## WILEY FINANCE

## FIFTH EDITION

Sample FRM® Review Test CD Included

# Financial Risk Manager Handbook

- Learn the essentials of managing market, credit, operational, and liquidity risk
   Learn the essentials of investment management and hedge fund risk
   Learn about structured products, futures, options, and other derivative instruments
   Identify regulatory and legal issues
   Ideal for self-instruction and in-house training in financial risk management
  - ▶ The official reference book for GARP's FRM<sup>®</sup> certification program

# PHILIPPE JORION





RISK MANAGEMENT LIBRARY

# Financial Risk Manager Handbook

Fifth Edition

Founded in 1807, John Wiley & Sons is the oldest independent publishing company in the United States. With offices in North America, Europe, Australia, and Asia, Wiley is globally committed to developing and marketing print and electronic products and services for our customers' professional and personal knowledge and understanding.

The Wiley Finance series contains books written specifically for finance and investment professionals as well as sophisticated individual investors and their financial advisors. Book topics range from portfolio management to e-commerce, risk management, financial engineering, valuation, and financial instrument analysis, as well as much more.

For a list of available titles, visit our Web site at www.WileyFinance.com.

# Financial Risk Manager Handbook

Fifth Edition

## PHILIPPE JORION GARP



Copyright © 2009 by Philippe Jorion, except for FRM sample questions, which are copyright 1997–2009 by GARP. The FRM designation is a GARP trademark. All rights reserved. Published by John Wiley & Sons, Inc., Hoboken, New Jersey. Published simultaneously in Canada.

Designations used by companies to distinguish their products are often claimed as trademarks. In all instances where John Wiley & Sons, Inc. is aware of a claim, the product names appear in initial capital or all capital letters. Readers, however, should contact the appropriate companies for more complete information regarding trademarks and registration.

No part of this publication may be reproduced, stored in a retrieval system, or transmitted in any form or by any means, electronic, mechanical, photocopying, recording, scanning, or otherwise, except as permitted under Section 107 or 108 of the 1976 United States Copyright Act, without either the prior written permission of the Publisher, or authorization through payment of the appropriate per-copy fee to the Copyright Clearance Center, Inc., 222 Rosewood Drive, Danvers, MA 01923, (978) 750-8400, fax (978) 646-8600, or on the web at www.copyright.com. Requests to the Publisher for permission should be addressed to the Permissions Department, John Wiley & Sons, Inc., 111 River Street, Hoboken, NJ 07030, (201) 748-6011, fax (201) 748-6008, or online at http://www.wiley.com/go/permissions.

Limit of Liability/Disclaimer of Warranty: While the publisher and author have used their best efforts in preparing this book, they make no representations or warranties with respect to the accuracy or completeness of the contents of this book and specifically disclaim any implied warranties of merchantability or fitness for a particular purpose. No warranty may be created or extended by sales representatives or written sales materials. The advice and strategies contained herein may not be suitable for your situation. You should consult with a professional where appropriate. Neither the publisher nor author shall be liable for any loss of profit or any other commercial damages, including but not limited to special, incidental, consequential, or other damages.

For general information on our other products and services or for technical support, please contact our Customer Care Department within the United States at (800) 762-2974, outside the United States at (317) 572-3993 or fax (317) 572-4002.

Wiley also publishes its books in a variety of electronic formats. Some content that appears in print may not be available in electronic books. For more information about Wiley products, visit our web site at www.wiley.com.

#### Library of Congress Cataloging-in-Publication Data:

Jorion, Philippe, 1955– Financial risk manager handbook / Philippe Jorion – 5th ed. p. cm. – (Wiley finance series) Includes index. ISBN 978-0-470-47961-2 (paper/CD-ROM)
1. Financial risk management. 2. Risk management. 3. Corporate–Finance. I. Title. HD61.J67 2009 332.64'5–dc22

2009008330

Printed in the United States of America

10 9 8 7 6 5 4 3 2 1

## Contents

Preface	ix
About the Author	xi
About GARP	xiii
Introduction	xv
PART ONE	-
Quantitative Analysis	
CHAPTER 1 Bond Fundamentals	3
CHAPTER 2 Fundamentals of Probability	31
CHAPTER 3 Fundamentals of Statistics	67
CHAPTER 4 Monte Carlo Methods	89
PART TWO	
Capital Markets	
CHAPTER 5 Introduction to Derivatives	111
CHAPTER 6 Options	127
CHAPTER 7 Fixed-Income Securities	161
CHAPTER 8 Fixed-Income Derivatives	195
CHAPTER 9 Equity, Currency, and Commodity Markets	217

