

19

OPTIMIZATION BY VARIATIONAL METHODS

BY MORTON M. DENN

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Preface

The development of a systematic theory of optimization since the mid-1950s has not been followed by widespread application to the design and control problems of the process industries. This surprising and disappointing fact is largely a consequence of the absence of effective communication between theorists and process engineers, for the latter typically do not have sufficient mathematical training to look past the sophistication with which optimization theory is usually presented and recognize the practical significance of the results. This book is an attempt to present a logical development of optimization theory at an elementary mathematical level, with applications to simple but typical process design and control situations.

The book follows rather closely a course in optimization which I have taught at the University of Delaware since 1965 to classes made up of graduate students and extension students from local industry, together with some seniors. Approximately half of the students each year have been chemical engineers, with the remainder made up of other types of engineers, statisticians, and computer scientists. The only formal

mathematical prerequisites are a familiarity with calculus through Taylor series and a first course in ordinary differential equations, together with the maturity and problem awareness expected of students at this level. In two sections of Chapter 3 and in Chapter 11 a familiarity with partial differential equations is helpful but not essential. With this background it is possible to proceed in one semester from the basic elements of optimization to an introduction to that current research which is of direct process significance. The book deviates from the course in containing more material of an advanced nature than can be reasonably covered in one semester, and in that sense it may be looked upon as comprising in part a research monograph.

Chapter 1 presents the essential features of the variational approach within the limited context of problems in which only one or a finite number of discrete variables is required for optimization. Some of this material is familiar, and a number of interesting control and design problems can be so formulated. Chapter 2 is concerned with the parallel variational development of methods of numerical computation for such problems. The approach of Chapter 1 is then resumed in Chapters 3 to 5, where the scope of physical systems analyzed is gradually expanded to include processes described by several differential equations with magnitude limits on the decisions which can be made for optimization. The optimal control of a flow reactor is a typical situation.

In Chapters 6 and 7 much of the preceding work is reexamined and unified in the context of the construction of Green's functions for linear systems. It is only here that the Pontryagin minimum principle, which dominates modern optimization literature, is first introduced in its complete form and carefully related to the more elementary and classical material which is sufficient for most applications.

Chapter 8 relates the results of optimization theory to problems of design of practical feedback control systems for lumped multivariable processes.

Chapter 9 is an extension of the variational development of principles of numerical computation first considered in Chapter 2 to the more complex situations now being studied.

Chapters 10 and 11 are concerned with both the theoretical development and numerical computation for two extensions of process significance. The former deals with complex structures involving recycle and bypass streams and with periodic operation, while the latter treats distributed-parameter systems. Optimization in periodically operated and distributed-parameter systems represents major pertinent efforts of current research.

Chapter 12 is an introduction to dynamic programming and Hamilton-Jacobi theory, with particular attention to the essential

equivalence in most situations between this alternate approach and the variational approach to optimization taken throughout the remainder of the book. Chapter 12 can be studied at any time after the first half of Chapters 6 and 7, as can any of the last five chapters, except that Chapter 9 must precede Chapters 10 and 11.

Problems appear at the end of each chapter. Some supplement the theoretical developments, while others present further applications.

In part for reasons of space and in part to maintain a consistent mathematical level I have omitted any discussion of such advanced topics as the existence of optimal solutions, the Kuhn-Tucker theorem, the control-theory topics of observability and controllability, and optimization under uncertainty. I have deliberately refrained from using matrix notation in the developments as a result of my experience in teaching this material; for I have found that the very conciseness afforded by matrix notation masks the significance of the manipulations being performed for many students, even those with an adequate background in linear algebra. For this reason the analysis in several chapters is limited to two-variable processes, where every term can be conveniently written out.

In preparing this book I have incurred many debts to colleagues and students. None will be discharged by simple acknowledgement, but some must be explicitly mentioned. My teacher, Rutherford Aris, first introduced me to problems in optimization and collaborated in the development of Green's functions as the unifying approach to variational problems. J. R. Ferron, R. D. Gray, Jr., G. E. O'Connor, A. K. Wagle, and particularly J. M. Douglas have been most helpful in furthering my understanding and have permitted me to use the results of our joint efforts. The calculations in Chapter 2 and many of those in Chapter 9 were carried out by D. H. McCoy, those in Section 10.8 by G. E. O'Connor, and Figures 6.1 to 6.4 were kindly supplied by A. W. Pollock. My handwritten manuscript was expertly typed by Mrs. Frances Phillips. For permission to use copyrighted material I am grateful to my several coauthors and to the following authors and publishers:

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Several of my colleagues at the University of Delaware have shaped my thinking over the years about both optimization and pedagogy, and it is my hope that their contributions to this book will be obvious at least to them. J. M. Douglas and D. D. Perlmutter have kindly read the entire manuscript and made numerous helpful suggestions for improvement. For the decision not to follow many other suggestions from students and colleagues and for the overall style, accuracy, and selection of material, I must, of course, bear the final responsibility.

