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# Advances in Intelligent Data Analysis Reasoning about Data

Second International Symposium, IDA-97  
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# Foreword

This volume is a collection of papers presented at the Second International Symposium on Intelligent Data Analysis (IDA-97) held at Birkbeck College, University of London, August 4-6, 1997. Our community is growing fast: The first Symposium, held in Baden-Baden in 1995, received 69 extended abstracts for review; this time we received 107 full papers. We accepted 50, divided equally between oral and poster presentations. Each paper was considered by at least two independent reviewers and the results were discussed in a meeting of program committee members.

IDA-97 was a single-track conference consisting of oral and poster presentations, invited speakers, demonstrations, and exhibitions. The conference Call for Papers introduced a theme, "Reasoning About Data", and many papers complement this theme, but other, exciting topics have emerged, including exploratory data analysis, data quality, knowledge discovery, and data-analysis tools, as well as the perennial technologies of classification and soft computing. A new and exciting theme involves analyzing time series data from physical systems, such as medical instruments, environmental data, and industrial processes.

We are very grateful to Professor David Hand, of the Open University, and Dr. Larry Hunter, of the National Library of Medicine in Washington D.C., for agreeing to give keynote talks. Each has made major contributions and has helped to define the interdisciplinary field of intelligent data analysis.

The symposium owes much to many hard-working individuals. Michael Berthold handled publicity and publications, and is responsible for this volume. The program committee and additional volunteer reviewers read the papers with great care and wrote excellent, informative, helpful reviews. Terrie Korpita and Peggy Weston at the University of Massachusetts coordinated the international reviewing process, a huge job performed flawlessly. The organization at Birkbeck has been tremendous. Phil Gregg was responsible for the IDA-97 homepage, which served to keep the community abreast of developments and was responsible in no small part for the increasing size of the symposium. Betty Walters, Sylvie Jami, Trevor Fenner, Claude Gierl, and Steven Swift were responsible for daily operations, enquiries, registrations, and the details that grew exponentially as the conference date drew nearer. The Systems group in Computer Science at Birkbeck College provided valuable computing support for the reviewing process and conference exhibitions. The symposium would not exist were it not for the confidence and financial backing of Birkbeck College, particularly Roger Johnson, Ken Thomas, and Guy Fitzgerald.

June 1997

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