SERGEY IZRAYLEVICH, PH.D. • VADIM TSUDIKMAN

AUTOMATED OPTION TRADING

CREATE, OPTIMIZE, AND TEST AUTOMATED TRADING SYSTEMS

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Sergey Izraylevich, Ph.D., and Vadim Tsudikman

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Printed in the United States of America

First Printing March 2012

ISBN-10: 0-13-247866-8 ISBN-13: 978-0-13-247866-3

Pearson Education LTD. Pearson Education Australia PTY. Limited Pearson Education Singapore, Pte. Ltd. Pearson Education Asia. Ltd. Pearson Education Canada, Ltd. Pearson Educatión de Mexico, S.A. de C.V. Pearson Education-Japan Pearson Education Malaysia, Pte. Ltd. Library of Congress Cataloging-in-Publication Data Izraylevich, Sergey, 1966-Automated option trading : create, optimize, and test automated trading systems / Sergey Izraylevich, Vadim Tsudikman. n cm Includes bibliographical references and index. ISBN 978-0-13-247866-3 (hardcover : alk. paper) 1. Stock options. 2. Options (Finance) 3. Electronic trading of securities. 4. Investment analysis. 5. Portfolio management. I. Tsudikman, Vadim, 1965-II. Title. HG6042.I968 2012 332.64'53-dc23

2011048038

This book is dedicated to our parents, Izraylevich Olga, Izraylevich Vladimir, Tsudikman Rachel, Tsudikman Jacob. This page intentionally left blank

Contents

	Introductionxv
Chapter 1	Development of Trading Strategies
	1.1 Distinctive Features of Option Trading Strategies 1
	1.1.1 Nonlinearity and Options Evaluation1
	1.1.2 Limited Period of Options Life
	1.1.3 Diversity of Options
	1.2 Market-Neutral Option Trading Strategies
	1.2.1 Basic Market-Neutral Strategy4
	1.2.2 Points and Boundaries of Delta-Neutrality6
	1.2.3 Analysis of Delta-Neutrality Boundaries10
	1.2.4 Quantitative Characteristics of Delta-Neutrality Boundaries14
	1.2.5 Analysis of the Portfolio Structure
	1.3.1 Specific Features of Partially Directional
	<i>Strategies</i>
	1.3.2 Embedding the Forecast into the Strategy
	<i>Structure</i>
	1.3.3 The Call-to-Put Ratio at the Portfolio Level40
	1.3.4 Basic Partially Directional Strategy
	1.3.5 Factors Influencing the Call-to-Put Ratio in an
	Options Portfolio
	1.3.6 The Concept of Delta-Neutrality as Applied
	to a Partially Directional Strategy49
	1.3.7 Analysis of the Portfolio Structure

	1.4 Delta-Neutral Portfolio as a Basis for the Option Trading Strategy
	1.4.1 Structure and Properties of Portfolios Situated at Delta-Neutrality Boundaries
	1.4.2 Selection of an Optimal Delta-Neutral Portfolio67
Chapter 2	Optimization
	2.1 General Overview
	2.1.1 Parametric Optimization73
	2.1.2 Optimization Space75
	2.1.3 Objective Function
	2.2 Optimization Space of the Delta-Neutral Strategy79
	2.2.1 Dimensionality of Optimization
	2.2.2 Acceptable Range of Parameter Values
	<i>2.2.3 Optimization Step</i>
	2.3 Objective Functions and Their Application
	2.3.1 Optimization Spaces of Different Objective
	<i>Functions</i>
	2.3.2 Interrelationships of Objective Functions91
	2.4 Multicriteria Optimization
	2.4.1 Convolution
	2.4.2 Optimization Using the Pareto Method
	2.5 Selection of the Optimal Solution on the Basis of
	Robustness102
	2.5.1 Averaging the Adjacent Cells
	2.5.2 Ratio of Mean to Standard Error104
	2.5.3 Surface Geometry106
	2.6 Steadiness of Optimization Space
	2.6.1 Steadiness Relative to Fixed Parameters109
	2.6.2 Steadiness Relative to Structural Changes110
	2.6.3 Steadiness Relative to the Optimization
	<i>Period</i>

	2.7 Optimization Methods114
	2.7.1 A Review of the Key Direct Search Methods116
	2.7.2 Comparison of the Effectiveness of Direct
	Search Methods127
	2.7.3 Random Search
	2.8 Establishing the Optimization Framework:
	Challenges and Compromises
Chapter 3	Risk Management
	3.1 Payoff Function and Specifics of Risk Evaluation135
	3.1.1 Linear Financial Instruments
	3.1.2 Options as Nonlinear Financial
	Instruments
	3.2 Risk Indicators
	3.2.1 Value at Risk (VaR)140
	3.2.2 Index Delta141
	3.2.3 Asymmetry Coefficient
	3.2.4 Loss Probability159
	3.3 Interrelationships Between Risk Indicators161
	3.3.1 Method for Testing the Interrelationships161
	3.3.2 Correlation Analysis
	3.4 Establishing the Risk Management System:
	Challenges and Compromises
Chapter 4	Capital Allocation and Portfolio Construction
	4.1 Classical Portfolio Theory and Its Applicability to Options
	4.1.1 Classical Approach to Portfolio Construction168
	4.1.2 Specific Features of Option Portfolios
	4.2 Principles of Option Portfolio Construction
	4.2.1 Dimensionality of the Evaluation System
	4.2.2 Evaluation Level1734.3 Indicators Used for Capital Allocation174
	4.3.1 Indicators Unrelated to Return and Risk Evaluation
	4.3.2 Indicators Related to Return and Risk
	1. 1.2 ΠΙΜΙCHICIS ΛΕΙΜΙΕΝ ΙΟ ΛΕΙΜΙΠ ΜΠΗ ΛΙSK
	<i>Evaluation</i>

