



Progress in Mathematics

Volume 223

Series Editors

H. Bass

J. Oesterlé

A. Weinstein

Fuensanta Andreu-Vaillo
Vicent Caselles
José M. Mazón

Parabolic Quasilinear Equations Minimizing Linear Growth Functionals

Springer Basel AG

Authors:

Fuensanta Andreu-Vaillo
José M. Mazón
Departamento de Análisis Matemático
Universitat de Valencia
Dr. Moliner 50
46100 Burjassot (Valencia)
Spain
e-mail: Fuensanta.Andreu@uv.es
mason@uv.es

Vicent Caselles
Departamento de Tecnología
Universitat Pompeu Fabra
Passeig de Circumvalació, 8
08003 Barcelona
Spain
e-mail: vicent.caselles@upf.edu

2000 Mathematics Subject Classification 35K55, 47H06, 47H20, 65M06, 68U10

A CIP catalogue record for this book is available from the Library of Congress,
Washington D.C., USA

Bibliographic information published by Die Deutsche Bibliothek
Die Deutsche Bibliothek lists this publication in the Deutsche Nationalbibliografie;
detailed bibliographic data is available in the Internet at <<http://dnb.ddb.de>>.

ISBN 978-3-0348-9624-5 ISBN 978-3-0348-7928-6 (eBook)

DOI 10.1007/978-3-0348-7928-6

This work is subject to copyright. All rights are reserved, whether the whole or part of the material is concerned, specifically the rights of translation, reprinting, re-use of illustrations, broadcasting, reproduction on microfilms or in other ways, and storage in data banks. For any kind of use whatsoever, permission from the copyright owner must be obtained.

© 2004 Springer Basel AG

Originally published by Birkhäuser Verlag, Basel, Switzerland in 2004

Softcover reprint of the hardcover 1st edition 2004

Printed on acid-free paper produced of chlorine-free pulp. TCF ∞

ISBN 978-3-0348-9624-5

9 8 7 6 5 4 3 2 1

www.birkhauser-science.com



Ferran Sunyer i Balaguer (1912–1967) was a self-taught Catalan mathematician who, in spite of a serious physical disability, was very active in research in classical mathematical analysis, an area in which he acquired international recognition. His heirs created the Fundació Ferran Sunyer i Balaguer inside the Institut d'Estudis Catalans to honor the memory of Ferran Sunyer i Balaguer and to promote mathematical research.

Each year, the Fundació Ferran Sunyer i Balaguer and the Institut d'Estudis Catalans award an international research prize for a mathematical monograph of expository nature. The prize-winning monographs are published in this series. Details about the prize and the Fundació Ferran Sunyer i Balaguer can be found at

<http://www.crm.es/FerranSunyerBalaguer/ffsb.htm>

**This book has been awarded the
Ferran Sunyer i Balaguer 2003 prize.**



The members of the scientific committee of the 2003 prize were:

Hyman Bass

University of Michigan

Antonio Córdoba

Universidad Autónoma de Madrid

Warren Dicks

Universitat Autònoma de Barcelona

Paul Malliavin

Université de Paris VI

Joseph Oesterlé

Université de Paris VI



Ferran Sunyer i Balaguer Prize winners:

- 1992 Alexander Lubotzky
Discrete Groups, Expanding Graphs and Invariant Measures, PM 125
- 1993 Klaus Schmidt
Dynamical Systems of Algebraic Origin, PM 128
- 1994 The scientific committee decided not to award the prize
- 1995 As of this year, the prizes bear the year in which they are awarded, rather than the previous year in which they were announced
- 1996 V. Kumar Murty and M. Ram Murty
Non-vanishing of L-Functions and Applications, PM 157
- 1997 A. Böttcher and Y.I. Karlovich
Carleson Curves, Muckenhoupt Weights, and Toeplitz Operators, PM 154
- 1998 Juan J. Morales-Ruiz
Differential Galois Theory and Non-integrability of Hamiltonian Systems, PM 179
- 1999 Patrick Dehornoy
Braids and Self-Distributivity, PM 192
- 2000 Juan-Pablo Ortega and Tudor Ratiu
Hamiltonian Singular Reduction, PM 222
- 2001 Martin Golubitsky and Ian Stewart
The Symmetry Perspective, PM 200
- 2002 André Unterberger
Automorphic Pseudodifferential Analysis and Higher Level Weyl Calculi, PM 209
- Alexander Lubotzky and Dan Segal
Subgroup Growth, PM 212

