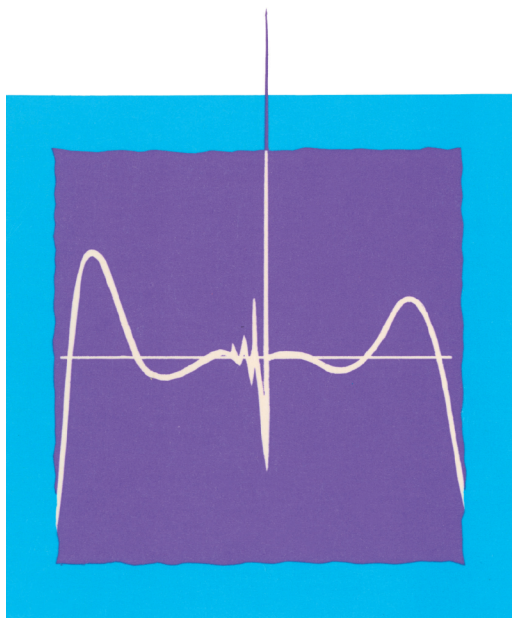


NUMERICAL METHODS THAT USUALLY WORK



FORMAN S. ACTON



MAA PRESS

An Imprint
of the
 AMERICAN
MATHEMATICAL
SOCIETY

**NUMERICAL
METHODS
THAT WORK**

NUMERICAL METHODS THAT WORK

Forman S. Acton

PROFESSOR EMERITUS OF COMPUTER SCIENCE
PRINCETON UNIVERSITY



THE MATHEMATICAL ASSOCIATION
OF AMERICA

WASHINGTON D.C.

Published in the United States of America by
The Mathematical Association of America.
Copyright © 1990 by Forman S. Acton
All rights reserved under International and Pan-American Copyright
Conventions.

This book was updated and revised from the 1970 edition
published by Harper & Row, Publishers.

Library of Congress Catalog Card Number 90-62538
ISBN 0-88385-450-3

Manufactured in the United States of America

Cover by Forman S. Acton

To My Parents

CONTENTS

PREFACE-90 xiii

TO THE INSTRUCTOR xv

TO THE STUDENT xix

**0. THE RAILROAD RAIL PROBLEM—
AN ESSENTIAL PREREQUISITE** 3

PART I—FUNDAMENTAL METHODS

1. THE CALCULATION OF FUNCTIONS 5

Wherein the student is introduced to the table-less computer that must evaluate its transcendental functions by divers means. Among others, the power series, continued fraction, and rational function approximations for the arctangent are displayed. Infinite products and asymptotic series appear briefly. We recommend recurrence relations for the evaluation of orthogonal series. In our final example we approximate, at length, a function defined by a quadrature over an infinite interval.

2. ROOTS OF TRANSCENDENTAL EQUATIONS 41

False Position, Newton's method and more specialized techniques introduce the basic ideas of iteration. Double root difficulties and elementary rate-of-convergence estimations are hidden among more important topics such as the need for good starting values and the geometric ideas that lead to workable algorithms. Divergence and significant figure loss make their debut. As a summary example, we analyze the solutions of $(\rho x + q)e^x = rx + s$ in considerable detail.

3. INTERPOLATION—AND ALL THAT! 89

Being the irreducible minimum about interpolation that an engineer needs to know. Bessel's, Everett's and Aitken's methods are exhibited and recommended. Lagrangian interpolation is praised for analytic utility and beauty but deplored for numerical practice. A short chapter.

4. QUADRATURE 100

Simpson, Gauss, and the method of undetermined coefficients are recommended. Extrapolation to the limit à la Romberg appears briefly. Considerable effort goes into dealing with infinite ranges of integration. Simple singularities of the integrand enter, menacingly, just before the end.

5. ORDINARY DIFFERENTIAL EQUATIONS— INITIAL CONDITIONS 129

We introduce extrapolation from initial conditions mostly in the context of predictor-corrector algorithms. Runge-Kutta is mentioned only as a good way to start. The philosophy of Bulirsch and Stoer is exhibited. We discuss the stability of Milne's method before passing to "stiff" equations and other forms of trouble that, if ignored, can wreck *any* standard integration scheme.

6. ORDINARY DIFFERENTIAL EQUATIONS— BOUNDARY CONDITIONS 157

Algebraic replacement of the two-point boundary value problem on a grid quickly leads to the solution of tridiagonal algebraic systems. Infinite ranges reappear, and a sample problem is

solved. We then solve a slightly nonlinear differential equation — and the student finally learns how nasty the world really is. We offer him a Hobson's choice between linearized algebraic iteration and a retreat to initial value integration techniques (iterated).

7. STRATEGY VERSUS TACTICS— ROOTS OF POLYNOMIALS 178

A discussion of some of the better methods, emphasizing both the need for an overall plan and the futility of trying to solve everybody's polynomial with a single system. We prefer Newton's method for refining isolated real roots, isolated complex roots, and isolated quadratic factors. Stepping searches, division of one polynomial by another, the Forward-Backward division algorithm, Lin's method for quadratic factors of difficult quartics, and Laguerre's method receive various amounts of attention. Root-squaring is not recommended. After discussing the *desiderata* for a public root-finding computer package, we finally raise the spectre of Wilkinson's pathologic polynomial.

8. EIGENVALUES I 204

An introductory discussion of the power method for finding the extreme eigenvalues of symmetric matrices. Three vibrating masses briefly introduce the subject. Shifting an eigenvalue into prominence and the art of running orthogonal to an extreme eigenvector are treated. A final section points to the unsymmetric eigenproblem but does not discuss it in realistic detail. In this chapter a brief exposure to the ideas and typography of vectors and matrices is helpful, although a lack of it should not stymie the student.

9. FOURIER SERIES 221

We stress the practical evaluation of Fourier series by recurrence relations, especially the finite Fourier series with its summation orthogonalities. Prior removal of singularities, suppression of the Gibb's phenomenon, and the role of various kinds of symmetry appear. We conclude with an extension of the recurrence scheme to polynomials orthogonal over a finite irregular set of points and a mere mention of the exponential formalism of the finite Fourier transform.

INTERLUDE—WHAT NOT TO COMPUTE—
A BRIEF CATHARTIC ESSAY**PART II—DOUBLE TROUBLE****10. THE EVALUATION OF INTEGRALS 261**

A detailed examination of two definite integrals as functions of their parameters. We find representations for them as power series, differential equations, asymptotic series, and rational functions. Our emphasis falls on assessing and removing the singularity—and the need for the economization procedures of Chapter 12.

**11. POWER SERIES, CONTINUED FRACTIONS,
AND RATIONAL APPROXIMATIONS 279**

A convenient cookbook of algorithms for transforming infinite series into continued fractions of several kinds, and vice versa—not to mention rational functions. The important quotient-difference algorithm appears.

12. ECONOMIZATION OF APPROXIMATIONS 289

A discussion of the ideas underlying economization of power series and rational functions, especially via Chebyshev polynomials and minimax criteria. Remes's second algorithm appears. We also actually compute some approximations—using both direct economization and Maehly's method for fitting the discrepancy, or "tail," of the rational function.

13. EIGENVALUES II—ROTATIONAL METHODS 316

A Wilkinsonian treatment of rotational methods for symmetric and unsymmetric matrices. Similarity and orthogonal transformations to produce tridiagonal and Hessenberg forms introduce the reductions of Jacobi, Givens, and Householder. We discuss root finding from characteristic polynomials expressed as a tridiagonal matrix. Sturmian sequences and some forms of degeneracy appear. The LR , QR , and Cholesky separations for nearly simultaneous liberation of all eigenvalues are described.