#### PART THREE

Market Risk Management	
CHAPTER 10 Introduction to Market Risk	247
CHAPTER 11 Sources of Market Risk	273
CHAPTER 12 Hedging Linear Risk	297
CHAPTER 13 Nonlinear Risk: Options	315
CHAPTER 14 Modeling Risk Factors	341
CHAPTER 15 VAR Methods	359
PART FOUR	
Investment Risk Management	
CHAPTER 16 Portfolio Management	383
CHAPTER 17 Hedge Fund Risk Management	401
PART FIVE	
Credit Risk Management	
CHAPTER 18 Introduction to Credit Risk	431
CHAPTER 19 Measuring Actuarial Default Risk	451
CHAPTER 20 Measuring Default Risk from Market Prices	479
CHAPTER 21 Credit Exposure	499
CHAPTER 22 Credit Derivatives and Structured Products	531
CHAPTER 23 Managing Credit Risk	561

#### PART SIX

#### Legal, Operational, and Integrated Risk Management **CHAPTER 24** 587 **Operational Risk CHAPTER 25** 607 **Liquidity Risk CHAPTER 26 Firm-Wide Risk Management** 623 **CHAPTER 27** Legal Issues 643 PART SEVEN **Regulation and Compliance CHAPTER 28 Regulation of Financial Institutions** 657 **CHAPTER 29 The Basel Accord** 667 **CHAPTER 30 The Basel Market Risk Charge** 699 About the CD-ROM 715 Index 717

## Preface

The *Financial Risk Manager Handbook* provides the core body of knowledge for financial risk managers. Risk management has evolved rapidly over the past decade and has become an indispensable function in many institutions.

This *Handbook* was originally written to provide support for candidates taking the FRM examination administered by GARP. As such, it reviews a wide variety of practical topics in a consistent and systematic fashion. It covers quantitative methods and capital markets, as well as market, credit, operational, and integrated risk management. It also discusses regulatory and legal issues essential to risk professionals.

This edition has been thoroughly updated to reflect recent developments in financial markets. The unprecedented losses incurred by many institutions have raised questions about risk management practices. These issues are now addressed in various parts of the book, which also include lessons from recent regulatory reports. The securitization process and structured credit products are critically examined. A new chapter on liquidity risk has been added, given the importance of this risk during the recent crisis. Finally, this *Handbook* incorporates the latest questions from the FRM examinations.

Modern risk management systems cut across the entire organization. This breadth is reflected in the subjects covered in this *Handbook*. The book was designed to be self-contained, but only for readers who already have some exposure to financial markets. To reap maximum benefit from this book, readers should have taken the equivalent of an MBA-level class on investments.

Finally, I want to acknowledge the help received in writing this *Handbook*. In particular, I thank the numerous readers who shared comments on previous editions. Any comment or suggestion for improvement will be welcome. This feedback will help us to maintain the high quality of the FRM designation.

Philippe Jorion February 2009

## **About the Author**

Philippe Jorion is a Professor of Finance at the Paul Merage School of Business at the University of California at Irvine. He has also taught at Columbia University, Northwestern University, the University of Chicago, and the University of British Columbia. He holds an M.B.A. and a Ph.D. from the University of Chicago and a degree in engineering from the University of Brussels. He is also a managing director at Pacific Alternative Asset Management Company (PAAMCO), a global fund of hedge funds.

Dr. Jorion is the author of more than 90 publications directed to academics and practitioners on the topics of risk management and international finance. He has also written a number of books, including *Big Bets Gone Bad: Derivatives and Bankruptcy in Orange County*, the first account of the largest municipal failure in U.S. history, and *Value at Risk: The New Benchmark for Managing Financial Risk*, which is aimed at finance practitioners and has become an industry standard.

Philippe Jorion is a frequent speaker at academic and professional conferences. He is on the editorial board of a number of finance journals and was editor in chief of the *Journal of Risk*.

## **About GARP**

**F**ounded in 1996, the Global Association of Risk Professionals (GARP) is the leading not-for-profit association for world-class financial risk certification, education, and training with close to 100,000 members representing 167 countries. With deep expertise and a strong reputation, GARP sets global standards and creates risk management programs valued worldwide. All GARP programs are developed with input from experts around the world to ensure that concepts and content reflect globally accepted practices.

