INTRODUCTION TOOPERATIONSRESEARCH



JOSEPH G. ECKER A MICHAEL KUPFERSCHMID

INTRODUCTION TO OPERATIONS RESEARCH

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INTRODUCTION TO OPERATIONS RESEARCH

To Juanita and to Kelly and Steve

To Gail

ABOUT THE AUTHORS

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viii ABOUT THE AUTHORS

worked for the next three years at Sikorsky Aircraft designing and flight testing helicopter autopilots. After returning to RPI for a Master of Engineering degree, which was awarded in 1972, he studied theatre engineering at the Yale School of Drama and worked for six more years in industry as a control systems engineer. In 1978 he resigned his position as design supervisor for the controls division of the J. R. Clancy Company and returned to RPI for graduate work in operations research and statistics, leading to a M.S. in 1980 and a Ph.D. in 1981. Dr. Kupferschmid has taught courses in operations research and in computing at RPI and is an author of seven research papers. His research interests are in the experimental evaluation of algorithm performance, the development of nonlinear optimization methods, and the applications of mathematical programming. Dr. Kupferschmid is a registered Professional Engineer.



This textbook is intended for use in a two-semester sequence of courses introducing the mathematical methods of operations research. Part I can also be used alone for a one-semester course on linear programming. We have chosen to provide deep and thorough coverage of the most important methods in operations research rather than a superficial treatment of a larger number of topics. The level of exposition is appropriate for juniors and seniors who are majoring in engineering, computer science, mathematics, and quantitative methods in management.

The basic techniques of operations research are simple and straightforward, and only a small amount of advanced mathematics is needed for a technically accurate introduction to the subject. This textbook assumes a knowledge of high school elementary algebra and a familiarity with simple matrix notation such as would be introduced in the first class of an undergraduate linear algebra course. In addition, Chapters 9 and 10 assume a knowledge of elementary differential calculus, and Part III assumes a knowledge of elementary probability and statistics. A concise appendix on matrix notation makes the book accessible to students who have not previously had any linear algebra.

Both the style of exposition and the mathematical notation have been chosen to reflect the simplicity of the subject, and the readability of the text is considered more important than rigor. Examples are used extensively to introduce and motivate the topics. In this way, the presentation reflects the inductive process of scientific discovery rather than imitating the retrospective deduction that is typical in research papers. This approach gives the student the opportunity to

rediscover the important results personally instead of merely reading about them in theorems. Proofs are given for some results, but only after the result has been illustrated by example, and only when the proof provides a constructive method for solving problems. Thus the book is not a treatise on mathematical theory.

The simplicity of the methods used in the book means that they can be deeply understood even by beginning students of the subject, and the treatment is mathematically precise even though the results are often stated informally. Thus the discussion is not a cookbook tabulation of trite formulae, and the student should reasonably be expected to understand the mathematical basis for the techniques in addition to being able to apply them.

Answers to selected exercises are given at the end of the book, and a separate answer book is available that contains complete solutions to all of the exercises.

The development of this text benefited greatly from the comments and suggestions made by our colleagues during its use in preliminary form over the past four years. In particular, we express our gratitude to Professors Carlton E. Lemke (Rensselaer Polytechnic Institute), Richard T. Wong (Purdue University), and Thomas M. Liebling (École Polytechnique Fédérale de Lausanne). We also thank the many RPI students who used the preliminary versions, proofread the text, and tested out the exercises. Special thanks are due to Richard Sych, Lori Grieb, Laura Ripans, Carla Bryan, and Robert Bosch.

Joseph G. Ecker Michael Kupferschmid

CONTENTS



1	INTRODUCTION	1
1.1	Operations Research	1
1.2	Nature and Scope of Operations Research	2
1.3	History and Development of Operations Research	3
1.4	Overview of Operations Research Methods	4
1.5	Perspective of This Text	5
1.6	Organization of This Text	6
	Selected References	6
	Exercises	6
PAR	RT 1	
LIN	EAR PROGRAMMING	9
2	LINEAR PROGRAMMING MODELS AND APPLICATIONS	11
2.1	Formulating Linear Programming Models	11
	An Introductory Resource Allocation Problem	11
	Assumption of Continuity	13
	Sensitivity of the Optimal Solution	14
	Algebraic Statement of Linear Programming Problems	15
2.2	Further Linear Programming Formulation Examples	15
	Brewery Problem	16
	Oil Refinery Problem	18
	Warehouse Problem	19
	Chicken and the Egg Problem	21
	Nurse Scheduling Problem	23
2.3	Some Scientific Applications of Linear Programming	24
	Curve Fitting	24
	Inconsistent Systems of Equations	26
	Feasibility Problem	28