Work loads required by the commoner matrix configurations lead to general recommendations. Finally, we talk about finding *eigenvectors*—something not everyone really wants.

14. ROOTS OF EQUATIONS—AGAIN 361

A return to the subject of Chapter 2, but this time in several dimensions and for a hopefully more experienced clientel. We point out more difficulties than we solve. The emphasis is on describing several reasonable strategies plus a plea that you seek strategies suitable to the particular problem. The chapter closes with three detailed examples of iterative procedures suggested by their geometries.

15. THE CARE AND TREATMENT OF SINGULARITIES 410

How to seek and destroy singularities in integrands and integrals. The use of trigonometric and elliptic function transformations. Logarithmic singularities. By way of example, five nasty integrals are tamed. Above all, a reiterated warning against wishful avoidance of singularities.

16. INSTABILITY IN EXTRAPOLATION 431

A description of numerical cancer: the insidious erosion of otherwise useful algorithms by exponentially amplified errors. We find the evil in recurrence relations, ordinary differential equations integrated from initial conditions, and in parabolic partial differential equations. We stress the distinction between finite difference replacements that are unstable and those that are merely imprecise.

17. MINIMUM METHODS 448

An exposition of some of the more effective ways to find minima in several dimensions, with a plea that other strategies for solving your problem be tried first. Stepping searches, ray minimum methods, and ellipsoidal center seekers appear. The influence of both the availability and pertinence of derivative information is stressed.

18. LAPLACE'S EQUATION—AN OVERVIEW 477

The two-dimensional Dirichlet problem introduces algebraic replacement on a grid. We soon pass to strategies for solving fringed tridiagonal linear algebraic systems, including the method of alternating directions. Boundary condition replacement on irregular boundaries are glanced at and found possible, though messy. Finally, we consider the finite parallel plate condenser by four unrelated methods. Our interest centers on the problems caused by the incompleteness of the boundary and the inconspicuousness of the singularities.

19. NETWORK PROBLEMS 499

A brief postlude on a less classical computational topic. We examine traffic through Baltimore, topological sorting of nodes in an ordered network, minimum tree construction in Alabama, and flow through a network of pipes. The algorithms are by Ford and Fulkerson, Kahn, and others.

AFTERTHOUGHTS 529**BIBLIOGRAPHY 537****INDEX 541**

PREFACE-90

As I think about the reprinting of this numerical methods book, now twenty years old, I consider what Time and the PC have done to its message. In 1970 computers were ‘large’; scientists and engineers used them in laboratories; numerical software for solving various types of equations could be borrowed from a friend but was not very reliable and was poorly documented. In 1989 computers have moved into the office and into the spare bedroom of the engineer’s home. Numerical software is widely available but is not very reliable and is poorly documented. Of course Newton’s Method is 20 years older but it seems to be bearing up well. Indeed, with the advent of programs that do *analytic* differentiation, his method has become even more attractive.

The big change has been to place the capacities of the large 1970 computer in the hands of many who previously would have had to seek far and perhaps borrow time on someone else’s machine. But access to bigger memories and faster cycle times have not changed the useful algorithms; they have merely increased the sizes of the problems that now seem feasible—almost always *linear* problems. And linear algebraic algorithms and software were, and still are, the one reasonably reliable group of ‘black-boxes’. They were good enough in 1970 so that most computer users were not going to write their own; one simply had to know why one *needed* to solve a system of 100 linear equations—a question all too often ignored then, and now! But

that important question lies outside the scope of this book (and the competence of its author). He has here merely raised the minatory finger—and having writ, moves on.

New tools have appeared: symbolic mathematical packages like Maple and Mathematica* that can reduce the drudgery (and increase the accuracy) of expanding complicated expressions into Taylor series. But they do not address questions about whether expansion will be a useful tactic—and if you have never before used one of these systems you will spend much more time learning how than you would expanding the immediate problem by hand. (Don't buy a chainsaw if you only have one sapling to cut! I assume that anyone reading this book is not about to tackle a forest.)

Since 1970 the Bulirsch-Stoer algorithm, mentioned briefly herein, has achieved a small but firm place among the ordinary differential equation integrators but its enthusiastic promoters have yet to produce an exposition that could fairly be included in a book at this level. Indeed, even to more sophisticated audiences they recommend it as a black-box, saying, in effect, "Try it—you'll like it!" I have been burnt by too many black boxes to take that position. Of course I regularly use other peoples' software, but if I can't fix a numerical algorithm, I won't use it. And since I haven't used B-S, I'm in no position to urge it on the public, however felicitous it may be.

Partial differential equations at a realistic algorithmic level require a book of their own. I only attempt to show the 'flavor' of the classical, still useful Finite Difference technique and point out some of the issues that must be addressed. For some partial differential equations Finite Elements, not even mentioned before, have certainly established themselves as a serious alternative to Finite Differences (tho, in my opinion, will never eliminate them) but to add Finite Elements now would have considerably lengthened the book and raised the expository level without enabling the reader to use them even on simple problems.

My doleful conclusion is that REAL algorithmic progress during the last twenty years has been principally in specialized areas that the student will wisely avoid in a first course. But from the student's point of view that means he really doesn't have to master a lot of new esoteric material. It's the best of worlds; it's the worst of worlds.

*Trademark

TO THE INSTRUCTOR

This book discusses efficient numerical methods for the solution of equations—algebraic, transcendental, and differential—assuming an electronic computer is available to perform the bulk of the arithmetic. I wrote it for upper-class students in engineering and the physical sciences—men who have had calculus and a first exposure to differential equations. More importantly, I wrote it for students whose motivations lie in the physical world, who would get answers to “real” problems. This intended audience shapes both the content of the book and its expository method.

My principal concern has been the proper matching of the tool to the job. Conversely, it has not been the indoctrination of the student into the beauties of analysis—numerical or otherwise. Students with motivations from the physical world are best led from the specific example to the general method. They rapidly become impatient with the development of a logical superstructure for which they have seen no practical use. An average junior in engineering at Princeton will follow an unmotivated mathematical derivation or proof for about 20 minutes before writing it off as “some more mathematical Mickey Mouse.”

When a student’s principal thrust is to solve problems, the author and instructor should talk principally about how problems are solved. Methods can be introduced with geometric, sometimes heuristic, arguments. Initially at least, their justification is that they work. The student uses these methods,

achieving a sense of power in being able to solve problems that his mathematics courses seem to have ignored. Then he tries a problem on which the method falters: a singularity appears, or too many significant figures disappear, or a debilitating instability arises. Now, *and not before*, is the student willing to delve into the deeper structure of the numerical method—convinced that its established utility can be retrieved and broadened only by such an effort. At this point his calculus training can be called into necessary play; at this point he can be shown the proof, especially a constructive proof. But at no point can he be expected to enthuse over, or even to tolerate, the systematic derivation of 17 quadrature formulas via some finite difference operator calculus. He doesn't need the 17 quadrature formulas, and he doesn't need to know how to derive them—elegantly or at all.

The book is divided into two parts, either of which could form the basis for a one-semester course in numerical methods. Part I discusses most of the standard techniques: roots of transcendental equations, roots of polynomials, eigenvalues of symmetric matrices and so on. This material can profitably be learned at the sophomore or junior level and, indeed, with the increasing availability of automatic computing equipment on American campuses, much of it is already diffusing into the standard freshman and sophomore courses in mathematics, physics, and engineering.

