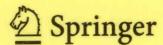
INTERDISCIPLINARY
APPLIED MATHEMATICS

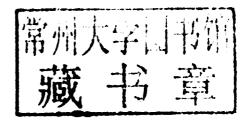
# Practical Bifurcation and Stability Analysis

**Third Edition** 



# Practical Bifurcation and Stability Analysis

Third Edition





Rüdiger Seydel Universität zu Köln Mathematisches Institut Weyertal 86-90 50931 Köln Germany seydel@math.uni-koeln.de

Series Editors
S.S. Antman
Department of Mathematics and
Institute for Physical Science and
Technology
University of Maryland
College Park, MD 20742
USA
ssa@math.umd.edu

L. Sirovich
Department of Biomathenatics
Laboratory of Applied Mathematics
Mt. Sinai School of Medicine
Box 1012
NYC 10029
USA
Lawrence.Sirovich@mssm.edu

J.E. Marsden
Control and Dynamical Systems
Mail Code 107-81
California Institute of Technology
Pasadena, CA 91125
10122 Torino
USA
marsden@cds.caltech.edu

ISBN 978-1-4419-1739-3 e-ISBN 978-1-4419-1740-9 DOI 10.1007/978-1-4419-1740-9 Springer New York Dordrecht Heidelberg London

MSC 2010: 34C, 65P, 34A, 34B, 34D, 35B32, 37M, 37N, 65L07, 70Kxx, 70-08, 70K, 76E30, 92-08

Library of Congress Control Number: 2009941054

### © Springer Science+Business Media, LLC 2010

All rights reserved. This work may not be translated or copied in whole or in part without the written permission of the publisher (Springer Science+Business Media, LLC, 233 Spring Street, New York, NY 10013, USA), except for brief excerpts in connection with reviews or scholarly analysis. Use in connection with any form of information storage and retrieval, electronic adaptation, computer software, or by similar or dissimilar methodology now known or hereafter developed is forbidden.

The use in this publication of trade names, trademarks, service marks, and similar terms, even if they are not identified as such, is not to be taken as an expression of opinion as to whether or not they are subject to proprietary rights.

Printed on acid-free paper

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

### **Preface**

Fifteen years have elapsed after the second edition of *Practical Bifurcation* and *Stability Analysis* was published. During that time period the field of computational bifurcation has become mature. Today, bifurcation mechanisms are widely accepted as decisive phenomena for explaining and understanding stability and structural change. Along with the high level of sophistication that bifurcation analysis has reached, the research on basic computational bifurcation algorithms is essentially completed, at least in ordinary differential equations. The focus has been shifting from mathematical foundations towards applications.

The evolution from equilibrium to chaos has become commonplace and is no longer at the cutting edge of innovation. But the corresponding methods of practical bifurcation and stability analysis remain indispensable instruments in all applications of mathematics. This constant need for practical bifurcation and stability analysis has stimulated an effort to maintain this book on a present-day level. The author's endeavor has resulted in this third edition. It is based on more than three decades of practical experience with the subject, and on many courses given at several universities.

Like the previous editions, this third edition consists of three parts. In the first part (Chapters 1 to 3) an introduction into bifurcation and stability phenomena is given, basically restricted to models built of ordinary differential equations. Phenomena such as birth of limit cycles, hysteresis, or period doubling are explained. The second part (Chapters 4 to 7) introduces computational methods for analyzing bifurcation and stability. This includes continuation and branch switching as basic means. The final part (Chapters 8 and 9) gives qualitative insight that may help in understanding and assessing computational results. Such an interpretation of numerical results is based on singularity theory, catastrophe theory, and chaos theory.

This book emphasizes basic principles and shows the reader how the methods result from combining and, on occasion, modifying the underlying principles. The book is written to address the needs of scientists and engineers and to attract mathematicians. Mathematical formalism is kept to a minimum; the style is not technical, and is often motivating rather than proving. Compelling examples and geometrical interpretations are essential ingredients in the style. Exercises and projects complete the text. The book

is self-contained, assuming only basic knowledge in calculus. The extensive bibliography includes many references on analytical and numerical methods, applications in science and engineering, and software. The references may serve as first steps in finding additional material for further research.

