# Matrix Algebra Useful for Statistics 




# Matrix Algebra Useful for Statistics 

SHAYLE R. SEARLE



Copyright © 1982, 2006 by John Wiley \& Sons, Inc. All rights reserved.
Published by John Wiley \& Sons, Inc., Hoboken, New Jersey.
Published simultaneously in Canada.

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/permission.

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 U.S. at (800) 762-2974, outside the U.S. 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 format. For information about Wiley products, visit our web site at www.wiley.com.

## Library of Congress Cataloging-in-Publication is available.

ISBN-13 978-0-470-00961-1
ISBN-10 0-470-00961-6

Printed in the United States of America.

To my wife Helen


## Freface

Algera is a mathematical shorthand for language, and matrices are a shorthind for algebra. Consequently, a special value of matrices is that they enatle many mathematical operations, especially those arising in statistics and the quantitative sciences, to be expressed concisely and with clarity. The algejra of matrices is, of course, in no way new, but its presentation is often so surriunded by the trappings of mathematical generality that assimilation car be difficult for readers who have only limited ability or training in mathenatics. Yet many such people nowadays find a knowledge of matrix algebra necessary for their work, especially where statistics and/or computers ire involved. It is to these people that I address this book; and for them, Ihave attempted to keep the mathematical presentation as informal as possble.

The sursuit of knowledge frequently involves collecting data; and those responsble for the collecting must appreciate the need for analyzing their data to ecover and interpret the information contained therein. Such people must therefore understand some of the mathematical tools necessary for this analysi, to an extent either that they can carry out their own analysis, or that the can converse with statisticians and mathematicians whose help will otherwie be needed. One of the necessary tools is matrix algebra. It is becoming as necessary to science today as elementary calculus has been for generatons. Matrices originated in mathematics more than a century ago, but ther broad adaptation to science is relatively recent, prompted by the widespead acceptance of statistical analysis of data, and of computers to do that anlysis; both statistics and computing rely heavily on matrix algebra. The pupose of this book is therefore that of bringing to a broad spectrum of readrs a knowledge of matrix algebra that is useful in the statistical analysi: of data and in statistics generally.

The asic prerequisite for using the book is high school algebra. Differential calulus is used on only a few pages, which can easily be omitted;
nothing will be lost insofar as a general understanding of matrix algebra is concerned. Proofs and demonstrations of most of the theory are given, for without them the presentation would be lifeless. But in every chapter the theoretical development is profusely illustrated with elementary numerical examples and with illustrations taken from a variety of applied sciences. And the last three chapters are devoted solely to uses of matrix algebra in statistics, with Chapters 14 and 15 outlining two of the most widely used statistical techniques: regression and linear models.

The mainstream of the book is its first eleven chapters, beginning with one on introductory concepts that includes a discussion of subscript and summation notation. This is followed by four chapters dealing with basic arithmetic, special matrices, determinants and inverses. Chapters 6 and 7 are on rank and canonical forms, 8 and 9 deal with generalized inverses and solving linear equations, 10 is a collection of results on partitioned matrices and 11 describes eigenvalues and eigenvectors. Background theory for Chapter 11 is collected in an appendix, Chapter 11A, some summaries and miscellaneous topics make up Chapter 12, statistical illustrations constitute Chapter 13, and Chapters 14 and 15 describe regression and linear models. All chapters except the last two end with exercises.

Occasional sections and paragraphs can be omitted at a first reading, especially by those whose experience in mathematics is somewhat limited. These portions of the book are printed in small type and, generally speaking, contain material subsidiary to the main flow of the text-material that may be a little more advanced in mathematical presentation than the general level otherwise maintained.

Chapters, and sections within chapters, are numbered with Arabic numerals $1,2,3, \ldots$. Within-chapter references to sections are by section number, but references across chapters use the decimal system; e.g., Section 1.3 is Section 3 of Chapter 1. These numbers are also shown in the running head of each page; e.g., [1.3] is found on page 4. Numbered equations are (1), (2), ..., within each chapter. Those of one chapter are seldom referred to in another, but when they are, the chapter reference is explicit; otherwise "equation (3)," or more simply "(3)," means the equation numbered (3) in the chapter concerned. Exercises are in un-numbered sections and are referenced by their chapter number; e.g., Exercise 6.2 is Exercise 2 at the end of Chapter 6.

I am greatly indebted to George P. H. Styan for his exquisitely thorough readings of two drafts of the manuscript and his extensive and very helpful array of comments. Harold V. Henderson's numerous suggestions for the final manuscript were equally as helpful. Readers of Matrix Algebra for the

Biological Sciences (Wiley, 1966), and students in fifteen years of my matrix algebra course at Cornell have also contributed many useful ideas. Particular thanks go to Mrs. Helen Seamon for her superb accuracy on the typewriter, her patience and fantastic attention to detail; such attributes are greatly appreciated.

Ithaca, New York
Shayle R. Searle
May 1982