	4.4 One-Dimensional System of Capital Allocation183
	4.4.1 Factors Influencing Capital Allocation
	4.4.2 Measuring the Capital Concentration in the
	Portfolio192
	4.4.3 Transformation of the Weight Function196
	4.5 Multidimensional Capital Allocation System
	4.5.1 Method of Multidimensional System
	Application
	4.5.2 Comparison of Multidimensional and
	One-Dimensional Systems
	4.6 Portfolio System of Capital Allocation
	4.6.1 Specific Features of the Portfolio System209
	4.6.2 Comparison of Portfolio and Elemental
	<i>Systems</i>
	4.7 Establishing the Capital Allocation System:
	Challenges and Compromises
Chanter E	Paaktooting of Ontion Trading Stratagian 917
Chapter 5	Backtesting of Option Trading Strategies
Chapter o	5.1 Database
Gliapter 5	
Gliapter o	5.1 Database
Chapter 5	5.1 Database .217 5.1.1 Data Vendors .218
Cilapter 5	5.1 Database .217 5.1.1 Data Vendors .218 5.1.2 Database Structure .219
Cilapter 5	5.1 Database .217 5.1.1 Data Vendors .218 5.1.2 Database Structure .219 5.1.3 Data Access .220
Cilapter 5	5.1 Database .217 5.1.1 Data Vendors .218 5.1.2 Database Structure .219 5.1.3 Data Access .220 5.1.4 Recurrent Calculations .221
Cilapter 5	5.1 Database.2175.1.1 Data Vendors.2185.1.2 Database Structure.2195.1.3 Data Access.2205.1.4 Recurrent Calculations.2215.1.5 Checking Data Reliability and Validity.222
Cilapter 5	5.1 Database.2175.1.1 Data Vendors.2185.1.2 Database Structure.2195.1.3 Data Access.2205.1.4 Recurrent Calculations.2215.1.5 Checking Data Reliability and Validity.2225.2 Position Opening and Closing Signals.225
Cilapier 5	5.1 Database.2175.1.1 Data Vendors.2185.1.2 Database Structure.2195.1.3 Data Access.2205.1.4 Recurrent Calculations.2215.1.5 Checking Data Reliability and Validity.2225.2 Position Opening and Closing Signals.2255.2.1 Signals Generation Principles.225
Cilapter 5	5.1 Database.2175.1.1 Data Vendors.2185.1.2 Database Structure.2195.1.3 Data Access.2205.1.4 Recurrent Calculations.2215.1.5 Checking Data Reliability and Validity.2225.2 Position Opening and Closing Signals.2255.2.1 Signals Generation Principles.2255.2.2 Development and Evaluation of
Cilapier 5	5.1 Database.2175.1.1 Data Vendors.2185.1.2 Database Structure.2195.1.3 Data Access.2205.1.4 Recurrent Calculations.2215.1.5 Checking Data Reliability and Validity.2225.2 Position Opening and Closing Signals.2255.2.1 Signals Generation Principles.2255.2.2 Development and Evaluation of Functionals.226
Cilapter 5	5.1 Database.2175.1.1 Data Vendors.2185.1.2 Database Structure.2195.1.3 Data Access.2205.1.4 Recurrent Calculations.2215.1.5 Checking Data Reliability and Validity.2225.2 Position Opening and Closing Signals.2255.2.1 Signals Generation Principles.2255.2.2 Development and Evaluation of Functionals.2265.2.3 Filtration of Signals.227
Cilapter 5	5.1 Database.2175.1.1 Data Vendors.2185.1.2 Database Structure.2195.1.3 Data Access.2205.1.4 Recurrent Calculations.2215.1.5 Checking Data Reliability and Validity.2225.2 Position Opening and Closing Signals.2255.2.1 Signals Generation Principles.2255.2.2 Development and Evaluation of Functionals.2265.2.3 Filtration of Signals.2275.3 Modeling of Order Execution.228
Cilapter 5	5.1 Database.2175.1.1 Data Vendors.2185.1.2 Database Structure.2195.1.3 Data Access.2205.1.4 Recurrent Calculations.2215.1.5 Checking Data Reliability and Validity.2225.2 Position Opening and Closing Signals.2255.2.1 Signals Generation Principles.2255.2.2 Development and Evaluation of Functionals.2265.2.3 Filtration of Signals.2275.3 Modeling of Order Execution.2285.3.1 Volume Modeling.229

5.4 Backtesting Framework
5.4.1 In-Sample Optimization and Out-of-Sample
<i>Testing</i> 232
5.4.2 Adaptive Optimization
5.4.3 Overfitting Problem
5.5 Evaluation of Performance
5.5.1 Single Event and Unit of Time Frame
5.5.2 Review of Strategy Performance Indicators237
5.5.3 The Example of Option Strategy Backtesting242
5.6 Establishing the Backtesting System: Challenges and
Compromises
Bibliography
Appendix
Basic Notions
Payoff Functions
Separate Options254
Option Combinations255
Index

Acknowledgments

The authors would like to express their gratitude to the team of High Technology Invest Inc. Special thanks are due to Arsen Balishyan, Ph.D., CFA, and Vladislav Leonov, Ph.D., and Eugen Masherov, Ph.D., for their continued help at all stages of this project.

About the Authors

Sergey Izraylevich, Ph.D., Chairman of the Board of High Technology Invest Inc., has traded options for well over a decade and currently creates automated systems for algorithmic option trading. A *Futures* magazine columnist, he has authored numerous articles for highly rated, peer-reviewed scientific journals. He began his career as a lecturer at The Hebrew University of Jerusalem and Tel-Hay Academic College, receiving numerous awards for academic excellence, including Golda Meir's Prize and the Max Shlomiok honor award of distinction.

Vadim Tsudikman, President of High Technology Invest Inc., is a financial consultant and investment advisor specializing in derivatives valuation, hedging, and capital allocation in extreme market environments. With more than 15 years of option trading experience, he develops complex trading systems based on multicriteria analysis and genetic optimization algorithms.

Izraylevich and Tsudikman coauthored *Systematic Options Trading* (FT Press) and regularly coauthor *Futures* magazine articles on cutting-edge issues related to option pricing, volatility, and risk management.

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Introduction

This book presents a concept of developing an automated system tailored specifically for options trading. It was written to provide a framework for transforming investment ideas into properly defined and formalized algorithms allowing consistent and disciplined realization of testable trading strategies.

