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# Similarity Search and Applications

12th International Conference, SISAP 2019 Newark, NJ, USA, October 2–4, 2019 Proceedings



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#### Preface

This volume contains the papers presented at the 12th International Conference on Similarity Search and Applications (SISAP 2019) held in Newark, NJ, USA, during October 2–4, 2019.

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 (http://www.sisap. org/) serving the similarity search community, for the exchange of examples of real-world applications, source code for similarity indexes, and experimental test beds and benchmark data sets.

The call for papers welcomed full papers, short papers, as well as demonstration papers, with all manuscripts presenting previously unpublished research contributions. All contributions were presented both orally and in a poster session, which facilitated fruitful exchanges between the participants. In addition, SISAP 2019 featured a doctoral consortium, accepting papers describing doctoral research and work in progress, providing students valuable feedback from experienced researchers in similarity search and related fields.

We received 42 submissions from authors based in 17 different countries. The Program Committee (PC) was composed of 63 international members. The papers and reviews were thoroughly discussed by the chairs and PC members: Each submission received three reviews. Based on these reviews and discussions among PC members, the PC chairs accepted 12 full papers to be included in the conference program and proceedings, resulting in an acceptance rate of 28% for the full papers. In addition, 18 short papers were accepted, and after separate review by SISAP chairs, two doctoral consortium papers were included in the program and proceedings as well.

The proceedings of SISAP are published by Springer as a volume in the *Lecture Notes in Computer Science* (LNCS) series. For SISAP 2019, 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, as judged by the PC co-chairs and Steering Committee.

Besides the presentations of the accepted papers, the conference program featured three keynote talks by exceptional researchers: Fabrizio Silvestri from Facebook, UK, Divesh Srivastava from AT&T Labs-Research, USA, and Prof. Alexander Tuzhilin from New York University, USA.

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We would like to thank all the authors who submitted papers to SISAP 2019, as well as 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 invested in making the SISAP series of conferences possible.

We also thank our sponsors and supporters for their generosity. All the submission, reviewing, and proceedings generation processes were made much easier through the EasyChair platform.

August 2019

Giuseppe Amato Claudio Gennaro Vincent Oria Miloš Radovanović

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**Keynote Abstracts** 

# Applications of Similarity Search to Socially Relevant Problems

Fabrizio Silvestri

Facebook, UK

**Abstract.** The Facebook AI team in London deals with applying artificial intelligence techniques to address societal problems such as the spread of online misinformation, or the integrity of election processes around the world. To do so, we have developed throughout the last years a set of tools that exploit similarity search technologies to efficiently and effectively run a very high number of classification tasks on a massive set of data.

In this talk, we are going to review some of the problems we have studied in the last year and we are going to show some of the solutions we have adopted in order to make the system run efficiently. We are also going to showcase some details of an internal project that uses similarity search as a core operation to allow efficient and effective inference operations.

### **Repairing Noisy Graphs**

Divesh Srivastava

AT&T Labs-Research, USA

Abstract. Graphs are a flexible way to represent data in a variety of applications, with nodes representing domain-specific entities (e.g., records in record linkage, products and types in an ontology) and edges capturing a variety of relationships between these entities (e.g., an equivalence relationship between records in record linkage, a type-subtype relationship between types in an ontology). Often, the edges in this graph are inferred based on similarities between nodes and are noisy, in that some edges are missing (i.e., real-world relationships that do not have corresponding edges in the graph) and some edges are spurious (i.e., edges in the graph that do not have corresponding real-world relationships). Directly analyzing such graphs can lead to undesirable outcomes, making it important to repair noisy graphs. In this talk, we describe an approach that takes advantage of properties of real-world relationships and their estimated probabilities to ask oracle queries (an abstraction of crowdsourcing) to efficiently repair the noisy graphs. We illustrate this approach for the case of graphs that are unions of cliques (which is the case for record linkage) and graphs that are trees (which is the case for ontologies), and present theoretical and empirical results for these cases.

# On Similarity Measures in Recommender Systems

Alexander Tuzhilin

New York University, USA

**Abstract.** Measures of similarity between users and between items to be recommended to the users lie at the core of many recommendation algorithms, and numerous metrics have been proposed in the recommender systems field since its inception. This talk will explore evolution of various similarity-based measures from the initial class of rating-based measures to the more recently proposed latent metrics and the metric learning methods. We will also explore possible future research directions and novel applications of similarity measures in recommender systems.

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