GARP is dedicated to advancing the risk profession. For more information about GARP, please visit www.garp.com.

#### FINANCIAL RISK MANAGER (FRM<sup>®</sup>) CERTIFICATION

The benchmark FRM designation is the globally accepted risk management certification for financial risk professionals. The FRM objectively measures competency in the risk management profession based on globally accepted standards. With a compound annual growth rate of 25 percent over the past seven years, the FRM program has experienced significant growth in every financial center around the world. Now 16,000+ individuals hold the FRM designation in over 90 countries. In addition, organizations with five or more FRM registrants grew from 105 in 2003 to 424 in 2008, further demonstrating the FRM program's global acceptance.

The FRM Continuing Professional Education (CPE) program, to be offered starting in 2009 exclusively for certified FRM holders, provides the perspective and framework needed to further develop competencies in the ever-evolving field of risk management.

For more information about the FRM program, please visit www.garp.com/ frmexam.

#### **OTHER GARP CERTIFICATIONS**

#### International Certificate in Banking Risk and Regulation (ICBRR)

The ICBRR allows individuals to expand their knowledge and understanding of the various risks, regulations, and supervisory requirements banks must face in today's economy, with emphasis on the Basel II Accord. This certificate is ideal for employees who are not professional risk managers but who have a strong need to understand risk concepts. The ICBRR program is designed for employees in nonrisk departments such as internal audit, accounting, information technology (IT), legal, compliance, and sales, acknowledging that everyone in the organization is a risk manager!

#### **Certificate in Energy Risk Management**

The Certificate in Energy Risk Management provides individuals with a comprehensive and cross-product understanding of the physical and financial marketplaces relating to crude oil, natural gas, liquefied natural gas, and electricity/power. This program is valuable for anyone working in or servicing the energy field and requiring an understanding of the physical and financial markets, how they interrelate, and the risks involved. This program will launch in 2Q 2009.

#### Certificate in Risk Management for Islamic Financial Institutions

This certificate is under development by a practice oversight committee of Islamic finance experts from around the globe. The program will cover the risk management methodologies specific to Sharia'a-compliant financial products and will be the only one of its kind anywhere in the world.

#### **GARP DIGITAL LIBRARY**

As the world's largest digital library dedicated to financial risk management, the GARP Digital Library (GDL) is the hub for risk management education and research material. The library's unique iReadings<sup>TM</sup> allow users to download individual chapters of books, saving both time and money. There are over 1,000 readings available from 12 different publishers. The GDL collection offers readings to meet the needs of anyone interested in risk management.

For more information, please visit www.garpdigitallibrary.org.

#### GARP EVENTS AND NETWORKING

GARP hosts major conventions throughout the world, where risk professionals come together to share knowledge, network, and learn from leading experts in the field. Conventions are bookended with interactive workshops that provide practical insights and case studies presented by the industry's leading practitioners.

GARP regional chapters provide an opportunity for financial risk professionals to network and share new trends and discoveries in risk management. Each one of our 52 chapters holds several meetings each year, in some locations more often, focusing on issues of importance to the risk management community, either globally or locally.

## Introduction

**G**ARP's formal mission is to be the leading professional association for financial risk managers, managed by and for its members and dedicated to the advancement of the risk profession through education, training, and the promotion of best practices globally. As a part of delivering on that mission, GARP has again teamed with Philippe Jorion to produce the fifth edition of the *Financial Risk Manager Handbook*.

The *Handbook* follows GARP's FRM Committee's published FRM Study Guide, which sets forth primary topics and subtopics covered in the FRM exam. The topics are selected by the FRM Committee as being representative of the theories and concepts utilized by risk management professionals as they address current issues.

Over the years the Study Guide has taken on an importance far exceeding its initial intent of providing guidance for FRM candidates. The Study Guide is now being used by universities, educators, and executives around the world to develop graduate-level business and finance courses, as a reference list for purchasing new readings for personal and professional libraries, as an objective outline to assess the risk management qualifications of an employee or a job applicant, and as guidance on the important trends currently affecting the financial risk management profession.

Given the expanded and dramatically growing recognition of the financial risk management profession globally, the *Handbook* has similarly assumed a natural and advanced role beyond its original purpose. It has now become the primary reference manual for risk professionals, academicians, and executives around the world. Professional risk managers must be well versed in a wide variety of risk-related concepts and theories, and must also keep themselves up-to-date with a rapidly changing marketplace. The *Handbook* is designed to allow them to do just that. It provides a financial risk management practitioner with the latest thinking and approaches to financial risk-related issues. It also provides coverage of advanced topics with questions and tutorials to enhance the reader's learning experience.

