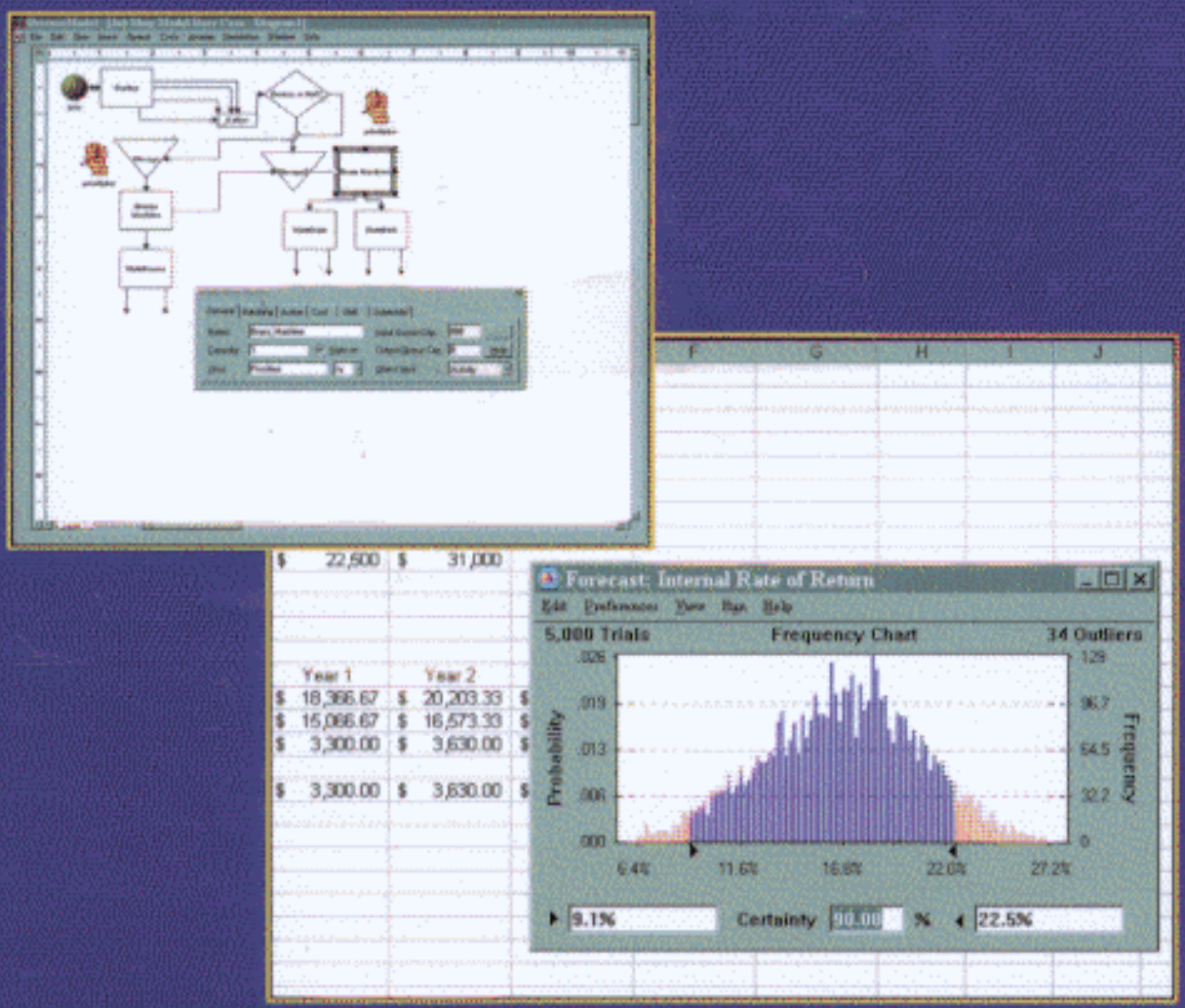
INTRODUCTION TO SIMULATION AND RISK ANALYSIS

SECOND EDITION



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Contents

Preface xiii

PART 1: SIMULATION FUNDAMENTALS

CHAPTER 1 Introduction to Simulation 1

The Nature of Simulation 3
Models and simulation 3
Types of Simulation Models 6
An example of Monte-Carlo simulation 6
An example of systems simulation 10
The Simulation Process 12
Verification and validation 13
Benefits and Limitations of Simulation 14
Simulation in Practice 14
Business simulation for dental practice management 15
Simulation modeling for hazardous waste remediation alternatives 16
Questions and Problems 19
References 20

