The Evaluation

a n d

Optimization

TRADING
STRATEGIES

S E C O N D E D I T I O N

OBERT PARDO President, Pardo Capital Limited

The Evaluation and Optimization of TRADING STRATEGIES

SECOND EDITION

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-ART COLLINS

AUTHOR OF BEATING THE FINANCIAL FUTURES MARKET: COMBINING SMALL BIASES INTO POWERFUL MONEY MAKING STRATEGIES

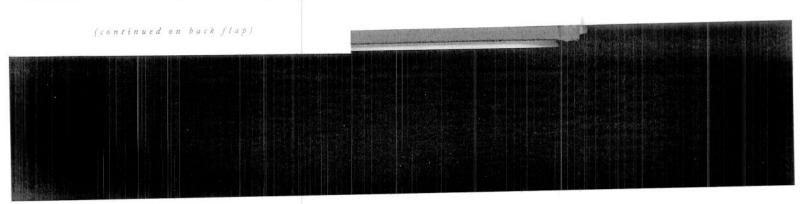
"This book is the definitive book on designing, testing, and using trading systems. There is no better book on the market."

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"t would be an understatement to say that the world has changed dramatically in the sixteen years since the first edition of Design, Testing, and Optimization of Trading Systems was published in 1991. With all of the changes in communications, technology, and trading styles, a thorough and comprehensive working knowledge of how to properly design and test strategies has never been more important than it has become in today's extremely competitive markets. Robert Pardo argues that a trading strategy can only be properly evaluated and successfully traded when profit and risk have been measured precisely and accurately which can only be done through computerized testing. In this updated and revised edition of his classic work, Pardo, a professional money manager and renowned expert in the design and testing of trading strategies and computerized trading applications, provides a clear-cut and specific road map for traders who want to transform a trading idea into a tested, verified, properly capitalized, and profitable automated trading strategy.

Pardo shows that the benefits of correct testing and optimization vastly outweigh the effort required to learn and master their proper application, and sets forth in detail the correct way to formulate, test, and evaluate a trading strategy. He explains how to properly optimize a trading strategy, incorporate out-of-sample data in the testing of a strategy, perform Walk-Forward Analysis™, develop a trading strategy profile, and judge real-time trading performance with respect to the trading strategy profile developed via historical testing. In addition, he identifies the symptoms of overfitting—



optimization that has "gone bad" resulting in false conclusions and offers guidelines to avoid it.

The trading game has never been as large or as lucrative as it is today. Nor have the markets ever been more efficient than they are today. Yet traders the world over continue to make profits. Why? They have found an edge. For anyone planning to employ algorithmic or mechanical strategies in their trading, this book presents, in a straightforward and accessible style, the edge that *you* can use to obtain and enjoy the fruits of profitable trading.

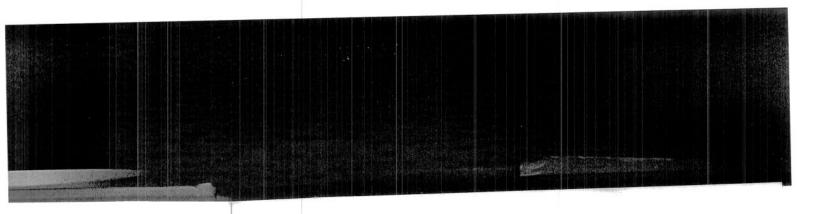
ROBERT PARDO is a recognized expert in the design and testing of trading strategies and computerized trading applications, and a long-standing professional money manager. He is founder and President of Pardo Capital Limited, a professional money management firm; Pardo Group Limited, a consulting firm; and Pardo Analytics Limited, a proprietary market analysis services firm. Since 1983, Pardo has continuously updated his software as well as designed, programmed, and documented versions of various commercial trading applications. He has worked as a consultant with world-class trading firms such as Goldman Sachs, Transworld Oil, and Daiwa Securities, and created the XT99 trading platform as a joint venture and ongoing strategic alliance between Pardo Capital Limited and Dunn Capital Management. Contact Robert at rep@pardocapital.com, or go to his Web site at http://www.pardocapital.com.