Extensive literature has been published in the past decades regarding systematic, algorithmic, automated, and mechanical trading. In the Bibliography of this book, we list some of the comprehensive works that deserve special attention. However, all books dedicated to the creation of automated trading systems deal with traditional investment tools, such as stocks, futures, or currencies. Although the development of options-oriented systems requires accounting for numerous specific features peculiar to these instruments, automated trading of options remains beyond the scope of professional literature. The philosophy, logic, and quantitative procedures used in the creation of automated systems for options trading are completely different from those used in conventional trading algorithms. In fact, all the components of a system intended for automated trading of options (strategy development, optimization, capital allocation, risk management, backtesting, performance measurement) differ significantly from their analogs in the systems intended for trading of plain assets. This book describes consecutively the key stages of creating automated systems intended specifically for options trading.

Automated trading of options represents a continuous process of valuation, structuring, and long-term management of investment portfolios (rather than individual instruments). Due to the nonlinearity of options, the expected returns and risks of their complex portfolios cannot be estimated by simple summation of characteristics corresponding to individual options. Special approaches are required to evaluate portfolios containing options (and their combinations) related to different underlying assets. In this book we discuss such approaches, describe systematically the core properties of option portfolios, and consider the specific features of automated options trading at the portfolio level.

The Book Structure

An automated trading system represents a package of software modules performing the functions of developing, formalizing, setting up, and testing trading strategies.

Chapter 1, "Development of Trading Strategies," discusses the development and formalization of option strategies. Since there is a huge multitude of trading strategies somehow related to options, we limit our discussion to market-neutral strategies. The reason for selecting this particular type of option strategies relates to its wide popularity among private and institutional investors.

Strategy setup includes optimization of its parameters, capital allocation between portfolio elements, and risk management. Chapter 2, "Optimization," deals with various optimization aspects. In this chapter we discuss various properties of optimization spaces, different types of objective functions and their interrelationships, several methods of multicriteria optimization, and problems of optimization steadiness relative to small changes in the parameters and strategy structure. Special attention is given to the application of traditional methods of parametric optimization to complex option portfolios.

In Chapter 3, "Risk Management," we discuss a set of option-specific risk indicators that can be used for developing a multicriteria risk management system. We investigate the influence of different factors on the effectiveness of the risk indicator and on the number of indicators needed for effective risk measuring.

In Chapter 4, "Capital Allocation and Portfolio Construction," we consider various aspects of capital allocation among the elements of an option portfolio. Capital can be allocated on the basis of different indicators not necessarily expressing return and risk. This chapter describes the step-by-step process of constructing a complex portfolio out of separate option combinations.

The testing of option strategies using historical data is discussed in Chapter 5, "Backtesting of Option Trading Strategies." In this chapter we stress the particularities of creating and maintaining option databases and provide methods to verify data accuracy and reliability. The problem of overfitting and the main approaches to solving it are also discussed. Performance evaluation of option strategies is also the topic of this chapter.

Strategies Considered in This Book

The nature of options makes it possible to create a considerable number of speculative trading strategies. Those can be based on different approaches encompassing the variety of principles and valuation techniques.

In many strategies options are used as auxiliary instruments to *bedge main positions*. In this book we are not going to delve into this field of options application since hedging represents only one constituent part of such trading strategies, but not their backbone.

Options may be used to create *synthetic underlying positions*. In this case the investor aims for the payoff profiles of an option combination and its underlying asset to coincide. This can increase trading leverage significantly. However, apart from leverage, automated trading of synthetic assets is no different from trading in underlying assets (besides the certain specificity regarding execution of trading orders, higher brokerage commissions, and the necessity to roll over positions). Thus, we will not dwell on such strategies either.

Most trading strategies dealing with plain assets (not options) are based on the *forecast* of the direction of their price movement (we will call them directional strategies). Options

can also be used in such strategies. For example, different kinds of option combinations, commonly referred to as *spreads*, benefit from the increase in the underlying price (bull spreads), or from its decline (bear spread). Despite the fact that trading strategies based on such option combinations possess many features distinguishing them from plain assets strategies, the main determinant of their performance is the accuracy of price forecasts. This quality makes such strategies quite similar to common directional strategies, and therefore we will not consider them in this book.

The focus of this book is on strategies that exploit the specific features of options. One of the key differences of options from other investment assets is the nonlinearity of their payoff functions. In the trading of stocks, commodities, currencies, and other linear assets, all profits and losses are directly proportional to their prices. In the case of options, however, position profitability depends not only on the direction of the price movement, but on many other factors as well. Combining different options on the same underlying asset can bring about almost any form of the payoff function.

This feature of options permits the creation of positions that depend not only on the direction and the amplitude of price fluctuations, but also on many other parameters, including volatility, time left until the expiration, and so forth. The main subject of our consideration is a special type of trading strategies sharing one common property referred to as *market-neutrality*. With regard to options, market-neutrality means that (1) small changes in the underlying price do not lead to a significant change in the position value, and (2) given larger price movements, the position value changes by approximately the same amount regardless of the direction of the underlying price movement. In reality these rules do not always hold, but they serve as a general guideline for a trader striving for market-neutrality. The main analytical instrument used to create market-neutral positions is delta. The position is market-neutral if the sum of the deltas of all its components (options and underlying assets) is equal to or close to zero. Such positions are referred to as *delta-neutral*.

Another type of trading strategy that will be considered in this book is a set of market-neutral strategies whose algorithms contain certain directional elements. Although in this case positions are created while taking into consideration the value of delta, its reduction to zero is not an obligatory requirement. Forecasts of the directions of future price movements represent an integral part of such a strategy. These forecasts can be incorporated into the strategy structure in the form of biased probability distributions or asymmetrical option combinations, or by application of technical and fundamental indicators. We will call such strategies *partially directional*.

