

*Editors*

Hans-Georg Bock

Frank de Hoog

Avner Friedman

Arvind Gupta

Helmut Neunzert

William R. Pulleyblank

Torgeir Rusten

Fadil Santosa

Anna-Karin Tornberg

Armin Iske  
Trygve Randen  
*Editors*

Mathematical  
Methods and Modelling  
in Hydrocarbon  
Exploration  
and Production



Springer

**Schlumberger**

*Editors*

Dr. Armin Iske

University of Leicester  
Department of Mathematics  
University Road  
Leicester, LE1 7RH, United Kingdom  
Email: iske@mcs.le.ac.uk

Dr. Trygve Randen

Schlumberger Stavanger Research  
Risabergveien 3  
4068 Stavanger, Norway  
Email: trygve.randen@slb.com

Library of Congress Control Number: 2004114140

Mathematics Subject Classification (2000):

65M25, 65M12, 65M50, 76M25, 76M28, 76T99, 65D15, 65D05, 65D07, 65D17

ISBN 3-540-22536-6 Springer Berlin Heidelberg New York

This work is subject to copyright. All rights are reserved, whether the whole or part of the material is concerned, specifically the rights of reprinting, reuse of illustrations, recitation, broadcasting, reproduction on microfilms or in any other way, and storage in data banks. Duplication of this publication or parts thereof is permitted only under the provisions of the German Copyright Law of September 9, 1965, in its current version, and permission for use must always be obtained from Springer. Violations are liable for prosecution under the German Copyright Law.

Springer is a part of Springer Science+Business Media  
springeronline.com

© Springer-Verlag Berlin Heidelberg 2005  
Printed in Germany

The use of registered names, trademarks, etc. in this publication does not imply, even in the absence of a specific statement, that such names are exempt from the relevant protective laws and regulations and therefore free for general use.

Typeset by the authors using a Springer T<sub>E</sub>X macro-package  
Cover design: *design & production* GmbH, Heidelberg  
Printed on acid-free paper 46/3142LK - 5 4 3 2 1 0

# Preface

Fossil fuels, including oil and gas, store a part of the energy which the earth has received from the sun during the last several hundred million years. These days, oil and gas account for around 64 % of the total world energy consumption. Despite the efforts in developing new renewable energy sources, oil and gas will continue to play a major role in meeting the world's ever increasing energy demand for the next few decades. Moreover, oil and gas are expected to remain the most cost effective and the most convenient sources of energy that we have at our disposal.

The required exploration and production of hydrocarbons, however, incorporate great technological challenges for the oil and gas industry. Indeed, about 70 % of today's oil and gas production rate comes from hydrocarbon fields that are more than 30 years old. But several of these fields are exhibiting a significant production decline. In order to meet the world's future demand for oil and gas, further technological advances are essentially needed, where new developments should aim at efficiency and accuracy in sub-surface mapping, monitoring of reservoir depletion, and numerical simulation of production scenarios. This requires research across multiple disciplines, including mathematics, geophysics, geology, petroleum engineering, signal processing, and computer science.

This work explains important aspects and fundamental concepts in hydrocarbon exploration and production. Moreover, new developments and recent advances in the relevant research areas are discussed, where special emphasis is placed on mathematical methods and modelling. The book reflects the multi-disciplinary character of the hydrocarbon production workflow, ranging from seismic data acquisition through imaging, seismic analysis & interpretation, and geological model building to numerical reservoir simulation. Various challenges concerning the production workflow are discussed in detail.

The thirteen chapters of this joint work, authored by international experts from academic and industrial institutions, include survey papers of expository character as well as original research articles. The material of this book is arranged in three parts.

- Part I.** *Seismic Interpretation;*
- Part II.** *Geological Model Building;*
- Part III.** *Reservoir Modelling and Simulation.*

The first part of the book, comprising Chapters 1-5, treats the analysis and interpretation of the input seismic data. The first chapter provides a very brief and basic introduction to geology and seismic. The next two chapters present a set of seismic attributes (measures computed from the seismic data) which are useful for the subsequent classification of geological responses. Chapters 4 and 5 propose novel pattern recognition strategies for the automated interpretation of seismic data.

