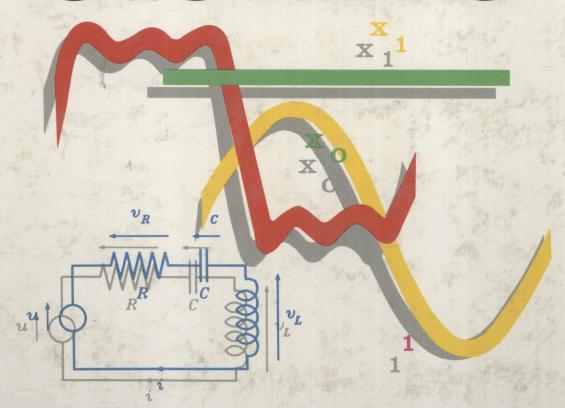
# MODERN SIGNALS AND SYSTEMS



# HUIBERT KWAKERNAAK RAPHAEL SIVAN

PRENTICE HALL INFORMATION AND SYSTEM SCIENCES SERIES
Thomas Kailath, Series Editor

TN911.7 K98

# MODERN SIGNALS AND SYSTEMS



Huibert Kwakernaak
University of Twente

Raphael Sivan
Technion, Israel Institute of Technology

with software by Rens C. W. Strijbos

University of Twente



E9262548



PRENTICE HALL, Englewood Cliffs, NJ 07632

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

KWAKERNAAK, HUIBERT.

Modern signals and systems/Huibert Kwakernaak, Raphael Sivan: with software by Rens C. W. Strijbos.

p. cm.

Includes bibliographical references (p. )

ISBN 0-13-809252-4

1. Signal processing. 2. System analysis. I. Signal processing.

tem analysis. I. Sivan, Raphael.

II. Strijbos, Rens C. W. III. Title. TK5102.5.K895 1991

621.382'2-dc20

89-39977

CIP

Editorial/production supervision and interior design: Joseph Scordato

Cover design: Annemarie Kwakernaak Series logo design: A.M. Bruckstein

Manufacturing buyers: Lori Bulwin/Patrice Fraccio

The author and publisher of this book have used their best efforts in preparing this book. These efforts include the development, research, and testing of the theories and programs to determine their effectiveness. The author and publisher make no warranty of any kind, expressed or implied, with regard to these programs or the documentation contained in this book. The author and publisher shall not be liable in any event for incidental or consequential damages in connection with, or arising out of, the furnishing, performance, or use of these programs.



© 1991 by Prentice-Hall, Inc. A Division of Simon & Schuster Englewood Cliffs, New Jersey 07632

All rights reserved. No part of this book may be reproduced, in any form or by any means, without permission in writing from the publisher.

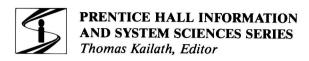
Printed in the United States of America

10 9 8 7 6 5 4 3 2 1

#### 4-555PDB-E1-0 NBZI

PRENTICE-HALL INTERNATIONAL (UK) LIMITED, London PRENTICE-HALL OF AUSTRALIA PTY. LIMITED, Sydney PRENTICE-HALL CANADA INC., Toronto PRENTICE-HALL HISPANOAMERICANA, S.A., Mexico PRENTICE-HALL OF INDIA PRIVATE LIMITED, New Delhi PRENTICE-HALL OF JAPAN, INC., Tokyo SIMON & SCHUSTER ASIA PTE. LTD., Singapore EDITORA PRENTICE-HALL DO BRASIL, LTDA., Rio de Janeiro

# MODERN SIGNALS AND SYSTEMS



ANDERSON & MOORE

Optimal Control: Linear Quadratic Methods

ANDERSON & MOORE

**Optimal Filtering** 

ASTROM & WITTENMARK

Computer-Controlled Systems: Theory and Design, 2/E

DICKINSON GARDNER

Systems: Analysis, Design and Computation

GOODWIN & SIN

Statistical Spectral Analysis: A Nonprobabilistic Theory

GRAY & DAVISSON

Adaptive Filtering, Prediction, and Control Random Processes: A Mathematical Approach for Engineers