The book attempts to provide a practical guide for the performance of parameter studies.

### New in This Edition

This third edition has been partly reorganized. The main change is a newly written Chapter 3. The third chapter of the second edition was removed, part of its contents was added to the fourth chapter. The new Chapter 3 is devoted to applications and extensions of standard ODE approaches. It includes brief expositions on delay differential equations, on differential-algebraic equations, and on pattern formation. This last aspect is concentrating on reaction-diffusion problems with applications in nerve models. Finally, this new third chapter addresses the aspect of deterministic risk, which can be tied to bifurcation. Applications include production of blood cells, dry friction, a flip-flop circuit, Turing bifurcation, and an electric power generator.

In addition to the new Chapter 3, several new sections have been inserted. In Chapter 5, the new Section 5.5 summarizes the information on second-order derivatives. In Chapter 7, on periodic orbits, the Section 7.6 on numerical aspects of bifurcation was enlarged. In Chapter 9, the section on fractal dimensions has been extended, and a new section has been added on the control of chaos, with focus on the OGY method.

Apart from these expanded sections, the entire book has been thoroughly reworked and revised. There are many new figures, while other figures have been improved. A considerable number of new references guide the reader to some more recent research or applications. The additions of this third edition are substantial; this may be quantified by the increase in the number of pages (+16%), figures (+19%), or references (+22%). The author has attempted to follow the now generally adopted practice to use branching and bifurcation as synonyms.

### How to Use the Book

A path is outlined listing those sections that provide the general introduction into bifurcation and stability. Readers without urgent interest in computational aspects may wish to concentrate on the following:

```
Sections 1.1 to 1.4;
all of Chapter 2;
part of Chapter 3;
part of Section 5.4.2, and Sections 5.5, 5.6.4, and 5.6.5;
Section 6.1, example in Section 6.4, and Section 6.8;
```

Sections 7.1 to 7.4, 7.7, and 7.8; all of Chapter 8; and all of Chapter 9.

Additional information and less important remarks are set in small print. On first reading, the reader may skip these parts without harm. Readers with little mathematical background are encouraged to read Appendices 1 to 3 first. Solutions to several of the exercises are given later in the text. References are not meant as required reading, but are hints to help those readers interested in further study. The figures framed in boxes are immediate output of numerical software.

I hope that this book inspires readers to perform their own experimental studies. The many examples and figures should provide a basis and motivation to start right away.

Köln, September 2009

Rüdiger Seydel

### Notation

### Problem-Inherent Variables

- $\lambda$  scalar parameter to be varied (bifurcation parameter)
- y vector of state variables, vector function, solution of an equation
- n number of components of vectors  $\mathbf{y}$  or  $\mathbf{f}$
- f vector function, defines the dynamics of the problem that is to be solved; typical equation  $f(y, \lambda) = 0$
- t independent variable, often time
- $\dot{\mathbf{y}}$  derivative of  $\mathbf{y}$  with respect to time,  $\dot{\mathbf{y}} = d\mathbf{y}/dt$
- $\mathbf{y}'$  derivative of  $\mathbf{y}$  with respect to a general independent variable
- a, b define an interval in which t varies,  $a \le t \le b$
- x spatial variable, may be scalar or vector with up to three components
- r vector function, often used to define boundary conditions as in  $\mathbf{r}(\mathbf{y}(a), \mathbf{y}(b)) = \mathbf{0}$
- T period in case of a periodic oscillation
- γ additional scalar parameter

### Notations for a General Analysis

In particular examples, several of the following meanings are sometimes superseded by a local meaning

### Specific Versions of y and $\lambda$

- $\lambda_0$  specific parameter value of a bifurcation point
- $\mathbf{y}_0$  specific *n*-vector of a bifurcation point
- $y_i$  ith component of vector  $\mathbf{y}$
- $\mathbf{y}^{j}$  jth continuation step (j is not an exponent here), specific solution
- $\lambda_j$  specific parameter value, corresponds to  $\mathbf{y}^j$
- $\mathbf{y}^{(\nu)}$  iterates of a map. For example, Newton iterate; for  $\nu = 1, 2, \dots$  sequence of vectors converging to a solution  $\mathbf{y}$
- $y^s$  stationary solution ( $y_s$  in Sections 6.6 and 6.7)

### Integers

- k frequently, the kth component has a special meaning
- N number of nodes of a discretization
- $i, j, l, m, \nu$  other integers (Note that i denotes the imaginary unit.)