MORTON M. DENN

Contents

Preface	vii
Introduction	1
OPTIMIZATION AND ENGINEERING PRACTICE	1
BIBLIOGRAPHICAL NOTES	2
Chapter 1 OPTIMIZATION WITH DIFFERENTIAL CALCULUS	4
1.1 Introduction	4
1.2 The Simplest Problem	4
1.3 A Variational Derivation	7
1.4 An Optimal-control Problem: Formulation	10
1.5 Optimal Proportional Control	12
1.6 Discrete Optimal Proportional Control	13
1.7 Discrete Optimal Control	15
1.8 Lagrange Multipliers	18
1.9 A Geometrical Example	21
	xi

1.10 Discrete Proportional Control with Lagrange Multipliers	23
1.11 Optimal Design of Multistage Systems	24
1.12 Optimal Temperatures for Consecutive Reactions	27
1.13 One-dimensional Processes	29
1.14 An Inverse Problem	30
1.15 Meaning of the Lagrange Multipliers	32
1.16 Penalty Functions	34
APPENDIX 1.1 Linear Difference Equations	36
BIBLIOGRAPHICAL NOTES	38
PROBLEMS	40
 Chapter 2 OPTIMIZATION WITH DIFFERENTIAL CALCULUS: COMPUTATION	 44
2.1 Introduction	44
2.2 Solution of Algebraic Equations	45
2.3 An Application of the Newton-Raphson Method	46
2.4 Fibonacci Search	49
2.5 Steep Descent	52
2.6 A Geometric Interpretation	53
2.7 An Application of Steep Descent	55
2.8 The Weighting Matrix	57
2.9 Approximation to Steep Descent	59
APPENDIX 2.1 Optimality of Fibonacci Search	62
APPENDIX 2.2 Linear Programming	65
BIBLIOGRAPHICAL NOTES	68
PROBLEMS	70
 Chapter 3 CALCULUS OF VARIATIONS	 73
3.1 Introduction	73
3.2 Euler Equation	73
3.3 Brachistochrone	77
3.4 Optimal Linear Control	79
3.5 A Disjoint Policy	81
3.6 Integral Constraints	84
3.7 Maximum Area	85
3.8 An Inverse Problem	86
3.9 The Ritz-Galerkin Method	88
3.10 An Eigenvalue Problem	90
3.11 A Distributed System	91
3.12 Control of a Distributed Plant	93
BIBLIOGRAPHICAL NOTES	96
PROBLEMS	97

Chapter 4 CONTINUOUS SYSTEMS—I	100
4.1 Introduction	100
4.2 Variational Equations	101
4.3 First Necessary Conditions	105
4.4 Euler Equation	108
4.5 Relation to Classical Mechanics	109
4.6 Some Physical Equations and Useful Transformations	110
4.7 Linear Feedback Control	114
4.8 An Approximate Solution	117
4.9 Control with Continuous Disturbances	121
4.10 Proportional Plus Reset Control	124
4.11 Optimal-yield Problems	125
4.12 Optimal Temperatures for Consecutive Reactions	128
4.13 Optimal Conversion in a Pressure-controlled Reaction	130
BIBLIOGRAPHICAL NOTES	130
PROBLEMS	132
 Chapter 5 CONTINUOUS SYSTEMS—II	 135
5.1 Introduction	135
5.2 Necessary Conditions	136
5.3 A Bang-bang Control Problem	138
5.4 A Problem of Nonuniqueness	142
5.5 Time-optimal Control of a Stirred-tank Reactor	144
5.6 Nonlinear Time Optimal Control	150
5.7 Time-optimal Control of Underdamped Systems	152
5.8 A Time-and-fuel Optimal Problem	155
5.9 A Minimum-integral-square-error Criterion and Singular Solutions	159
5.10 Nonlinear Minimum-integral-square-error Control	163
5.11 Optimal Cooling Rate in Batch and Tubular Reactors	165
5.12 Some Concluding Comments	169
BIBLIOGRAPHICAL NOTES	169
PROBLEMS	171
 Chapter 6 THE MINIMUM PRINCIPLE	 175
6.1 Introduction	175
6.2 Integrating Factors and Green's Functions	176
6.3 First-order Variational Equations	180
6.4 The Minimization Problem and First Variation of the Objective	181
6.5 The Weak Minimum Principle	184
6.6 Equivalent Formulations	187
6.7 An Application with Transversality Conditions	189

