Nora Reyes · Richard Connor · Nils Kriege · Daniyal Kazempour · Ilaria Bartolini · Erich Schubert · Jian-Jia Chen (Eds.)

# Similarity Search and Applications

14th International Conference, SISAP 2021 Dortmund, Germany, September 29 – October 1, 2021 Proceedings





# Lecture Notes in Computer Science 13058

### **Founding Editors**

Gerhard Goos

Karlsruhe Institute of Technology, Karlsruhe, Germany

Juris Hartmanis

Cornell University, Ithaca, NY, USA

### **Editorial Board Members**

Elisa Bertino

Purdue University, West Lafayette, IN, USA

Wen Gao

Peking University, Beijing, China

Bernhard Steffen

TU Dortmund University, Dortmund, Germany

Gerhard Woeginger

RWTH Aachen, Aachen, Germany

Moti Yung

Columbia University, New York, NY, USA

More information about this subseries at http://www.springer.com/series/7409

Nora Reyes · Richard Connor · Nils Kriege · Daniyal Kazempour · Ilaria Bartolini · Erich Schubert · Jian-Jia Chen (Eds.)

# Similarity Search and Applications

14th International Conference, SISAP 2021 Dortmund, Germany, September 29 – October 1, 2021 Proceedings



Editors
Nora Reyes 
Nora Reyes 
National University of San Luis
San Luis, Argentina

Nils Kriege D
University of Vienna
Vienna, Austria

Ilaria Bartolini (b) University of Bologna Bologna, Italy

Jian-Jia Chen (b)
TU Dortmund University
Dortmund, Germany

Richard Connor D University of St Andrews St Andrews, UK

Daniyal Kazempour Daniyal Kazempour Kiel University Kiel, Germany

Erich Schubert D
TU Dortmund University
Dortmund, Germany

ISSN 0302-9743 ISSN 1611-3349 (electronic) Lecture Notes in Computer Science ISBN 978-3-030-89656-0 ISBN 978-3-030-89657-7 (eBook) https://doi.org/10.1007/978-3-030-89657-7

LNCS Sublibrary: SL3 - Information Systems and Applications, incl. Internet/Web, and HCI

### © Springer Nature Switzerland AG 2021

This work is subject to copyright. All rights are reserved by the Publisher, whether the whole or part of the material is concerned, specifically the rights of translation, reprinting, reuse of illustrations, recitation, broadcasting, reproduction on microfilms or in any other physical way, and transmission or information storage and retrieval, electronic adaptation, computer software, or by similar or dissimilar methodology now known or hereafter developed.

The use of general descriptive names, registered names, trademarks, service marks, 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.

The publisher, the authors and the editors are safe to assume that the advice and information in this book are believed to be true and accurate at the date of publication. Neither the publisher nor the authors or the editors give a warranty, expressed or implied, with respect to the material contained herein or for any errors or omissions that may have been made. The publisher remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

This Springer imprint is published by the registered company Springer Nature Switzerland AG The registered company address is: Gewerbestrasse 11, 6330 Cham, Switzerland

### **Preface**

This volume contains the papers presented at the 14th International Conference on Similarity Search and Applications (SISAP 2021) held between September 29 and October 1, 2021. The conference was hosted by TU Dortmund, Germany. Due to the COVID-19 pandemic and international travel restrictions around the globe, SISAP 2021 was planned as a "hybrid or virtual" event, and in August 2021 it was decided that it would be held as an online conference only due to rapidly increasing incidences in Germany despite a good vaccination rate.

SISAP is an annual forum for researchers and application developers in the area of similarity data management. It focuses on the technological problems shared by numerous application domains, such as data mining, information retrieval, multimedia, computer vision, pattern recognition, computational biology, geography, biometrics, machine learning, and many others that make use of similarity search as a necessary supporting service.

From its roots as a regional workshop in metric indexing, SISAP has expanded to become the only international conference entirely devoted to the issues surrounding the theory, design, analysis, practice, and application of content-based and feature-based similarity search. The SISAP initiative has also created a repository<sup>1</sup> serving the similarity search community, for the exchange of examples of real-world applications, source code for similarity indexes, and experimental testbeds and benchmark data sets.

SISAP 2021 continued the two-year tradition of the SISAP Doctoral Symposium, for which a technical program was assembled to give PhD students an opportunity to present their research ideas in an international research venue. The Doctoral Symposium provides a forum that facilitates interaction among PhD students and stimulates feedback from more experienced researchers. This year's SISAP also included a single special session, on the topic of search in graph-structured data. Again in keeping with previous years, the reviewing process for the special session was integrated with the main conference program to ensure the same quality of acceptance.

The call for papers welcomed full research papers and short research papers, as well as position and demonstration papers, with all manuscripts presenting previously unpublished research contributions.