### Scalars

- [y] a scalar measure of y (cf. Section 2.2)
- $\rho$  radius
- $\vartheta$  angle
- $\omega$  frequency
- $\epsilon$  accuracy, error tolerance
- $\delta$  distance between two solutions, or parameter
- $\eta$  value of a particular boundary condition
- au test function indicating bifurcation
- $\Delta$  increment or decrement, sometimes acting as operator on the following variable; for instance,  $\Delta\lambda$  means an increment in  $\lambda$
- s arclength
- u, v functions, often solutions of scalar differential equations
- $\sigma$  step length
- p parameterization, or phase condition, or polynomial
- $c_i$  constants
- $\mu = \alpha + i\beta$  complex-conjugate eigenvalue
- $\zeta, \xi$  further scalars with local meaning

### Vectors

- **z** *n*-vector (column) in various roles, as tangent, or initial vector of a trajectory, or emanating solution, or eigenvector
- $\mathbf{z}^{tr}$  row vector (transposed column)
- **d** difference between two *n*-vectors
- h n-vector, solution of a linearization;  $\mathbf{h}_0$  or  $\mathbf{h}$  are related n-vectors
- $\mathbf{e}_i$  ith unit vector (cf. Appendix A.2)
- $\varphi$   $\varphi(t; \mathbf{z})$  is the trajectory starting at  $\mathbf{z}$  (Eq. (7.7))
- $\mathbf{w}$  eigenvector, also  $\mathbf{w}^k$
- $\mu = \alpha + i\beta$  vector of eigenvalues
- $\Lambda$  vector of parameters
- $\mathbf{Y}$  vector with more than n components, contains  $\mathbf{y}$  as subvector
- **F** vector with more than n components, contains **f** as subvector
- **R** vector with more than n components, contains  $\mathbf{r}$  as subvector
- P map, Poincaré map
- q argument of Poincaré map

### $n^2$ -Matrices (n rows, n columns)

- I identity matrix
- J Jacobian matrix  $f_y$  of first-order partial derivatives of f(y) w.r.t. y
- M monodromy matrix
- **A**, **B** derivatives of boundary conditions (Eq. (6.12))
- $\mathbf{E}, \mathbf{G}_j$  special matrices of multiple shooting (Eq. (6.21), Eq. (6.22))
- Φ, Z fundamental solution matrices (cf. Section 7.2)
- S element of a group  $\mathcal{G}$

### **Further Notations**

- $\Omega$  hypersurface
- $\mathcal{M}$  manifold
- $\mathcal{G}$  group, see Appendix A.7
- $\in$  "in," element of a set,  $\not\in$  for "not in"
- \* as superscript means "transposed"
- ln natural logarithm
- Re real part
- Im imaginary part
- $\partial$  partial derivative
- $\bar{\mathbf{y}}, \bar{\lambda}, \ \bar{\mathbf{h}}, \bar{\mathbf{z}}$  overbar characterizes approximations
- $\nabla u$  gradient of u ( $\nabla$  is the "del" operator)
- $\nabla^2 u$  Laplacian operator (summation of second-order derivatives)
- $\nabla \cdot u$  divergence of u
- := defining equation; the left side is "new" and is defined by the right-hand side; see, for example, Eq. (4.14)
- $O(\sigma)$  terms of order of  $\sigma$
- | | vector norm, see Appendix A.1

### Abbreviations

- t.h.o. terms of higher order
- w.r.t. with respect to
- DAE differential-algebraic equation (cf. Section 3.3)
- ODE ordinary differential equation
- OGY Ott-Grebogi-Yorke method (cf. Section 9.6)
- PDE partial differential equation
- UPO unstable periodic orbit

