11тн **Е D I T I O N**

Elementary Linear Algebra

Applications Version

HOWARD ANTON

Professor Emeritus, Drexel University

CHRIS RORRES

University of Pennsylvania



Howard Anton obtained his B.A. from Lehigh University, his M.A. from the University of Illinois, and his Ph.D. from the Polytechnic University of Brooklyn, all in mathematics. In the early 1960s he worked for Burroughs Corporation and Avco Corporation at Cape Canaveral, Florida, where he was involved with the manned space program. In 1968 he joined the Mathematics Department at Drexel University, where he taught full time until 1983. Since then he has devoted the majority of his time to textbook writing and activities for mathematical associations. Dr. Anton was president of the EPADEL Section of the Mathematical Association of America (MAA), served on the Board of Governors of that organization, and guided the creation of the Student Chapters of the MAA. In addition to various pedagogical articles, he has published numerous research papers in functional analysis, approximation theory, and topology. He is best known for his textbooks in mathematics, which are among the most widely used in the world. There are currently more than 175 versions of his books, including translations into Spanish, Arabic, Portuguese, Italian, Indonesian, French, Japanese, Chinese, Hebrew, and German. For relaxation, Dr. Anton enjoys travel and photography.

Chris Rorres earned his B.S. degree from Drexel University and his Ph.D. from the Courant Institute of New York University. He was a faculty member of the Department of Mathematics at Drexel University for more than 30 years where, in addition to teaching, he did applied research in solar engineering, acoustic scattering, population dynamics, computer system reliability, geometry of archaeological sites, optimal animal harvesting policies, and decision theory. He retired from Drexel in 2001 as a Professor Emeritus of Mathematics and is now a mathematical consultant. He also has a research position at the School of Veterinary Medicine at the University of Pennsylvania where he does mathematical modeling of animal epidemics. Dr. Rorres is a recognized expert on the life and work of Archimedes and has appeared in various television documentaries on that subject. His highly acclaimed website on Archimedes (http://www.math.nyu.edu/~crorres/Archimedes/contents.html) is a virtual book that has become an important teaching tool in mathematical history for students around the world.

To: My wife, Pat My children, Brian, David, and Lauren My parents, Shirley and Benjamin My benefactor, Stephen Girard (1750–1831), whose philanthropy changed my life *Howard Anton*

To: Billie

Chris Rorres

This textbook is an expanded version of *Elementary Linear Algebra*, eleventh edition, by Howard Anton. The first nine chapters of this book are identical to the first nine chapters of that text; the tenth chapter consists of twenty applications of linear algebra drawn from business, economics, engineering, physics, computer science, approximation theory, ecology, demography, and genetics. The applications are largely independent of each other, and each includes a list of mathematical prerequisites. Thus, each instructor has the flexibility to choose those applications that are suitable for his or her students and to incorporate each application anywhere in the course after the mathematical prerequisites have been satisfied. Chapters 1–9 include simpler treatments of some of the applications covered in more depth in Chapter 10.

This edition gives an introductory treatment of linear algebra that is suitable for a first undergraduate course. Its aim is to present the fundamentals of linear algebra in the clearest possible way—sound pedagogy is the main consideration. Although calculus is not a prerequisite, there is some optional material that is clearly marked for students with a calculus background. If desired, that material can be omitted without loss of continuity.

Technology is not required to use this text, but for instructors who would like to use MATLAB, *Mathematica*, Maple, or calculators with linear algebra capabilities, we have posted some supporting material that can be accessed at either of the following companion websites:

> www.howardanton.com www.wiley.com/college/anton

Summary of Changes in This Edition

Many parts of the text have been revised based on an extensive set of reviews. Here are the primary changes:

- Earlier Linear Transformations Linear transformations are introduced earlier (starting in Section 1.8). Many exercise sets, as well as parts of Chapters 4 and 8, have been revised in keeping with the earlier introduction of linear transformations.
- New Exercises Hundreds of new exercises of all types have been added throughout the text.
- **Technology** Exercises requiring technology such as MATLAB, *Mathematica*, or Maple have been added and supporting data sets have been posted on the companion websites for this text. The use of technology is not essential, and these exercises can be omitted without affecting the flow of the text.
- Exercise Sets Reorganized Many multiple-part exercises have been subdivided to create a better balance between odd and even exercise types. To simplify the instructor's task of creating assignments, exercise sets have been arranged in clearly defined categories.
- **Reorganization** In addition to the earlier introduction of linear transformations, the old Section 4.12 on *Dynamical Systems and Markov Chains* has been moved to Chapter 5 in order to incorporate material on eigenvalues and eigenvectors.
- **Rewriting** Section 9.3 on *Internet Search Engines* from the previous edition has been rewritten to reflect more accurately how the Google PageRank algorithm works in practice. That section is now Section 10.20 of the applications version of this text.
- Appendix A Rewritten The appendix on reading and writing proofs has been expanded and revised to better support courses that focus on proving theorems.
- Web Materials Supplementary web materials now include various applications modules, three modules on linear programming, and an alternative presentation of determinants based on permutations.
- Applications Chapter Section 10.2 of the previous edition has been moved to the websites that accompany this text, so it is now part of a three-module set on Linear

Programming. A new section on Internet search engines has been added that explains the PageRank algorithm used by Google.