CHAPTER 2 Simulation Using Excel 21

Basic Excel Skills 22
Copying formulas and cell references 22
Functions 24
Charts and graphs 26
Other useful Excel tips 27
Building Simulation Models Using Excel 28
A simulation model for Dave's Candies 29
A simulation model for Mantel Manufacturing 30
Constructing frequency distributions and histograms 31
Random Variates 33
Random numbers 33
Generating random variates from discrete distributions 35
Using Excel's VLOOKUP function 36
Using Excel's random number generation tool 37
Monte-Carlo Simulation on Spreadsheets 39
Simulation analysis of Dave's Candies 39

Simulation analysis of Mantel Manufacturing 40
Simulating casino games 43
Concluding remarks 48
Simulation in Practice 49
Risk/return financial modeling and analysis 49
A deterministic spreadsheet simulation model for production scheduling at Welch's 51
Questions and Problems 52
References 56
Appendix 57

CHAPTER 3 Probability and Statistics in Simulation 63
Basic Statistical Concepts 64
Descriptive statistics 64
Sampling distributions 67
Confidence intervals 68
Random Variables and Probability Distributions 69
Useful continuous distributions 71
Useful discrete distributions 77
Other useful distributions 78
Generating Random Variates 81
Inverse transformation method 82
Special methods 86
Generating random variates in Excel and Crystal Ball 87
Applications in Financial Analysis and Management 89
Simulating stock prices 89
Options pricing 89
Cash management simulation 91
Modeling Probabilistic Inputs 93
Distribution fitting of empirical data 94
Goodness-of-fit tests 97
Distribution fitting with Crystal Ball 100
Judgmental modeling 101
Statistical Issues in Monte-Carlo Simulation 102
Sample size 102
Output analysis 103
Simulation in Practice 104
Simulation analysis for Red Cross blood drives 104
Simulating a major running race 105
Questions and Problems 107
References 111

PART 2: SIMULATION IN RISK ANALYSIS

CHAPTER 4 Risk Analysis Using Crystal Ball 112
Risk Analysis 113
Monte-Carlo Simulation with Crystal Ball 115
A financial analysis risk simulation 115

Specifying input information 115
Crystal Ball output 122
Creating Crystal Ball reports 126
Additional Crystal Ball Modeling and Analysis Options 127
Correlated assumptions 127
Overlay charts 128
Trend charts 130
Sensitivity analysis 130
Statistical issues in risk analysis 133
Analyzing decision alternatives 135
Other Crystal Ball tools 138
Simulation in Practice 139
Applications of risk analysis using Crystal Ball 139
Simulation in new-product screening at Cinergy Corporation 142
Questions and Problems 145

CHAPTER 5 Applications of Risk Analysis 152
Operations Management Applications 153
Machine reliability and maintenance 153
Project management 157
Hotel overbooking 161
Call center capacity analysis 163
Finance Applications 166
Rate of return analysis 166
Retirement planning 167
Cash budgeting 170
New-product development 172
Recycling decision model 176
Marketing Applications 180
Sales projection 180
Marketing analysis for pharmaceuticals 180
Analysis of distribution strategies 182
Engineering Applications 185
Reliabilty of a spring 186
Risk assessment of toxic waste 187
Electrical circuit analysis 188
Simulation in Practice 190
Risk analysis at Getty Oil Company 190
Assessing tritium supply alternatives by the U.S. Department of Energy 190
Questions and Problems 192
References 198

PART 3: SYSTEMS SIMULATION

CHAPTER 6 Building System Simulation Models 199
System Simulation Modeling Approaches 200
Simulating Inventory Systems Using Activity Scanning 201
Basic concepts of inventory modeling 201