Part II cuts across the basic tools, stressing such common problems as instabilities in extrapolation, removal of singularities, loss of significant figures, and so on. It also introduces some of the methods that are useful with the larger problems associated with partial differential equations. At Princeton many students take the material of Part II as their first formal course in numerical methods—having absorbed the earlier material largely by osmosis. Some remedial reference to Part I is occasionally needed, but surprisingly little has been necessary in the last two years. The material of Part II is normally taken at Princeton by juniors and seniors.

I have tried to write a readable book. Clarity in presenting major points often requires the suppression of minor ones, at least temporarily. Thus the trained mathematician will encounter statements that are “incorrect” in the sense that all the qualifications and exceptions necessary to make them precise are not set forth nearby. The instructor may wish to warn the students about these inaccuracies and even to supply the lacunae, but here I would recommend caution. An excess of fleshy detail before the student has a firm skeleton on which to hang it is a burden that frequently will bring down the entire structure, leaving a heap of rubble that has neither beauty nor utility. Exceptional information ought to be supplied the *second* time through the subject, or when the student asks for it. The curious student who wants more complete discussions may be referred to the book by Ralston with a warning that it is written for the first-year graduate student.

One topic is largely missing: formal error analysis with its emphasis on inequalities leading to bounds on approximations. I firmly believe such an analysis should be delayed until at least the third time through a numerical method. The student oriented toward results quickly discovers that the expedient way to test his methods is to run them again at half the interval and with slightly perturbed input data. Not that this expediency will catch all inadequacies in his finite difference approximations, but it will deal with a far greater percentage of them than will any formal error analysis.

I have not usually tried to prove convergence of any iterative process. It is a commonplace that numerical processes that are efficient usually cannot be proven to converge, while those amenable to proof are inefficient. Again my plea is insufficient pertinence to the student's purpose. The best demonstration of convergence is convergence itself. Judicious introduction of these two topics at the few places where they produce insight may be desirable, but they are so formidable in typographic appearance that all but the most docile students usually skip them. I prefer to leave their formal presentation to the instructor's discretion.

Finally, pedagogical expedience strongly suggests that the teaching of programming of digital computers be clearly separated from the teaching of numerical methods for solving problems, at least at the elementary levels. Any person who has mixed the two realizes how hopelessly the two sets of difficulties become intertwined both in the minds and in the practice of the students. At the advanced level, to be sure, the interaction between programming techniques and numerical algorithms is a fruitful study, but the sophomore should be exposed to fruitful studies in homeopathic doses! We recommend that the ability to write simple programs in FORTRAN, PL/1 or ALGOL be a prerequisite to this course, while access to a reasonable computer is almost a necessity.

FORMAN S. ACTON

TO THE STUDENT

I hope you like to formulate physical phenomena into equations and then solve those equations to see how well your formulations actually predict experimental results. It is for such people that I wrote this book. But if you have tried this fascinating game, you have realized that solving the equation is frequently harder than getting it in the first place.

The complexities of theoretical formulations soon frustrate our ability to solve their equations analytically, and numerical solution methods—when performed by hand—often require days of laborious arithmetic. Thus, in the past, engineers, always under pressure to produce working devices quickly, have tended to avoid theoretical formulations. To solve anything quickly before the advent of the electronic computer meant to solve it analytically, and this usually required analytic simplification to the point where the answers had only a remote connection with the original problem. Experiment with an actual device was much quicker.

In the 1940s a big change occurred in some sectors of Engineering. Atomic explosions and jet aircraft required experiments that were no longer simple, cheap, or quick. Five years and millions of dollars were involved before a new idea for a jet engine could be pronounced successful, and the costs of an atomic test were not measured merely in money. Theoretical investigation suddenly had become a necessity for the engineer instead of a pleasant pastime. In 1950, Von Neumann's computer opportunely appeared, solidly establishing the

theoretical investigation as a practical developmental tool, sometimes *the* practical tool, and nothing has been the same since.

The incorporation of numerical methods into the engineering curriculum is only now taking place, and there is still considerable discussion over how it should be done. Thus, if you are a student, you are probably coming into an upperclass course in Numerical Methods after having had the classical exposure to calculus and differential equations that has been pretty much standard since Newton (but without Newton's numerical experience!) or so I have assumed while writing this book. (If anybody asks me, I'll be glad to suggest a quite different curriculum that I feel would be far preferable for the final quarter of the twentieth century.)

Having disposed of the question "*Why* learn about numerical methods?" let me now get around to the equally important question of *how* to learn about them. I shall be brief.

Numerical equation solving is still largely an art, and like most arts it is learned by practice. Principles there are, but even they remain unreal until you actually apply them. To study numerical equation solving by watching somebody else do it is rather like studying portrait painting by the same method. It just won't work. The principal reason lies in the tremendous variety within the subject. By contrast, analytic solution methods work for very restricted classes of problems. Thus we know how to solve ordinary differential equations analytically, provided they are linear and with constant coefficients! Let them have variable coefficients, and we become quite unsure of ourselves. If any non-linearity creeps in, you might as well give up. But all three kinds of ordinary differential equations can be solved by numerical methods—provided, of course, that a solution exists. Thus it would be quite surprising if one numerical method succeeded everywhere—and no single method does!

The art of solving problems numerically arises in two places: in choosing the proper method and in circumventing the main road-blocks that always seem to appear. So throughout the book I shall be urging you to go try the problems—mine or yours.

I have tried to make my explanations clear, but sad experience has shown that you will not really understand what I am talking about until you have made some of the same mistakes that I have made. I hesitate to close a preface with a ringing exhortation for you to go forth to make fruitful mistakes; somehow, it doesn't seem quite the right note to strike! Yet, the truth it contains is real. Guided, often laborious, experience is the best teacher for an art. If all you desire is a conversational knowledge of an art, you've chosen the wrong subject, the wrong author, and just possibly the wrong profession. It is one of the minor paradoxes of our language that, even in the 1970s, you learn how to solve real problems only by getting your hands dirty with rational numbers—although rational problems can frequently be solved only with real numbers. Good luck!

AFTERTHOUGHTS

The students in my Numerical Methods course usually have been Juniors—with a sprinkling of graduates and the occasional rather sophisticated Sophomore. Mostly they have been Engineers and Scientists. (Mathematicians at Princeton are proudly Pure while most Computer Scientists find an obligatory decimal point to be slightly demeaning.) Thus the student interest has centered on solving ‘typical’ physical problems that in practice devolve to simplified versions such as those treated in the text. Since some instructors have requested more exercises I have included some more below.

My recent practice has been to go rapidly through the first 6 chapters in as many weeks with weekly computation laboratories in which simple (pencil and pocket-calculator) problems are worked with an instructor present to get people out of mudholes onto productive paths. (These sessions are partly remedial as at least half of my students have had some exposure to these early topics in a first computer programming course that contained considerable numerical methods.)

In the second half of the semester I cover topics from the rest of the book according to the perceived class interests but the computational homework has been devoted entirely to one half-term project—each student’s problem being unique. I feel strongly that somewhere in the undergraduate scientific curriculum the student should be asked to work a problem to which

he does not know the answer and for which the answer, when found, should not proclaim its correctness. In most underclass courses the answers to the exercises are known *a priori*: they are in the back of the book or they turn out to be π or $\sqrt{2}$ —or one's roommate did the problem last term. For such problems the effort goes entirely into *getting* the answer. But in realistic engineering problems somewhere between 50 and 90 percent of the effort goes into *verifying that the 'answer' obtained is, indeed, correct*. The student needs this kind of experience at least once, somewhere, and I choose to supply it here.

