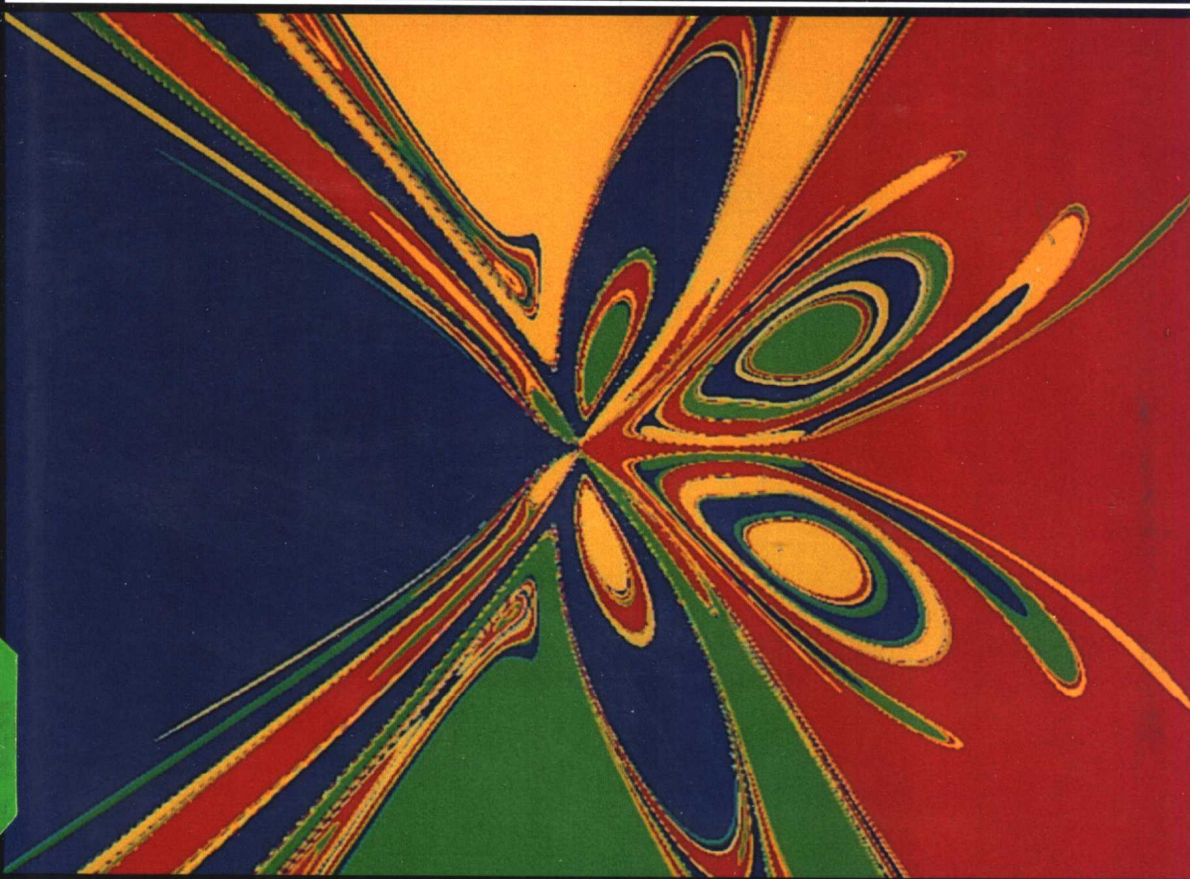


# CHAOTIC AND FRACTAL DYNAMICS

An Introduction for  
Applied Scientists and Engineers



Francis C. Moon

# CHAOTIC AND FRACTAL DYNAMICS

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## An Introduction for Applied Scientists and Engineers

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## PREFACE

Had anyone predicted that new discoveries could be made in dynamics 300 years after publication of Newton's *Principia*, they would have been thought naive or foolish. Yet, in the decade 1977–1987, new phenomena in nonlinear dynamics were discovered, principal among these being chaotic and unpredictable behavior from apparently deterministic systems. Since publication in 1987 of *Chaotic Vibrations*, the first edition of this book, new discoveries in dynamics have been made in many of the sciences, including biology. And, what should be of special interest for the applied scientist or engineer is the emergence of applications of the new ideas in chaotic dynamics and fractals. Chaotic dynamics has been known to be a common occurrence in fluid mechanics, and turbulence remains one of the unsolved problems of classical physics. However, it is now generally accepted that unpredictable dynamics can be found quite easily in simple electrical and mechanical systems as well as in other physical systems.