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Additional Praise for

The Evaluation and Optimization of Trading Strategies

"The *decisive* step in system trading is the determination of the reliability and robustness of your system. This greatly expanded and very accessible new edition of Bob's classic presents a thorough yet easy to apply and timetested methodology to accurately make this determination. This makes it possible to form a realistic idea of how your system should perform in the future and increases the likelihood of lasting real-time trading profit."

—Murray Ruggerio, Vice President of Research and Development for TradersStudio; Contributing Editor Futures Magazine.

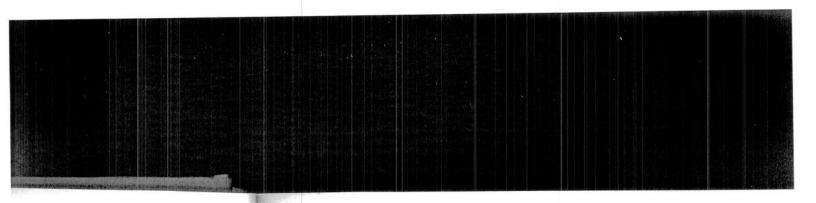
"Bob Pardo has re-written his own excellent book, and made it even better. It contains a basic step-by-step guide to building a trading system, along with an introduction to advanced system building concepts and tools. Simply avoiding the problems and errors Bob warns about can help lead to real time success. A must read for anyone interested in a systematic approach to trading."

---Michael Tepper, Atlas Capital Management, Inc.

"A significant contribution that will present, explain, clarify, and illustrate Algo Trading strategies and how to properly test/optimize trading models, thoroughly researched and perceptive. It will give the reader very practical and seasoned insight into the world of Algo Trading. Bob Pardo brings a very lucid approach to a very esoteric subject; a welcome departure from most texts. It is both accessible and rigorous, which is quite rare."

—Bruce J. Serra, Vice President, Institutional Sales, MF Global Inc.

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Contents

Foreword	XV
Preface	xvii
Acknowledgments	xxix
Introduction	1
CHAPTER 1 On Trading Strategies	5
Why This Book Was Written	7
Who Will Benefit from This Book?	8
The Goals of This Book	10
The Lay of the Land	10
CHAPTER 2 The Systematic Trading Edge	17
Discretionary Trading	18
Raising the Bar	19
Verification	22
Quantification	24
Risk and Reward	24
The Performance Profile	26
Objectivity	27
Consistency	29
Extensibility	32
The Benefits of the Historical Simulation	33
Positive Expectancy	34
The Likelihood of Future Profit	34
The Performance Profile	35
Proper Capitalization	35