The second part of the book, Chapters 6-9, addresses the construction of models of the sub-surface. Chapter 6 provides a very comprehensive treatment of geological modelling and reservoir simulation. The following Chapters 7 and 8 propose new concepts for 3D geo-body model building. The approach taken in Chapter 7 is based on hierarchical segmentation, whereas the method of Chapter 8 works with level set and marching methods. Velocity estimation is an important task in sub-surface model construction, and techniques from tomography are effective tools in this respect. The complexity of tomographic inversion from seismic data is, however, significant. Chapter 9 uses modern techniques from seismic tomography in order to design efficient tomographic inversion methods.

The last part of the book, Chapters 10-13, is concerning the simulation of oil and gas production from geological models. Chapter 10 presents an integrated workflow and a case study, where advanced concepts from previous chapters of the book are applied. The resulting workflow, ranging from seismic data acquisition to reservoir simulation, is orders of magnitude faster than the conventional workflow. In order to effectively model physical phenomena in reservoir flow, multiscale methods are essentially required for reservoir simulation. To this end, a novel finite volume method over adaptive triangular meshes is explored in Chapter 11, where multivariate scattered data interpolation is an important ingredient. Selected details and principles of optimal multivariate interpolation are discussed in Chapter 12. Finally, Chapter 13 provides a practical approach to history matching the model with time-lapse measurements. This includes an illustrative real-world case study concerning monitoring the injection of CO<sub>2</sub> into the sub-surface.

Large parts of the material presented in this book were developed between November 2000 and April 2004 through the European research and training network NetAGES, "Network for Automated Geometry Extraction from Seismic". The NetAGES project hosted a distributed multi-disciplinary team of young researchers, PhD and postdoctoral students, and senior researchers at one industrial partner (Schlumberger Stavanger Research, Norway) and three academic partners (Munich University of Technology, University of Vienna, and Stavanger University College). Recent research results of the NetAGES young researchers and their supervisors are presented in Chapters 7-12.

In addition, collaborators from other institutions contributed to this book, either through interconnected projects (University of Surrey, University of Oxford and Schlumberger Abingdon Technology Centre, UK) or by extensions of the NetAGES training network (SINTEF Petroleum Research, Trondheim, Norway). Chapters 1-6 and Chapter 13 were written on the basis of such joint work.

All thirteen contributions to this book are invited chapters. In order to ensure their scientific and instructive quality, the chapters went through two stages of reviews. The first stage was organized by the editors in October 2003, where each chapter was carefully reviewed by independent experts external to NetAGES, as well as by experts from the NetAGES consortium and by young researchers from NetAGES. After submission of its prefinal version to Springer-Verlag in March 2003, the entire manuscript was then reviewed by a panel of ten anonymous reviewers. This second review stage was organized by Springer-Verlag.

Finally, we wish to thank those who supported the making of this book. It is in particular our great pleasure to acknowledge Dr. Martin Peters from Springer-Verlag, Heidelberg, for his everlasting support and great enthusiasm towards the book project. Moreover, the friendly and effective collaboration with Ute McCrory (Springer-Verlag) is kindly appreciated. Special thanks go to the authors for their fine contributions, and to the reviewers for their constructive comments and suggestions. Last but not least, partial financial support was granted by the European Commission through the NetAGES network (contract no. IST-1999-29034).

*Stavanger, October 2004*

*Armin Iske  
Trygve Randen*

# Table of Contents

---

## Part I Seismic Interpretation

---

### Introduction to Seismic Texture

*Jürgen Schlaf, Trygve Randen, Lars Sønneland* ..... 3

### Atlas of 3D Seismic Attributes

*Trygve Randen, Lars Sønneland* ..... 23

### The Use of Structure Tensors in the Analysis of Seismic Data

*Maria Faraklioti, Maria Petrou* ..... 47

### Automated Structural Interpretation Through Classification of Seismic Horizons

*Hilde G. Borgos, Thorleif Skov, Lars Sønneland*..... 89

### Automatic Fault Extraction Using Artificial Ants

*Stein Inge Pedersen, Thorleif Skov, Trygve Randen, Lars Sønneland*... 107

---

## Part II Geological Model Building

---

### Geological Modelling and Reservoir Simulation

*Chris L. Farmer* ..... 119

### Geological Model Building: A Hierarchical Segmentation Approach

*Erik Monsen, Trygve Randen, Lars Sønneland, Jan E. Odegard* ..... 213

### Mapping 3D Geo-Bodies Based on Level Set and Marching Methods

*Stine Kjersti Richardsen, Trygve Randen*..... 247

### Modern Techniques in Seismic Tomography

*Alexander A. Boukhgueim*..... 267

---

**Part III Reservoir Modelling and Simulation**

---

**From 3D Seismic Facies to Reservoir Simulation: An Example From the Grane Field**  
*Alexis Carrillat, Brice Vallès* ..... 301

