

Grundlehren der mathematischen Wissenschaften 104

A Series of Comprehensive Studies in Mathematics

Series editors

M. Berger P. de la Harpe F. Hirzebruch
N.J. Hitchin L. Hörmander A. Kupiainen
G. Lebeau F.-H. Lin B.C. Ngô M. Ratner
D. Serre Ya.G. Sinai N.J.A. Sloane
A.M. Vershik M. Waldschmidt

Editor-in-Chief

A. Chenciner J. Coates S.R.S. Varadhan

For further volumes:
<http://www.springer.com/series/138>

Kai Lai Chung

Markov Chains

With Stationary Transition Probabilities

Second Edition

 Springer

Kai Lai Chung (1917–2009)
Stanford University, USA

ISSN 0072-7830

ISBN-13: 978-3-642-62017-1

e-ISBN-13: 978-3-642-62015-7

DOI: 10.1007/978-3-642-62015-7

Springer Heidelberg Dordrecht London New York

Library of Congress Catalog Card Number: 66-25793

Mathematics Subject Classification (2010): 60-XX, 60J10

© by Springer-Verlag OHG, Berlin · Göttingen · Heidelberg 1960

© by Springer-Verlag, Berlin · Heidelberg 1967

This work is subject to copyright. All rights are reserved, whether the whole or part of the material is concerned, specifically the rights of translation, reprinting, reuse of illustrations, recitation, broadcasting, reproduction on microfilm or in any other way, and storage in data banks. Duplication of this publication or parts thereof is permitted only under the provisions of the German Copyright Law of September 9, 1965, in its current version, and permission for use must always be obtained from Springer. Violations are liable to prosecution under the German Copyright Law.

The use of general descriptive names, registered names, trademarks, etc. in this publication does not imply, even in the absence of a specific statement, that such names are exempt from the relevant protective laws and regulations and therefore free for general use.

Cover design: VTEX, Vilnius

Printed on acid-free paper

Springer is part of Springer Science+Business Media (www.springer.com)

To my parents

Preface to the First Edition

The theory of Markov chains, although a special case of Markov processes, is here developed for its own sake and presented on its own merits. In general, the hypothesis of a denumerable state space, which is the defining hypothesis of what we call a "chain" here, generates more clear-cut questions and demands more precise and definitive answers. For example, the principal limit theorem (§§ I.6, II.10), still the object of research for general Markov processes, is here in its neat final form; and the strong Markov property (§ II.9) is here always applicable. While probability theory has advanced far enough that a degree of sophistication is needed even in the limited context of this book, it is still possible here to keep the proportion of definitions to theorems relatively low.

From the standpoint of the general theory of stochastic processes, a continuous parameter Markov chain appears to be the first essentially discontinuous process that has been studied in some detail. It is common that the sample functions of such a chain have discontinuities worse than jumps, and these baser discontinuities play a central role in the theory, of which the mystery remains to be completely unraveled. In this connection the basic concepts of separability and measurability, which are usually applied only at an early stage of the discussion to establish a certain smoothness of the sample functions, are here applied constantly as indispensable tools. Hence it is hoped that this book may also serve as an illustration of the modern rigorous approach to stochastic processes toward which there is still so much misgiving.

The two parts of the book, dealing respectively with a discrete and a continuous parameter, are almost independent. It was my original intention to write only the second part, preceded by whatever necessary material from the first. As it turned out, I have omitted details of the continuous parameter analogues when they are obvious enough, in order to concentrate in Part II on those topics which have no counterparts in the discrete parameter case, such as the local properties of sample functions and of transition probability functions. It is these topics that make the continuous parameter case a relatively original and still challenging theory.

Markov process is named after A. A. MARKOV who introduced the concept in 1907 with a discrete parameter and finite number of states. The denumerable case was launched by KOLMOGOROV in 1936, followed

closely by DOEBLIN whose contributions pervade all parts of the Markov theory. Fundamental work on continuous parameter chains was done by DOOB in 1942 and 1945; and in 1951 PAUL LÉVY, with his unique intuition, drew a comprehensive picture of the field. The present work has grown out of efforts to consolidate and continue the pioneering work of these mathematicians. It is natural that I have based the exposition on my own papers, with major revisions and additions; in particular, the first few sections form an expansion of my lecture notes (mimeographed, Columbia University 1951) which have had some circulation. Quite a few new results, by myself and by colleagues subject to my propaganda, have been as it were made to order for this presentation. Historical comments and credit acknowledgements are to be found in the Notes at the end of the sections. But as a rule I do not try to assign priority to fairly obvious results; to do so would be to insult the intelligence of the reader as well as that of the authors involved.

This book presupposes no knowledge of Markov chains but it does assume the elements of general probability theory as given in a modern introductory course. Part I is on about the same mathematical level as FELLER'S *Introduction to probability theory and its applications, vol. I*. For Part II the reader should know the elementary theory of real functions such as the oft-quoted theorems of DINI, FATOU, FUBINI and LEBESGUE. He should also be ready to consult, if not already familiar with, certain basic measure-theoretic propositions in DOOB'S *Stochastic processes*. An attempt is made to isolate and expose [*sic*] the latter material, rather than to assure the reader that it is useless luxury. The mature reader can read Part II with only occasional references to Part I.