A problem type that has been very effective for these purposes is the preparation of an efficient computer *function* (i.e., a working, thoroughly debugged program) for an integral like

$$H(b) = \int_0^{\infty} \frac{e^{-bx}}{\sqrt{x(1+x)}} dx.$$

For large b an asymptotic series is useful; for small b a singularity has to be propitiated, analytically, before a series in b is possible—and these two approaches leave a gap that the student has to struggle to fill. One of the ground rules is that numerical quadrature is *not* to be part of the final function (too slow) although it is a necessary tool during the development. Likewise, covering the gap by interpolation in a large stored table lies outside the aesthetic framework of the exercise, although I have reluctantly accepted it for part credit when submitted as a last-ditch effort by a weak student. A mature mathematician can perform this exercise in a couple of afternoons, but a student often needs a half-semester of a course, even with considerable help. Weekly conferences with the instructor are essential; without them, there is the danger that work either is postponed into impossibility or proceeds forever down ultimately unproductive paths.

There is a whole family of similar integrals that can be assigned; generally

$$G(b) = \int_0^{\infty} \frac{e^{-bx^j}}{x^k(1+x^l)^m} dx$$

with

$$j = 1, 2 \quad k = 0, 1/2 \quad l = 1, 2 \quad m = 1/2, 1$$

that offer varying degrees of difficulty so that the problem can be tailored to the student's abilities—or ambitions. In addition to the techniques covered in the book, most of these integrals can be evaluated efficiently by rather sophisticated recurrences. When time has permitted I have derived the recurrence for the integral of page 261*—thereby tempting the better student to explore this new tool for his gap-covering algorithm.

Tests and examinations

I have usually given two 50-minute tests and a final 3-hour examination. These, together with observations available from the labs and weekly project conferences have provided a more-than-adequate basis for grading. The tests have been 'closed book' except for Abramowitz & Stegun and a pocket calculator—neither of which are usually necessary but knowing that they will be available usually keeps the students from spending time memorizing formulae. Hopefully they will have concentrated on strategic algorithmic principles. Here is a 50-minute test that is difficult to do well but one that provides good opportunities for exhibiting mastery of the course concepts.

Test

1. It is necessary to compute the sequence of 50 functions

$$F_k(b) = \int_0^1 e^{bt} t^k dt \quad k = 0, 1, \dots, 49$$

for various b that are not known at the time you must write the computer program. Integration by parts gives the recurrence

$$bF_k(b) + kF_{k-1}(b) = e^b \quad k = 1, 2, \dots$$

from

$$F_0(b) = (e^b - 1)/b$$

*Run

$$I_{n-1} = I_n + cK_n/(2n) \quad J_{n-1} = (2nJ_n + cI_{n-1})/(2n - 1) \quad K_{n-1} = K_n + J_{n-1}$$

from largish N down to 1, whence $F(b) = J_0/c/K_0$. The starting values of I_n , J_n and K_n are arbitrary but should not all be zero.

The recurrence is economical, if usable. For what values of (b, k) can the recurrence be used to deliver 10 significant figures (or 10 decimals, if you prefer) on a 13 digit machine?

2. a) How would you integrate

$$b \frac{d^2 u}{dt^2} + \frac{a}{t} \frac{du}{dt} + u^3 = 0$$

from the initial conditions

$$u(0) = 1 \quad \frac{du}{dt}(0) = 0$$

for various (a, b) ?

- b) If the coefficient b is large (say, 1000), what effect will it have on your favored process?
3. A large number of peculiar quintic polynomials are to be solved for all their real roots that lie on the range $(-10, 10)$. These polynomials are peculiar because the coefficient of their x^5 term is typically smaller than the other coefficients by at least a factor of 100. Five algorithms are listed below.
- a) Write 2 or 3 sentences about each, explaining how it can be applied to this problem (if at all) and comment on its usefulness.
- b) Give *your* recommendation for handling this problem—not necessarily from the list—and defend it.
1. Forward-Backward Division
 2. Newton's Method
 3. Binary Chop
 4. Lin's Method
 5. Lehmer's (concentric circles) Method

Exercises

These exercises are intended to be performed with pencil, paper and a pocket calculator. Most are 'remedial' in the sense that, ideally, students taking this course should be able to do them in relatively short order—say, 5 to 20 minutes each—on the basis of prior experience. Since many lack that experience, I have given them in supervised laboratories where individual guidance is available before too much frustration sets in.

Precision Problems

1. How would you evaluate

$$\ln\sqrt{x+1} - \ln\sqrt{x}$$

for large x without losing significant figures? Compare your method with direct evaluation for $x = 123456.7$.

2. Find the behavior of

$$\ln \left[\frac{\sqrt{1+x^2} - x}{\sqrt{1+x^2} + x} \right]$$

a) for large x

b) for x near zero

and then suggest how the function should be evaluated.

3. Evaluate

$$w(x) = 1 + \frac{1}{2} \tanh x^2 - \cosh x$$

for $x = 0.1$

a) as expressed here

b) from a series expansion

Keep all arithmetic to 10 significant figures if possible. Where and how does error arise?

4. Consider evaluating

$$\frac{\cosh x}{2 - \cos x} \quad x \geq 0$$

and then decide how you would solve for

$$\frac{\cosh x}{2 - \cos x} = 1 + \epsilon$$

for small ϵ .

5. How should one solve $\tan \theta = B$ for θ if B is greater than 10? Assume you do not have specialized tables.
6. Devise iterative computational algorithms for solving

$$\frac{\tanh x}{\arctan x} = b$$

for x when

a) $b = s$ near $2/\pi$

b) b is near 1

without serious instability or loss of significance. Estimate the range of applicability of your algorithms.

7. Consider the quadratic equation obtained by eliminating either the $\sin^2 x$ or $\sinh^2 y$ term from the equation pair

$$\beta = \sin^2 x + \sinh^2 y \quad \beta = u^2 + v^2$$

$$\alpha \tanh^2 y = \tan^2 x \quad \alpha = u^2/v^2$$

as a method for determining x and y when (u, v) are given. Where are the trouble spots? What has to be done to avoid significant figure loss? How many separate algorithms do you end up with via this approach?

8. Examine the limiting behaviors of

$$\frac{\sin x}{1 + \cos x} \quad \text{and} \quad \frac{\sinh x}{\cosh x - 1}$$

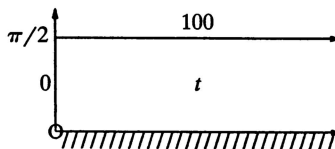
as x approaches zero (from each side).

Conformal mapping

[The student should have seen complex variables in their rectangular and polar forms, but no course in the subject is presumed. The instructor should do a mapping first—perhaps $z = \sin t$ using the first quadrant of t .]

9. Find the complex z -map of the figure under

$$z = \tanh t$$



labelling the critical points.

10. Consider the mapping from t to w of the figure in Problem 9 via

$$\sin w = \tanh t.$$

Compare the final potential problem with the original one.

11. Devise an algorithm to evaluate a point w that corresponds to a *complex* value of t near $(0, i\pi/2)$.

Singularity removal

12. Find a series in b for

$$F(b) = \int_0^1 \frac{dx}{\sqrt{1 - bx^3}} \quad (a)$$

when b is small. How many terms are needed to obtain approximately 8 significant figures when b is 0.5? For what ranges of b values is the series practical? Then transform

$$\int_0^1 \frac{dx}{\sqrt{1 - x^3}}$$

to remove the singularity, sketch, estimate its value. Devise a method for evaluating $F(1 - \beta)$ when β is small. [*Hint*: Transform the dummy variable in (a) so that the parameter is in the *limit* rather than in the integrand. Then consider an intergral that is related to the difference between $F(1)$ and $F(b)$.]