This fifth edition of the *Handbook* includes revised coverage of the primary topic areas covered by the FRM examination. Importantly, this edition also includes the latest lessons from the recent credit crisis, as well as new and more recent sample FRM questions.

The *Handbook* continues to keep pace with the dynamic financial risk profession while simultaneously offering serious risk professionals an excellent and cost-effective tool to keep abreast of the latest issues affecting the global risk management community. Developing credibility and global acceptance for a professional certification program is a lengthy and complicated process. When GARP first administered its FRM exam in 1997, the concept of a professional risk manager and a global certification relating to that person's skill set was more theory than reality. That has now completely changed, as the number of current FRM holders exceeds 16,000.

The FRM is now the benchmark for a financial risk manager anywhere in the world. Professional risk managers having earned the FRM credential are globally recognized as having achieved a level of professional competency and a demonstrated ability to dynamically measure and manage financial risk in a real-world setting in accordance with global standards.

GARP is proud to continue to make this *Handbook* available to financial risk professionals around the world. Philippe Jorion, a preeminent risk management professional, has again compiled an exceptional reference book. Supplemented by an interactive test question CD, this *Handbook* is a requirement for any risk professional's library.

Global Association of Risk Professionals February 2009

# **One**

## **Quantitative Analysis**

## CHAPTER

## **Bond Fundamentals**

**R**isk management starts with the pricing of assets. The simplest assets to study are regular, fixed-coupon bonds. Because their cash flows are predetermined, we can translate their stream of cash flows into a present value by discounting at a fixed interest rate. Thus the valuation of bonds involves understanding compounded interest, discounting, as well as the relationship between present values and interest rates.

Risk management goes one step further than pricing, however. It examines potential changes in the price of assets as the interest rate changes. In this chapter, we assume that there is a single interest rate, or yield, that is used to price the bond. This will be our fundamental risk factor. This chapter describes the relationship between bond prices and yields and presents indispensable tools for the management of fixed-income portfolios.

This chapter starts our coverage of quantitative analysis by discussing bond fundamentals. Section 1.1 reviews the concepts of discounting, present values, and future values. Section 1.2 then plunges into the price-yield relationship. It shows how the Taylor expansion rule can be used to relate movements in bond prices to those in yields. This Taylor expansion rule, however, covers much more than bonds. It is a building block of risk measurement methods based on local valuation, as we shall see later. Section 1.3 then presents an economic interpretation of duration and convexity.

The reader should be forewarned that this chapter, like many others in this handbook, is rather compact. This chapter provides a quick review of bond fundamentals with particular attention to risk measurement applications. By the end of this chapter, however, the reader should be able to answer advanced FRM questions on bond mathematics.

#### **1.1 DISCOUNTING, PRESENT, AND FUTURE VALUE**

An investor considers a zero-coupon bond that pays \$100 in 10 years. Assume that the investment is guaranteed by the U.S. government, and that there is no credit risk. So, this is a default-free bond, which is exposed to market risk only. Because the payment occurs at a future date, the current value of the investment is surely less than an up-front payment of \$100.

To value the payment, we need a discounting factor. This is also the interest rate, or more simply the yield. Define  $C_t$  as the cash flow at time t and the

discounting factor as y. We define T as the number of periods until maturity, e.g., number of years, also known as **tenor**. The **present value** (PV) of the bond can be computed as

$$PV = \frac{C_T}{(1+y)^T}$$
(1.1)

For instance, a payment of  $C_T =$ \$100 in 10 years discounted at 6 percent is only worth \$55.84 now. So, all else fixed, the market value of zero-coupon bonds decreases with longer maturities. Also, keeping *T* fixed, the value of the bond decreases as the yield increases.

Conversely, we can compute the future value (FV) of the bond as

$$FV = PV \times (1+y)^T \tag{1.2}$$

For instance, an investment now worth PV = \$100 growing at 6 percent will have a future value of FV = \$179.08 in 10 years.

Here, the yield has a useful interpretation, which is that of an internal rate of return on the bond, or annual growth rate. It is easier to deal with rates of returns than with dollar values. Rates of return, when expressed in percentage terms and on an annual basis, are directly comparable across assets. An annualized yield is sometimes defined as the effective annual rate (EAR).