We received 44 submissions from authors based in 16 different countries. The Program Committee (PC) was composed of 55 members from 20 countries. Each submission received at least four reviews, and the papers and reviews were thoroughly discussed by the chairs and PC members. Based on the reviews and discussions, the PC chairs accepted 23 full papers and 5 short papers, resulting in an acceptance rate of 52% for the full papers and a cumulative acceptance rate of 64% for full and short papers. These rates are a little higher than usual, however the PC chairs are confident that this does not reflect a drop in standards, but rather is an artifact of the context of the COVID-19 pandemic. After a separate review by the Doctoral Symposium Program

<sup>1</sup> https://www.sisap.org/.

Committee members, three Doctoral Symposium papers, giving a clear sample of emerging topics in similarity search and applications, were accepted for presentation and included in the program and proceedings.

The proceedings of SISAP are published by Springer as a volume in the Lecture Notes in Computer Science (LNCS) series. For SISAP 2021, as in previous years, extended versions of selected excellent papers were invited for publication in a special issue of the journal Information Systems. The conference also conferred a Best Paper Award, a Best Student Paper Award, and a Best Doctoral Symposium Paper Award, as judged by the PC chairs and the Steering Committee.

We would like to thank all the authors who submitted papers to SISAP 2021. We would also like to thank all members of the PC and the external reviewers for their effort and contribution to the conference. We want to extend our gratitude to the members of the Organizing Committee for the enormous amount of work they have done, and our sponsors and supporters for their generosity. Finally, we thank all the participants in the online event, who make up the thriving SISAP community.

September 2021

Nora Reyes Richard Connor Nils Kriege Daniyal Kazempour Ilaria Bartolini Erich Schubert Jian-Jia Chen

### **Organization**

### **General Chairs**

Erich Schubert TU Dortmund University, Germany Jian-Jia Chen TU Dortmund University, Germany

### **Program Committee Chairs**

Richard Connor University of St Andrews, UK

Nora Reyes Universidad Nacional de San Luis, Argentina

### **Doctoral Symposium Chair**

Ilaria Bartolini University of Bologna, Italy

### **Publication Chair**

Daniyal Kazempour Christian-Albrechts-Universität zu Kiel, Germany

### **Publicity Chair**

Peer Kröger Christian-Albrechts-Universität zu Kiel, Germany

### **Steering Committee**

Laurent Amsaleg CNRS-IRISA, France Edgar Chávez CICESE, Mexico

Michael E. Houle National Institute of Informatics, Japan Pavel Zezula Masaryk University, Czech Republic

### **Program Committee**

Giuseppe Amato ISTI-CNR, Italy
Laurent Amsaleg CNRS-IRISA, France
Fabrizio Angiulli University of Calabria, Italy
Ilaria Bartolini University of Bologna, Italy
Christian Beecks University of Münster, Germany

Panagiotis Bouros Johannes Gutenberg University Mainz, Germany

Benjamin Bustos University of Chile, Chile

K. Selcuk Candan Arizona State University, USA

Edgar Chavez CICESE, Mexico

Alan Dearle University of St Andrews, UK
Vlastislav Dohnal Masaryk University, Czech Republic
Vladimir Estivill-Castro Universitat Pompeu Fabra, Spain

Rolf Fagerberg University of Southern Denmark, Denmark

Fabrizio Falchi ISTI-CNR, Italy

Karina Figueroa Universidad Michoacana de San Nicolas de Hidalgo,

Mexico

Claudio Gennaro ISTI-CNR, Italy

Magnus Lie Hetland Norwegian University of Science and Technology, Norway

Thi Thao Nguyen Ho Aalborg University, Denmark

Michael E. Houle National Institute of Informatics, Japan

Daniyal Kazempour Christian-Albrechts-Universität zu Kiel, Germany

Nils Kriege University of Vienna, Austria

Peer Kröger Christian-Albrechts-Universität zu Kiel, Germany

Yusuke Matsui University of Tokyo, Japan

Vladimir Mic Masaryk University, Czech Republic

Luisa Micó University of Alicante, Spain Lia Morra Politecnico di Torino, Italy Henning Müller HES-SO, Switzerland

Deepak P. Queen's University Belfast, UK
Rodrigo Paredes Universidad de Talca, Chile
Marco Patella University of Bologna, Italy
Oscar Pedreira Universidade da Coruna, Spain
Miloš Radovanović University of Novi Sad, Serbia

Marcela Ribeiro Federal University of São Carlos, Brazil

Kunihiko Sadakane University of Tokyo, Japan Maria Luisa Sapino Universita' di Torino, Italy