xii CONTENTS

	Selected References Exercises	3
3	THE SIMPLEX ALGORITHM FOR LINEAR PROGRAMMING	3
3.1	Standard Form and Pivoting	3
	Standard Form	3
	The Simplex Tableau	4
2.0	Pivoting on a Simplex Tableau	4
3.2	Canonical Form	4
	Canonical Form Finding a Better Basic Feasible Solution	4
	The Simplex Rule for Pivoting	4
	The Geometry of a Pivot	4
3.3	Optimal, Unbounded, and Infeasible Forms	4'
	Optimal Form	4
	Unbounded Form	4
	Two Infeasible Forms	49
3.4	Solving Linear Programs in Canonical Form	51
	Pivoting to Optimal Form	5.
	What Can Go Wrong: Degeneracy and Cycling Ways to Prevent Cycling	52
	Convergence in the Nondegenerate Case	54 55
	Convergence in the Degenerate Case	55
3.5	Obtaining Canonical Form from Standard Form	58
	Getting an Identity	58
	The Subproblem Technique	59
	Pivoting to Form a Subproblem	62
2.6	Summary of the Subproblem Technique	62
3.6	The Simplex Algorithm	63
2.5	The Simplex Algorithm	63
3.7	Reformulating Any Linear Program into Standard Form	64
	Maximization Problems Inequality Constraints	64
	Free Variables	64
3.8	The Method of Artificial Variables	65
	Getting $\mathbf{b} \geq 0$	69
	The Artificial Problem	69 70
	Feasibility of the Original Problem	71
	Canonical Form for the Original Problem	71
3.9	Pivot Matrices and the Revised Simplex Method	74
	Pivot Matrices	74
	The Revised Simplex Method	76
2 10	Tableaus with the Same Basic Sequence	78
3.10	Computer Solution of Linear Programs Computer Cycling	79
	Controlling Roundoff Errors	79
	Tolerances and Errors	80
	Other Practical Considerations	81 82
	Selected References	83
	Exercises	92

4	GEOMETRY OF THE SIMPLEX ALGORITHM	91
4.1	Geometry of Pivoting	91
	Graphical Representation of the Feasible Set	91
	Extreme Points and Basic Feasible Solutions	93
	The General Case	96
	Alternative Representation of the Feasible Set	97
4.2	Graphical Interpretation of Canonical Form Tableaus	98
4.2	Convex Sets	99
	Definition of a Convex Set Convexity of the Feasible Set	99
4.3	Multiple Optimal Solutions	100
7.3	Finding All Optimal Solutions	101
	Convexity of the Set of Optimal Solutions	101 102
	Optimal Rays	102
	Selected References	105
	Exercises	105
5	DUALITY IN LINEAR PROGRAMMING	109
5.1	The Standard Dual Pair	109
	Duality Relations	110
5.2	Getting the Dual Solution from a Primal Solution	111
	Relationships between Optimal Tableaus	111
	Constructing an Optimal Dual Vector	113
5.3	Economic Interpretation of Dual Variables	115
	The Complementary Slackness Conditions	118
5.4	Finding the Dual of Any Linear Program	119
	Dual of a Linear Program in Standard Form A More Complicated Example	120
	Dual of the Transportation Problem	121 122
5.5	The Dual Simplex Method	
5.5	Another Example of Dual Simplex Pivoting	124 127
5.6	Using the Dual to Computational Advantage	
2.0	A Difficult Primal Problem Having an Easy Dual	128 128
5.7	Theorems of the Alternative	130
2.7		
	Selected References Exercises	132
		133
6	SENSITIVITY ANALYSIS IN LINEAR PROGRAMMING	139
6.1	The Brewery Problem	120
6.2	Changes in Production Requirements	139 141
	Changes in Nonbasic Variables	141
	Increasing Basic Variables	141
	Decreasing Basic Variables	144
	When a Nonbasic Variable Exceeds Its Minimum Ratio	145
6.3	Changes in Available Resources	145
	Changes in One Resource	146
	Simultaneous Changes in Several Resources	148
	Computing Shadow Prices	150