Contents

Preface	xi
1 Total Variation Based Image Restoration	1
1.1 Introduction	1
1.2 Equivalence between Constrained and Unconstrained Restoration	8
1.3 The Partial Differential Equation Satisfied by the Minimum of (1.17)	13
1.4 Algorithm and Numerical Experiments	18
1.5 Review of Numerical Methods	25
2 The Neumann Problem for the Total Variation Flow	31
2.1 Introduction	31
2.2 Strong Solutions in $L^2(\Omega)$	33
2.3 The Semigroup Solution in $L^1(\Omega)$	35
2.4 Existence and Uniqueness of Weak Solutions	42
2.5 An L^N - L^∞ Regularizing Effect	47
2.6 Asymptotic Behaviour of Solutions	50
2.7 Regularity of the Level Lines	55
3 The Total Variation Flow in \mathbb{R}^N	57
3.1 Initial Conditions in $L^2(\mathbb{R}^N)$	57
3.2 The Notion of Entropy Solution	62
3.3 Uniqueness in $L^1_{\text{loc}}(\mathbb{R}^N)$	63
3.4 Existence in $L^1_{\text{loc}}(\mathbb{R}^N)$	69
3.5 Initial Conditions in $L^1(\mathbb{R}^N)$	71
3.6 Time Regularity	72
3.7 An L^N - L^∞ Regularizing Effect	77
3.8 Measure Initial Conditions	77
4 Asymptotic Behaviour and Qualitative Properties of Solutions	81
4.1 Radially Symmetric Explicit Solutions	81
4.2 Some Qualitative Properties	87
4.3 Asymptotic Behaviour	92

4.4	Evolution of Sets in \mathbb{R}^2 : The Connected Case	103
4.5	Evolution of Sets in \mathbb{R}^2 : The Nonconnected Case	114
4.6	Some Examples	118
4.7	Explicit Solutions for the Denoising Problem	120
5	The Dirichlet Problem for the Total Variation Flow	125
5.1	Introduction	125
5.2	Definitions and Preliminary Facts	126
5.3	The Main Result	129
5.4	The Semigroup Solution	129
5.5	Strong Solutions for Data in $L^2(\Omega)$	143
5.6	Existence and Uniqueness for Data in $L^1(\Omega)$	148
5.7	Regularity for Positive Initial Data	159
6	Parabolic Equations Minimizing Linear Growth Functionals: L^2-Theory	163
6.1	Introduction	163
6.2	Preliminaries	167
6.3	The Existence and Uniqueness Result	171
6.4	Strong Solution for Data in $L^2(\Omega)$	173
6.5	Asymptotic Behaviour	199
6.6	Proof of the Approximation Lemma	200
7	Parabolic Equations Minimizing Linear Growth Functionals: L^1-Theory	213
7.1	Introduction	213
7.2	The Main Result	216
7.3	The Semigroup Solution	217
7.4	Existence and Uniqueness for Data in $L^1(\Omega)$	232
7.5	A Remark for Strictly Convex Lagrangians	264
7.6	The Cauchy Problem	268
Appendix		
A	Nonlinear Semigroups	271
A.1	Introduction	271
A.2	Abstract Cauchy Problems	272
A.3	Mild Solutions	275
A.4	Accretive Operators	278
A.5	Existence and Uniqueness Theorem	285
A.6	Regularity of Mild Solutions	290
A.7	Completely Accretive Operators	291

B	Functions of Bounded Variation	297
B.1	Definitions	297
B.2	Approximation by Smooth Functions	298
B.3	Traces and Extensions	300
B.4	Sets of Finite Perimeter and the Coarea Formula	301
B.5	Some Isoperimetric Inequalities	302
B.6	The Reduced Boundary	303
B.7	Connected Components of Sets of Finite Perimeter	305
C	Pairings Between Measures and Bounded Functions	311
C.1	Trace of the Normal Component of Certain Vector Fields	311
C.2	The Measure (z, Du)	314
C.3	Representation of the Radon–Nikodym Derivative $\theta(z, Du, \cdot)$	317
	Bibliography	323
	Index	339