HAYKIN

Adaptive Filter Theory 2/E

JAIN

Fundamentals of Digital Image Processing Lectures on Adaptive Parameter Estimation

**JOHNSON** KAILATH

Linear Systems

KUMAR & VARAIYA

Stochastic Systems: Estimation, Indentification, and Adaptive

Control

KUNG

VLSI Array Processors

KUNG, WHITEHOUSE, &

VLSI and Modern Signal Processing

KAILATH, EDS. KWAKERNAAK & SIVAN

Modern Signals and Systems

LANDAU

System Identification and Control Design Using PIM+ Software

LIUNG

System Identification: Theory for the User

MACOVSKI

Medical Imaging Systems

MIDDLETON & GOODWIN

Digital Control and Estimation: A Unified Approach

NARENDRA &

ANNASWAMY

Stable Adaptive Systems

SASTRY & BODSON

Adaptive Control: Stability, Convergence, and Robustness

SOLIMAN & SRINATH

Continuous and Discrete Signals and Systems

SPILKER

Digital Communications by Satellite

WILLIAMS

Designing Digital Filters

To my parents H. K.

To Ilana, Ori, Ayelet, Keren, and Yael R. S.

#### Preface

Almost twenty years ago, as young and inexperienced scientists, we dared (where did we take the chutzpah?) to write an advanced graduate textbook, *Linear Optimal Control Systems* (New York: John Wiley, 1972). We found the collaboration enjoyable and rewarding. A few years ago, being not so young anymore, and possibly more mature, we decided to join hands again, this time in what we thought to be a more modest endeavor, to write an undergraduate textbook on modern signals and systems.

Having taught this material over and over again, we had little doubt that it would not be a too difficult or lengthy task to organize what we thought to be the Signals and Systems material. How wrong we were! We ignored the fact that time and again, while standing in front of our classes, we experienced a moment of hesitation, realizing that not all the material we were teaching was totally consistent and completely clear.

It took us nearly four years of work, and almost endless brain racking and soul searching, to integrate the signals and systems material into a unified framework and to produce a book we are satisfied with. We hope that the meticulous care we took in creating the text shows. We also hope that teachers and students alike appreciate the concise and precise style to which we aspired without wanting to compromise the intuitive appeal.

Our *Modern Signals and Systems* is a textbook for a one- or two-semester junior course, which often goes by the name "Signals and Systems", or sometimes by names such as "Linear Systems" or "Dynamical Systems," and is a required course in the curriculum of most electrical engineering departments. The book contains a comprehensive and well-integrated treatment of the basic notions of signal theory

xx Preface

and of both the time- and frequency-domain analysis of systems. The discrete- and continuous-time case are treated in parallel, sometimes even typographically in two column format. The book contains many examples, several of which are pursued over many chapters. An extensive collection of homework problems concludes each chapter. In addition, the final section of each chapter provides problems whose solution requires a computer. An unusual feature is that the book comes complete with application software of near-professional quality, provided on a disk, that runs on a personal computer.

It is assumed that the student has a background in basic calculus and algebra, knows how to work with complex numbers, has heard of differential equations and linear algebra, knows the fundamentals of physics and electricity, and possibly has had an introductory course in electrical circuits. To use the software, some familiarity with a personal computer is helpful.

From this book we have taught two-quarter (at the University of Twente) and one-semester (at the Technion) courses to sophomore students. We managed to cover practically all of Chapters 1–8 and a sprinkle of the applications in Chapters 9–11. In departments that devote two semesters to the Signals and Systems course, the entire book may easily be covered. There may even be time to pursue the applications dealt with in Chapters 9–11 in a little more depth, at the discretion of the teacher.

A chapter-by-chapter description of the material follows.

Chapter 1 offers a brief overview of the ideas of signals and systems. By way of motivation, a sketch is given of the application areas that are elaborated in the final three chapters of the book.

Chapter 2 presents an introduction to signals. We describe basic notions such as the time axis of signals, discrete- and continuous-time signals, periodic and harmonic signals, various operations on signals, and signal spaces. The final section is devoted to *generalized* signals. A more elaborate treatment of this material, based on *distribution* theory, is presented in Supplement C.