xiv CONTENTS

6.4	Changes in Selling Prices	151
	Simultaneous Changes in Prices	153
6.5	Adding New Products or Constraints	154
	New Products	154
	Technology Changes	155
	New Constraints	156
	Selected References	157
	Exercises	157
7	LINEAR PROGRAMMING MODELS FOR NETWORK FLOW PROBLEMS	161
7.1	The Transportation Problem	161
	The Transportation Tableau	166
7.2	Using the Dual to Improve the Current Solution	167
	Obtaining an Optimal Transportation Tableau	174
	A Final Comparison with the Simplex Algorithm	175
7.3	The Transportation Algorithm	176
7.4	Finding an Initial Basic Feasible Solution	178
7.5	Variations of the Transportation Problem	181
	Unequal Supply and Demand The Transshipment Problem	181 183
	Multiple Optimal Solutions	186
7.6	The Assignment Problem	187
7.7	General Network Models	190
	The General Network Flow Model	191
	Spanning Trees and Basic Feasible Solutions	193
	Solving a General Network Flow Problem	195
	Summary of the General Network Flow Algorithm Finding an Initial Feasible Spanning Tree	198
	Selected References	199
	Exercises	201 201
		201
	T II	
	EGER, NONLINEAR AND DYNAMIC	
'KU	GRAMMING	209
8	INTEGER PROGRAMMING	211
8.1	The Integer Programming Problem	211
8.2	Implicit Enumeration	214
8.3	Solution by Branch and Bound	217
	The Branch-and-Bound Algorithm	217
	A Branch-and-Bound Example in Detail	218
	The Order of Selecting Unfathomed Nodes Practical Considerations in Using Branch and Bound	225
8.4	0–1 Integer Programs	227
U-7	A 0-1 Example	227 228
	Looking Ahead	233
	How Far to Look Ahead	237
	Getting Nonnegative, Increasing Cost Coefficients	238
	The Branch-and-Bound Algorithm for 0–1 Programs	239

8.5	Integer Programming Formulation Examples	242
	The Oakwood Furniture Problem Revisited	242
	The Knapsack Problem	243
	Capital Budgeting	243
	Facility Location	244
	The Traveling Salesman Problem	246
0 (A Scheduling Problem	247
8.6	Integer Programming Formulation Techniques	250
	Writing General Integer Programs as 0–1 Programs	250
	Mixed-Integer Programs Enforcing Logical Conditions	251 251
	Selected References Exercises	253 253
	LACTUSES	233
9	NONLINEAR PROGRAMMING	250
9.1		259
7.1	A Nonlinear Programming Problem Contour Plots	259
	Assumption of Continuity	261 263
	Algorithms for Nonlinear Programming	263
9.2	Unconstrained Minimization	264
7.4	Maxima and Minima in One Dimension	264
	Maxima and Minima in <i>n</i> Dimensions	267
9.3	Equality Constraints	272
7.3	Parametric Representation of Equality Constraints	272
	Several Equality Constraints	278
	Several Parameters	280
	The Method of Lagrange	280
	Classifying Lagrange Points	283
	An Important Use of the Lagrange Multiplier Theorem	286
9.4	Inequality Constraints	287
	Active and Inactive Constraints	288
	The Orthogonality Condition	290
	The Karush–Kuhn–Tucker Conditions	291
9.5	Convexity	295
	Convex Functions	295
	Convexity and Minima	296
0.	Checking Whether a Function is Convex	297
9.6	Karush-Kuhn-Tucker Theory of Nonlinear Programming	299
	The KKT Method	300
	Strategy in Solving the KKT Conditions	302
9.7	Numerical Methods of Nonlinear Programming	304
	Line Searching The Method of Standard Popularia	306
	The Method of Steepest Descent The Generalized Reduced-Gradient Method	307 311
	The Ellipsoid Algorithm	315
	Conclusion	313
9.8	Nonlinear Programs with Special Structure	322
	Quadratic Programming	322
	Geometric Programming	326
	Separable Programming	329
	Other Theoretical Aspects of Nonlinear Programming	332