# Contents

Preface			V
Conten	ts		IX
Notatio	n		XV
Chapte	r 1 I	introduction and Prerequisites	1
1.1	A Noi	nmathematical Introduction	1
1.2	Statio	onary Points and Stability (ODEs)	8
	1.2.1	Trajectories and Equilibria	8
	1.2.2	Deviations	10
	1.2.3	Stability	11
	1.2.4	Linear Stability; Duffing Equation	13
	1.2.5	Degenerate Cases; Parameter Dependence	20
	1.2.6	Generalizations	21
1.3	Period	dic Orbits and Limit Sets	26
	1.3.1	Simulation	26
	1.3.2	Periodic Orbits	28
	1.3.3	An Analytical Method	29
	1.3.4	Trajectories in Phase Space	30
	1.3.5	Orbits with Infinite Period	31
1.4	Maps		32
	1.4.1	Occurrence of Maps	34
	1.4.2	Stability of Fixed Points	34
	1.4.3	Cellular Automata	35
1.5	Some	Fundamental Numerical Methods	38
	1.5.1	Newton's Method	38
	1.5.2	Integration of ODEs	41
	1.5.3	Calculating Eigenvalues	46
	1.5.4	ODE Boundary-Value Problems	47
	1.5.5	Further Tools	48
Exe	rcises		48

### X Contents

Chapte	r 2 Basic Nonlinear Phenomena	53
2.1	A Preparatory Example	54
2.2	Elementary Definitions	55
2.3	Buckling and Oscillation of a Beam	57
2.4	Turning Points and Bifurcation Points: The Geometric	
	View	61
2.5	Turning Points and Bifurcation Points: The Algebraic	
	View	68
2.6	Hopf Bifurcation	75
2.7	Bifurcation of Periodic Orbits	82
2.8	Convection Described by Lorenz's Equation	85
2.9	Hopf Bifurcation and Stability	93
2.10	Generic Bifurcation	99
2.11	Bifurcation in the Presence of Symmetry	108
Exe	rcises	110
Chapte		117
3.1	Delay Differential Equations	117
	3.1.1 A Simple Discretization	118
	3.1.2 Stability Analysis of a Stationary Solution	121
3.2	Nonsmooth Dynamics	123
	3.2.1 Dry Friction	124
	3.2.2 Applications	125
	3.2.3 Numerical Computation	127
	3.2.4 Switching Conditions	128
	3.2.5 Bifurcation	131
3.3	Differential-Algebraic Equations (DAEs)	131
3.4	Nerve Impulses	138
	3.4.1 Model of Hodgkin and Huxley	138
	3.4.2 Space-Clamp Dynamics	140
	3.4.3 FitzHugh's Model	142
3.5	Waves and Pattern Formation	144
	3.5.1 Waves	144
	3.5.2 Nerve Conduction	147
	3.5.3 Reaction-Diffusion Problems	149
	3.5.4 Linear Stability Analysis	149
	3.5.5 Turing Bifurcation	151
	3.5.6 Special Cases $n = 2$	152
	3.5.7 Numerical Computation	154
3.6	Deterministic Risk	156
Evo	rojene	166

	Contents	XI
Chapte	r 4 Principles of Continuation	169
4.1	Principle Tasks	170
4.2	Ingredients of Predictor–Corrector Methods	173
4.3	Homotopy	174
4.4	Predictors	177
	4.4.1 ODE Methods; Tangent Predictor	177
	4.4.2 Polynomial Extrapolation; Secant Predictor	179
4.5	Parameterizations	180
	4.5.1 Parameterization by Adding an Equation	180
	4.5.2 Arclength and Pseudo Arclength	182
	4.5.3 Local Parameterization	183
4.6	Correctors	184
4.7	Step Controls	187
4.8	Practical Aspects	190
4.9	What Else Can Happen	193
4.10	The Art and Science of Parameter Study	196
	rcises	197
Chapte	r 5 Calculation of the Branching Behavior of	
Nonline	ear Equations	199
5.1	Calculating Stability	199
	5.1.1 Accuracy Problems	200
	5.1.2 Applying the QR Method	200
	5.1.3 Alternatives	202
5.2	Bifurcation Test Functions	203
5.3	Indirect Methods for Calculating Bifurcation Points	207
	5.3.1 Interpolation with Test Functions	207
	5.3.2 Approximation of Turning Points	209
	5.3.3 Inverse Interpolation	210
5.4	Direct Methods for Calculating Bifurcation Points	212
	5.4.1 The Branching System	213
	5.4.2 An Electrical Circuit	217
	5.4.3 A Family of Test Functions	220
	5.4.4 Direct Versus Indirect Methods	222
5.5	Analyzing the Singular Matrix	226
	5.5.1 Simple Rank Deficiency	226
	5.5.2 Second-Order Derivatives	228
	5.5.3 How to Get it Nonsingular	230
5.6	Branch Switching	231
	5.6.1 Constructing a Predictor via the Tangent	232
	5.6.2 Predictors Based on Interpolation	232
	5.6.3 Correctors with Selective Properties	235
	5.6.4 Symmetry Breaking	237
	5.6.5 Coupled Cell Reaction	238