Markov chains have been used a good deal in applied probability and statistics. In these applications one is generally looking for something considerably more specific or rather more general. In the former category belong finite chains, birth-and-death processes, etc.; in the latter belong various models involving a continuous state space subject to some discretization such as queueing problems. It should be clear that such examples cannot be adequately treated here. In general, the practical man in search of ready-made solutions to his own problems will discover in this book, as elsewhere, that mathematicians are more inclined to build fire stations than to put out fires. A more regrettable omission, from my point of view, is that of a discussion of semigroup or resolvent theory which is pertinent to the last few sections of the book. Let us leave it to another treatise by more competent hands.

A book must be ended, but not without a few words about what lies beyond it. First, sporadic remarks on open problems are given in the Notes. Even for a discrete parameter and in the classical vein, a semblance of fullness exists only in the positive-recurrent case. Much less

is known in the null-recurrent case, and a serious study of nonrecurrent phenomena has just begun recently. The last is intimately related to an analysis of the discontinuities of continuous parameter sample functions already mentioned. In the terminology of this book, the question can be put as follows: how do the sample curves manage to go to infinity and to come back from there? A satisfactory answer will include a real grasp on the behavior of instantaneous states, but the question is equally exigent even if we confine ourselves to stable states (as in §§ II.17 to 20). This area of investigations has been called the theory of "boundaries" in analogy with classical analysis, but it is perhaps more succinctly described as an intrinsic theory of compactification of the denumerable state space of the Markov chain. There are a number of allusions to this theme scattered throughout the book, but I have refrained from telling an unfinished story. The solicitous voice of a friend has been heard saying that such a new theory would supersede the part of the present treatment touching on the boundary. Presumably and gladly so. Indeed, to use a Chinese expression, why should the azure not be superior to the blue?

Among friends who have read large portions of the manuscript and suggested valuable improvements are J. L. DOOB, HENRY P. MCKEAN Jr. and G. E. H. REUTER. My own work in the field, much of it appearing here and some of it for the first time, has been supported in part by the Office of Scientific Research of the United States Air Force. To these, and quite a few others who rendered help of one kind or other, I extend my hearty thanks.

January, 1960

K. L. C.

Preface to the Second Edition

In this revised edition I have added some new material as well as making corrections and improvements. In Part I the additions (in §§ 9, 10, 11) are a few results closely related to the original text and illustrative of the method of taboos. In Part II the major additions have to do with the boundary theory; these include "fine topology" in § 11, "Martin boundary" and "entrance law" in § 19. The old Addenda have been expanded into the new § 12, some of the developments there being also germane to the boundary theory. It is hoped that these efforts have now brought the reader right up to the edge of the boundary. A number of selected items have been inserted in the Bibliography as a further guide to the latest literature on the above-mentioned and other topics.

For some of the important revisions I am particularly indebted to STEVEN OREY and DAVID FREEDMAN for their extensive counsel. All other readers who have sent in corrections are also gratefully acknowledged here. Numerous lesser changes are made, including some for the sake of pedagogy and commentary. Personal taste and habit not being stationary in time, I should have liked to make more radical departures such as deleting hundreds of the ω 's in the cumbersome notation, but have generally decided to leave well enough alone. Most of the corrections have already been incorporated in the Russian translation which was published in 1964, but many of the additions are new.

The second edition appears at a time when boundary theory (envisaged in this book as a study in depth of the behavior of sample functions in relation to the "infinities") has just begun to take shape. This vital theme, already announced in the preface to the first edition, will no doubt be the most challenging part of the theory to come. I have chosen not to enter into it in detail in the belief that such a development needs more time to mature. In this regard it may be a timely observation that the theory of Markov processes in general state space, which flourished in recent years and has built up a powerful machinery, has had to date little impact on the denumerable [chain] case. This is because the prevailing assumptions allow the sample functions virtually no other discontinuities than jumps — a situation which would make a trite object of a chain. On the other hand, the special theory of Markov chains has yet to adapt its methodology to a broader context suitable for the general state space. Thus there exists at the moment a state of mutual detachment which surely must not be suffered to continue. Future progress in the field looks to a meaningful fusion of these two aspects of the Markovian phenomenon.

October, 1966

K. L. C.

Contents

Part I. Discrete Parameter

§ 1. Fundamental definitions	1
§ 2. Transition probabilities	5
§ 3. Classification of states	12
§ 4. Recurrence	17
§ 5. Criteria and examples	21
§ 6. The main limit theorem	28
§ 7. Various complements	35
§ 8. Repetitive pattern and renewal process	41
§ 9. Taboo probabilities	45
§ 10. The generating function	54
§ 11. The moments of first entrance time distributions	61
§ 12. A random walk example	71
§ 13. System theorems	76
§ 14. Functionals and associated random variables	81
§ 15. Ergodic theorems	90
§ 16. Further limit theorems	99
§ 17. Almost closed and sojourn sets	112

Part II. Continuous Parameter

§ 1. Transition matrix: basic properties	119
§ 2. Standard transition matrix	128
§ 3. Differentiability	134
§ 4. Definitions and measure-theoretic foundations	140
§ 5. The sets of constancy	148
§ 6. Continuity properties of sample functions	157
§ 7. Further specifications of the process	160
§ 8. Optional random variable	165
§ 9. Strong Markov property	172
§ 10. Classification of states	182
§ 11. Taboo probability functions	187
§ 12. Last exit time	197
§ 13. Ratio limit theorems; discrete approximations	212
§ 14. Functionals	224
§ 15. Post-exit process	230
§ 16. Imbedded renewal process	239
§ 17. The two systems of differential equations	245
§ 18. The minimal solution	251
§ 19. The first infinity	257
§ 20. Examples	272
Bibliography	292
Index	298