Chapter 3 deals with a number of fundamental ideas related to systems. Two types of systems are introduced at this point: *input-output* systems and *input-output mapping* systems. The definitions of these systems are *set theoretic*, based on the approach of Jan C. Willems to system theory. These ideas allow an axiomatic approach to system theory even at the level of an undergraduate text. The chapter continues by distinguishing various types of systems. By way of linearity and time-invariance, the discussion arrives at *convolution* systems. The convolution operation is thoroughly treated, and the stability of convolution systems is touched upon. A study of the response of convolution systems to harmonic inputs results in the *frequency response* function. The chapter concludes with a discussion of the response of convolution systems to periodic inputs—leading to *cyclical* convolution—and a brief introduction to the interconnection of systems.

In Chapter 4 we consider systems described by constant coefficient linear difference and differential equations. After a review of elementary material concerning the solution of constant coefficient linear difference and differential equations, we deal with the impulse response, stability, and frequency response of these systems. A central notion is that of the *initially-at-rest system*. In the discussion of stability

we introduce bounded-input-bounded-output (BIBO) and converging-input-converging-output (CICO) stability.

Chapter 5 deals with the state description of systems. Also, here the initial approach is set theoretic. The definition of the state rests upon the *state matching property* formulated by Willems. After introducing the basic ideas, the realization of linear difference and differential systems as state systems is discussed. A further section is devoted to the existence of solutions of state equations and the numerical integration of state differential equations. The chapter continues with the explicit solution of linear state equations and modal analysis. The treatment of the stability of state systems is integrated with that of difference and differential systems.

Chapters 6–8 are devoted to the *frequency domain* description of signals and systems. Chapter 6 begins with a concise but fundamental presentation of signal *expansion*. The theory is made concrete by the introduction of *harmonic* bases for signal spaces and the associated finite and infinite *Fourier series expansions*. Various aspects of these expansions, such as the identities of Plancherel and Parseval, convergence properties, the trigonometric form, symmetry properties, and generalized infinite Fourier series, are carefully presented. The chapter concludes with a treatment of the response of convolution systems to periodic inputs.

Chapter 7 is devoted to Fourier *transforms*. First, transform theory is explained in an abstract setting. The discussion soon focuses on *expansion transforms* (i.e., the transformation from a signal to its expansion coeffcients). In this way, the Fourier series expansions of finite-time and periodic signals of Chapter 6 immediately lead to two of the four Fourier transforms that are considered, namely, the discrete-to-discrete Fourier transform (abbreviated DDFT, more conventionally known as the discrete Fourier transform) and the continuous-to-discrete Fourier transform (CDFT). The properties of these transforms are reviewed. Following this it is shown that the expansion of aperiodic rather than periodic or finite-time signals leads to *Fourier integral expansions*. These result in the discrete-to-continuous Fourier transform (DCFT, also known as the discrete-time Fourier transform) and the continuous-to-continuous Fourier transform (CCFT, commonly known as the Fourier integral transform). Also, the properties of these last two transforms are discussed in detail, emphasizing parallels. The chapter ends with showing how Fourier transform theory is used in the frequency domain analysis of convolution systems.

The third chapter dealing with frequency domain analysis, Chapter 8, is devoted to the z-transform and the Laplace transform. First, it is explained that Fourier transform theory cannot handle exponentially increasing signals. To overcome this difficulty, the DCFT and CCFT are modified to the (two-sided) z-transform and Laplace transform. To deal with initial value problems, the one-sided z-transform and Laplace transform are introduced. The existence, properties and inversion of the z-transform and Laplace transform are treated with considerable completeness. Three separate sections of Chapter 8 are devoted to the application of these transforms to the analysis of convolution systems, difference and differential systems, and state systems.

The final chapters of the book present applications of the theory to three important areas for which a course on Signals and Systems forms a prerequisite: signal

**xxii** Preface

processing and digital filtering, communication, and feedback and automatic control. Indeed, teachers of courses on these subjects may find that part of their material is covered in this book.

