

Decision Modeling

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1. This document was written using the very versatile L^AT_EX and PSTricks programs, which are open-source software. L^AT_EX is particularly good at

writing mathematical expressions, and PStricks produces excellent graphics. Both can be downloaded for free from the \TeX Users Group (TUG) at <http://www.tug.org>.

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Preface

In this e-book, a word, phrase, or page number in red indicates a link to somewhere else in this document; a word or phrase in pink indicates a link to the web. In particular, both the Table of Contents and the Index are linked to the appropriate places in the main body of the material.

The reader needs to have learnt, or be prepared to learn, the basics of spreadsheets. A quick overview of the basics of spreadsheet operations using the syntax of Excel is provided in Chapter One. This e-book should be read in conjunction with any other materials which have been required for your course.

A great deal of care has gone into the preparation of this document, but there may well be some errors lurking somewhere. Readers who spot such errors, or who simply want to offer suggestions for improvement, are encouraged to contact the author by email.

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