Preface

Our goal in this monograph is to present general existence and uniqueness results for quasilinear parabolic equations whose operator is, in divergence form, the subdifferential of a Lagrangian which is convex in $|\nabla u|$ and has linear growth as $|\nabla u| \rightarrow \infty$. We devote particular attention to the case of the minimizing *total variation flow* for which we study the Neumann, Dirichlet and Cauchy problem in \mathbb{R}^N together with the main qualitative properties of its evolution. This kind of problem appears in different contexts: image processing, faceted crystal growth, continuum mechanics, etc. Motivated by the use of the *total variation model in image restoration*, we started our study of the *minimizing total variation* (TV) *flow* in collaboration with C. Ballester, by studying the corresponding Neumann and Dirichlet problems [13], [14]. Later, in a joint paper with J. I. Diaz [15] we studied the asymptotic behaviour of the solutions of these problems. This study was continued in [34] where some extinction profiles were identified. In particular, this provided some explicit solutions of the denoising problem in image processing. The techniques developed for the total variation flow were extended to cover the case of general convex Lagrangians with linear growth rate in the modulus of the gradient, providing a general existence and uniqueness result in this case [16],[17]. Energy functionals with linear growth appear in different contexts, two classical examples being the nonparametric area integrand $f(\xi) = \sqrt{1 + \|\xi\|^2}$, which is associated with the time-dependent minimal surface equation, and the Hencky model in plasticity.

Let us summarize the contents of this book.

Chapter 1 is devoted to the study of the variational approach to image restoration based on total variation minimization subject to the constraints given by the image acquisition model. We review the model initially introduced by L. Rudin, S. Osher and E. Fatemi [175] which had, on one hand, a strong influence in the development of variational models in image denoising and restoration, and, on the other, pioneered the use of the BV model in image processing. The chapter contains the proof of the Chambolle–Lions theorem proving that the constraints can be incorporated by means of a Lagrange multiplier, thus justifying the usual numerical approach to the problem. Then we interpret the corresponding Euler–Lagrange equation in terms of partial differential equations by means of the PDE

characterization of the subdifferential of the total variation. This result follows as a consequence of the results in [13] and has been presented in [48]. The approach we present here is a simple and direct approach to the characterization of the subdifferential of positively 1-homogeneous convex functionals of the gradient due to F. Alter in his unpublished work [3]. Then we display a few experiments on image restoration obtained with this model. The chapter also contains a review of the main numerical methods used in the variational approach to image restoration. We apologize in advance for any missing work.

In Chapter 2 we study the Neumann problem for the minimizing total variation flow. First we present the main existence and uniqueness results for this problem, which are essentially taken from [13]. Due to the homogeneity of the operator associated with the problem in L^p for any $p \geq 1$ we prove that the semi-group solutions are strong solutions. This, combined with the regularity results for quasi-minimizers of the perimeter, permits us to prove a regularizing effect on the level lines of the solution, a result which also holds for the solution of the restoration problem. The chapter also contains a proof that solutions of the Neumann problem stabilize as $t \rightarrow \infty$ by converging to the mean value of the initial datum.

The Cauchy problem for the total variation flow is studied in Chapter 3. The purpose of this chapter is to prove existence and uniqueness of entropy solutions for initial data in $L^1_{loc}(\mathbb{R}^N)$. This will enable us to study in later chapters the main features of the flow in \mathbb{R}^N , thus, dismissing the effect of boundary conditions. First, we study the flow in $L^2(\mathbb{R}^N)$. In Section 2 we prove uniqueness of entropy solutions for initial data in $L^1_{loc}(\mathbb{R}^N)$, using Kruzhkov's method of doubling variables. Then we prove existence for initial data in $L^1_{loc}(\mathbb{R}^N)$. We end up with the study of the time regularity of solutions.

Chapter 4 is devoted to a study of the asymptotic behaviour and qualitative properties of the solutions of the total variation flow in \mathbb{R}^N . We start by describing some numerically observed features of the flow, namely that local maxima (resp. minima) immediately decrease (resp. increase) and produce flat zones in the solution. For that we shall need some radially symmetric explicit solutions of the flow. We also note that the length of the level curves of the solutions is a decreasing function of time. Our next purpose will be to describe the extinction profile (the solution has a finite extinction time) of compactly supported solutions. This behaviour is described by a function which is the solution of an eigenvalue problem for the operator $-\operatorname{div} \left(\frac{Du}{|Du|} \right)$. The rest of the chapter is devoted to the study of explicit solutions of this eigenvalue problem in the plane. In the radial case, positive solutions can be fully characterized. Then we look for characteristic functions which are solutions of it. This permits characterization of the bounded sets of finite perimeter $\Omega \subset \mathbb{R}^2$ for which the function $u(t, x) = (1 - \frac{\operatorname{Per}(\Omega)}{|\Omega|}t)^+ \chi_\Omega(x)$ is an entropy solution of the minimizing total variation flow in \mathbb{R}^2 . As an important by-product of the eigenvalue problem, one can obtain explicit solutions of

the Rudin–Osher–Fatemi image denoising model. The results of this chapter have been taken from [13], [15], [34].