Generally, automated strategies are designed to trade one or just a few financial instruments (mainly futures on a given underlying asset). Even if several instruments are traded simultaneously, in most cases positions are opened, closed, and analyzed independently. Options are no exception. Most traders develop systems oriented solely at trading OEX (options on S&P 100 futures) or options on oil futures. In this

book we will consider strategies intended to trade an *unlimited number of options relating* to many underlying assets. All positions created within one trading strategy will be *evaluated and analyzed jointly as a whole portfolio.*

Scientific and Empirical Approaches to Developing Automated Trading Strategies

There are two main approaches to the development of automated trading strategies. The first approach is based on the principles and concepts defined by a strategy developer. All the elements composing such a strategy originate from economic knowledge, fundamental estimates, expert opinions, and so forth. Formalization of such knowledge, estimates, and assumptions in the form of algorithmic rules provides a basis for creating an automated trading strategy. Following the example of Robert Pardo, we will call this a *scientific approach*.

At its extreme, the scientific approach provides for a total rejection of optimization procedures. All the rules and parameters of a trading system are determined solely on the basis of knowledge and forecasts of the developer. Apparently, the likelihood of creating a profitable strategy, while avoiding engagement in optimization procedures, is extremely low. Scientific approach in its pure form is hardly applicable in real trading.

The alternative approach is based on the complete denial of any a priori established theories, models, and principles while developing automated trading strategies. This approach requires extensive use of computer technologies to search for profitable trading rules. All algorithms can be tested for this task (with no concern for any economically sound reasons standing behind their application). Candidate algorithms can be selected from a number of ready-made alternatives available or actually constructed by the system developer. The method of algorithm creation is not determined by preliminary assumptions and is not limited by any exogenous reasoning. Trading rules are selected solely on the basis of their testing using historical data. The resulting strategy is devoid of any behavioral logic or economic sense. Following Robert Pardo, we will call it an *empirical approach*.

At its extreme, the empirical approach is a purposeful quest for algorithms and parameters that maximize simulated profit (minimize loss or satisfy any other utility function). This approach is based exclusively on optimization. Nowadays there is a wide choice of hightechnology software that facilitates fast development of effective algorithms and provides for establishment of optimal parameter sets. For example, neuron networks and genetic methods represent powerful tools that enable relatively fast finding of optimal solutions through the creation of self-learning systems.

Usually trading strategies constructed on the basis of the empirical approach show remarkable results when tested on historical time series, but demonstrate failure in real trading. The reason for this is overfitting. Even walk-forward analysis does not eliminate this threat because the significant number of degrees of freedom (which is not unusual under the empirical approach) allows choosing such a set of trading rules and parameters that would generate satisfactory results not only during the optimization period, but in the walk-forward analysis as well (we will examine this in detail in Chapter 5). Thus, practical use of the empirical approach exclusively is risky and hardly applicable in real trading.

Rational Approach to Developing Automated Trading Strategies

Most developers of automated trading strategies combine scientific methods and empirical approaches. On the one hand, strategies resulting from such combining are based on strong economic grounds. On the other hand, they benefit from the numerous advantages of optimization and from the impressive progress in computer intelligence. We will call this the *rational approach*.

Under the rational approach a set of rules, determining the general structure of a trading strategy, is formed at the initial stage of strategy creation. These rules are based on the prior knowledge and assumptions about market behavior. The results of statistical research, either received by the strategy developer or obtained from scientific publications and private sources, can also be used to shape the general framework. Obviously, patterns established during such research introduce certain logic into the strategy under development. At the same time, statistical research may result in the discovery of inexplicable relationships lacking any economic sense behind them. Such relationships should be treated with special care since they may either be random in nature or result from data mining.

The initial stage of strategy creation is based mainly on the elements of scientific approach. At this stage the following must be determined:

- Principles of generating the signals for opening and closing trading positions
- Indicators used to generate open and close signals
- A universe of investment assets that are both available and suitable for trading
- Requirements to the portfolio and restrictions imposed on it
- Capital allocation among different portfolio elements
- Methods and instruments of risk management

At the next stage of developing a trading strategy, the rules laid down on the basis of scientific approach are formalized in the form of computable algorithms. This stage is congested with elements of the empirical approach. These are the essential steps:

- Defining specific parameters. All rules formulated on the basis of the scientific approach should be formalized using a certain number of parameters.
- Specifying the algorithms for parameter calculation. Different algorithms may be invented for calculating the same parameter.
- Establishing the procedures for the selection of parameter values. This requires adopting a certain optimization technique.

Usually the decision on the number of parameters and selection of methods for their optimization does not depend on the economic considerations of the developer, but follows from the specific requirements to the strategy and from its technical constraints. These requirements and constraints are developed with regard to the reliability, stability, and other strategy features, among which the capability to avoid the overfitting is one of the most important properties.

In this book we will follow the principles of rational approach to the creation of trading strategies. The main task of the developer is to combine methods attributed to the scientific and the empirical approaches in a reasonable and balanced manner. In order to accomplish this task successfully, all basic components of a trading strategy should be clearly identified as belonging either to components that are set on the basis of well-founded reasoning or to an alternative category of components that are formed primarily by applying various optimization methods.

Index

A

acceptable values, determining range of, 76, 85-87 access in historical database (in backtesting systems), 220-221 adaptive optimization, 233-234 additive convolution, 97, 172 adjacent cells, average of, 103-104 alternating-variable ascent optimization method, 116-118 comparison with random search method, 132 effectiveness of, 128 American option, defined, 251 amoeba search optimization method, 123-127 analysis of variance (ANOVA) in one-dimensional capital allocation system, 190-191

analytical method (index delta calculation), 142-143 analytical method (VaR calculation), 137 arbitrage situations, tests for, 223 assets in delta-neutral strategy, 5 in portfolio analysis of delta-neutrality strategy, 24-25 analysis of partially directional strategies, 58 price forecasts, 35 call-to-put ratio in portfolio, 40-49 delta-neutrality applied to, 49-57 embedding in strategy structure, 36-40

asymmetry coefficient, 157-159, 180-181 asymmetry of portfolio analysis of delta-neutrality strategy, 29-30 analysis of partially directional strategies, 60 at-the-money, defined, 252 attainability of delta-neutrality, 14, 19-20, 51, 54-55 automated trading systems defined. xv empirical approach to development, xviii-xix rational approach to development, xix-xx scientific approach to development, xviii average of adjacent cells, 103-104

