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Results are proved carefully and the key concepts are motivated by concrete examples drawn from financial market models. Students can test their understanding through the large number of exercises that are integral to the text.

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Probability for Finance

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Preface

Mathematical models of financial markets rely in fundamental ways on the concepts and tools of modern probability theory. This book provides a concise but rigorous account of the probabilistic ideas and techniques most commonly used in such models. The treatment is self-contained, requiring only calculus and linear algebra as pre-requisites, and complete proofs are given – some longer constructions and proofs are deferred to the ends of chapters to ensure the smooth flow of key ideas.

New concepts are motivated through examples drawn from finance. The selection and ordering of the material are strongly guided by the applications we have in mind. Many of these applications appear more fully in later volumes of the 'Mastering Mathematical Finance' series, including [SCF], [BSM] and [NMFC]. This volume provides the essential mathematical background of the financial models described in detail there.

In adding to the extensive literature on probability theory we have not sought to provide a comprehensive treatment of the mathematical theory and its manifold applications. We focus instead on the more limited objective of writing a fully rigorous, yet concise and accessible, account of the basic concepts underlying widely used market models. The book should be read in conjunction with its partner volume [SCF], which describes the properties of stochastic processes used in these models.

In the first two chapters we introduce probability spaces, distributions and random variables from scratch. We assume a basic level of mathematical maturity in our description of the principal aspects of measures and integrals, including the construction of the Lebesgue integral and the important convergence results for integrals. Beginning with discrete examples familiar to readers of [DMFM], we motivate each construction by means of specific distributions used in financial modelling. Chapter 3 introduces product measures and random vectors, and highlights the key concept of independence, while Chapter 4 is devoted to a thorough discussion of conditioning, moving from the familiar discrete setting via the properties of inner product spaces and the Radon–Nikodym theorem to the construction of general conditional expectations for integrable random variables. The final chapter explores key limit theorems for sequences of random variables, beginning with orthonormal sequences of square-integrable functions, fol-

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Preface

lowed by a discussion of the relationships between various modes of convergence, and concluding with an introduction to weak convergence and the Central Limit Theorem for independent identically distributed random variables of finite mean and variance.

Concrete examples and the large number of exercises form an integral part of this text. Solutions to the exercises and further material can be found at www.cambridge.org/9781107002494.