Chapter 9 is the first of the applications chapters. It concerns signal processing and digital filtering. The chapter begins with a discussion of the effect of sampling and interpolation on the frequency content of signals. This leads to a transparent derivation of the sampling theorem. Next on- and off-line signal processing are introduced. After a discussion of windows and windowing, two sections are devoted to an elementary treatment of various methods to design finite and infinite impulse response digital filters. The chapter ends with a derivation of the fast Fourier transform and some considerations about the numerical computation of transforms and convolutions.

Chapter 10 outlines some basic applications to communication theory. The chapter begins with the application of Fourier transforms to the description of narrow-band signals. This is a beautiful theory, which is indispensable in the analysis of modulation and demodulation. Following this, various well-known modulation schemes, including amplitude and frequency modulation, are presented. The chapter ends with a brief discussion of multiplexing.

Chapter 11, finally, contains a concise outline of feedback theory and automatic control. The potential benefits of feedback are demonstrated at a fairly abstract level, illustrated by simple concrete examples. The final section of this chapter reviews various important results on the stability of feedback systems.

The body of the text is complemented with five supplements.

As was mentioned earlier, the book comes with computer software, provided on a disk. The software consists of a powerful interpreter named SIGSYS, which offers a wide and flexible range of operations to generate and handle signals, including Fourier tranformation, convolution, and the integration of differential equations. The software has been strongly inspired by MATLAB, which is a widely used computational tool. The difference is that where the main data type of MATLAB is a matrix, that of SIGSYS is a real- or complex-valued *signal*. In addition, complex and real scalars and polynomials are supported. SIGSYS offers an opportunity to do calculations of a widely varying nature interactively. The graphic support provides instantaneous visualization. An extensive Tutorial, describing and illustrating all the operations and commands of SIGSYS, is included at the end of the book. The READ.ME file on the disk that contains SIGSYS should be consulted before running the program. It contains instructions how to set up and start SIGSYS and also lists corrections and modifications to the Tutorial. The disk furthermore contains a number of demos.

We have used SIGSYS for several years to run a laboratory course in parallel with the Signals and Systems course as follows. During the first weeks of the term, students were instructed to go through the first 16 sections of the Tutorial and to do all the exercises provided by the Tutorial. In addition, the students were assigned two or three Computer Exercises from Chapters 2 and 3, whose main purpose is to become familiar with the computer. Depending on the available time, during the rest of the course students were assigned a number of other problems from the Computer Exercises for the rest of the chapters.

Preface xxiii

A solutions manual for the Problems and Computer Exercises is available to teachers who adopt the book and may be obtained from the publisher. The manual comes with a disk that provides solutions to all the Computer Exercises in macro form. Also, hard-copy solutions are supplied.

The story of the software is this: Right at the initial stages of planning the book it occurred to us that supporting the text with software would be timely and instructive. The success of MATLAB was a powerful stimulus, and it stood example for SIGSYS in many ways. We were lucky to get Rens Strijbos, a long-time associate, to develop the program for us. The time and effort spent on this work are fully comparable with our own exertions. The software was written in the C language and developed in a UNIX environment by using a variety of programming tools.

Writing this book also got us in other ways involved in high technology. The early versions of the text were prepared by using the text formatting language Troff, and the figures were produced with a drawing program. Being able to keep in daily touch by electronic mail was a forceful incentive. Fax and international courier mail from time to time supplemented communication by ordinary mail. The work on the book took us on numerous trips back and forth between Israel and The Netherlands and also to such places as Amherst, Mass., Berlin, Bern, Englewood Cliffs, N.J., and, last but not least, the Sinai desert.

We are grateful to our teachers, in particular Lotfi Zadeh and Charlie Desoer, who showed us what perspicuity means, and to our students, who keep insisting on getting things clear. Our departments deserve credit for accepting our absorption in the project of writing the book, our periods of absence, footing the bills for computer time, and supporting part of the traveling. In particular, we acknowledge the support of the Fund for the Promotion of Research of the Technion. We thank our secretaries, Marja Langkamp and Annette Berg, for their invaluable help. In conclusion, we wish to express our sincere appreciation to Tim Bozik of Prentice Hall for his continued belief in the project even when we started missing deadlines.