vii

-	1	N.I"	TΕ	N.1"	TC

Contents

A Measure of Real-Time Trading Performance	36
The Benefits of Optimization	37
The Benefits of the Walk-Forward Analysis	38
The Advantages of a Thorough Understanding	39
Confidence	40
Strategy Refinement	41
CHAPTER 3 The Trading Strategy Development Process	43
Two Philosophical Approaches to Strategy Development	44
The Scientific Approach	44
The Path of Empirical Development	45
An Overview of the Trading Strategy Design Process	47
Step 1: Formulate the Trading Strategy	49
Step 2: Translate the Rules into a Definitive Form	49
Step 3: Preliminary Testing	50
Step 4: Optimize the Trading Strategy	51
Step 5: The Walk-Forward Analysis	52
Step 6: Trade the System	53
Step 7: Evaluate Real-Time Performance	54
Step 8: Improving the System	55
	and marr
CHAPTER 4 The Strategy Development Platform	57
	58
The Scripting Language	
The Scripting Language Diagnostics	58 59
The Scripting Language Diagnostics Reporting	58 59 62
The Scripting Language Diagnostics Reporting Optimization	58 59 62 68
The Scripting Language Diagnostics Reporting Optimization The Objective Function	58 59 62 68 68
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed	58 59 62 68 68
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed Automation	58 59 62 68 68 68
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed	58 59 62 68 68
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed Automation	58 59 62 68 68 68
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed Automation Walk-Forward Analysis	58 59 62 68 68 68 69
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed Automation Walk-Forward Analysis Portfolio Analysis	58 59 62 68 68 68 69 69
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed Automation Walk-Forward Analysis Portfolio Analysis In Conclusion	58 59 62 68 68 68 69 69 70
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed Automation Walk-Forward Analysis Portfolio Analysis In Conclusion CHAPTER 5 The Elements of Strategy Design	58 59 62 68 68 68 69 70 71
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed Automation Walk-Forward Analysis Portfolio Analysis In Conclusion CHAPTER 5 The Elements of Strategy Design The Three Principal Components of a Strategy	58 59 62 68 68 68 69 70 71 73
The Scripting Language Diagnostics Reporting Optimization The Objective Function Speed Automation Walk-Forward Analysis Portfolio Analysis In Conclusion CHAPTER 5 The Elements of Strategy Design The Three Principal Components of a Strategy Entry and Exit	58 59 62 68 68 69 69 70 71 73

An Overview of a Typical Tradi A Trade Equals an Entry and ar

Entry Filters

The Management of Risk

Trade Risk Strategy Risk Portfolio Risk

The Management of Profit

The Trailing Stop

The Impact of Overnight Change on Profit Targets

The Impact of Overnight Change on

Position Sizing

Advanced Strategies

Summary

CHAPTER 6 The Historical !

The Essential Reports

The Performance Summary
The Trade List
The Equity Curve
Performance by Period

The Importance of Accuracy Software Limitations

Rounding Issues Phantom Trades

Price Orders

Realistic Assumptions

Price and Trade Slippage Opening Gap Slippage Opening and Closing Range Slippage Slippage Due to Size

The Significance of Slippage

Limit Moves

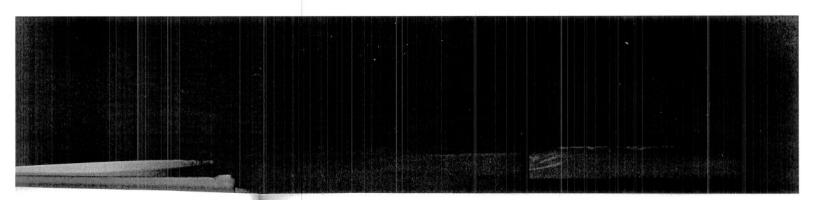
Major Events and Dates

Historical Data

Stock Prices

Cash Markets

Futures Markets



CON	NTENTS	Contents	ix
rformance	36	An Overview of a Typical Trading Strategy	75
	37	A Trade Equals an Entry and an Exit	
nalysis	38	Entry Filters	76
lerstanding	1000000	The Management of Risk	78
ici stalidilig	39	Trade Risk	79
	40	Strategy Risk	80 82
	41	Portfolio Risk	84
zy Development Process	43	The Management of Profit	85
5 Development Frocess	40	The Trailing Stop	85
trategy Development	44	The Impact of Overnight Change on the Trailing Stop	87
3,	44	Profit Targets	87
	45	The Impact of Overnight Change on Target Orders	88
y Design Process	47	Position Sizing	89
	49	Advanced Strategies	91
re Form	49	Summary	92
	50	Julilliui y	32
	51		
	52	CHAPTER 6 The Historical Simulation	93
	53	The Ferential Beneate	
	54	The Essential Reports The Performance Summary	94
	55	The Trade List	94 94
nmont Diatform	PR 207	The Frade List The Equity Curve	107
pment Platform	57	Performance by Period	108
	58	The Importance of Accuracy	109
	59	Software Limitations	109
	62	Rounding Issues	109
	68	Phantom Trades	111
		Price Orders	112
	68	Realistic Assumptions	113
	68	Price and Trade Slippage	113
	69	Opening Gap Slippage	115
	69	Opening and Closing Range Slippage	116
	70	Slippage Due to Size	117
	71	The Significance of Slippage	117
		Limit Moves	118
itegy Design	7 3	Major Events and Dates	118
ı Strategy	74	Historical Data	120
	74	Stock Prices	120
	74	Cash Markets	120
	75	Futures Markets	121