	5.6.6	Parameterization by Irregularity	243
	5.6.7	Other Methods	244
5.	7 Meth	ods for Calculating Specific Bifurcation Points	245
	5.7.1	A Special Implementation for the Branching System	246
	5.7.2	Regular Systems for Simple Bifurcation Points	248
	5.7.3	Methods for Turning Points	249
	5.7.4	Methods for Hopf Bifurcation Points	250
	5.7.5	Further Bibliographical Remarks	251
5.	8 Concl	luding Remarks on One-Parameter Problems	252
5.	9 Two-	Parameter Problems	252
E	xercises		257
Chap	ter 6	Calculating Branching Behavior of	
		due Problems	263
6.		ged Boundary-Value Problems	264
6.		llation of Bifurcation Points	270
6.		oing Down for an Implementation	276
6.		ch Switching and Symmetry	278
6.		al Bifurcation	285
6.		ng Stability	288
0.	6.6.1	Elementary Approaches	289
	6.6.2	Inertial Manifolds	290
6.	200 min ==	Bifurcation in PDEs	292
6.	1	outation of Heteroclinic and Homoclinic Orbits	296
	-		299
Chap	ter 7	Stability of Periodic Solutions	303
7.	1 Perio	dic Solutions of Autonomous Systems	304
7.	2 The I	Monodromy Matrix	307
7.	3 The I	Poincaré Map	310
7.	4 Mech	anisms of Losing Stability	314
	7.4.1	Bifurcation Points of Periodic Solutions	316
	7.4.2	Period Doubling	321
	7.4.3	Bifurcation into Torus	329
7.	5 Calcu	lating the Monodromy Matrix	332
	7.5.1	A Posteriori Calculation	332
	7.5.2	Monodromy Matrix as a By-Product of Shooting	334
	7.5.3	Numerical Aspects	335
7.	6 Calcu	lating Bifurcation Behavior	337
	7.6.1	Test Functions	337
	7.6.2	Applying Branching Systems	338
	7.6.3	Calculating a Periodic Orbit Close to a Hopf	
		Bifurcation	339
	7.6.4	Handling of Period Doubling	340

		Contents	XIII
	7.7	7.6.5 Applying Simulation	$\frac{341}{345}$
		7.7.1 Numerical Bifurcation Analysis of Periodic	
		Solutions	346
		7.7.2 Phase Locking	346
	7.8	Further Examples and Phenomena	351
	Exer	cises	353
Ch	apter	r 8 Qualitative Instruments	357
	8.1	Significance	357
	8.2	Construction of Normal Forms	358
	8.3	A Program Toward a Classification	361
	8.4	Singularity Theory for One Scalar Equation	363
	8.5	The Elementary Catastrophes	372
		8.5.1 The Fold	372
		8.5.2 The Cusp	373
		8.5.3 The Swallowtail	374
	8.6	Zeroth-Order Reaction in a CSTR	376
	8.7	Center Manifolds	379
	Exer	cises	383
Cha	apter	r 9 Chaos	385
	9.1	Flows and Attractors	386
	9.2	Examples of Strange Attractors	392
	9.3	Routes to Chaos	396
		9.3.1 Route via Torus Bifurcation	396
		9.3.2 Period-Doubling Route	397
		9.3.3 Intermittency	398
	9.4	Phase Space Construction	398
	9.5	Fractal Dimensions	400
	9.6	Control of Chaos	405
	9.7	Liapunov Exponents	409
		9.7.1 Liapunov Exponents for Maps	409
		9.7.2 Liapunov Exponents for ODEs	410
		9.7.3 Characterization of Attractors	413
		9.7.4 Computation of Liapunov Exponents	414
		9.7.5 Liapunov Exponents of Time Series	416
	9.8	Power Spectra	418
	Exer	cises	421