Enschede and Haifa

Huibert Kwakernaak Raphael Sivan

## **Contents**

	PKEF	xix	
1	OVERVIEW OF SIGNALS AND SYSTEMS		
	1.1	Introduction 1	
		Signals, 1 Systems, 2	
	1.2	Examples of Signals and Systems 2	
		Input-Output Systems, 3 Input-Output Mapping Systems, 4 Time Signals, 4 Discrete-Time Systems, 5 Continuous-Time Systems, 6	
	1.3	Applications of Signal and System Theory 7	
		Application to Signal Processing, 8 Application to Communication Engineering, 8 Application to Automatic Control, 10	
2	AN II	NTRODUCTION TO SIGNALS	11
	2.1	Introduction 11	
	2.2	Signals 12	

viii Contents

		Discrete- and Continuous-Time Signals, 12 Time Sequences and Sampled Signals, 14 Finite-Time, Semi-Infinite-Time, and Infinite-Time Signals, 15 Some Well-Known Signals, 16 Periodic Signals, 18 Harmonic Signals, 18	
	2.3	Elementary Operations On and Among Time Signals	21
		Signal Range Transformation, 21 Quantization, 22 Signal Axis Transformation, 23 Sampling and Interpolation, 25 Pointwise Binary Operations, 30	
	2.4	Signal Spaces 31	
		Norms, 32 Normed Spaces, 35 Inner Product, 37	
	2.5	Generalized Signals 42	
		The Need for the Delta Function, 42 Principles of the Theory of Singular Functions, 45 Linear Combinations of Delta Functions, 46 Time Scaling and Time Translation of Delta Functions, 47 Multiplication by a Function, 48 Differentiation, 49 Delta Function as the Derivative of a Step, 50 Approximations to Delta Functions, 51 Review, 53	
	2.6	Problems 53	
	2.7	Computer Exercises 58	
3	INTRO	DUCTION TO SYSTEMS	65
	3.1	Introduction 65	
	3.2	Input-Output Systems and Input-Output Mapping Systems 66	
		Examples of IO and IOM Systems, 67 Discrete- and Continuous-Time Systems, 68 Memoryless IOM Systems, 68 Non-Anticipating Systems, 70 Time-Invariance, 72 Additional Examples of Input-Output Systems, 75	

	3.3	Linear Systems 77	
		Linearity of IOM Systems, 78 Linearization, 79 The IO Map of Linear IOM Systems, 82 Non-Anticipating and Real Linear IOM Systems, 85	
	3.4	Convolution Systems 87	
		Impulse Response, 89 Examples, 89 Non-Anticipativeness of Convolution Systems, 91 Step Response, 92	
	3.5	Convolution 95	
		Properties and Existence of the Convolution, 98 Convolution With the Unit Functions $\Delta$ and $\delta$ , 101 Convolution With Derivatives of the Delta Function, 101	
	3.6	Stability of Convolution Systems 103	
	3.7	Harmonic Inputs 107	
		Harmonic Inputs and Frequency Response, 107 Response to Real Harmonic Signals, 112 Engineering Significance of Frequency Response, 115	
	3.8	Periodic Inputs 121	
		Periodic Extension and One-Period Restriction, 123 Cyclical Convolution, 125 Cyclical and Regular Convolution, 126 Response of Convolution Systems to Periodic Inputs, 128 Response of Convolution Systems to Harmonic Periodic Inputs, 132	
	3.9	Interconnections of Systems 136	
		Series and Parallel Connections, 137	
	3.10	Problems 141	
	3.11	Computer Exercises 152	
4	DIFFE	RENCE AND DIFFERENTIAL SYSTEMS	15
	4.1	Introduction 157	
	4.2	Difference and Differential Systems: Definition and Examples 158	
		Examples of Difference and Differential Systems, 160	

4.3	Basics	of Difference	and Di	fferential S	Systems	164

Solutions to Difference and Differential Equations, 164
Non-Anticipativity of Difference and Differential
IOM Systems, 166
Time Investigates of Difference and Differential

