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# Privacy in Statistical Databases

UNESCO Chair in Data Privacy International Conference, PSD 2010 Corfu, Greece, September 22-24, 2010 Proceedings



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#### Preface

Privacy in statistical databases is a discipline whose purpose is to provide solutions to the tension between the social, political, economic and corporate demand for accurate information, and the legal and ethical obligation to protect the privacy of the various parties involved. Those parties are the respondents (the individuals and enterprises to which the database records refer), the data owners (those organizations spending money in data collection) and the users (the ones querying the database or the search engine, who would like their queries to stay confidential). Beyond law and ethics, there are also practical reasons for data-collecting agencies and corporations to invest in respondent privacy: if individual respondents feel their privacy guaranteed, they are likely to provide more accurate responses. Data owner privacy is primarily motivated by practical considerations: if an enterprise collects data at its own expense, it may wish to minimize leakage of those data to other enterprises (even to those with whom joint data exploitation is planned). Finally, user privacy results in increased user satisfaction, even if it may curtail the ability of the database owner to profile users.

There are at least two traditions in statistical database privacy, both of which started in the 1970s: the first one stems from official statistics, where the discipline is also known as statistical disclosure control (SDC), and the second one originates from computer science and database technology. In official statistics, the basic concern is respondent privacy. In computer science, the initial motivation was also respondent privacy but, from 2000 onwards, growing attention has been devoted to owner privacy (privacy-preserving data mining) and user privacy (private information retrieval). In the last few years, the interest and the achievements of computer scientists in the topic have substantially increased, as reflected in the contents of this volume.

"Privacy in Statistical Databases 2010" (PSD 2010) was held under the sponsorship of the UNESCO Chair in Data Privacy, which has provided a stable umbrella for the PSD biennial conference series since PSD 2008, held in Istanbul. Previous PSD conferences were PSD 2006, the final conference of the Eurostat-funded CENEX-SDC project, held in Rome in 2006, and PSD 2004, the final conference of the EU FP5 CASC project (IST-2000-25069), held in Barcelona in 2004. Proceedings of PSD 2008, PSD 2006 and PSD 2004 were published by Springer in LNCS 5262, LNCS 4302 and LNCS 3050, respectively. The four PSD conferences held so far are a follow-up of a series of high-quality technical conferences on SDC, which started twelve years ago with "Statistical Data Protection-SDP'98", held in Lisbon in 1998 and with proceedings published by OPOCE, and continued with the AMRADS project SDC Workshop, held in Luxemburg in 2001 and with proceedings published by Springer in LNCS 2316.

#### VI Preface

The PSD 2010 Program Committee accepted for publication in this volume 25 papers out of 37 full submissions. Furthermore, 5 additional submissions were received which were reviewed for short presentation at the conference and inclusion in the companion CD proceedings. Papers came from 16 different countries from 4 different continents. Each submitted paper received at least two reviews. The revised versions of the 25 accepted papers in this volume are a fine blend of contributions from official statistics and computer science. Topics covered include tabular data protection, microdata protection, synthetic data, differential privacy, on-line databases and remote access, privacy-preserving protocols, and legal issues.

We are indebted to many people. First, to the Government of Catalonia for financial support to the UNESCO Chair in Data Privacy, which enabled the latter to sponsor PSD 2010. Also, to the Organization Committee for making the conference possible and especially to Jesús Manjón, who helped prepare these proceedings. In evaluating the papers we were assisted by the Program Committee and the following external reviewers: Anne-Sophie Charest, Jörg Drechsler, Sara Foresti, Flavio Foschi, Gabriel Ghinita and Peter-Paul de Wolf.

We also wish to thank all the authors of submitted papers and apologize for possible omissions.

July 2010

Josep Domingo-Ferrer Emmanouil Magkos

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