The purpose of this book is to help translate the new mathematical ideas in nonlinear dynamics into language that engineers and scientists can use and apply to physical systems. Many fine books have been written on chaos, fractals, and nonlinear dynamics (see e.g., Appendix D), but most have focused on the mathematical principles. Many readers of the first edition cited the inclusion of many physical examples as an important feature of the book, and they have urged me to keep the physical nature of chaos as a hallmark of any new edition. The decision to make a substantial rewrite of *Chaotic Vibrations* was

based on feedback from a number of readers. They asked for more tutorial material on maps or difference equations and fractals, and they wanted some problems so that the book could be used as a basis of a course.

In this book I have tried to start from a background that a B.S. engineering or science graduate would have; namely, ordinary differential equations and some intermediate-level dynamics and vibrations or system dynamics courses. I have also taken the view of an experimentalist, namely that the book should provide some tools to measure, predict, and quantify chaotic dynamics in physical systems.

Chapter 1 includes an introduction to classical nonlinear dynamics; however, if the book is used as a text, additional supplemental material is recommended. Chapter 2 presents an experimentalist's view of chaotic dynamics along with some simple tools such as the Poincaré map. Chapter 3 introduces maps and is entirely new. It is an attempt to summarize the basic concepts of coupled iterative difference equations as they relate to chaotic dynamics. Chapter 4 is a much expanded litany of physical applications with lots of references to experimental observations of chaos along with the appropriate mathematical models. Many readers have found the discussion of experimental methods (Chapter 5) to be useful, and this too has been expanded. If Chapter 2 asks the question, "How do we recognize chaos?," then in Chapter 6 we ask, "How do we predict when chaos will occur?" Topics such as period doubling, homoclinic bifurcations, Shil'nikov chaos, and Lyapunov exponents are discussed here. The treatment of fractals has been much expanded in the new Chapter 7, including an introduction to multifractals. One of the new directions in chaos research has been in spatiotemporal dynamics. An introduction to some of the simple models of spatially extended systems including dynamics of chain systems and Lagrangian chaos are discussed in Chapter 8. Finally, in Appendix C, an expanded list of chaotic toys and experiments is presented; a guide to some of the more popular books on chaos and fractals is given in Appendix D.

Although over 100 new references have been included in this new edition, it became clear that the tremendous growth in papers on chaos and fractals in the last few years would make it impossible to cover all the significant papers. I apologize to those researchers whose fine contributions have not been cited, especially those who took the time to send me papers, photos, and software. The inclusion of more of the papers from my own Cornell research laboratory must be interpreted as an author's vanity and not any measure of their relative importance to the field.

I have written this new edition not only because of the success of the first, but because I believe the new ideas of chaos and fractals are important to the fields of applied and engineering dynamics. It is already evident that these new geometric and topological concepts have become part of the laboratory tools in dynamics analysis in the same way that Fourier analysis became an important part of engineering systems dynamics decades ago. Already, these tools have found application in areas such as machine noise, impact printer dynamics, nonlinear circuit design, laser instabilities, mixing of chemicals, and even in understanding the dynamics of the human heart. This book is only an introduction to the subject, and it is hoped that interested students would be inspired to explore the more advanced aspects of chaos and fractals, not only for its potential application, but for the fascination and beauty of the basic mathematical ideas which underlie this subject.

# ACKNOWLEDGMENTS

Many of the examples presented in this book reflect one and a half decades of research on nonlinear dynamics at Cornell University, especially in the Nonlinear Dynamics and Magneto-Mechanics Laboratory. This unique facility has had many contributors and sponsors. First, I must thank my colleagues at Cornell in Theoretical and Applied Mechanics, John Guckenheimer, Phillip Holmes, Subrata Mukherjee, and Richard Rand, who have always been a source of advice and criticism to myself and other students of the Laboratory. Any deliberate lack of mathematical rigor in this book, however, must be blamed on me.