Erich Schubert TU Dortmund University, Germany

Tetsuo Shibuya University of Tokyo, Japan

Tomas Skopal Charles University in Prague, Czech Republic

Nenad Tomasev Google DeepMind, UK

Caetano Traina University of São Paulo, Brazil Goce Trajcevski Iowa State University, USA

Lucia Vadicamo ISTI-CNR, Italy

Takashi Washio Osaka University, Japan Pascal Welke University of Bonn, Germany

Kaoru Yoshida Sony Computer Science Laboratories, Inc., Japan

Pavel Zezula Masaryk University, Czech Republic

Kaiping Zheng National University of Singapore, Singapore Arthur Zimek University of Southern Denmark, Denmark

Andreas Züfle George Mason University, USA

### **Additional Reviewers**

Franka Bause University of Vienna, Austria
Andre Droschinsky
Erik Thordsen TU Dortmund University, Germany
TU Dortmund University, Germany

Florian Kurpicz Karlsruhe Institute of Technology, Germany

Lukas MiklautzUniversity of Vienna, AustriaLutz OettershagenUniversity of Bonn, GermanyTill SchulzUniversity of Bonn, Germany

## **Contents**

Similarity Search and Retrieval	
Organizing Similarity Spaces Using Metric Hulls	3
Scaling Up Set Similarity Joins Using a Cost-Based Distributed-Parallel Framework  Fabian Fier and Johann-Christoph Freytag	17
A Triangle Inequality for Cosine Similarity	32
A Cost Model for Reverse Nearest Neighbor Query Processing on R-Trees Using Self Pruning Felix Borutta, Peer Kröger, and Matthias Renz	45
How Many Neighbours for Known-Item Search? Jakub Lokoč and Tomáš Souček	54
On Generalizing Permutation-Based Representations for Approximate Search Lucia Vadicamo, Claudio Gennaro, and Giuseppe Amato	66
Data-Driven Learned Metric Index: An Unsupervised Approach	81
Towards a Learned Index Structure for Approximate Nearest Neighbor Search Query Processing  Maximilian Hünemörder, Peer Kröger, and Matthias Renz	95
Similarity vs. Relevance: From Simple Searches to Complex Discovery  Tomáš Skopal, David Bernhauer, Petr Škoda, Jakub Klímek, and Martin Nečaský	104
Non-parametric Semi-supervised Learning by Bayesian Label Distribution  Propagation  Jonatan Møller Nuutinen Gøttcke, Arthur Zimek, and Ricardo J. G. B. Campello	118

Optimizing Fair Approximate Nearest Neighbor Searches Using Threaded	
B+-Trees  Omid Jafari, Preeti Maurya, Khandker Mushfiqul Islam, and Parth Nagarkar	133
Fairest Neighbors: Tradeoffs Between Metric Queries  Magnus Lie Hetland and Halvard Hummel	148
Intrinsic Dimensionality	
Local Intrinsic Dimensionality and Graphs: Towards LID-aware Graph Embedding Algorithms	159
Structural Intrinsic Dimensionality	173
Relationships Between Local Intrinsic Dimensionality and Tail Entropy  James Bailey, Michael E. Houle, and Xingjun Ma	186
The Effect of Random Projection on Local Intrinsic Dimensionality	201
Clustering and Classification	
Accelerating Spherical k-Means	217
MESS: Manifold Embedding Motivated Super Sampling	232
Handling Class Imbalance in k-Nearest Neighbor Classification by Balancing Prior Probabilities	247
Applications of Similarity Search	
Similarity Search for an Extreme Application: Experience and Implementation	265
What Makes a Good Movie Recommendation? Feature Selection for Content-Based Filtering	280
Maciej Gawinecki, Wojciech Szmyd, Urszula Żuchowicz, and Marcin Walas	

Contents	X111
Indexed Polygon Matching Under Similarities	295
Clustering Adverse Events of COVID-19 Vaccines Across the United States Ahmed Askar and Andreas Züfle	307
Similarity Search in Graph-Structured Data	
Metric Indexing for Graph Similarity Search	323
The Minimum Edit Arborescence Problem and Its Use in Compressing Graph Collections	337
Lucas Gnecco, Nicolas Boria, Sébastien Bougleux, Florian Yger, and David B. Blumenthal	55,
Graph Embedding in Vector Spaces Using Matching-Graphs	352
An A*-algorithm for the Unordered Tree Edit Distance with Custom Costs  Benjamin Paaßen	364
FIMSIM: Discovering Communities by Frequent Item-Set Mining and Similarity Search	372
Doctoral Symposium	
Towards an Italian Healthcare Knowledge Graph	387
Progressive Query-Driven Entity Resolution	395
Discovering Latent Information from Noisy Sources in the Cultural Heritage Domain Fabrizio Scarrone	402
Author Index	409