Chapter 5 is concerned with the Dirichlet problem for the total variation flow. In this case, the homogeneity of the operator is lost, and the notion of entropy solution in the sense of Kruzhkov is required to obtain a uniqueness result. Existence and time regularity of entropy solutions follow from the usual semigroup theory approach. The techniques introduced in this chapter will be the basis for results in the next two chapters dealing with more general operators. The presentation of this chapter is based on [14].

The next two chapters are devoted to a study of the Dirichlet problem for quasilinear parabolic equations whose operator is, in divergence form, the subdifferential of a Lagrangian which is convex and has linear growth in the magnitude of the gradient. More precisely, we study the Dirichlet problem in a bounded domain Ω with boundary datum $\varphi \in L^1(\partial\Omega)$, for the differential operator $-\operatorname{div} \mathbf{a}(x, Du)$, where $\mathbf{a}(x, \xi) = \nabla_{\xi} f(x, \xi)$, f being a convex function of ξ with linear growth as $\|\xi\| \rightarrow \infty$. The regularity assumptions we need to impose on the Lagrangian f exclude the total variation flow, i.e., the case $f(\xi) = \|\xi\|$, which was studied in Chapter 5; but we include many examples relevant in applications, like the non-parametric area integrand and Hencky plasticity. In Chapter 6 we prove existence and uniqueness of strong solutions in $L^2(\Omega)$ using the theory of nonlinear semigroups generated by subdifferential operators. Now, to get the full strength of the abstract result derived from semigroup theory, we need to characterize the subdifferential of the energy functional associated with the problem. In Chapter 7 we prove existence and uniqueness of entropy solutions for data in $L^1(\Omega)$. Existence follows by means of Crandall–Liggett’s semigroup generation theorem, while uniqueness is proved using again Kruzhkov’s method of doubling variables. The results of these two chapters are essentially taken from [16] and [17], respectively.

The book finishes with three appendices in which we outline some of the main tools used in the above chapters. In the first one (Appendix A) we present without proofs the main results of nonlinear semigroup theory which is the main tool used in this text to prove existence of solutions. Due to the linear growth of the energy functionals associated with the problems studied in this monograph, the natural energy space to study them is the space of functions of bounded variation. In Appendix B we outline some of the main points of the theory of functions of bounded variation used in the previous chapters. Finally, following G. Anzellotti’s paper [25], Appendix C is devoted to the main results about pairings between measures and bounded measurable functions, one of the fundamental tools of the text.

It is a pleasure to acknowledge here the debt we owe to our coauthors, namely C. Ballester, G. Bellettini, J.I. Diaz and M. Novaga. This monograph could not have been written without their contribution. We would like to thank also F. Alter for permitting us to reproduce his unpublished work [3]. We are also indebted to

B. Rougé and the CNES for stimulating discussions about the restoration problem which gave us a better understanding of it, and for his kind permission to reproduce the images of Chapter 1. We thank M. Bertalmio, A. Solé and B. Rougé for providing us these experiments. Finally we are indebted with L. Rudin from Cognitech Inc. for stimulating us to work on the theoretical analysis of the total variation restoration problem which motivated the subsequent work. Thanks should also be extended to many colleagues with whom we have shared their views on image processing and PDEs, among them we would like to thank Ph. Bénilan, J. Blat, A. Chambolle, P.L. Lions, F. Malgouyres, L. Moisan, S. Moll, J.M. Morel, P. Mulet, S. Osher, G. Sapiro, S. Segura, J. Toledo and J.L. Vázquez.

Last but not least, the first and third authors acknowledge partial support by the Spanish DGICYT, Project PB98-1442, the PNPGC, Project BFM2002-01145 and the RTN Programme of the EC “Nonlinear Partial Differential Equations Describing Front Propagation and other Singular Phenomena”, reference HPRN-CT-2002-00274. The second author acknowledges partial support by the Departament d’Universitats, Recerca i Societat de la Informació de la Generalitat de Catalunya, by PNPGC project, reference BFM2000-0962-C02-01, by a CNES project, and, in previous stages of this work by the TMR European Project “Viscosity Solutions and their Applications”, reference FMRX-CT98-0234.

Barcelona and Valencia, December 2002