It is important to note that the interest rate should be stated along with the method used for compounding. Annual compounding is very common. Other conventions exist, however. For instance, the U.S. Treasury market uses semiannual compounding. Define in this case  $y^{S}$  as the rate based on semiannual compounding. To maintain comparability, it is expressed in annualized form, i.e., after multiplication by 2. The number of periods, or semesters, is now 2*T*. The formula for finding  $y^{S}$  is

$$PV = \frac{C_T}{(1+y^S/2)^{2T}}$$
(1.3)

For instance, a Treasury zero-coupon bond with a maturity of T = 10 years would have 2T = 20 semiannual compounding periods. Comparing with (1.1), we see that

$$(1+y) = (1+y^{s}/2)^{2}$$
(1.4)

Continuous compounding is often used when modeling derivatives. It is the limit of the case where the number of compounding periods per year increases to infinity. The continuously compounded interest rate  $y^{C}$  is derived from

$$PV = C_T \times e^{-y^C T} \tag{1.5}$$

where  $e^{(\cdot)}$ , sometimes noted as  $exp(\cdot)$ , represents the exponential function.

Note that in all of these Equations (1.1), (1.3), and (1.5), the present value and future cash flows are identical. Because of different compounding periods, however, the yields will differ. Hence, the compounding period should always be stated.

#### **Example: Using Different Discounting Methods**

Consider a bond that pays \$100 in 10 years and has a present value of \$55.8395. This corresponds to an annually compounded rate of 6.00% using  $PV = C_T/(1+y)^{10}$ , or  $(1+y) = (C_T/PV)^{1/10}$ .

This rate can be transformed into a semiannual compounded rate, using  $(1 + y^S/2)^2 = (1 + y)$ , or  $y^S/2 = (1 + y)^{1/2} - 1$ , or  $y^S = ((1 + 0.06)^{(1/2)} - 1) \times 2 = 0.0591 = 5.91\%$ . It can be also transformed into a continuously compounded rate, using  $\exp(y^C) = (1 + y)$ , or  $y^C = \ln(1 + 0.06) = 0.0583 = 5.83\%$ .

Note that as we increase the frequency of the compounding, the resulting rate decreases. Intuitively, because our money works harder with more frequent compounding, a lower investment rate will achieve the same payoff at the end.

#### **KEY CONCEPT**

For fixed present value and cash flows, increasing the frequency of the compounding will decrease the associated yield.

#### EXAMPLE 1.1: FRM EXAM 2002—QUESTION 48

An investor buys a Treasury bill maturing in 1 month for \$987. On the maturity date the investor collects \$1,000. Calculate effective annual rate (EAR).

- **a.** 17.0%
- **b.** 15.8%
- **c.** 13.0%
- **d.** 11.6%

#### EXAMPLE 1.2: FRM EXAM 2002—QUESTION 51

Consider a savings account that pays an annual interest rate of 8%. Calculate the amount of time it would take to double your money. Round to the nearest year.

- a. 7 years
- b. 8 years
- c. 9 years
- **d.** 10 years

#### **1.2 PRICE-YIELD RELATIONSHIP**

#### 1.2.1 Valuation

The fundamental discounting relationship from Equation (1.1) can be extended to any bond with a fixed cash-flow pattern. We can write the present value of a bond *P* as the discounted value of future cash flows:

$$P = \sum_{t=1}^{T} \frac{C_t}{(1+y)^t}$$
(1.6)

where:  $C_t$  = the cash flow (coupon or principal) in period *t* 

t = the number of periods (e.g., half-years) to each payment

T = the number of periods to final maturity

y = the discounting factor per period (e.g.,  $y^{S}/2$ )

A typical cash-flow pattern consists of a fixed coupon payment plus the repayment of the principal, or **face value** at expiration. Define *c* as the coupon *rate* and *F* as the face value. We have  $C_t = cF$  prior to expiration, and at expiration, we have  $C_T = cF + F$ . The appendix reviews useful formulas that provide closed-form solutions for such bonds.

When the coupon rate c precisely matches the yield y, using the same compounding frequency, the present value of the bond must be equal to the face value. The bond is said to be a **par bond**. If the coupon is greater than the yield, the price must be greater than the face value, which means that this is a **premium bond**. Conversely, if the coupon is lower, or even zero for a zero-coupon bond, the price must be less than the face value, which means that this is a **discount bond**.