The Continuous Contract	124	CHA
The Perpetual Contract	124	
Adjusted Continuous Contracts	125	Sear
The Size of the Test Window	126	Th
Statistical Requirements	127	Th Hi
Sample Size and Statistical Error	127	M
How Many Trades?	129	Adv
Stability	129	Si
Degrees of Freedom	130	Ge
Frequency of Trading	131	Pa
Types of Markets	132	Gen
The Bull Market	132	The
The Bear Market	134	A Re
The Cyclic Market	135	Mult
The Congested Market	137	To the second
Efficient Markets	137	СНА
The Life Cycle of a Trading Strategy	140	
Window Size and Model Life	141	Opti
		A Si
CHAPTER 7 Formulation and Specification	145	The
on a role of a continuous and openication	113	Th
Formulate the Trading Strategy	145	Th
Specification—Translate the Idea into a Testable		Th
Strategy	147	Th
Make a Vague Idea Precise	150	Th
Control of the Contro	11	A Mi
CHAPTER 8 Preliminary Testing	157	The
Chaire of Tellminary Testing	101	The
Verification of Calculations and Trades	158	Th
Calculations	159	The
Trading Rules	159	The
In Summary	164	The
Theoretical Expectations	164	How
Preliminary Profitability	166	Doe:
The Multimarket and Multiperiod Test	169	
Selecting the Basket	169	СНА
Determining the Length of the Test Period	171	ls th
Segmenting the Data	171	Rob
The Test The Results of the Test	172	
the vesuits of the test	177	The

CHAPTER 9 Search and Jud

Search Methods

The Grid Search
The Prioritized Step Search
Hill Climbing Search Algorithms
Multipoint Hill Climbing Search

Advanced Search Methods

Simulated Annealing Genetic Algorithms Particle Swarm Optimization

General Problems with Search I The Objective Function A Review of a Variety of Evalua Multiple Evaluation Types

CHAPTER 10 Optimization

Optimization Contra Overfitting
A Simple Optimization
The Optimization Framework

The Parameters
The Scan Range
The Historical Sample
The Objective Function
The Optimization Evaluation

A Multimarket and Multiperiod The Evaluation of the Optimiza The Robust Trading Strategy

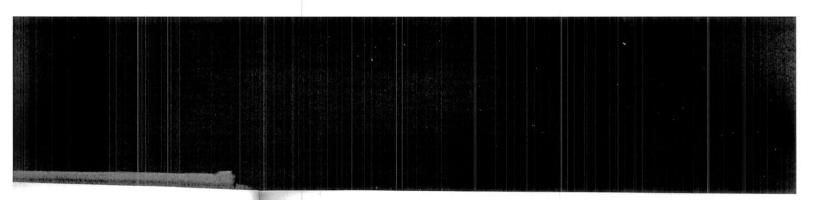
The Robust Optimization

The Statistically Significant Opt The Distribution of the Optimiz The Shape of the Optimization | How Does the Strategy Respond Does the Strategy Deserve Furt

CHAPTER 11 Walk-Forward A

Is the Trading Strategy Robust? Robustness and Walk-Forward I The Cure for Overfitting





