# **Nonlinear Dynamics**

## A Two-way Trip from Physics to Math

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## Preface

#### About the book

The aim of this book is to render available to readers the tools that nonlinear dynamics provides for the exploration of new problems in all fields of physics. In research we deal with open problems: problems for which, at the beginning, we have no solutions but at most a set of hunches, feelings and guesses based on our previous experience with other problems. From there, we work our path to the solutions (though we do not always succeed). In finding our way we take what seems to us the *most natural* approach just as we would bush-walk in the forest avoiding as much as possible the difficult paths in our hike towards an interesting place.

We will follow in the presentation the same procedure that we follow when doing research, i.e., we begin with the problem and find one path to the solution, we work inductively proposing new paths, checking them and redrawing our route according to the experience we gain in successive efforts.

We will avoid the temptation of selecting the problems according to the tools we possess. Rather, we prefer to construct the tools along with the problems. We sustain the idea that our tools (theories) and our problems evolve hand in hand. The best pages of physics have been written in this way. Consider for example the pairs calculus-mechanics (Newton) or Hilbert spaces-quantum theory (Von Neumann) and, as we will see, nonlinear dynamics-topology (Poincaré).

This is a book to be read with paper and pencil at hand. Our intention is to furnish readers with enough knowledge to be able to do research in nonlinear dynamics after having read the book (or better, *while* they are reading the book). We prefer to convey the key ideas within their mathematical framework rather than doing lengthy demonstrations. Therefore, the calculations around the results presented in the book are usually only sketched or left more or less as guided exercises.

At the end of the day, we would like the reader to finish this book with the feeling (or certainty) that, given enough time, she/he would have come up with the same answers to the problems as those we have shown (well . . . perhaps just better answers). After all *the answers are dictated by the problems*, the two of them evolve in interaction, and our task is to read them from nature.

#### About nonlinear dynamics

Nonlinear dynamics is a subject at least as old in physics as Newton's mechanics. The dynamics of the planetary system, a primary concern for Newton, Poincart and many others, turns out to be nonlinear in general, but fortunately the simplest examples can be solved exactly (two-body systems are completely integrable). In the context of Hamiltonian mechanics a completely integrable system is 'almost' a linear system in an appropriate set of coordinates (those given by the Hamilton-Jacobi theory for integrable systems [arno89]).

In contrast, three-body problems are also nonlinear, but in general very complex and non-integrable. It was while studying the three-body problem that **Poincaré** gave a new and important impulse to nonlinear dynamics at the beginning of the 20th century. However, the new physics of the atom (later the nucleus, then quarks, ...) caught the attention of physicists. There was apparently no use for nonlinear dynamics in quantum mechanics since the latter rests on Hilbert spaces (linear spaces after all). The excess of zeal with quantum mechanics caused the (almost complete) disappearance of nonlinear dynamics from physics and especially from textbooks.

The emergence of computers as new tools for theoretical physics in the late 1950s and early 1960s favoured a comeback of nonlinear dynamics. Numerical simulations made accessible to the intuition of physicists and non-physicists the richness of nonlinear models. The graphical output added an artistic touch.

Commensurate with its earlier neglect, the impact of the phenomenology of nonlinear dynamics rocked the physics community in the early **1980s**, to the point that people even talked of a 'new science' [glei87].

Today, we have a calmer perspective. We **recognize** that many situations can only be described with nonlinear interactions. There is a growing consciousness that the tools, methods and phenomenology of nonlinear dynamics will be increasingly necessary for the study of most subjects in physics and natural science in general.

The present text is far from being a complete guide to nonlinear dynamics but it covers the basic ideas for general systems. Some topics, though important for historical and even practical reasons for physicists, like one-dimensional maps and Hamiltonian mechanics, have not been emphasized, *on purpose*. We are certain that if we were to stress these special (singular) cases we would induce the wrong generalization, just as our generation was induced to think that Hamilton-Jacobi theory applied to all systems.

The discussion is presented in most cases having in mind low-dimensional systems, i.e., systems where the spatial aspects behave coherently. In general, spatio-temporal dynamics is known to a lesser degree than low-dimensional dynamics and the authors' knowledge of the subject is correspondingly more limited.