Equation (1.6) describes the relationship between the yield y and the value of the bond P, given its cash-flow characteristics. In other words, the value P can also be written as a nonlinear function of the yield y:

$$P = f(y) \tag{1.7}$$

Conversely, we can set P to the current market price of the bond, including any accrued interest. From this, we can compute the "implied" yield that will solve this equation.

Figure 1.1 describes the price-yield function for a 10-year bond with a 6% annual coupon. In risk management terms, this is also the relationship between the payoff on the asset and the risk factor. At a yield of 6%, the price is at par, P =\$100. Higher yields imply lower prices. This is an example of a **payoff function**, which links the price to the underlying risk factor.

Over a wide range of yield values, this is a highly nonlinear relationship. For instance, when the yield is zero, the value of the bond is simply the sum of cash



FIGURE 1.1 Price-Yield Relationship

flows, or \$160 in this case. When the yield tends to very large values, the bond price tends to zero. For small movements around the initial yield of 6%, however, the relationship is quasilinear.

There is a particularly simple relationship for consols, or perpetual bonds, which are bonds making regular coupon payments but with no redemption date. For a consol, the maturity is infinite and the cash flows are all equal to a fixed percentage of the face value,  $C_t = C = cF$ . As a result, the price can be simplified from Equation (1.6) to

$$P = cF\left[\frac{1}{(1+y)} + \frac{1}{(1+y)^2} + \frac{1}{(1+y)^3} + \cdots\right] = \frac{c}{y}F$$
(1.8)

as shown in the appendix. In this case, the price is simply proportional to the inverse of the yield. Higher yields lead to lower bond prices, and vice versa.

#### **Example: Valuing a Bond**

Consider a bond that pays \$100 in 10 years and a 6% annual coupon. Assume that the next coupon payment is in exactly one year. What is the market value if the yield is 6%? If it falls to 5%?

The bond cash flows are  $C_1 = \$6$ ,  $C_2 = \$6$ , ...,  $C_{10} = \$106$ . Using Equation (1.6) and discounting at 6%, this gives the present value of cash flows of \$5.66, \$5.34, ..., \$59.19, for a total of \$100.00. The bond is selling at par. This is logical because the coupon is equal to the yield, which is also annually compounded. Alternatively, discounting at 5% leads to a price of \$107.72.

#### **1.2.2 Taylor Expansion**

Let us say that we want to see what happens to the price if the yield changes from its initial value, called  $y_0$ , to a new value,  $y_1 = y_0 + \Delta y$ . Risk management is all about assessing the effect of changes in risk factors such as yields on asset values. Are there shortcuts to help us with this?

We could recompute the new value of the bond as  $P_1 = f(y_1)$ . If the change is not too large, however, we can apply a very useful shortcut. The nonlinear relationship can be approximated by a **Taylor expansion** around its initial value<sup>1</sup>

$$P_1 = P_0 + f'(y_0)\Delta y + \frac{1}{2}f''(y_0)(\Delta y)^2 + \cdots$$
 (1.9)

where  $f'(\cdot) = \frac{dP}{dy}$  is the first derivative and  $f''(\cdot) = \frac{d^2P}{dy^2}$  is the second derivative of the function  $f(\cdot)$  valued at the starting point.<sup>2</sup> This expansion can be generalized to situations where the function depends on two or more variables. For bonds, the first derivative is related to the *duration* measure, and the second to *convexity*.

Equation (1.9) represents an infinite expansion with increasing powers of  $\Delta y$ . Only the first two terms (linear and quadratic) are ever used by finance practitioners. They provide a good approximation to changes in prices relative to other assumptions we have to make about pricing assets. If the increment is very small, even the quadratic term will be negligible.

Equation (1.9) is fundamental for risk management. It is used, sometimes in different guises, across a variety of financial markets. We will see later that this Taylor expansion is also used to approximate the movement in the value of a derivatives contract, such as an option on a stock. In this case, Equation (1.9) is

$$\Delta P = f'(S)\Delta S + \frac{1}{2}f''(S)(\Delta S)^2 + \cdots$$
(1.10)

where S is now the price of the underlying asset, such as the stock. Here, the first derivative f'(S) is called *delta*, and the second f''(S), *gamma*.