BIBLIOGRAPHY

- Abramowitz, M., and I. Stegun, *Handbook of Mathematical Functions* (AMS 55), National Bureau of Standards, Washington, D.C., U.S. Government Printing Office, 1964.
- Acton, F. S., *Analysis of Straight-Line Data*, New York, Dover, 1966.
- “Algorithms for elliptic functions and elliptic integrals,” *Numerische Mathematik*, 5; also see *CACM*, 4 (1961), 180, 543; *CACM*, 6 (1963), 166; *CACM*, 9 (1966), 12.
- Bowman, F., *Introduction to Elliptic Functions*, New York, Dover, 1961.
- Bulirsch, R., and S. Stoer, “Numerical treatment of ordinary differential equations by extrapolation methods,” *Numerische Mathematik*, 8 (1966), 1–13, 93–104.
- Churchill, R. V., *Fourier Series and Boundary Value Problems*, New York, McGraw-Hill, 1941.
- Clenshaw, C. W., “A note on the summation of Chebyshev series,” *MTAC*, 9 (1955), 118–120.
- Comrie, L. J., *Chambers’s Shorter Six-Figure Mathematical Tables*, London and Edinburgh, W. and R. Chambers, 1966.

- Comrie, L. J., *Chambers's Six-Figure Mathematical Tables*, Vols. I and II, London and Edinburgh, W. and R. Chambers, 1949.
- Fletcher, R., and M. J. D. Powell, "A rapidly convergent descent method for minimization," *Computer J.*, 6 (1963), 163–168.
- Ford, L. R., Jr., "Maximal flows through a network," *Can. J. Math.*, 8 (1956), 399–404.
- Ford, L. R., Jr., and D. R. Fulkerson, "A simple algorithm for finding maximal network flows and an application to the Hitchcock problem," Santa Monica, RAND Corp., P-743, Sept. 1955.
- Forsythe, G. E., and W. R. Wasow, *Finite-Difference Methods for Partial Differential Equations*, New York, Wiley, 1960.
- Gentleman, W. M., and G. Sande, "Fast Fourier transforms—for fun and profit," *Proc. Fall Joint Computer Conf.* (1966), 563–578.
- Goldfeld, S. M., R. E. Quandt, and H. F. Trotter, "Maximization by improved quadratic hill-climbing and other methods," *Econometrics Res. Program Res. Mem.* 95, Princeton University, April 1968.
- Goldfeld, S. M., R. E. Quandt, and H. F. Trotter, "Maximization by quadratic hill-climbing," *Econometrica*, 34 (1966), 541–551.
- Graffe, C. H., *Die Auflösung der höheren numerischen Gleichungen*, Zurich, F. Schilthess, 1837.
- Hamming, R. W., *Numerical Methods for Engineers and Scientists*, New York, McGraw-Hill, 1962.
- Hartree, D. R., *Numerical Analysis*, New York, Oxford University Press, 1958.
- Hastings, C., *Approximations for Digital Computers*, Princeton, N.J., Princeton University Press, 1955.
- Isaacson, E., and H. B. Keller, *Analysis of Numerical Methods*, New York, Wiley, 1966.
- Jahnke-Emde, *Tables of Functions with Formulae and Curves*, 4th ed., New York, Dover, 1951.
- Kahn, A. B., "Topological sorting of large networks," *CACM*, 5 (1962), 558–562.
- Kantorovich, L. V., and V. I. Krylov, *Approximate Methods of Higher Analysis* (translated by C. D. Benster), Groningen, Noordhoff, 1958.
- Klein, M., "Scheduling project networks," *CACM*, 10 (1967), 225–230.

- Knuth, D. E., *Fundamental Algorithms*, Reading, Mass., Addison-Wesley, 1968.
- Kogbetliantz, E. G., "Generation of elementary functions," in *Mathematical Methods for Digital Computers*, Vol. 1, A. Ralston and H. F. Wilf, eds., New York, Wiley, 1960.
- Kuiken, H. K., "Determination of the intersection points of two plane curves by means of differential equations," *CACM*, 11 (1968), 502–506.
- Lance, G. N., *Numerical Methods for High Speed Computers*, London, Iliffe and Sons, 1960.
- Lanczos, C., *Applied Analysis*, Princeton, N.J., Van Nostrand, 1956.
- Lasser, D. J., "Topologically ordering of a list of randomly numbered elements of a network," *CACM*, 4 (1961), 167–168.
- Lehmer, D. H., "A machine method for solving polynomial equations," *JACM*, 8 (1961), 151–162.
- Lin, S. N., "Numerical solution of complex roots of quartic equations," *J. Math. and Phys.*, 26 (1947), 279–283.
- Maehly, H., "Methods for fitting rational approximations. Part I: Telescoping procedures for continued fractions," *JACM*, 7 (1960), 150–162.
- Maehly, H., "Methods for fitting rational approximations. Parts II and III," *JACM*, 10 (1963), 257–277 . . . (equation 11.5 on p. 269 is in error).
- Maehly, H., "Rational approximations for transcendental functions," internal report, Mathematics Department, Princeton University, 1956.
- Milne, W. E., *Numerical Calculus*, Princeton, N.J., Princeton University Press, 1949.
- Milne, W. E., *Numerical Solution of Differential Equations*, New York, Wiley, 1953.
- Nicholson, T. A. J., "Finding the shortest route between two points in a network," *Computer J.*, 9 (1966), 275–280.
- Oliver, J., "Relative error propagation in the recursive solution of linear recurrence relations," *Numerische Mathematik*, 9 (1967), 321–340.
- Olver, F. W. J., "The evaluation of zeros of high-degree polynomials," *Phil. Trans. Roy. Soc. London, A*, 244 (1952), 385–415.
- Powell, M. J. D., "An efficient method for finding the minimum of a function of several variables without calculating derivatives," *Computer J.*, 7 (1964), 155–162.

- Powell, M. J. D., "An iterative method for finding stationary values of a function of several variables," *Computer J.*, 5 (1962), 147–151.
- Ralston, A., *A First Course in Numerical Analysis*, New York, McGraw-Hill, 1965.
- Ralston, A., and H. F. Wilf, eds., *Mathematical Methods for Digital Computers*, Vol. 1, New York, Wiley, 1960.
- Rosser, J. B., "A Runge–Kutta for all seasons," *SIAM Rev.*, 9 (1967), 417–452.
- Rutihäuser, H., "Deflation bei Bandmatrizen," *Z. Angew. Math. Phys.*, 10 (1959), 314–319.
- Rutihäuser, H., "Der quotienten-differenzen Algorithmus," *Z. Angew. Math. Phys.*, 5 (1954), 496–507.
- Sneddon, I. N., *Mixed Boundary Value Problems in Potential Theory*, Amsterdam, North-Holland, 1966 (and New York, Wiley).
- Spielberg, K., "Representation of power series in terms of polynomials, rational approximations, and continued fractions," *JACM*, 8 (1961), 613–627.
- Tukey, J. W., and J. W. Cooley, "An algorithm for the machine calculation of complex Fourier series," *Math. of Comp.* 19 (1965), 297–301.
- Wilkinson, J. H., *The Algebraic Eigenvalue Problem*, London, Oxford, 1965.
- Wilkinson, J. H., "The evaluation of the zeros of ill-conditioned polynomials, part 1," *Numerische Mathematik*, 1 (1959), 150–166.
- Wilkinson, J. H., "Householder's method for the solution of the algebraic eigenproblem," *Computer J.*, 3 (1960), 23–27.
- Wynn, P., "Transformations to accelerate the convergence of Fourier series," *MRC Tech. Sum. Rep. 673*, U.S. Army Mathematics Research Center, University of Wisconsin, July 1966.