## XIV Contents

Appendices	s
A.1 Sor	ne Basic Glossary 425
	ne Basic Facts from Linear Algebra 426
A.3 Sor	ne Elementary Facts from ODEs
A.4 Im	plicit Function Theorem
A.5  Spe	ecial Invariant Manifolds
A.6 Nu	merical Integration of ODEs
A.7 Syı	nmetry Groups 434
A.8 Pro	oof of Theorem 5.8
A.9 Nu	merical Software and Packages
List of Ma	jor Examples
References	
Index	

# 1 Introduction and Prerequisites

### 1.1 A Nonmathematical Introduction

Every day of our lives we experience changes that occur either gradually or suddenly. We often characterize these changes as quantitative or qualitative, respectively. For example, consider the following simple experiment (Figure 1.1). Imagine a board supported at both ends, with a load on top. If the load  $\lambda$  is not too large, the board will take a bent shape with a deformation depending on the magnitude of  $\lambda$  and on the board's material properties (such as stiffness, K). This state of the board will remain stable in the sense that a small variation in the load  $\lambda$  (or in the stiffness K) leads to a state that is only slightly perturbed. Such a variation (described by Hooke's law) would be referred to as a quantitative change. The board is deformed within its elastic regime and will return to its original shape when the perturbation in  $\lambda$  is removed.

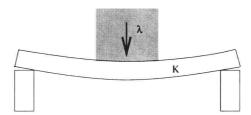


Fig. 1.1. Bending of a board

The situation changes abruptly when the load  $\lambda$  is increased beyond a certain critical level  $\lambda_0$  at which the board breaks (Figure 1.2b). This sudden action is an example of a qualitative change; it will also take place when the material properties are changed beyond a certain limit (see Figure 1.2a). Suppose the shape of the board is modeled by some function (solution of an equation). Loosely speaking, we may say that there is a solution for load values  $\lambda < \lambda_0$  and that this solution ceases to exist for  $\lambda > \lambda_0$ . The load  $\lambda$  and stiffness K are examples of parameters. The outcome of any experiment, any event, and any construction is controlled by parameters. The practical problem is to control the state of a system—that is, to find parameters such

### 1 Introduction and Prerequisites

2

that the state fulfills our requirements. This role of parameters is occasionally emphasized by terms such as *control parameter*, or *design parameter*. Varying a parameter can result in a transition from a quantitative change to a qualitative change. The following pairs of verbs may serve as illustrations:

 $\begin{array}{ccc} \mathrm{bend} & \to & \mathrm{break} \\ \mathrm{incline} & \to & \mathrm{tilt} \ \mathrm{over} \\ \mathrm{stretch} & \to & \mathrm{tear} \\ \mathrm{inflate} & \to & \mathrm{burst} \, . \end{array}$ 

The verbs on the left side stand for states that are stable under small perturbations; the response of each system is a quantitative one. This behavior ends abruptly at certain critical values of underlying parameters. The related drastic and irreversible change is reflected by the verbs on the right side. Close to a critical threshold the system becomes most sensitive; tiny perturbations may trigger drastic changes. To control a system may mean to find parameters such that the state of the system is safe from being close to a critical threshold. Since reaching a critical threshold often is considered a failure, the control of parameters is a central part of risk control.

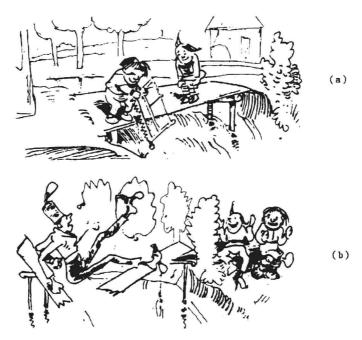


Fig. 1.2. From W. Busch [Bus62]. After the original hand drawing in Wilhelm-Busch-Museum, Hannover