	CONTENTS	Contents	xi
	124	CHAPTER 9 Search and Judgment	179
	124	Search Methods	
	125	The Grid Search	180
	126	The Prioritized Step Search	181
	127	Hill Climbing Search Algorithms	185
	127	Multipoint Hill Climbing Search	188 189
	129	Advanced Search Methods	
	129	Simulated Annealing	191 193
	130	Genetic Algorithms	193
	131	Particle Swarm Optimization	193
	132	General Problems with Search Methods	198
	132	The Objective Function	201
	134	A Review of a Variety of Evaluation Methods	115000000
	135	Multiple Evaluation Types	203
	137	Multiple Evaluation Types	208
	137	CHAPTER 10 Ontimination	044
×	140	CHAPTER 10 Optimization	211
	141	Optimization Contra Overfitting	213
		A Simple Optimization	214
ecification	145	The Optimization Framework	216
		The Parameters	216
	145	The Scan Range	218
o a Testable	1	The Historical Sample	220
	147	The Objective Function	222
	150	The Optimization Evaluation	222
	150	A Multimarket and Multiperiod Optimization	223
		The Evaluation of the Optimization	225
	157	The Robust Trading Strategy	225
les	150	The Robust Optimization	227
163	158 159	The Statistically Significant Optimization Profile	227
	159	The Distribution of the Optimization Profile	229
	164	The Shape of the Optimization Profile	231
	164	How Does the Strategy Respond to Optimization?	235
	166	Does the Strategy Deserve Further Development?	
5t	169	boes the strategy beserve further bevelopment?	236
	169	CHAPTER 11 Walk-Forward Analysis	237
	171	TALLE THE TALL WELL AND THE TALL THE TA	401
	171	Is the Trading Strategy Robust?	238
	172	Robustness and Walk-Forward Efficiency	238
	177	The Cure for Overfitting	239
		and a rat a rationity	439

A More Reliable Measure of Risk and Return	241
Assessing the Impact of Market Changes	241
The Best Parameter Set for Trading	242
The Theory of Relevant Data	243
Peak Performance	243
Statistical Rigor	244
Shifting Markets	245
The Varieties of Market Conditions	245
The Walk-Forward	247
The Role of the Walk-Forward	247
Setting up a Walk-Forward	248
An Example of a Walk-Forward Test	250
The Walk-Forward Analysis	251
The Purpose of the Walk-Forward Analysis	252
An Example of a Walk-Forward Analysis	255
Is the Strategy Robust?	256
What Rate of Profit Should We Expect?	260
What Is the Risk?	261
Walk-Forward Analysis and the Portfolio	261
CHAPTER 12 The Evaluation of Performance	26 3
CHAPTER 12 The Evaluation of Performance The Trading Strategy as an Investment	263 263
The Trading Strategy as an Investment The Dimension of Risk	263
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives	263 264 264
The Trading Strategy as an Investment The Dimension of Risk	263 264
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Risk	263 264 264 265
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context	263 264 264 265 267
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader	263 264 264 265 267 268
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader	263 264 264 265 267 268 269
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader Trading Capital and Risk	263 264 264 265 267 268 269 270
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader Trading Capital and Risk Risk Adjusted Return	263 264 264 265 267 268 269 270 272
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader Trading Capital and Risk Risk Adjusted Return Reward to Risk Ratio	263 264 264 265 267 268 269 270 272 273
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader Trading Capital and Risk Risk Adjusted Return Reward to Risk Ratio Model Efficiency	263 264 264 265 267 268 269 270 272 273 273
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader Trading Capital and Risk Risk Adjusted Return Reward to Risk Ratio Model Efficiency Consistency Patterns of Profit and Loss	263 264 264 265 267 268 269 270 272 273 273 276
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader Trading Capital and Risk Risk Adjusted Return Reward to Risk Ratio Model Efficiency Consistency	263 264 264 265 267 268 269 270 272 273 273 276
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader Trading Capital and Risk Risk Adjusted Return Reward to Risk Ratio Model Efficiency Consistency Patterns of Profit and Loss CHAPTER 13 The Many Faces of Overfitting	263 264 264 265 267 268 269 270 272 273 273 276 277
The Trading Strategy as an Investment The Dimension of Risk Compare the Strategy to the Alternatives Maximum Drawdown and Trading Maximum Drawdown in Context Maximum Drawdown and the Trader Maximum Run-up and the Trader Trading Capital and Risk Risk Adjusted Return Reward to Risk Ratio Model Efficiency Consistency Patterns of Profit and Loss	263 264 265 267 268 269 270 272 273 273 276 277