6.8 The Strong Minimum Principle	191
6.9 The Strong Minimum Principle: A Second Derivation	194
6.10 Optimal Temperatures for Consecutive Reactions	197
6.11 Optimality of the Steady State	199
6.12 Optimal Operation of a Catalytic Reformer	202
6.13 The Weierstrass Condition	207
6.14 Necessary Condition for Singular Solutions	207
6.15 Mixed Constraints	209
6.16 State-variable Constraints	211
6.17 Control with Inertia	212
6.18 Discontinuous Multipliers	214
6.19 Bottleneck Problems	217
6.20 Sufficiency	220
APPENDIX 6.1 Continuous Dependence of Solutions	221
BIBLIOGRAPHICAL NOTES	222
PROBLEMS	226
 Chapter 7 STAGED SYSTEMS	 228
7.1 Introduction	228
7.2 Green's Functions	229
7.3 The First Variation	231
7.4 The Weak Minimum Principle	232
7.5 Lagrange Multipliers	233
7.6 Optimal Temperatures for Consecutive Reactions	234
7.7 The Strong Minimum Principle: A Counterexample	237
7.8 Second-order Variational Equations	238
7.9 Mixed and State-variable Constraints	242
BIBLIOGRAPHICAL NOTES	243
PROBLEMS	245
 Chapter 8 OPTIMAL AND FEEDBACK CONTROL	 247
8.1 Introduction	247
8.2 Linear Servomechanism Problem	248
8.3 Three-mode Control	250
8.4 Instantaneously Optimal Relay Control	254
8.5 An Inverse Problem	257
8.6 Discrete Linear Regulator	262
APPENDIX 8.1 Liapunov Stability	265
BIBLIOGRAPHICAL NOTES	266
PROBLEMS	269

Chapter 9 NUMERICAL COMPUTATION	271
9.1 Introduction	271
9.2 Newton-Raphson Boundary Iteration	271
9.3 Optimal Temperature Profile by Newton-Raphson Boundary Iteration	274
9.4 Steep-descent Boundary Iteration	278
9.5 Newton-Raphson Function Iteration: A Special Case	283
9.6 Newton-Raphson Function Iteration: General Algorithm	288
9.7 Optimal Pressure Profile by Newton-Raphson Function Iteration	290
9.8 General Comments on Indirect Methods	293
9.9 Steep Descent	295
9.10 Steep Descent: Optimal Pressure Profile	299
9.11 Steep Descent: Optimal Temperature Profile	301
9.12 Steep Descent: Optimal Staged Temperatures	304
9.13 Gradient Projection for Constrained End Points	308
9.14 Min H	311
9.15 Second-order Effects	314
9.16 Second Variation	315
9.17 General Remarks	321
BIBLIOGRAPHICAL NOTES	321
PROBLEMS	325
 Chapter 10 NONSERIAL PROCESSES	 326
10.1 Introduction	326
10.2 Recycle Processes	327
10.3 Chemical Reaction with Recycle	329
10.4 An Equivalent Formulation	331
10.5 Lagrange Multipliers	332
10.6 The General Analysis	333
10.7 Reaction, Extraction, and Recycle	337
10.8 Periodic Processes	348
10.9 Decomposition	355
BIBLIOGRAPHICAL NOTES	357
PROBLEMS	358
 Chapter 11 DISTRIBUTED-PARAMETER SYSTEMS	 359
11.1 Introduction	359
11.2 A Diffusion Process	359
11.3 Variational Equations	360
11.4 The Minimum Principle	362
11.5 Linear Heat Conduction	364
11.6 Steep Descent	365