- Hallmark Features
 Relationships Among Concepts One of our main pedagogical goals is to convey to the student that linear algebra is a cohesive subject and not simply a collection of isolated definitions and techniques. One way in which we do this is by using a crescendo of *Equivalent Statements* theorems that continually revisit relationships among systems of equations, matrices, determinants, vectors, linear transformations, and eigenvalues. To get a general sense of how we use this technique see Theorems 1.5.3, 1.6.4, 2.3.8, 4.8.8, and then Theorem 5.1.5, for example.
 - Smooth Transition to Abstraction Because the transition from R^n to general vector spaces is difficult for many students, considerable effort is devoted to explaining the purpose of abstraction and helping the student to "visualize" abstract ideas by drawing analogies to familiar geometric ideas.
 - **Mathematical Precision** When reasonable, we try to be mathematically precise. In keeping with the level of student audience, proofs are presented in a patient style that is tailored for beginners.
 - Suitability for a Diverse Audience This text is designed to serve the needs of students in engineering, computer science, biology, physics, business, and economics as well as those majoring in mathematics.
 - **Historical Notes** To give the students a sense of mathematical history and to convey that real people created the mathematical theorems and equations they are studying, we have included numerous *Historical Notes* that put the topic being studied in historical perspective.
- *About the Exercises* **Graded Exercise Sets** Each exercise set in the first nine chapters begins with routine drill problems and progresses to problems with more substance. These are followed by three categories of exercises, the first focusing on proofs, the second on true/false exercises, and the third on problems requiring technology. This compartmentalization is designed to simplify the instructor's task of selecting exercises for homework.
 - **Proof Exercises** Linear algebra courses vary widely in their emphasis on proofs, so exercises involving proofs have been grouped and compartmentalized for easy identification. Appendix A has been rewritten to provide students more guidance on proving theorems.
 - **True/False Exercises** The True/False exercises are designed to check conceptual understanding and logical reasoning. To avoid pure guesswork, the students are required to justify their responses in some way.
 - **Technology Exercises** Exercises that require technology have also been grouped. To avoid burdening the student with keyboarding, the relevant data files have been posted on the websites that accompany this text.
 - **Supplementary Exercises** Each of the first nine chapters ends with a set of supplementary exercises that draw on all topics in the chapter. These tend to be more challenging.
- Supplementary Materials for Students
- Student Solutions Manual This supplement provides detailed solutions to most oddnumbered exercises (ISBN 978-1-118-464427).
 - **Data Files** Data files for the technology exercises are posted on the companion websites that accompany this text.
 - MATLAB Manual and Linear Algebra Labs This supplement contains a set of MATLAB laboratory projects written by Dan Seth of West Texas A&M University. It is designed to help students learn key linear algebra concepts by using MATLAB and is available in PDF form without charge to students at schools adopting the 11th edition of the text.
 - Videos A complete set of Daniel Solow's *How to Read and Do Proofs* videos is available to students through WileyPLUS as well as the companion websites that accompany

this text. Those materials include a guide to help students locate the lecture videos appropriate for specific proofs in the text.

Supplementary Materials for Instructors

- Instructor's Solutions Manual This supplement provides worked-out solutions to most exercises in the text (ISBN 978-1-118-434482).
- **PowerPoint Presentations** PowerPoint slides are provided that display important definitions, examples, graphics, and theorems in the book. These can also be distributed to students as review materials or to simplify note taking.
- Test Bank Test questions and sample exams are available in PDF or LATEX form.
- WileyPLUS An online environment for effective teaching and learning. WileyPLUS builds student confidence by taking the guesswork out of studying and by providing a clear roadmap of what to do, how to do it, and whether it was done right. Its purpose is to motivate and foster initiative so instructors can have a greater impact on classroom achievement and beyond.

A Guide for the Instructor Although linear algebra courses vary widely in content and philosophy, most courses fall into two categories—those with about 40 lectures and those with about 30 lectures. Accordingly, we have created long and short templates as possible starting points for constructing a course outline. Of course, these are just guides, and you will certainly want to customize them to fit your local interests and requirements. Neither of these sample templates includes applications or the numerical methods in Chapter 9. Those can be added, if desired, and as time permits.