B

backtesting systems challenges and compromises, 246 framework for, 232 adaptive optimization, 233-234 in-sample optimization/ out-of-sample testing, 232-233 overfitting problem, 234-236 historical database, 217 data access, 220-221 data reliability/validity, 222-224 data vendors for, 218

recurrent calculations, 221-222 structure of, 219-220 order execution simulation, 228 commissions, 231 price modeling, 230-231 volume modeling, 229 performance evaluation indicators, 236 backtesting example, 242-245 characteristics of return. 237-238 consistency, 241 maximum drawdown, 238-239 profit/loss factor, 240-241 Sharpe coefficient, 239-240 single events, 236 unit of time frame, 236 signals generation, 225 filtration of signals, 227-228 functionals development/ evaluation, 226-227 principles of, 225-226 bear spreads, payoff functions, 258-259 boundaries of delta-neutrality, 6-10 in calm versus volatile markets, 10-11.13 optimal portfolio selection, 67-72 in partially directional strategies, 49-55, 57 portfolio structure and properties at, 62-65 quantitative characteristics of, 14-21

broker commissions (in backtesting systems), 231 bull spreads, payoff functions, 258-259

С

calendar optimization, defined, 73 calendar spreads, payoff functions, 257-258 call options defined, 251 payoff functions, 254-255 call-to-put ratio in portfolio, 40-42 factors affecting, 44-49 calm markets delta-neutrality boundaries in, 10-13, 51-52 portfolio structure analysis long and short combinations. 26-27 loss probability, 31-33 number of combinations in portfolio, 22-24 number of underlying assets in portfolio, 24-25 portfolio asymmetry, 29-30 straddles and strangles, 28-29 VaR, 33-34 capital allocation challenges and compromises, 214-216 classical portfolio theory, 168-169 option portfolios, features of, 169-170 in delta-neutral strategy, 5

indicators asymmetry coefficient, 180-181 delta, 180 expected profit, 179 inversely-to-the-premium, 175-176 inversely-to-the-premium versus stock-equivalency, 176-178 profit probability, 179 stock-equivalency, 174-175 VaR, 181-183 weight function for return/risk evaluation, 178-179 multidimensional system, 172, 204-205 one-dimensional system versus, 206-209 one-dimensional system, 170, 172 analysis of variance in, 190-191 factors affecting, 183-186 historical volatility in, 186-187 measuring capital concentration, 192-195 multidimensional system versus, 206-209 number of days to expiration in, 187-188 number of underlying assets in, 188-190 weight function transformation, 196-204

in partially directional strategies, 43 portfolio system, 209-211 elemental approach versus, 173-174, 211-214 capital concentration concave versus convex weight function comparison, 202-204 measuring, 192-195 one-dimensional versus multidimensional capital allocation systems, 208-209 portfolio versus elemental capital allocation systems, 213-214 capital management systems first level of, 167 in partially directional strategies, 43 second level of, 167 characteristics of return performance indicator, 237-238 classical portfolio theory, 168-169 option portfolios, features of, 169-170 closing signals in delta-neutral strategy, 4 generating (in backtesting systems), 225 filtration of signals, 227-228 functionals development/ evaluation, 226-227 principles of, 225-226 in partially directional strategies, 42

combination of options, 3 combinations defined. 252 factors affecting call-to-put ratio, 44-49 long and short combinations, analysis of delta-neutrality strategy, 26-27 in partially directional strategies, 43 payoff functions for, 255 bull/bear spreads, 258-259 calendar spreads, 257-258 straddles, 256 strangles, 256-257 in portfolio analysis of delta-neutrality strategy, 22-24 analysis of partially directional strategies, 57-59 commissions (in backtesting systems), 231 computation, defined, 74 concave weight function, 196, 198 convex weight function compared by capital concentration, 202-204 by profit, 200-202 conditional optimization, 74 consistency performance indicator, 241 constraints in conditional optimization, 74

convex weight function, 196-198 concave weight function compared by capital concentration, 202-204 by profit, 200-202 convolution of indicators, 172 in multicriteria optimization, 97-98 correlation analysis of objective functions, 91-96 risk indicator interrelationships, 162-165 correlation coefficient in objective function relationships, 91 criterion parameters in partially directional strategies, 42 criterion threshold index, 14-17, 51-52 point of delta-neutrality, determining, 7-8

D

data access in historical database (in backtesting systems), 220-221 data reliability in historical database (in backtesting systems), 222-224 data validity in historical database (in backtesting systems), 222-224 data vendors for historical database (in backtesting systems), 218 database (in backtesting systems), 217 data access, 220-221 data reliability/validity, 222-224 data vendors for, 218

recurrent calculations, 221-222 structure of, 219-220 deformable polyhedron optimization method, 123-127 delta, 138-139, 169, 180, 253. See also index delta delta-neutral strategy, xvii, 4 basic form of, 4-5 optimal portfolio selection, 67-72 optimization space of, 79-80 acceptable range of parameter values, 85-87 optimization dimensionality, 80-85 optimization step, 87-88 partially directional strategies versus, 34 points and boundaries of, 6-10 in calm versus volatile markets, 10-11, 13 quantitative characteristics of. 14-21 portfolio structure analysis, 21-34 long and short combinations. 26-27 loss probability, 31-33 number of combinations in portfolio, 22-24 number of underlying assets in portfolio, 24-25 portfolio asymmetry, 29-30 straddles and strangles, 28-29 VaR, 33-34

portfolio structure and properties at boundaries, 62-65 price forecasts versus, 35 delta-neutrality applied to partially directional strategies, 49-55, 57 attainability, 14, 19-20, 51, 54-55 derivatives, Greeks as, 138 determination coefficient in objective function relationships, 91 dimensionality of optimization, 80-85 one-dimensional optimization, 80-82 two-dimensional optimization, 83-85 direct filtration method, 227 direct methods, defined, 78 direct search optimization methods, 115 alternating-variable ascent method, 116-118 comparison of effectiveness, 127-130 drawbacks to, 115-116 Hook-Jeeves method, 118-120 Nelder-Mead method, 123-127 Rosenbrock method, 120-123 directional strategies, xvi diversification, underlying assets in portfolio, 24 diversity of options available, 3 domination in Pareto method, 99