11.7	Computation for Linear Heat Conduction	366
11.8	Chemical Reaction with Radial Diffusion	371
11.9	Linear Feedforward-Feedback Control	377
11.10	Optimal Feed Distribution in Parametric Pumping	381
11.11	Concluding Remarks	387
	BIBLIOGRAPHICAL NOTES	387
	PROBLEMS	389
Chapter 12	DYNAMIC PROGRAMMING AND HAMILTON-JACOBI THEORY	392
12.1	Introduction	392
12.2	The Principle of Optimality and Computation	393
12.3	Optimal Temperature Sequences	394
12.4	The Hamilton-Jacobi-Bellman Equation	398
12.5	A Solution of the Hamilton-Jacobi-Bellman Equation	400
12.6	The Continuous Hamilton-Jacobi-Bellman Equation	402
12.7	The Linear Regulator Problem	405
	BIBLIOGRAPHICAL NOTES	407
	PROBLEMS	407
Name Index		411
Subject Index		415

Introduction

OPTIMIZATION AND ENGINEERING PRACTICE

The optimal design and control of systems and industrial processes has long been of concern to the applied scientist and engineer, and, indeed, might be taken as a definition of the function and goal of engineering. The practical attainment of an optimum design is generally a consequence of a combination of mathematical analysis, empirical information, and the subjective experience of the scientist and engineer. In the chapters to follow we shall examine in detail the principles which underlie the formulation and resolution of the practical problems of the analysis and specification of optimal process units and control systems. Some of these results lend themselves to immediate application, while others provide helpful insight into the considerations which must enter into the specification and operation of a working system.

The formulation of a process or control system design is a trial-and-error procedure, in which estimates are made first and then information is sought from the system to determine improvements. When a

sufficient mathematical characterization of the system is available, the effect of changes about a preliminary design may be obtained analytically, for the perturbation techniques so common in modern applied mathematics and engineering analysis have their foundation in linear analysis, despite the nonlinearity of the system being analyzed. Whether mathematical or experimental or a judicious combination of both, perturbation analysis lies at the heart of modern engineering practice.

Mathematical optimization techniques have as their goal the development of rigorous procedures for the attainment of an optimum in a system which can be characterized mathematically. The mathematical characterization may be partial or complete, approximate or exact, empirical or theoretical. Similarly, the resulting optimum may be a final implementable design or a guide to practical design and a criterion by which practical designs are to be judged. In either case, the optimization techniques should serve as an important part of the total effort in the design of the units, structure, and control of a practical system.

Several approaches can be taken to the development of mathematical methods of optimization, all of which lead to essentially equivalent results. We shall adopt here the variational method, for since it is grounded in the analysis of small perturbations, it is the procedure which lies closest to the usual engineering experience. The general approach is one of assuming that a preliminary specification has been made and then enquiring about the effect of small changes. If the specification is in fact the optimum, any change must result in poorer performance and the precise mathematical statement of this fact leads to *necessary conditions*, or equations which define the optimum. Similarly, the analysis of the effect of small perturbations about a nonoptimal specification leads to computational procedures which produce a better specification. Thus, unlike most approaches to optimization, the variational method leads rather simply to both necessary conditions and computational algorithms by an identical approach and, furthermore, provides a logical framework for studying optimization in new classes of systems.

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An outstanding treatment of the logic of engineering design may be found in

D. F. Rudd and C. C. Watson: "Strategy of Process Engineering," John Wiley & Sons, Inc., New York, 1968

Mathematical simulation and the formulation of system models is discussed in

A. E. Rogers and T. W. Connolly: "Analog Computation in Engineering Design," McGraw-Hill Book Company, New York, 1960

R. G. E. Franks: "Mathematical Modeling in Chemical Engineering," John Wiley & Sons, Inc., New York, 1967

Perturbation methods for nonlinear systems are treated in such books as

- W. F. Ames: "Nonlinear Ordinary Differential Equations in Transport Processes," Academic Press, Inc., New York, 1968
———: "Nonlinear Partial Differential Equations in Engineering," Academic Press, Inc., New York, 1965
R. E. Bellman: "Perturbation Techniques in Mathematics, Physics, and Engineering," Holt, Rinehart and Winston, Inc., New York, 1964
W. J. Cunningham: "Introduction to Nonlinear Analysis," McGraw-Hill Book Company, New York, 1958
N. Minorsky: "Nonlinear Oscillations," D. Van Nostrand Company, Inc., Princeton, N.J., 1962