Continuous review model with lost sales 203
Continuous review model with back orders 208
Simulating Waiting-Line Systems Using Process-Driven Models 211
Basic concepts of queueing models 212
Analytical models 213
Single-server queueing model 214
Multiple-server models 220
Event-Driven Simulation Models 223
An event-driven simulation for a single-server queue 223
An Event-Driven Inventory Simulation Model 229
Entities and Attributes 233
Continuous Simulation Modeling 234
Simulation in Practice 238
Improving distribution costs at Ciba-Geigy using simulation 238
Security checkpoint improvement through simulation 239
A system dynamics model for insurance evaluation 241
Questions and Problems 243
References 248

CHAPTER 7 Output Analysis and Experimentation for Systems Simulation 249
Dynamic Behavior in Systems Simulation 250
Output analysis for terminating systems 250
Output analysis for nonterminating systems 253
The method of batch means 255
Comparing Policies and Systems 256
Independent sampling 256
Correlated sampling 257
Comparing several systems 257
Experimental Design 260
Simple factorial experiments 260
Simulation in Practice 262
Simulation in Waste-Processing System Design 262
Improving Florida Driver's Licensing Offices Through Simulation 263
Questions and Problems 266
References 270

CHAPTER 8 Systems Simulation Using ProcessModel 271
ProcessModel Overview 273
Model elements 273
The modeling environment 275
Diagramming the process flow 277
Input distributions 277
Defining special logic 278
Running a simulation 278
ProcessModel Example: Simulating a Phone Support Help Desk 279
Define process flow 280

Specify resource requirements 280
Specify resource information 281
Run the simulation 282
View output reports 282
Enhancing the Help Desk Process Model 287
Reneging 287
Visual staffing 288
Changing arrival patterns 288
Simulation Options and Scenarios 290
Attributes and Variables 292
Action logic 295
ProcessModel Example: Inventory Simulation with Back Orders 300
Simulation in Practice 304
A simulation model for Air Force maintenance 304
Questions and Problems 304

CHAPTER 9 Applications of Systems Simulation 307
Simulation in Practice: Designing Emergency Room Facilities Using Simulation 308
An Emergency Room Simulation Model 308
ProcessModel implementation 309
Sensitivity analysis 311
Simulation in Practice: Simulation in Local Area Network Design 312
A Local Area Network Simulation Model 314
ProcessModel implementation 314
Simulation results 316
Simulation in Practice: Simulating Dispatching Policies in a Manufacturing Plant 317
A Job Shop Simulation Model 318
ProcessModel implementation 319
Analysis of results 323
Simulation in Practice: Simulation in Supply Chain Management 324
Simulating Alternative Supply Chain Systems 326
ProcessModel implementation 328
Just-in-time model 331
Analysis of results 331
Questions and Problems 331
References 334

PART 4: EXTENSIONS OF SIMULATION

CHAPTER 10 Simulation in Forecasting and Optimization 335
Time Series Forecasting 336
Linear smoothing methods 336
Seasonal smoothing methods 338

Error metrics and forecast accuracy 338
Regression models 339
Forecasting with CB Predictor 339
Integrating Forecasting and Simulation 343
Forecasting and simulating a net income model 345
Optimization 348
Types of optimization models 349
Linear optimization example: Portfolio allocation 349
Integer optimization example: Project selection 351
Nonlinear optimization example: Hotel pricing 352
Spreadsheet Optimization Using Excel Solver 353
Solving integer optimization models 356
Solving nonlinear optimization models 356
Risk Analysis of Optimization Results 357
Combining Optimization and Simulation 359
Using OptQuest 360
Interpreting results 364
Adding a requirement 364
Finding an optimal inventory policy 366
Questions and Problems 366

APPENDIX A Normal Distribution 370

APPENDIX B t Distribution 371

APPENDIX C Chi-Square Limits 372

APPENDIX D Kolmogorov-Smirnov Limits 373

Bibiography 374

Index 387