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Among the present and former graduate students who have contributed much to the life of this laboratory are G. S. Copeland (David Taylor Naval Lab), J. Cusumano (Penn State University), M. Davies, B. F. Feeny (Institut für Robotik, ETH Zürich), M. Golnaraghi (University of Waterloo), P.-Y. Chen (Chung-Shan Institute of Science and Technology, Taiwan), C.-K. Lee (IBM San José), G.-X. Li (Heroux, Inc., Montreal), G. Muntean, O. O'Reilly, and P. Schubring (U. California, Berkley). Many undergraduate students have made

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# 1

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## INTRODUCTION: A NEW AGE OF DYNAMICS

*In the beginning, how the heav'ns and earth rose out of chaos.*

J. Milton

*Paradise Lost*, 1665

### 1.1 WHAT IS CHAOTIC DYNAMICS?

For some, the study of dynamics began and ended with Newton's Law of  $F = mA$ . We were told that if the forces between particles and their initial positions and velocities were given, one could predict the motion or history of a system forever into the future, given a big enough computer. However, the arrival of large and fast computers has not fulfilled the promise of infinite predictability in dynamics. We now know that the motion of very simple dynamical systems cannot always be predicted far into the future. Such motions have been labeled *chaotic*, and their study has promoted a discussion of some exciting new mathematical ideas in dynamics. Three centuries after the publication of Newton's *Principia* (1687), it is appropriate that new phenomena have been discovered in dynamics and that new mathematical concepts from topology and geometry have entered this venerable science.



The nonscientific concept of chaos<sup>1</sup> is very old and is often associated with a physical state or human behavior without pattern and out of control. The term *chaos* often stirs fear in humankind because it implies that governing laws or traditions no longer have control over events such as prison riots, civil wars, or a world war. Yet there is always the hope that some underlying force or reason is behind the chaos or can explain why seemingly random events appear unpredictable.

In the physical sciences, the paragon of chaotic phenomena is turbulence. Thus, a rising column of smoke or the eddies behind a boat or aircraft wing<sup>2</sup> provide graphic examples of chaotic motion. For example, the flow pattern behind a cylinder (Figure 1-1) and the mixing of drops of color in paint (Color Plate 10) illustrate the basic nature of chaotic dynamics. The fluid mechanician, however, believes that these events are not random because the governing equations of physics for each fluid element can be written down. Also, at low velocities, the fluid patterns are quite regular and predictable from these equations. Beyond a critical velocity, however, the flow becomes turbulent. A great deal of the excitement in nonlinear dynamics today is centered around the hope that this transition from ordered to disordered flow may be explained or modeled with relatively simple mathematical equations. What we hope to show in this book is that these new ideas about turbulence extend to other problems in physics as well. It is the recognition that chaotic dynamics are inherent in all of nonlinear physical phenomena that has created a sense of revolution in physics today.

We must distinguish here between so-called random and chaotic motions. The former is reserved for problems in which we truly do not know the input forces or we only know some statistical measures of the parameters. The term *chaotic* is reserved for those *deterministic* problems for which there are no random or unpredictable inputs or

<sup>1</sup> The origin of the word *chaos* is a Greek verb which means *to gape open* and which was often used to refer to the primeval emptiness of the universe before things came into being (*Encyclopaedia Britannica*, Vol. 5, p. 276). To the stoics, chaos was identified with water and the watery state which follows the periodic destruction of the earth by fire. In *Metamorphoses*, Ovid used the term to denote the raw and formless mass in which all is disordered and from which the ordered universe is created. A modern dictionary definition of chaos (Funk and Wagnalls) provides two meanings: (i) utter disorder and confusion and (ii) the unformed original state of the universe.

<sup>2</sup> The reader should look at the beautiful collection of photos of fluid turbulent phenomena compiled by Van Dyke (1982).