**Reservoir Flow Simulation by Adaptive ADER Schemes**  
*Martin Käser, Armin Iske* ..... 339

**Optimal Multivariate Interpolation**  
*Tobias Werther* ..... 389

**A Method for Ranking  $CO_2$  Flow Models Using Seismic Modeling and Time-Lapse Data**  
*Magne Lygren, Erik Lindeberg, Per Bergmo, Geir Vaaland Dahl, Kristine Årland Halvorsen, Trygve Randen, Lars Sønneland* ..... 409

**Appendix: Colour Plates** ..... 419

**Index** ..... 449



# List of Contributors

## **Per Bergmo**

SINTEF Petroleum Research  
N-7465 Trondheim, Norway  
Per.Bergmo@iku.sintef.no

## **Hilde G. Borgos**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
Hilde.Borgos@slb.com

## **Alexander A. Boukhgueim**

University of Vienna  
Department of Mathematics  
A-1090 Wien, Austria  
boukhga5@univie.ac.at

## **Alexis Carrillat**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
ACarrillat@slb.com

## **Geir Vaaland Dahl**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
gvdahl@slb.com

## **Maria Faraklioti**

University of Surrey  
CVSSP, SEPS  
Guildford GU2 7XH, UK

## **Chris L. Farmer**

University of Oxford  
Centre for Industrial and  
Applied Mathematics  
Oxford OX1 3LB, UK  
farmer5@slb.com

## **Hans Georg Feichtinger**

University of Vienna  
Department of Mathematics  
A-1090 Wien, Austria  
hans.feichtinger@univie.ac.at

## **Kristine Årland Halvorsen**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
KHalvorsen@slb.com

## **Armin Iske**

University of Leicester  
Department of Mathematics  
Leicester LE1 7RH, UK  
iske@mcs.le.ac.uk

## **Martin Käser**

University of Trento  
Civil & Environmental Engineering  
I-38050 Trento, Italy  
martin.kaeser@ing.unitn.it

## **Erik Lindeberg**

SINTEF Petroleum Research  
N-7465 Trondheim, Norway  
Erik.Lindeberg@iku.sintef.no

**Magne Lygren**

Statoil ASA  
Forusbeen 50  
N-4035 Stavanger, Norway  
mly@statoil.com

**Erik Monsen**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
Erik.Monsen@slb.com

**Jan E. Odegard**

Rice University  
CITI  
Houston, TX, U.S.A.  
odegard@rice.edu

**Stein Inge Pedersen**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
Stein.Inge.Pedersen@slb.com

**Maria Petrou**

University of Surrey  
CVSSP, SEPS  
Guildford GU2 7XH, UK  
m.petrou@surrey.ac.uk

**Trygve Randen**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
Trygve.Randen@slb.com

**Stine Kjersti Richardsen**

Norwegian Defence  
Research Establishment  
FFI Horten, P.O. Box 115  
N-3191 Horten, Norway  
Stine-Kjersti.Richardsen@ffi.no

**Jürgen Schlaf**

ConocoPhillips Norway  
P.O. Box 220  
N-4098 Tananger, Norway  
juergen.schlaf@conocophillips.com

**Thorleif Skov**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
Thorleif.Skov@slb.com

**Lars Sønneland**

Schlumberger Stavanger Research  
P.O. Box 8013  
N-4068 Stavanger, Norway  
Lars.Sonneland@slb.com

**Brice Vallès**

RF - Rogaland Research  
Thormøhlensgt. 55  
N-5008 Bergen, Norway  
Brice.Valles@rf.no

**Tobias Werther**

University of Vienna  
Department of Mathematics  
A-1090 Wien, Austria  
tobias.werther@univie.ac.at

Part I

## Seismic Interpretation