E

elemental capital allocation approach, 173-174 portfolio system versus, 211-214 embedding price forecasts in strategy structure, 36-40 empirical approach to automated trading system development, xviii-xix equity curve in backtesting results, 242-244 European option, defined, 251 evaluation of option pricing, 1-2 of performance (in backtesting systems), 236 backtesting example, 242-245 characteristics of return, 237-238 consistency, 241 maximum drawdown. 238-239 profit/loss factor, 240-241 Sharpe coefficient, 239-240 single events, 236 unit of time frame. 236 exhaustive search optimization method, 114-115 expected profit (capital allocation indicator), 179 expiration date, 169 defined, 251 in delta-neutral strategy, 8-13

effect on call-to-put ratio, 48-49 in one-dimensional capital allocation system, 187-188 exponential annual return, 237

F

fair value pricing, determining, 1-2 filtration of signals, 227-228 first level of capital management systems, 167 fixed parameters, steadiness of optimization space, 109-110 forecasts of underlying asset prices, 35 call-to-put ratio in portfolio, 40-42 factors affecting, 44-49 delta-neutrality applied to, 49-57 embedding in strategy structure, 36-40 full optimization cycle, defined, 74 functionals, development and evaluation of, 226-227 fundamental analysis for price forecasts, 35

G

gamma, 138, 253 generating signals in delta-neutral strategy, 4 genetic algorithms, 115 global maximum, defined, 75 Greeks, 169 defined, 253 in risk evaluation, 138-139

H

hedging strategies, xvi historical database (in backtesting systems), 217 data access. 220-221 data reliability/validity, 222-224 data vendors for, 218 recurrent calculations. 221-222 structure of, 219-220 historical method (VaR calculation), 137 historical optimization period, steadiness of optimization space, 112-114 historical volatility defined, 252 in delta-neutral strategy, 80 in one-dimensional capital allocation system, 186-187 recurrent calculations applied, 221-222 in risk evaluation. 136 Hook-Jeeves optimization method, 118-120 comparison with random search method, 132 effectiveness of, 128

І–Ј–К

ideal strategy, 241 implied volatility defined, 252 estimations, 224 in-sample optimization, 232-233 in-the-money, defined, 252 index delta, 139, 141, 169 analysis of effectiveness at different time horizons, 150-156 in risk evaluation, 146-149 analytical method of calculation, 142-143 applicability of, 156-157 calculation algorithm, 141-142 example of calculation, 144-146 indirect filtration method, 227 interrelationships between risk indicators, 161 correlation analysis, 162-165 testing, 161 of objective functions, 91-96 intrinsic value, defined, 251 inversely-to-the-premium (capital allocation indicator), 175-176 stock-equivalency versus, 176-178 investment assets in delta-neutral strategy, 5 in portfolio analysis of delta-neutrality strategy, 24-25 analysis of partially directional strategies, 58 price forecasts, 35 call-to-put ratio in portfolio, 40-49

delta-neutrality applied to, 49-57 embedding in strategy structure, 36-40 isolines in delta-neutrality boundaries, 9

L

length of delta-neutrality boundary, 14, 17-19, 51-54 life span of options, limited nature of, 2-3 linear annual return, 237 linear assets, options versus, xvii linear financial instruments nonlinear instruments versus, 135 risk evaluation, 136-137 local maximum, defined, 75 long calendar spreads, 258 long combinations analysis of delta-neutrality strategy, 26-27 factors affecting call-to-put ratio, 44-49 in portfolio, analysis of partially directional strategies, 58-59 long options, payoff functions, 254-255 long positions, limitations on, 111 long straddles, 256 long strangles, 256 loss probability, 159-160 analysis of delta-neutrality strategy, 31-33 in portfolio, analysis of partially directional strategies, 60

M

margin requirements, 170, 252 market impact, 230 market volatility, effect on call-to-put ratio, 46-47 market-neutral strategies, 258. See also delta-neutral strategy market-neutrality, xvii Markowitz, Harry, 168 maximum drawdown, 238-239 as objective function effect on optimization space, 90 relationship with percentage of profitable trades.93 relationship with profit, 92 mean, ratio to standard error, 104-105 minimax convolution.97 modeling (in backtesting systems), 228 commissions, 231 price modeling, 230-231 volume modeling, 229 money management in delta-neutral strategy, 5 Monte-Carlo method (VaR calculation), 137 moving averages, compared with average of adjacent cells, 103 multicriteria optimization, 79 convolution, 97-98 nontransitivity problem, 96-97 Pareto method, 99-102

robustness of optimal solution, 102 averaging adjacent cells, 103-104 ratio of mean to standard error. 104-105 surface geometry, 106-108 steadiness of optimization space, 108-109 relative to fixed parameters, 109-110 relative to historical optimization period, 112-114 relative to structural changes, 110-111 multidimensional capital allocation system, 172, 204-205 one-dimensional system versus, 206-209 multiple regression analysis in one-dimensional capital allocation system, 190-191 multiplicative convolution, 97, 172

Ν

Nelder-Mead optimization method, 123-129 neuronets, 115 nodes, defined, 74 nonlinear financial instruments linear instruments versus, 135 risk evaluation, 138-139 risk indicators, 139 asymmetry coefficient, 157-159 index delta, 141-157 interrelationships between, 161-165 loss probability, 159-160 VaR (Value at Risk), 140-141 nonlinearity, options evaluation and, 1-2 nonmodal optimization, 76 nonmodal optimization space, 82 nontransitivity in multicriteria optimization, 96-97 normalization, 184

