, although a firm understanding of the nature of language is essential for the trained language tester, so too is at least a basic familiarity with statistics, that is, those statistics that are commonly used in analysis and investigation of and with language tests.

This volume thus aims to complement the other volumes in CLAS by providing a firm grounding in such statistical procedures as are needed for language test analysis. There are, of course, many introductory textbooks to statistics, but there are very few that are specifically focussed on the needs of language testers. Yet it is common knowledge that one learns best
by applying the theory one is learning to the solution of practical problems within one's area of experience, and so the best way for language testers to learn statistics is in the context of language tests. This book does precisely that: the examples that are used to illustrate and explain are taken from the field of language testing. And Lyle Bachman is himself an internationally known and respected applied linguist and language testing researcher. His almost unique combination of applied linguistic and statistical expertise makes him very well qualified to author this volume, and the authority with which he writes carries weight and conviction.

An overriding consideration in designing, developing and using language tests is that of usefulness. Bachman and Palmer (1996) define test usefulness as consisting of six qualities: reliability, construct validity, authenticity, interactiveness, impact and practicality. An important part of their approach is what they call the logical, or subjective, evaluation of usefulness by the test developer during the design and development of the test.

However, the usefulness of a test also depends to a great extent on how test takers perform on that test. The evaluation of test usefulness must therefore also include the empirical investigation of test performance. One crucial aspect of this performance is the scores that the test takers obtain. Test developers must go beyond mere assertions of usefulness, and provide evidence that supports the claims they make about how test scores can be appropriately interpreted and used. Similarly, it is the responsibility of test users to require test developers to provide such evidence, and to use this evidence appropriately and ethically in their selection and use of language tests.

The primary purpose of this book is to make the knowledge and skills – the 'tools' – of statistical analysis accessible to classroom teachers and other applied linguists who may need to develop and use language tests. Statistical analyses provide ways to corroborate, with empirical evidence, beliefs and claims about the tests we develop or use. Statistical analyses can also show where tests fall short of expectations, and provide guidance for improving them. For these reasons, the tools of statistical analysis are essential to any test development and use.

The presentations in this book focus on the rationales and appropriate applications for the use of these procedures for language testing, rather than on theoretical or mathematical exposition. For each of the procedures discussed, Bachman provides the following:
1 a non-technical rationale for using the procedure, including the type of information the procedure will provide and what we can do with this information;

2 a discussion of the conditions under which the procedure may be used appropriately, and where there is a choice of more than one procedure, considerations for making an informed choice;

3 explicit step-by-step instructions for the procedure; and

4 guidelines for using the results of the procedure.

The book is in three parts. Part I discusses terms, concepts and statistical procedures that are basic to the analyses presented in the later chapters, Part II discusses statistical procedures for analyzing test scores for the purposes of improving their usefulness, and Part III discusses statistical procedures that can inform the ways in which we interpret and use test scores. Readers who are unfamiliar with quantitative methodology may want to read the chapters in the order presented. Readers who are already familiar with the basic concepts may want to go directly to those chapters that are most relevant to their particular needs and interests.

However, statistical concepts and associated procedures are best learned by doing. It is impossible to learn all the necessary procedures and apply them accurately and appropriately without considerable and repeated practice. Perhaps the strongest feature of this book, in addition to the fact that the text itself is excellent – clear, coherent, practical, user friendly and of an appropriate length – is the fact that it is accompanied by a practice Workbook and a CD containing data for statistical analysis.

No textbook on statistics can possibly familiarize readers and users with everything they need to know in order to analyze language tests adequately. What is needed is constant practice and feedback.

Learning how to use the statistical procedures discussed in this book will thus be greatly facilitated by practice in applying them and working them through with the actual data from language tests included on the CD. The Workbook includes extensive practice exercises with these data sets. The exercises provide opportunities for readers to apply what they have learned from this book in calculating the appropriate statistical procedures and interpreting the results. The exercises provide practice in hand calculations with small data sets and in the use of the SPSS computer program (SPSS Inc., 2002) for larger data sets.
Anyone using this book and the associated Workbook and CD should be able to become comfortable with and confident in his or her ability to use statistical analyses appropriately in their own work, whether this be language testing or other areas of applied linguistics research.

J Charles Alderson
Acknowledgements

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### Abbreviations

<table>
<thead>
<tr>
<th>Abbreviation</th>
<th>Description</th>
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<tbody>
<tr>
<td>CAT</td>
<td>computer adaptive testing</td>
</tr>
<tr>
<td>CFA</td>
<td>confirmatory factor analysis</td>
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<td>CI</td>
<td>confidence interval</td>
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<td>CLA</td>
<td>communicative language ability</td>
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<td>CR</td>
<td>criterion-referenced</td>
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<tr>
<td>CTT</td>
<td>classical test theory</td>
</tr>
<tr>
<td>EFA</td>
<td>exploratory factor analysis</td>
</tr>
<tr>
<td>G-theory</td>
<td>generalizability theory</td>
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<tr>
<td>IA</td>
<td>item analysis</td>
</tr>
<tr>
<td>ICC</td>
<td>item characteristic curve</td>
</tr>
<tr>
<td>IIF</td>
<td>item information function</td>
</tr>
<tr>
<td>IRT</td>
<td>item response theory</td>
</tr>
<tr>
<td>L1</td>
<td>first language</td>
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<tr>
<td>L2</td>
<td>second language</td>
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<tr>
<td>MFRM</td>
<td>many-facet Rasch measurement</td>
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<tr>
<td>MTMM</td>
<td>multitrait–multimethod correlation matrix</td>
</tr>
<tr>
<td>NR</td>
<td>norm-referenced</td>
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<tr>
<td>SEM</td>
<td>standard error measurement</td>
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<tr>
<td>TIF</td>
<td>test information function</td>
</tr>
<tr>
<td>TLU</td>
<td>target language use</td>
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<tr>
<td>TMF</td>
<td>test method facets</td>
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