INDEX

- accelerating convergence, by Aitken extrapolation, 216
 - by shifting eigenvalues of a matrix, 215
 - of Gauss-Seidel iterations, 480, 483
- activities, *see* PERT
 - activities represented as edges of a graph, 508
 - events represented as nodes of a graph, 508
- Adams–Bashforth, 146
- adaptive quadrature, 105
- Aitken extrapolation, 216
- Aitken interpolation, 93
- Alabama, 516
- alternating directions, method of, 483
- alternating series, loss of significant figures in, 14, 69
- approximating by a series of exponentials, 252
- approximating error curves by matching, at extrema, 301
- at zeros, 300
- approximating quadratic factors of polynomials, 195
- approximation for x , 26
- arctangent function, 6
 - continued fraction for, 7
 - Gauss iteration for, 9
 - series for, 6
 - series for large arguments, 30
 - series of Chebyshev polynomials for, 36
- asymptotic series, 16, 262
 - derivation of, from an integral, 17, 262
 - derivation of, from differential equations, 18
 - for $\operatorname{erfc} x$, 16
 - minimum term of, 17, 263
- backward difference in parabolic partial differential equations, 442
- backward polynomial division, 191
- Baltimore traffic, 504
- banded symmetric matrices, reduction of, 329
- Bessel functions, recursive evaluation of $J_n(x)$, 23
 - series for $J_0(x)$, 70
- Bessel's interpolation formula, 90

- binary chop, 179
- biorthogonality of the eigenvectors of
 - an unsymmetric matrix with those of its transpose, 220
- bisection method, *see* binary chop
- block tridiagonal systems, 482
- bottleneck problems in a network, 524
- boundary conditions, at infinity, 163
 - for ordinary differential equations, *see* Chapter 6
- boundary-value problems of physics, orthogonal functions defined by, 495
- bounds for integrals on infinite regions, 113
- breaking an infinite range of integration, 112
- Bulirsch and Stoer, 136
- characteristic polynomial of a matrix,
 - evaluation from tridiagonal form, 332
 - evaluation from Hessenberg form, 344
- characteristic roots, *see* eigenvalues (Chapters 8 and 13)
- characteristic value problem, *see* eigenvalue problems (Chapters 8 and 13)
- Chebyshev polynomials, 292
 - expansion of $\tan^{-1}kx$ in, 36
 - matching approximations to functions at extrema of, 301
 - minimax property of, 290, 293
 - used in economizing power series, 293
- Cholesky algorithm for factoring matrices, 348
- circle of indeterminacy, 76
- clustered roots, 363
- complex polynomial roots, 189 f.
 - by forward-backward division, 195
 - by Newton's method for quadratic factors, 194
 - by Newton's method in the complex plane, 189
- computational singularities, 65, 410
- condenser, parallel-plate, 491
 - exact map for, 497
 - integral equation for, 420, 493
 - Rosser iteration for, 495
- conformal map for the parallel-plate condenser, 497
- continued fraction, 7
 - computational forms of, 280
 - evaluation of as a rational function, 287
 - for $\arctan x$, 7
 - for $\tanh x$, 27
 - from a power series, 285
 - tail of, expression for, 312
 - truncation of, 312
- convergence of an iteration, 54, 216
 - acceleration of by Aitken extrapolation, 216
 - analytic discussion, 394 f.
- convergent iteration, construction of, 398
- corrector step, *see* predictor-corrector methods
- $\cosh z$, roots of $\cosh z = w$, by iteration, 390 f.
- cosines, series for, economized, 293, 305
 - evaluation of series of, 11
- Crank-Nicholson, 447
- critical paths in a network, 508
- curve crawlers in several dimensions, 379 f., 382
- curved boundaries, Laplace's equation, 485
- deferred approach to the limit, *see* Richardson extrapolation
- deflating a matrix, 219
- derivative, first, estimated from two points, 158
 - second, estimated from three points, 159
- derivative of a polynomial, evaluation
 - by synthetic division, 183
 - evaluation from a tridiagonal form, 334
- descent to a nearby subsurface in n dimensions, 384
- difference equation, solution of linear, 144
- difference table, 91
- direct fitting of rational approximations, 310
- direct fitting of the discrepancy, of a power series, 304
 - of a continued fraction, 311
- Dirichlet problem, 477, 488

- discontinuities, removal of to speed convergence of series, 233
- discovery of loops in ordered networks, 313, 315
- discrepancy caused by truncating a continued fraction, 311
- divergent iterations, 44, 145, 440
- division of one polynomial by another, 190
- double length accumulation of vector innerproducts, 343
- double root strategy in several dimensions, 401
- double roots of polynomials, 186

- economization, of a power series, 291
 - of rational functions, 308
 - of $\sin \theta/\theta$, 426
- eigenvectors, 355
 - by inverse iteration, 359
 - from specialized matrices, 356
- ellipsoids, contours of, 210, 462
 - second derivative geometries of, 461, 469 f.
 - seeking the center of, 458
 - strategy for minimization via, 474
- elliptic functions (Jacobian), 415
- elliptic integral $K(k)$, 416
 - computation of, 417
- equal-ripple error, 291 f.
 - direct production of, 299
- error amplifier, 440
- error caused by truncating a continued fraction, 311
- error function, erf (x), continued fraction for, 313
 - series representations for, 15 f.
- error growth, exponential, 440
 - linear, 216
 - quadratic, 216
- error terms for quadrature formulas, 111
- estimation of the tail of an integral, 113, 117
- exponential error, 440
- exponential fitting of data, 252
- Euler's constant, 268
- evaluating a determinant, 354
 - in Hessenberg form, 344
 - in tridiagonal form, 332
- evaluating a polynomial, by synthetic division, 59, 181
 - for complex arguments, 192–193
 - from Hessenberg form, 344
 - from tridiagonal form, 332
- evaluating e^x on a computer, 27, 28
- evaluating finite Fourier series, 11
- evaluating series of orthogonal functions, 11
- evaluating the characteristic polynomial derivative from tridiagonal form, 334
- evaluating the characteristic polynomial from tridiagonal form, 332
 - from Hessenberg form, 344
- evaluating the discrepancy caused by truncating a continued fraction, 311
- Everett's interpolation formula, 92
 - relation of coefficients to Lagrange's, 98
- e^x calculated symmetrically from $\tanh \frac{x}{2}$, 27
- exponential approximation, 252
- exponential equations, the integration of boundary-value problems leading to, 169 f.
- exponential fitting, 252
- exponential form of Fourier series, 240
- extraneous solution to a difference equation, 144
- extrapolation to the limit, Richardsonian, 106

- factorization of the second order exponential equation, 170
- False Position, method of, 52
 - rate of convergence of, 56
- False Position in 2 dimensions, 374
 - computational details, 378
 - speed of convergence, 379
- finding non-extremal eigenvalues by the power method, 218
- finding the smallest eigenvalue by shifting, 217
- finite Fourier series, 228 f.
 - discontinuity removal in, 225, 233
 - for unequally spaced points, 238
 - improving the convergence of, 225