0

objective function defined.74 effect on optimization space, 89-91 explained, 78-79 interrelationships of, 91-96 usage of, 88 one-dimensional capital allocation system, 170-172 analysis of variance in, 190-191 factors affecting, 183-186 historical volatility in, 186-187 measuring capital concentration, 192-195 multidimensional system versus, 206-209 number of days to expiration in, 187-188

number of underlying assets in, 188-190 weight function transformation, 196-204 one-dimensional optimization, 80-82 opening signals in delta-neutral strategy, 4 generating (in backtesting systems), 225 filtration of signals, 227-228 functionals development/ evaluation, 226-227 principles of, 225-226 in partially directional strategies, 42 optimal area, defined, 75 optimal delta-neutral portfolio selection, 67-72 optimal solution defined, 75 robustness of, 82, 102 averaging adjacent cells, 103-104 ratio of mean to standard error. 104-105 surface geometry, 106-108 optimization adaptive optimization, 233-234 challenges and compromises in, 134 defined, 73 dimensionality of, 80-85 one-dimensional optimization, 80-82 two-dimensional optimization, 83-85

in-sample optimization, 232-233 multicriteria optimization convolution, 97-98 nontransitivity problem, 96-97 Pareto method, 99-102 robustness of optimal solution, 102-108 steadiness of optimization space, 108-114 objective function effect on optimization space, 89-91 explained, 78-79 interrelationships of, 91-96 usage of, 88 parametric optimization, explained, 73-75 terminology, 74-75 optimization methods direct search methods, 115 alternating-variable ascent method, 116-118 comparison of effectiveness, 127-130 drawbacks to, 115-116 Hook-Jeeves method, 118-120 Nelder-Mead method, 123-127 Rosenbrock method, 120-123 exhaustive search, 114-115 random search, 131-133

optimization space defined, 74 of delta-neutral strategy, 79-80 acceptable range of parameter values, 85-87 optimization dimensionality, 80-85 optimization step, 87-88 effect of objective functions on, 89-91 explained, 75-77 steadiness of, 108-109 relative to fixed parameters, 109-110 relative to historical optimization period, 112-114 relative to structural changes, 110-111 optimization step, 76, 87-88 option combinations defined. 252 factors affecting call-to-put ratio, 44-49 long and short combinations, analysis of delta-neutrality strategy, 26-27 in partially directional strategies, 43 payoff functions for, 255 bull/bear spreads, 258-259 calendar spreads, 257-258 straddles. 256 strangles, 256-257

in portfolio analysis of delta-neutrality strategy, 22-24 analysis of partially directional strategies, 57-59 option portfolios capital allocation indicators asymmetry coefficient, 180-181 delta, 180 expected profit, 179 inversely-to-the-premium, 175-176 inversely-to-the-premium versus stock-equivalency, 176-178 profit probability, 179 stock-equivalency, 174-175 VaR, 181-183 weight function for return/risk evaluation, 178-179 capital allocation systems, challenges and compromises, 214-216 features of, 169-170 multidimensional capital allocation system, 172, 204-205 one-dimensional system versus, 206-209 one-dimensional capital allocation system, 170-172 analysis of variance in, 190-191 factors affecting, 183-186

historical volatility in, 186-187 measuring capital concentration, 192-195 multidimensional capital allocation system versus, 206-209 number of days to expiration in, 187-188 number of underlying assets in, 188-190 weight function transformation, 196-204 portfolio capital allocation system, 209, 211 elemental system versus, 173-174, 211-214 option strategies, payoff functions for. 255 bull/bear spreads, 258-259 calendar spreads, 257-258 straddles. 256 strangles, 256-257 option trading strategies limited options life span, 2-3 nonlinearity and options evaluation, 1-2 option diversity, 3 options, linear assets versus, xvii order execution simulation (in backtesting systems), 228 commissions, 231 price modeling, 230-231 volume modeling, 229

out-of-sample testing, 232-233 out-of-the-money, defined, 252 overfitting problem, 234-236

Р

parameter values, determining acceptable range of, 76, 85-87 parametric optimization, 73-75. See also optimization Pareto method, 172 in multicriteria optimization, 99-102 partially directional strategies, xvii basic form of, 42-43 call-to-put ratio, 40-42 factors affecting, 44-49 delta-neutrality applied to, 49-57 delta-neutrality strategy versus. 34 embedding forecast in strategy structure, 36-40 features of, 35 portfolio structure analysis, 57-61 payoff functions call-to-put ratio in portfolio, 40-42 factors affecting, 44-49 defined. 253 for option combinations, 255 bull/bear spreads, 258-259 calendar spreads, 257-258 straddles, 256 strangles, 256-257 in option portfolios, 169 for separate put/call options, 254-255

percentage of profitable trades as objective function effect on optimization space, 90 relationship with maximum drawdown, 93 relationship with profit, 92 performance evaluation indicators (in backtesting systems), 236 backtesting example, 242-245 characteristics of return, 237-238 consistency, 241 maximum drawdown, 238-239 profit/loss factor, 240-241 Sharpe coefficient, 239-240 single events, 236 unit of time frame, 236 points of delta-neutrality, 6-10 in calm versus volatile markets, 10-11.13 quantitative characteristics of, 14-21 polymodal optimization, 76 polymodal optimization space, 82 portfolio asymmetry, analysis of partially directional strategies, 60 portfolio capital allocation approach, 173-174, 209-211 elemental system versus, 211-214 portfolio construction capital allocation indicators asymmetry coefficient, 180-181 delta. 180 expected profit, 179

inversely-to-the-premium, 175-176 inversely-to-the-premium versus stock-equivalency, 176-178 profit probability, 179 stock-equivalency, 174-175 VaR, 181-183 weight function for return/risk evaluation, 178-179 capital allocation systems, challenges and compromises, 214-216 classical portfolio theory, 168-169 option portfolios, features of, 169-170 multidimensional capital allocation system, 204-205 one-dimensional system versus, 206-209 one-dimensional capital allocation system analysis of variance in, 190-191 factors affecting, 183-186 historical volatility in, 186-187 measuring capital concentration, 192-195 multidimensional system versus, 206-209 number of days to expiration in, 187-188

number of underlying assets in, 188-190 weight function transformation, 196-204 option portfolios multidimensional capital allocation system, 172 one-dimensional capital allocation system, 170-172 portfolio versus elemental approach to capital allocation, 173-174 portfolio capital allocation system, 209-211 elemental system versus, 211-214 portfolio structure at delta-neutrality boundaries. 62-65 portfolio structure analysis of delta-neutrality strategy, 21-34 long and short combinations, 26-27 loss probability, 31-33 number of combinations in portfolio, 22-24 number of underlying assets in portfolio, 24-25 portfolio asymmetry, 29-30 straddles and strangles, 28-29 VaR, 33-34 of partially directional strategies, 57-61