xvi CONTENTS

	Selected References	33:
	Exercises	334
10	DYNAMIC PROGRAMMING	34'
10.1	An Introductory Example	347
	The Stagecoach Problem	347
	The Backward Recursive Relations	349
	The Forward Recursive Relations	351
	Basic Features of a Dynamic Programming Formulation	352
10.2	A Loading Problem	353
10.3	The Boxes Problem	356
10.4	An Equipment Replacement Problem	359
10.5	Problems with Several State Variables	363
	The Curse of Dimensionality	364
10.6	Continuous State Dynamic Programming Problems	364
	A Simple Example	364
	A More Complicated Example	366
	Selected References	369
	Exercises	369
	RT III	
PRC	DBABILISTIC MODELS	375
11	QUEUEING MODELS	377
11.1	A Simple Example and Basic Terminology	377
11.2	A Simple Model Suggested by Observation	379
	Consequences of Exponentially Distributed Interarrival Times	382
	Special Case 1: Arrivals But No Departures	387
	Special Case 2: Departures But No Arrivals	390
11.3	A More General Arrivals and Departures Model	391
11.4	Steady-State Queueing Systems	394
11.5	A Single-Server System with Constant Rates	397
11.6	Operating Characteristics from Basic Principles	399
11.7	Multiple-Server Queues	402
11.8	Finite Queues	405
11.9	Limited-Source Queues	407
11.10	Optimization in Queues	409
	Optimizing over the Number of Servers, s	411
	Optimizing over the Mean Service Rate, μ Optimizing over the Mean Arrival Rate, λ	412
11.11		412
11.11	Queueing Models Involving Nonexponential Distributions The Kendall Notation	413
		414
	Selected References	415
	Exercises	415
12	INVENTORY MODELS	421
12.1	Economic Order-Quantity Models	421
	Economic Order-Quantity Models with No Shortages Allowed	421
	Economic Order-Quantity Models with Shortages Allowed	422 424
	Economic Order-Quantity Models with Price Breaks	424
	Economic Order-Quantity Models with Several Inventories	427

12.2	Dynamic Inventory Models with Periodic Review	429
	Concave Cost Functions	432
	Convex Cost Functions	437
12.3	Stochastic Inventory Models	441
	A Single-Period Model	441
	A Two-Period Model	449
	Selected References	452
	Exercises	452
13	SIMULATION	457
13.1	Next-Event Simulation	458
	Observing a Queueing System	459
	Constructing an Event List	459
13.2	Statistical Analysis of Simulation Results	463
	Estimating L and L_q	463
	Estimating W and W_q	464
	Estimating Server Utilization	464
	Estimating Probability Distributions Checking Random Interevent Times	464
13.3		465
13.3	Generating Pseudorandom Numbers Random and Pseudorandom Number Sequences	466
	Random-Number Generators	467
	The Multiplicative Congruential Algorithm	468 469
	Other Uniform Random-Number Generators	471
	Nonuniform Distributions	473
13.4	Monte Carlo Simulations	475
	Evaluation of an Integral	475
	The Metropolis Algorithm	477
13.5	Practical Considerations in Simulation Modeling	480
	Computer Programs for Simulation	480
	Logical and Statistical Validity	484
	Selected References	487
	Exercises	488
	APPENDIX	491
	NOTATIONAL CONVENTIONS FOR MATRIX	771
	ALGEBRA	
A.1	Matrices	491
	Equality of Two Matrices	492
4.2	Multiplying Two Matrices	492
A.2 A.3	Systems of Linear Equations	493
A.3 A.4	The Sum of Two Matrices	494
A.4 A.5	Multiplying a Matrix by a Real Number	494
A.6	The Transpose of a Matrix Some Simple Matrix Identities	494
. 2.0		495
	Selected References	495
	Answers to Selected Exercises Index	497
	muca	505

CHAPTER	1

INTRODUCTION

During World War II, the U.S. Army Air Corps suffered many casualties in the course of flying strategic bombing missions over Nazi Germany. An anecdote about that era concerns a study conducted to determine how to reduce those horrible losses. Army B-17 aircraft were examined for holes made by bullets and flak during bombing missions, and the location of each hole was marked on an outline drawing of a B-17. When all of the holes had been marked, it was clear that some parts of a B-17 were much more likely to suffer battle damage than others. The general in charge of the study convened a briefing of military planners to propose that the most heavily damaged areas be provided with additional armor plating. Finding the best places to put the extra armor was very important because only a small amount of weight could be added to the airplanes. At the conclusion of the briefing, after many of those in attendance had agreed to the soundness of the plan, a junior officer in the back of the room timidly raised his hand and was recognized to speak. Clearing his throat nervously, the lieutenant asked in a small voice if it might not be better to armor the parts of the airplane showing the fewest holes rather than the parts with the most severe damage. "After all," he pointed out, "the airplanes that you measured the holes in are the ones that came back."

1.1 OPERATIONS RESEARCH

The preceding story is probably apocryphal, but the question of where to put the armor has many features that are typical of problems in **operations**