The Case of the Overfit For The Case of the Overfit Tra The Symptoms of an Overfi The Causes of Overfitting

Degrees of Freedom
Measuring Degrees of Freedom
Degrees of Freedom, Sample Si
Trade Sample Size
Optimization Error 1—Overpara
Optimization Error 2—Overscal
The Big Fish in a Small Pond Sy
The Walk-Forward Test

CHAPTER 14 Trading the

The Mental Aspects of Trad Return on Investment

Poor Strategy Market Contraction Unseen Market Conditions Superior Alternatives

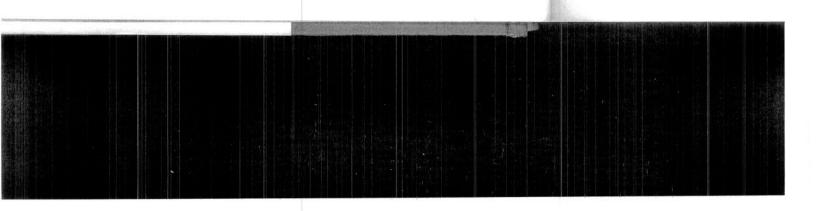
Maximum Risk Real-time and Evaluation Page Comparing the Evaluation a Understanding the Test Properformance Quirks

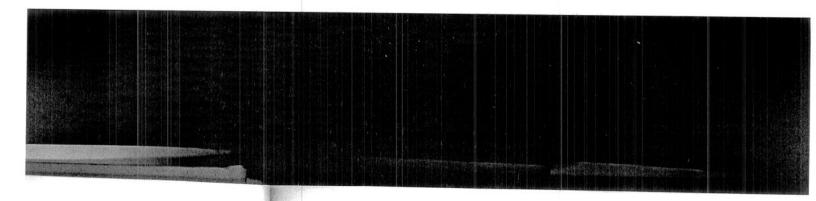
The Windfall Profit The Losing Run Flat Production

In Conclusion

Notes

Index





	CONTENTS	Contents	10
	1		Xiii
nd Return	241	The Case of the Overfit Forecasting Model	
langes	241	The Case of the Overfit Trading Model	286
3	242		289
	243	The Symptoms of an Overfit Trading Model The Causes of Overfitting	290
	243	Degrees of Freedom	291
	244	Measuring Degrees of Freedom	292
	245	Degrees of Freedom, Sample Size and Startup Overhead	292
;	245	Trade Sample Size	293
	247	Optimization Error 1—Overparameterization	295
		Optimization Error 2—Overscanning	296
	247	The Big Fish in a Small Pond Syndrome	297 298
	248	The Walk-Forward Test	298
:	250		290
	251	CHAPTER 14 Trading the Strategy	301
S	252		301
	255	The Mental Aspects of Trading	302
	256	Return on Investment	303
ct?	260	Poor Strategy	303
	261	Market Contraction	303
tfolio	261	Unseen Market Conditions	304
		Superior Alternatives	305
erformance	263	Maximum Risk	305
		Real-time and Evaluation Performance	308
ent	263	Comparing the Evaluation and Trade Profile	310
	264	Understanding the Test Profile	311
ıtives	264	Performance Quirks	313
isk	265	The Windfall Profit	315
	267	The Losing Run	316
	268	Flat Production	316
	269	In Conclusion	317
	270		317
	272	Notes	319
	273	Index	
	273	AHUU	323
	276		
	277		
	211		
verfitting	281		
	282		
	284		