Perhaps the most pertinent perturbation method from a system analysis viewpoint, the Newton-Raphson method, which we shall consider in detail in Chaps. 2 and 9, is discussed in

- R. E. Bellman and R. E. Kalaba: "Quasilinearization and Nonlinear Boundary Value Problems," American Elsevier Publishing Company, New York, 1965

1

Optimization with Differential Calculus

1.1 INTRODUCTION

A large number of interesting optimization problems can be formulated in such a way that they can be solved by application of differential calculus, and for this reason alone it is well to begin a book on optimization with an examination of the usefulness of this familiar tool. We have a further motivation, however, in that all variational methods may be considered to be straightforward extensions of the methods of differential calculus. Thus, this first chapter provides the groundwork and basic principles for the entire book.

1.2 THE SIMPLEST PROBLEM

The simplest optimization problem which can be treated by calculus is the following: $\mathcal{E}(x_1, x_2, \dots, x_n)$ is a function of the n variables x_1, x_2, \dots, x_n . Find the particular values $\bar{x}_1, \bar{x}_2, \dots, \bar{x}_n$ which cause the function \mathcal{E} to take on its minimum value.

We shall solve this problem in several ways. Let us note first that the minimum has the property that

$$\varepsilon(x_1, x_2, \dots, x_n) - \varepsilon(\bar{x}_1, \bar{x}_2, \dots, \bar{x}_n) \geq 0 \quad (1)$$

Suppose that we let $x_1 = \bar{x}_1 + \delta x_1$, where δx_1 is a small number in absolute value, while $x_2 = \bar{x}_2$, $x_3 = \bar{x}_3$, \dots , $x_n = \bar{x}_n$. If we divide Eq. (1) by δx_1 , we obtain, depending upon the algebraic sign of δx_1 ,

$$\frac{\varepsilon(\bar{x}_1 + \delta x_1, \bar{x}_2, \dots, \bar{x}_n) - \varepsilon(\bar{x}_1, \bar{x}_2, \dots, \bar{x}_n)}{\delta x_1} \geq 0 \quad \delta x_1 > 0 \quad (2a)$$

or

$$\frac{\varepsilon(\bar{x}_1 + \delta x_1, \bar{x}_2, \dots, \bar{x}_n) - \varepsilon(\bar{x}_1, \bar{x}_2, \dots, \bar{x}_n)}{\delta x_1} \leq 0 \quad \delta x_1 < 0 \quad (2b)$$

The limit of the left-hand side as $\delta x_1 \rightarrow 0$ is simply $\partial \varepsilon / \partial x_1$, evaluated at $\bar{x}_1, \bar{x}_2, \dots, \bar{x}_n$. From the inequality (2a) this partial derivative is nonnegative, while from (2b) it is nonpositive, and both inequalities are satisfied only if $\partial \varepsilon / \partial x_1$ vanishes. In an identical way we find for all x_k , $k = 1, 2, \dots, n$,

$$\frac{\partial \varepsilon}{\partial x_k} = 0 \quad (3)$$

at the minimizing values $\bar{x}_1, \bar{x}_2, \dots, \bar{x}_n$. We thus have n algebraic equations to solve for the n unknowns, $\bar{x}_1, \bar{x}_2, \dots, \bar{x}_n$.

It is instructive to examine the problem somewhat more carefully to search for potential difficulties. We have, for example, made a rather strong assumption in passing from inequalities (2a) and (2b) to Eq. (3), namely, that the partial derivative in Eq. (3) exists at the values x_1, x_2, \dots, x_n . Consider, for example, the function

$$\varepsilon(x_1, x_2, \dots, x_n) = |x_1| + |x_2| + \dots + |x_n| \quad (4)$$

which has a minimum at $x_1 = x_2 = \dots = x_n = 0$. Inequalities (1) and (2) are satisfied, but the partial derivatives in Eq. (3) are not defined at $x_k = 0$. If we assume that one-sided derivatives of the function ε exist everywhere, we must modify condition (3) to

$$\lim_{x_k \rightarrow \bar{x}_k^-} \frac{\partial \varepsilon}{\partial x_k} \leq 0 \quad (5a)$$

$$\lim_{x_k \rightarrow \bar{x}_k^+} \frac{\partial \varepsilon}{\partial x_k} \geq 0 \quad (5b)$$

with Eq. (3) implied if the derivative is continuous.

In problems which describe real situations, we shall often find that physical or economic interpretations restrict the range of variables we