- finite Fourier series, (*Continued*)
 in exponential form, 239–242
 number of terms possible, 222, 230
 recursive calculation of the coefficients, 231
 recursive evaluation, 11
 finite orthogonal polynomials on unequally spaced points, 235
 fitting a cubic to two functional values and two derivatives, 454 f.
 fitting the discrepancy, 304
 Fletcher, 467
 flow through a network of pipes, 517 f.
 circuit equations for, 519
 nodal equations for, 519
 Ford, 524
 Forsythe, 483
 forward-backward division algorithm for polynomial roots, 195
 forward differences in parabolic partial differential equations, 438
 Fourier series, limit on number of coefficients for finite, 222
 optimality of, 224
 orthogonality in, 223
 rate of convergence of, 225
 recursive evaluation of, 11
 fringed tridiagonal equation systems, 480
 Fulkerson, 524
 functional iteration, convergence of, 52, 399
 starting values for, 47
 stopping, 48

 Gaussian elimination, 342, 358
 Gaussian quadrature, 103
 Gaussian triangularization, *see* Gaussian elimination
 Gauss–Seidel, 480, 483
 Gibbs phenomenon, 227
 Lanczos's σ factors for, 228
 Gill, 156
 Givens reduction of a matrix, 322, 330
 Goldfeld, 476
 gradient methods, *see* functional minimization (Chapter 17)
 gradient vector, 210, 368, 381
 Graeffe's method, 198
 Gram–Schmidt orthogonalization, 219

 graphical extrapolation of a differential equation solution, 130

 Hamming's method, (o.d.e.), 146
 Hartree, 170
 Hessenberg form, 317
 direct reduction of unsymmetric matrices to, 341
 evaluation of the characteristic polynomial from, 344
 reduction to tridiagonal form, 342
 highly oscillatory ordinary differential equations, 152
 homogeneous algebraic equations, 206
 Hotelling's deflation method for eigenvalues, 218
 Householder's reduction for symmetric matrices, 324 f.

 ill-conditioned systems, 253
 improving the convergence of series by recasting as continued fractions, 296
 as rational functions, 263
 infinite integrals, 413
 infinite integrands, 66, 120, 412
 infinite product for $\sin x$, 20
 infinite regions, quadrature over, 112
 transformation of dummy variable, 112
 initial-value treatment of boundary-value problems, 173
 innerproduct doublelength accumulation, its necessity in large linear systems, 343
 instabilities, in initial-value problems, 434
 in ordinary differential equations, 143, 434
 in parabolic partial differential equations, 436 f.
 in recurrence relations, 21, 432
 integral equation for the parallel plate condenser, 420, 493
 integral equations, singular, 420, 493
 integration of highly oscillatory differential equations, 152
 integration of "stiff" differential equations, 148
 interchanging, example of, with a tridiagonal matrix, 358

- interior eigenvalues by orthogonalization, 218
- interpolation, special methods for, 98
- interpolation formulas, *see* Chapter 3
- Aitken, 93
- Bessel, 90
- by the method of undetermined coefficients, 108
- Everett, 92
- higher order, 90
- Lagrange, 96
- quadratic, 90
- unequally spaced values, 95
- inverse iteration for eigenvectors, 357
- isoclines, *see* graphical extrapolation
- of a differential equation solution
- isolated roots, 81
- iterated multiplication, 211
- iterated vector, multiplication by a matrix, 214
- iteration method for the largest eigenvalue, 213
- iterative solution of a quadratic, 58
- Jacobi plane rotation, 319
- comparative inefficiency of for eigenvalues, 321
- Jacobian elliptic functions: sn , cn , dn , computation of, 417
- properties, 415
- Kahn, 512
- Lagrange's interpolation formula, 96, 108
- disadvantages of, 96
- Lagrangian interpolation coefficients, 96
- their relation to Everett's, 98
- Laguerre's method for polynomial roots, 187, 335
- Laplace's equation, *see* Chapter 18
- bordered tridiagonal form from, 480
- closed boundary, 477 f.
- curved boundary conditions, 485
- normal derivative boundary conditions, 488
- open boundary, 491 f.
- latent roots, *see* eigenvalues (Chapters 8 and 13)
- latent vectors, *see* eigenvectors
- Least-Squares fitting, 25, 253
- least-squares property of orthogonal expansions, 223–225
- Lehmer method for polynomials, 196
- linear convergence, 216
- linear error, 216
- linearization of nonlinear differential equations, 171–173
- Lin's method for quartics with complex roots, 198
- list representation of a network, 501, 503
- $\ln x$, integral representation for, 268
- Lobashevski, *see* Graeffe
- loop detection in an ordered network, 513, 515
- loss of significant figures by subtraction, 72
- loss of significant figures in alternating series, 14, 69
- LR algorithms, 346
- convergence of, 348
- for tridiagonal forms, 350
- Madelung transformation, 154
- Maehly, 296
- maximal network flows, Ford and Fulkerson's algorithm for, 524
- method of undetermined coefficients, 108
- Milne's method, *see* colorplate opposite 132
- instability of, 143
- minimum methods, *see* Chapter 17
- downhill, 451
- ray minimum, 452
- with first derivatives, 467
- without derivatives, 464
- minimum path through a network, 504 f.
- minimum spanning tree for a network, 516
- minimum term of asymptotic series, 17, 263
- multiple eigenvalues, 339
- multiple roots, 75
- indeterminacy near, 76
- precision in calculating, 76
- rate of convergence to, 77
- speeding convergence near, 77
- suppression of known roots near, 78
- nearly* multiple roots, 78

- negligible terms of cubics (quartics, quadratics), 59
- neighborhood array, 501
- network equations from the topology, 520
- network flows, nodal equations for, 519
 - circuit equations for, 519
- Newton–Cotes quadrature, 102
 - rate of convergence, 106
- Newton’s method, 51
 - for double polynomial roots, 186
 - for double roots, 64
 - for quadratic polynomial factors, 194
 - for second-order boundary-value problems in ordinary differential equations, 175–176
 - for simple polynomial roots, 180
 - in n dimensions, 367
 - in two dimensions, 194, 369
 - one-dimensional, in n -space, 369
 - rate of convergence of, 54
 - utility of, in higher dimensions, 366
- nodal matrix for a network, 501
- noise amplifier, 439
 - suppressor, 440
- nonlinear differential equations,
 - linearization of, 172
- non-polynomial behavior, need for removing, 120
- normalization, of homogeneous equations, 208
 - of orthogonal functions, 229
 - of vectors, 208, 213
- numerical indeterminacy, 76
- ordinary differential equations, initial value problems, *see* Chapter 5
 - instabilities in numerical integration, 143
 - Milne’s method, *see* colorplate opposite 132
 - predictor corrector methods, 130
 - Runge–Kutta methods, 139
- ordinary differential equations, boundary value problems, *see* Chapter 6
 - mildly nonlinear systems, 171
 - treated as initial-value problems, 173
- orthogonal expansions, least-squares property of, 224
- orthogonal functions, evaluating series of, 11
- orthogonal polynomials on a discrete set of points, 235
- orthogonal reductions of matrices to Hessenberg form, 340 f.
 - to tridiagonal form, 325
- orthogonality in Fourier series, 223
- orthogonality of the eigenvectors of symmetric matrices, 211
- orthogonalizing a vector with respect to another, 219, 380
- oscillatory infinite integrals, 117
- parabolic partial differential equations, 437 f.
 - backward difference algorithms, 442
 - forward difference algorithms, 438
 - symmetric difference algorithms, 445, 446
- parallel plate condenser, 491 f.
 - conformal map for, 494, 497
 - Fourier series solution for, 495
 - singular integral equation for, 420, 493
- pathologic polynomials, 201
- PERT, 508 f.
- perverse formulations of numerical problems, 248
- pivoting, *see* interchanging
- plane rotations for matrices, 319
- polynomial derivative evaluation, by synthetic division, 183
 - from tridiagonal form, 234
- polynomial division, 190
- polynomial evaluation, by synthetic division, 59, 181
 - from Hessenberg form, 344
 - from tridiagonal form, 332
- polynomial roots, *see* Chapter 7
 - shifting by a constant, 59
- polynomials orthogonal on a discrete set of points, 235
- position vector, 210
- power method for eigenvalues, *see* iterated multiplication
- power series, from a continued fraction, 285
 - from differential equations, 15, 269
 - from rational functions, 282