The Taylor expansion allows easy aggregation across financial instruments. If we have  $x_i$  units (numbers) of bond *i* and a total of *N* different bonds in the portfolio, the portfolio derivatives are given by

$$f'(y) = \sum_{i=1}^{N} x_i f'_i(y)$$
(1.11)

<sup>&</sup>lt;sup>1</sup>This is named after the English mathematician Brook Taylor (1685–1731), who published this result in 1715. The full recognition of the importance of this result only came in 1755 when Euler applied it to differential calculus.

<sup>&</sup>lt;sup>2</sup> This first assumes that the function can be written in polynomial form as  $P(y + \Delta y) = a_0 + a_1 \Delta y + a_2(\Delta y)^2 + \cdots$ , with unknown coefficients  $a_0, a_1, a_2$ . To solve for the first, we set  $\Delta y = 0$ . This gives  $a_0 = P_0$ . Next, we take the derivative of both sides and set  $\Delta y = 0$ . This gives  $a_1 = f'(y_0)$ . The next step gives  $2a_2 = f''(y_0)$ . Here, the term "derivatives" takes the usual mathematical interpretation, and has nothing to do with *derivatives products* such as options.

#### **1.3 BOND PRICE DERIVATIVES**

For fixed-income instruments, the derivatives are so important that they have been given a special name.<sup>3</sup> The negative of the first derivative is the **dollar duration** (**DD**):

$$f'(y_0) = \frac{dP}{dy} = -D^* \times P_0$$
 (1.12)

where  $D^*$  is called the modified duration. Thus, dollar duration is

$$DD = D^* \times P_0 \tag{1.13}$$

where the price  $P_0$  represent the *market* price, including any accrued interest. Sometimes, risk is measured as the **dollar value of a basis point (DVBP)**,

$$DVBP = DD \times \Delta y = [D^* \times P_0] \times 0.0001$$
(1.14)

with 0.0001 representing an interest rate change of one basis point (bp) or one hundredth of a percent. The **DVBP**, sometimes called the **DV01**, measures can be easily added up across the portfolio.

The second derivative is the dollar convexity (DC):

$$f''(y_0) = \frac{d^2 P}{dy^2} = C \times P_0 \tag{1.15}$$

where *C* is called the **convexity**.

For fixed-income instruments with known cash flows, the price-yield function is known, and we can compute analytical first and second derivatives. Consider, for example, our simple zero-coupon bond in Equation (1.1) where the only payment is the face value,  $C_T = F$ . We take the first derivative, which is

$$\frac{dP}{dy} = \frac{d}{dy} \left[ \frac{F}{(1+y)^T} \right] = (-T) \frac{F}{(1+y)^{T+1}} = -\frac{T}{(1+y)} P$$
(1.16)

Comparing with Equation (1.12), we see that the modified duration must be given by  $D^* = T/(1 + y)$ . The conventional measure of **duration** is D = T, which does not include division by (1 + y) in the denominator. This is also called **Macaulay duration**. Note that duration is expressed in periods, like T. With annual compounding, duration is in years. With semiannual compounding, duration is in semesters. It then has to be divided by two for conversion to years. Modified

<sup>&</sup>lt;sup>3</sup>Note that this chapter does not present duration in the traditional textbook order. In line with the advanced focus on risk management, we first analyze the properties of duration as a sensitivity measure. This applies to any type of fixed-income instrument. Later, we will illustrate the usual definition of duration as a weighted average maturity, which applies for fixed-coupon bonds only.

duration  $D^*$  is related to Macaulay duration D

$$D^* = \frac{D}{(1+y)}$$
(1.17)

Modified duration is the appropriate measure of interest rate exposure. The quantity (1 + y) appears in the denominator because we took the derivative of the present value term with discrete compounding. If we use continuous compounding, modified duration is identical to the conventional duration measure. In practice, the difference between Macaulay and modified duration is usually small.

Let us now go back to Equation (1.16) and consider the second derivative, which is

$$\frac{d^2 P}{dy^2} = -(T+1)(-T)\frac{F}{(1+y)^{T+2}} = \frac{(T+1)T}{(1+y)^2} \times P$$
(1.18)

Comparing with Equation (1.15), we see that the convexity is  $C = (T + 1)T/((1 + y)^2)$ . Note that its dimension is expressed in period squared. With semiannual compounding, convexity is measured in semesters squared. It then has to be divided by 4 for conversion to years squared.<sup>4</sup> So, convexity must be positive for bonds with fixed coupons.

