

VLDB2013

39th International Conference on Very Large Data Bases, Riva del Garda, Trento, Italy



Proceedings of the VLDB Endowment

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**Proceedings of the 39th International Conference on
Very Large Data Bases, Riva del Garda, Trento, Italy**

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LETTER FROM THE GUEST EDITORS

This is the fifth issue of Proceedings of the VLDB Endowment (PVLDB) Volume 6. This issue consists of five papers from the July 2012 revision track or accepted without revisions from the November 2012 track. The papers will be presented at the VLDB 2013 Conference to be held in Riva Del Garda, Italy, in August 2013.

The papers in this issue cover a broad range of topics from scalable machine learning applied to relational data, evaluation of analytical queries on encrypted sensitive data, differential privacy, scalable identification of sensitive data accessed by SQL queries, to reliable distributed storage systems.

We would like to thank the authors for their high-quality submissions and revisions. Thanks also go to our PC members and chairs for their dedicated hard work that makes the PVLDB process possible.

We hope you will find the papers in this issue interesting and inspiring, and we hope that you will continue to submit your work to PVLDB. We look forward to seeing you in Riva Del Garda.

Dan Olteanu, Oxford University
Divesh Srivastava, AT&T Labs
Associate Editors, PVLDB 2013