Time-Invariance of Difference and Differential Systems, 167

Linearity of Difference and Differential Systems, 170 Linear Time-Invariant Difference and Differential Systems, 172

The Initially-At-Rest System, 173

#### 4.4 Response of Linear Time-Invariant Difference and Differential Systems 178

Solution of the Homogeneous Equation, 179 Particular Solutions, 184 General Solution of Difference and Differential Equations, 185

#### 4.5 Initially-At-Rest Difference and Differential Systems 190

Impulse Response, 190
Particular Solutions of Linear Time-Invariant
Difference and Differential Systems, 196

## 4.6 Stability of Difference and Differential Systems 200

BIBO Stability of Initially-At-Rest Linear Time-Invariant Difference and Differential Systems, 201

Boundedness and Convergence of Zero Input Responses, 202 BIBO Stability of IO Systems, 203 CICO Stability, 206

## 4.7 Frequency Response of Difference and Differential Systems 210

Frequency Response Function of Difference and Differential Systems, 210 Steady-State and Transient Response to Harmonic Inputs, 215 Frequency Response Functions of Electrical Networks, 217

#### 4.8 Problems 221

#### 4.9 Computer Exercises 229

хi

238

5	STATE	DESCRIPTION OF SYSTEMS
	5.1	Introduction 238
	5.2	State Description of Systems 239
		The Notion of State, 239 State Systems, 246 State Difference and Differential Systems, 249 State Transition Map, 250 Linearity of State Systems, 252 Time-Invariance of State Systems, 253
	5.3	Realization of Difference and Differential Systems as State Systems 255
		Implementation of State Difference and Differential Systems, 256 State Realization of Linear Difference and Differential Systems: Examples, 259 State Realization of Linear Difference and Differential Systems, 263
	5.4	Solution of State Equations 268
		Existence of Solutions, 269 Numerical Integration of State Differential Equations, 270
	5.5	Solution of Linear State Equations 275
		Homogeneous State Difference and Differential Equations, 275 State Transition Matrix, 276 Transition Matrix of Time-Invariant Systems, 279 Solution of the Inhomogeneous Equation, 283
	5.6	Modal Analysis of Linear Time-Invariant State Systems 289
		Time-Invariant State Transformations, 290 Modal Transformations, 292 Modes, 297
	5.7	Stability of State Systems 304
		Boundedness and Convergence of the Zero-Input State Response, 305 BIBO, CICO, BIBS, and CICS Stability of State Systems, 306
	5.8	Frequency Response of State Systems 310

Frequency Response Matrix, 311

xii Contents

	5.9	Problems 317	
	5.10	Computer Exercises 324	
(	6 EXPA	ANSION THEORY AND FOURIER SERIES	330
	6.1	Introduction 330	
	6.2	Signal Expansion 331	
		Linear Independence, 331 Basis, 332 Orthogonal and Orthonormal Bases, 336 Best Approximation and the Projection Theorem, 339 Uncountable and Harmonic Bases, 342	
	6.3	Signal Expansion for Linear Systems 342	
		Expansion of Input and Output, 343 Spectral Expansion, 345 Orthogonality of Spectral Bases, 348	
	6.4		
		Fourier Series Expansion, 349 Examples, 353 Identities of Plancherel and Parseval, 356 Fourier Series Expansion of Periodic Signals, 359 Convergence Properties of the Infinite Fourier Series Expansion, 362 Trigonometric Form of the Infinite Fourier Series Expansion 364 Symmetry Properties of the Fourier Coefficients, 365 Generalized Infinite Fourier Series, 367	
	6.5 Linear Time-Invariant Systems With Periodic Inputs 370		
		Frequency Domain Solution of the Response of Convolution Systems to Periodic Inputs, 370 Frequency Domain Solution of Cyclical Convolution Systems, 374	
	6.6	Problems 376	
	6.7	Computer Exercises 380	
7	FOURI	ER TRANSFORMS	385
	7.1	Introduction 385	
	7.2	Transform Theory 386	