	Long Template	Short Template
Chapter 1: Systems of Linear Equations and Matrices	8 lectures	6 lectures
Chapter 2: Determinants	3 lectures	2 lectures
Chapter 3: Euclidean Vector Spaces	4 lectures	3 lectures
Chapter 4: General Vector Spaces	10 lectures	9 lectures
Chapter 5: Eigenvalues and Eigenvectors	3 lectures	3 lectures
Chapter 6: Inner Product Spaces	3 lectures	1 lecture
Chapter 7: Diagonalization and Quadratic Forms	4 lectures	3 lectures
Chapter 8: General Linear Transformations	4 lectures	3 lectures
Total:	39 lectures	30 lectures

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CHAPTER 1 Systems of Linear Equations and Matrices 1

- 1.1 Introduction to Systems of Linear Equations 2
- 1.2 Gaussian Elimination 11
- 1.3 Matrices and Matrix Operations 25
- 1.4 Inverses; Algebraic Properties of Matrices 39
- 1.5 Elementary Matrices and a Method for Finding A^{-1} 52
- 1.6 More on Linear Systems and Invertible Matrices 61
- 1.7 Diagonal, Triangular, and Symmetric Matrices 67
- 1.8 Matrix Transformations 75
- 1.9 Applications of Linear Systems 84
 - Network Analysis (Traffic Flow) 84
 - Electrical Circuits 86
 - Balancing Chemical Equations 88
 - Polynomial Interpolation 91
- 1.10 Application: Leontief Input-Output Models 96

CHAPTER 2 Determinants 105

- 2.1 Determinants by Cofactor Expansion 105
- 2.2 Evaluating Determinants by Row Reduction 113
- 2.3 Properties of Determinants; Cramer's Rule 118

CHAPTER 3 Euclidean Vector Spaces 131

- 3.1 Vectors in 2-Space, 3-Space, and *n*-Space 131
- 3.2 Norm, Dot Product, and Distance in R^n 142
- 3.3 Orthogonality 155
- 3.4 The Geometry of Linear Systems 164
- 3.5 Cross Product 172

CHAPTER 4 General Vector Spaces 183

- 4.1 Real Vector Spaces 183
- 4.2 Subspaces 191
- 4.3 Linear Independence 202
- 4.4 Coordinates and Basis 212
- 4.5 Dimension 221
- 4.6 Change of Basis 229
- 4.7 Row Space, Column Space, and Null Space 237
- 4.8 Rank, Nullity, and the Fundamental Matrix Spaces 248
- 4.9 Basic Matrix Transformations in R^2 and R^3 259
- 4.10 Properties of Matrix Transformations 270
- 4.11 Application: Geometry of Matrix Operators on R^2 280

CHAPTER 5 Eigenvalues and Eigenvectors 291

- 5.1 Eigenvalues and Eigenvectors 291
- 5.2 Diagonalization 302
- 5.3 Complex Vector Spaces 313
- 5.4 Application: Differential Equations 326
- 5.5 Application: Dynamical Systems and Markov Chains 332

CHAPTER 6 Inner Product Spaces 345

- 6.1 Inner Products 345
- 6.2 Angle and Orthogonality in Inner Product Spaces 355
- 6.3 Gram–Schmidt Process; *QR*-Decomposition 364
- 6.4 Best Approximation; Least Squares 378
- 6.5 Application: Mathematical Modeling Using Least Squares 387
- 6.6 Application: Function Approximation; Fourier Series 394

CHAPTER 7 Diagonalization and Quadratic Forms 401

- 7.1 Orthogonal Matrices 401
- 7.2 Orthogonal Diagonalization 409
- 7.3 Quadratic Forms 417
- 7.4 Optimization Using Quadratic Forms 429
- 7.5 Hermitian, Unitary, and Normal Matrices 437

CHAPTER 8 General Linear Transformations 447

- 8.1 General Linear Transformations 447
- 8.2 Compositions and Inverse Transformations 458
- 8.3 Isomorphism 466
- 8.4 Matrices for General Linear Transformations 472
- 8.5 Similarity 481

CHAPTER 9 Numerical Methods 491

- 9.1 LU-Decompositions 491
- 9.2 The Power Method 501
- 9.3 Comparison of Procedures for Solving Linear Systems 509
- 9.4 Singular Value Decomposition 514
- 9.5 Application: Data Compression Using Singular Value Decomposition 521

CHAPTER 10 Applications of Linear Algebra 527

- 10.1 Constructing Curves and Surfaces Through Specified Points 528
- 10.2 The Earliest Applications of Linear Algebra 533
- 10.3 Cubic Spline Interpolation 540

- 10.4 Markov Chains 551
- 10.5 Graph Theory 561
- 10.6 Games of Strategy 570
- 10.7 Leontief Economic Models 579
- 10.8 Forest Management 588
- 10.9 Computer Graphics 595
- 10.10 Equilibrium Temperature Distributions 603
- 10.11 Computed Tomography 613
- 10.12 Fractals 624
- 10.13 Chaos 639
- 10.14 Cryptography 652
- 10.15 Genetics 663
- 10.16 Age-Specific Population Growth 673
- 10.17 Harvesting of Animal Populations 683
- 10.18 A Least Squares Model for Human Hearing 691
- 10.19 Warps and Morphs 697
- 10.20 Internet Search Engines 706

APPENDIX A Working with Proofs A1

APPENDIX B Complex Numbers A5

Answers to Exercises A13 Index 11