- Powell, 458, 464, 467
 predecessor vectors, 524
 predictor-corrector methods, 130
 for first order equations, 130
 for higher order equations, 140
 reversing the cycle of, 150
 stability of, 143
 preliminary adjustment of a function, 25
 proper value, *see* eigenvalues (Chapters 8 and 13)
- QD algorithms for transforming power series to and from continued fractions, 285
- QR algorithms, 347
 quadratic convergence, 216
 quadratic equations, iterative solution, 58
 quadratic factors, evaluation of, from tridiagonal forms, 337
 quadratic form of a matrix, 209
 quadratic interpolation for table compression, 90
 quadrature formulas by the method of undetermined coefficients, 108
 quadrature with increasing precision
 adaptive, 105
 Simpson's rule for, 104
- Quandt, 476
 quotient-difference (QD) algorithm, 285
- railroad rail problem, 3
 rate of convergence of Newton's method, 54
 rational function, asymptotic series
 recast as, 263
 evaluation algorithm, 287
 from continued fraction, 286
- ray minimum methods, 452
 recurrence methods, 11, 20
 recurrence relations, evaluating characteristic polynomials of tridiagonal forms by, 332
 evaluating Fourier series by, 11
 evaluating orthogonal expansions by, 11
 for $\cos n\theta$, $\sin n\theta$, 20
 for evaluating $J_0(x)$, 21, 23
 for $J_n(x)$, 23
 for Legendre polynomials, 434
 instabilities in, 21
- recursive calculation of finite Fourier series coefficients, 231
 recursive evaluation of Fourier series, 11
 reduction of banded symmetric matrices, 329
 reduction of general matrices to specialized forms, 317, 340
 reduction to small quantities, 60, 69, 74
 relative error, 49
 Remes's algorithm, 302
 removing a known root in two or more dimensions, 370 f.
 removing the singularity, need for, 121, 155, 492
 removing two singularities of the form $(b^2-x^2)^{-1/2}$, 414, 416
 replacement of Laplace's equation on a grid, 478 f.
 replacing a differential equation on a grid, 158, 478
 representing a network as a list, 503
 as a neighborhood array, 502
 as a nodal matrix, 502
 reversing the predictor-corrector cycle, 150
- Riccati equation, 149
 transformation, 149
- Richardson extrapolation, 106, 135
 role of continuity in convergence of Fourier series, 226-227
- Romberg integration, 106
 root-squaring methods, 198
 root suppression, 336, 370
 roots by minimization—a warning, 366
 roots near a minimum (maximum), 402
 roots of a polynomial, shifting, 59
 roots of $ze^{-z}-b$, 387
- rotational algorithms for eigenvalues, *see* Chapter 13
- Runge-Kutta, 139
 Rutishauser, 285
- searching for the real roots of a polynomial, 184
 secant method, 52
 rate of convergence of, 56
 series for $\tanh x$, 28
 series from differential equations, 15, 269

- series replacement of transcendental functions, 65, 74, 424
 - to reduce variables to small quantities, 74
- shifting the eigenvalues of matrices, 215
 - convergence accelerated by, 215
- shifting the root of a polynomial, 59
- significant figure loss by subtraction, 70
 - in alternating series, 14, 69
- similarity transformation, 318
- Simpson's rule, 102
- simultaneous linear algebraic equations
 - by Cramer's rule, 247
- singular integral equation, 420
- singular integrals, 120
- singularities, $(b^2-x^2)^{-1/2}$, 414
 - computational, 65 f.
 - in an integrand, 66, 120, 412
 - logarithmic, 125
 - off-stage, 413
 - removable, 414, 418
 - strength of, 67, 273
 - x^{-1} , 67, 123
- singularity in an integrand, removing,
 - 121 f., 422 f.
 - dividing out, 412
 - subtracting off, 121, 123, 412
- small quantities, storing, 71, 498
- smaller root of a quadratic, 58
- smallest eigenvalue by shifting, 217
- Spielberg, 284
- square root algorithm, 49
- stability, of functional iteration, 394, 399
 - of Milne's method, 143
 - of Newton's method, 50, 180
 - of recurrence calculations, 432
 - of the binary chop, 179
- stable iterations, construction of, 398
- starting an initial-value integration, 138
- starting values for functional iterations, 47
- statistical data, poor encoding of, 250
- stepping searches for polynomial roots, 184
 - reduction of by reciprocal transformation, 185
- "stiff" differential equations, 148
- stopping an iteration, 48
- strength of a singularity estimated from an integral, 267, 273
- Sturmanian sequence of polynomials, 334
- subtracting off the singularity, 121, 412
- summation orthogonality relations, for finite Fourier series, 228
 - for finite orthogonal polynomials, 236
- suppressing the unwanted solution in exponential second-order differential equations, 170
- suppression of known roots in Newton's method, 337
- suppression versus deflation in eigenvalue calculations, 336
- symmetric difference in parabolic partial differential equations, 445
- symmetry in Fourier series, 222
- synthetic division, 59, 181
 - first derivatives from, 183
 - efficient polynomial evaluator, 182
- $\tanh u$, continued fraction for, 27
- throwback of fourth differences onto second differences, 91
- topological ordering of network nodes, 509 f.
 - by Kahn's algorithm, 512
 - by Klein's algorithm, 513
 - by Knuth's algorithm, 513
 - by Lasser's algorithm, 510
- traffic, Baltimore, 503
- trees, *see* networks
- tridiagonal equations, 161-162, 481
- tridiagonal form, evaluation of characteristic polynomial from, 332
 - LR algorithms for, 350
 - pivoting example, 358
 - QR algorithm for, 352
 - quadratic factors from, 337
 - zeros in, 334
- trigonometric approximation, *see* Fourier series (Chapter 9)
- Trotter, 476
- truncation error, in parabolic partial differential equations, 445
 - in quadrature formulas, 102, 111
 - in replacements for Laplace's equation, 488
- two-point functional iteration, 52
- undetermined coefficients, method of, 108

- unimportant terms of an equation, 58
- unsymmetric matrices, eigenvalues of, 220, 340
- unvisualizable roots, 365
- unwanted solutions in second-order differential equations, suppression of, 170
- vector orthogonalization, 219
- vibrating masses, eigenproblem for, 204
- Wasow, 483
- Wilkinson's pathologic polynomial, 201
- work requirements for eigenvalue determinations, 353

Numerical Methods That Work deals with a common sense approach to numerical algorithms for the solutions of equations: algebraic, transcendental, and differential. It assumes that a computer is available for performing the bulk of the arithmetic. The book is divided into two parts, either of which could form the basis for a one-semester course in numerical methods. Part I discusses most of the standard techniques: roots of transcendental equations, roots of polynomials, eigenvalues of symmetric matrices and so on. Part II cuts across the basic tools, stressing such common problems as instabilities in extrapolation, removal of singularities, and loss of significant figures. The book is written with clarity and precision, intended for practical rather than theoretical use.

“An eminently readable and very well motivated introductory text.”
Mathematics of Computation

“A first-rate book which can be used either as a text or reference.”
Choice



Forman Acton is Professor Emeritus of Computer Science from Princeton University.

Cover Design: Barbieri & Green