position closing signals in delta-neutral strategy, 4 in partially directional strategies, 42 position opening signals in delta-neutral strategy, 4 in partially directional strategies, 42 position opening/closing signals, generating (in backtesting systems), 225 filtration of signals, 227-228 functionals development/ evaluation, 226-227 principles of, 225-226 premium defined, 251 inversely-to-the-premium (capital allocation indicator), 175-176 stock-equivalency versus, 176-178 price forecasts, 35 call-to-put ratio in portfolio, 40-42 factors affecting, 44-49 delta-neutrality applied to, 49-57 embedding in strategy structure, 36-40 price modeling (in backtesting systems), 230-231 profit concave versus convex weight function comparison, 200-202 as objective function effect on optimization space, 89

relationship with maximum drawdown, 92 relationship with percentage of profitable trades, 92 relationship with Sharpe coefficient, 91 one-dimensional versus multidimensional capital allocation systems, 206-208 portfolio versus elemental capital allocation systems, 211-213 profit probability (capital allocation indicator), 179 profit/loss factor, 240-241 put options defined, 251 payoff functions, 254-255

Q–R

quantitative characteristics of deltaneutrality boundaries, 14-21
quantitative characteristics analysis, 244-245
random search optimization method, 131-133
range of acceptable values, determining, 76, 85-87
rational approach to automated trading system development, xix-xxx
recurrent calculations in historical database (in backtesting systems), 221-222
regression analysis, 154 reliability of data in historical database (in backtesting systems), 222-224 requirements in delta-neutral strategy, 5 restrictions in delta-neutral strategy, 5 rho, 138, 253 risk, lack of definition for, 135 risk evaluation effectiveness of index delta, 146-149 linear financial instruments. 136-137 nonlinear financial instruments. 138-139 risk indicators, 139 asymmetry coefficient, 157-159 establishing risk management systems, 165-166 index delta, 141 analysis of effectiveness at different time horizons. 150-156 analysis of effectiveness in risk evaluation, 146-149 analytical method of calculation, 142-143 applicability of, 156-157 calculation algorithm, 141-142 example of calculation, 144-146 interrelationships between, 161 correlation analysis, 162-165 testing, 161 loss probability, 159-160 VaR (Value at Risk), 140-141

risk management in delta-neutral strategy, 5 establishing risk indicators, 165-166 the Greeks, 169 in partially directional strategies, 43 robustness of optimal solution, 82, 102 averaging adjacent cells, 103-104 defined, 75 ratio of mean to standard error, 104-105 surface geometry, 106-108 Rosenbrock optimization method, 120-123, 129 rotating coordinates optimization method, 120-123

S

scientific approach to automated trading system development, xviii second level of capital management systems, 167 selecting optimal delta-neutral portfolio, 67-72 selective convolution, 97 Sharpe coefficient, 239-240 as objective function effect on optimization space, 90 relationship with profit, 91 short calendar spreads, 257 short combinations analysis of delta-neutrality strategy, 26-27

factors affecting call-to-put ratio, 44-49 in portfolio, analysis of partially directional strategies, 58-59 short options, payoff functions, 254-255 short straddles. 256 short strangles, 256 signal-generation indicators in delta-neutral strategy, 4 signals generation in backtesting systems, 225 filtration of signals, 227-228 functionals development/ evaluation, 226-227 principles of, 225-226 in delta-neutral strategy, 4 simplex search optimization method, 123-127 simulation of order execution (in backtesting systems), 228 commissions, 231 price modeling, 230-231 volume modeling, 229 single events in performance evaluation, 236 slippage, 230 smoothing, advantages of, 88 smoothness of optimization space, 77 spreads, xvii standard deviation of asset returns in risk evaluation, 136

standard error, ratio to mean, 104-105

steadiness of optimization space, 77, 108-109 relative to fixed parameters, 109-110 relative to historical optimization period, 112-114 relative to structural changes, 110-111 stock-equivalency (capital allocation indicator), 5, 174-175 inversely-to-the-premium versus, 176-178 straddles analysis of delta-neutrality strategy, 28-29 payoff functions, 256 strangles analysis of delta-neutrality strategy, 28-29 payoff functions, 256-257 strike price, defined, 251 strikes range index, 14-17, 51-52 structural changes, steadiness of optimization space, 110-111 structural optimization, defined, 73 surface geometry, determining robustness of optimal solution, 106-108 survival bias problem, 218 synchronization, 219 synthetic assets strategies, xvi

Т

technical analysis for price forecasts. 35 testing risk indicator interrelationships, 161. See also backtesting systems theta, 138, 253 three-dimensional optimization, 77 time decay, defined, 252 time horizons, effectiveness of index delta, 150-156 time value, defined, 252 transformation of weight function, 196-204 transitivity in multicriteria optimization, 96-97 two-dimensional optimization, 77,83-85

U

unconditional optimization, 74 underlying assets in one-dimensional capital allocation system, 188-190 unimodal optimization, 76 unimodal optimization space, 82 unit of time frame in performance evaluation, 236

V

validity of data in historical database (in backtesting systems), 222-224 Value at Risk. *See* VaR values, determining acceptable range of, 76, 85-87 VaR (Value at Risk), 181-183 analysis of delta-neutrality strategy, 33-34 calculation methods, 137 drawbacks to, 140-141 in portfolio, analysis of partially directional strategies, 61 in risk evaluation, 136 variation coefficients, 181, 183 vega, 138-139, 253 vendors for historical database (in backtesting systems), 218 visual analysis of backtesting results, 242-244 volatile markets delta-neutrality boundaries in, 10-13delta-neutrality boundaries in partially directional strategies, 51-52 historical volatility in risk evaluation, 136 portfolio structure analysis long and short combinations, 26-27 loss probability, 31-33 number of combinations in portfolio, 22-24 number of underlying assets in portfolio, 24-25

portfolio asymmetry, 29-30 straddles and strangles, 28-29 VaR, 33-34 volume modeling (in backtesting systems), 229

W–Z

walk-forward analysis, 235 weight function for return/risk evaluation, 178-179 transformation of, 196-204