Putting together all these equations, we get the Taylor expansion for the change in the price of a bond, which is

$$\Delta P = -[D^* \times P](\Delta y) + \frac{1}{2}[C \times P](\Delta y)^2 + \cdots$$
(1.19)

Therefore duration measures the first-order (linear) effect of changes in yield and convexity the second-order (quadratic) term.

#### Example: Computing the Price Approximation<sup>5</sup>

Consider a 10-year zero-coupon Treasury bond trading at a yield of 6 percent. The present value is obtained as  $P = 100/(1 + 6/200)^{20} = 55.368$ . As is the practice in the Treasury market, yields are semiannually compounded. Thus all computations should be carried out using semesters, after which final results can be converted into annual units.

Here, Macaulay duration is exactly 10 years, as D = T for a zero coupon bond. Its modified duration is  $D^* = 20/(1 + 6/200) = 19.42$  semesters, which is 9.71 years. Its convexity is  $C = 21 \times 20/(1 + 6/200)^2 = 395.89$  semesters

<sup>&</sup>lt;sup>4</sup> This is because the conversion to annual terms is obtained by multiplying the semiannual yield  $\Delta y$  by two. As a result, the duration term must be divided by 2 and the convexity term by 2<sup>2</sup>, or 4, for conversion to annual units.

<sup>&</sup>lt;sup>5</sup> For such examples in this handbook, please note that intermediate numbers are reported with fewer significant digits than actually used in the computations. As a result, using rounded off numbers may give results that differ slightly from the final numbers shown here.

squared, which is 98.97 in years squared. Dollar duration is  $DD = D^* \times P = 9.71 \times \$55.37 = \$537.55$ . The DVBP is  $DVBP = DD \times 0.0001 = \$0.0538$ .

We want to approximate the change in the value of the bond if the yield goes to 7%. Using Equation (1.19), we have  $\Delta P = -[9.71 \times \$55.37](0.01) + 0.5[98.97 \times \$55.37](0.01)^2 = -\$5.375 + \$0.274 = -\$5.101$ . Using the linear term only, the new price is \$55.368 - \$5.375 = \$49.992. Using the two terms in the expansion, the predicted price is slightly higher, at \$55.368 - \$5.375 + \$0.274 = \$50.266.

These numbers can be compared with the exact value, which is \$50.257. The linear approximation has a relative pricing error of -0.53%, which is not bad. Adding a quadratic term reduces this to an error of 0.02% only, which is very small, given typical bid-ask spreads.

More generally, Figure 1.2 compares the quality of the Taylor series approximation. We consider a 10-year bond paying a 6 percent coupon semiannually. Initially, the yield is also at 6 percent and, as a result, the price of the bond is at par, at \$100. The graph compares three lines representing

1.	The actual, exact price	$P = f(y_0 + \Delta y)$
2.	The duration estimate	$P = P_0 - D^* P_0 \Delta y$
3.	The duration and convexity estimate	$P = P_0 - D^* P_0 \Delta y + (1/2) C P_0 (\Delta y)^2$

The actual price curve shows an increase in the bond price if the yield falls and, conversely, a depreciation if the yield increases. This effect is captured by the tangent to the true price curve, which represents the linear approximation based on duration. For small movements in the yield, this linear approximation provides a reasonable fit to the exact price.



FIGURE 1.2 Price Approximation

#### **KEY CONCEPT**

Dollar duration measures the (negative) slope of the tangent to the price-yield curve at the starting point.

For large movements in price, however, the price-yield function becomes more curved and the linear fit deteriorates. Under these conditions, the quadratic approximation is noticeably better.

We should also note that the curvature is away from the origin, which explains the term *convexity* (as opposed to concavity). Figure 1.3 compares curves with different values for convexity. This curvature is beneficial since the second-order effect  $0.5[C \times P](\Delta y)^2$  must be positive when convexity is positive.

As the figure shows, when the yield rises, the price drops but less than predicted by the tangent. Conversely, if the yield falls, the price increases faster than along the tangent. In other words, the quadratic term is always beneficial.

#### **KEY CONCEPT**

Convexity is always positive for regular coupon-paying bonds. Greater convexity is beneficial both for falling and rising yields.

The bond's modified duration and convexity can also be computed directly from numerical derivatives. Duration and convexity cannot be computed directly for some bonds, such as mortgage-backed securities, because their cash flows are uncertain. Instead, the portfolio manager has access to pricing models that can be used to reprice the securities under various yield environments.



FIGURE 1.3 Effect of Convexity