

Lecture Notes in Computer Science

Lecture Notes in Artificial Intelligence

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Discovery Science


27th International Conference, DS 2024
Pisa, Italy, October 14–16, 2024
Proceedings, Part II

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Preface

Discovery Science 2024 conference provides an open forum for intensive discussions and exchange of new ideas among researchers working in the area of Discovery Science. The conference focus is on the use of Artificial Intelligence, Data Science and Big Data Analytics methods in science. Its scope includes the development and analysis of methods for discovering scientific knowledge, coming from machine learning, data mining, intelligent data analysis, and big data analytics, as well as their application in various domains. The 27th International Conference on Discovery Science (DS 2024) was held in Pisa, Italy, during October 14–16, 2024.

This was the fourth time the conference was organized as a stand-alone physical event. Indeed, for its first 20 editions, DS was co-located with the International Conference on Algorithmic Learning Theory (ALT). In 2018 it was co-located with the 24th International Symposium on Methodologies for Intelligent Systems (ISMIS 2018). Then starting from 2019, it has been a stand-alone event. DS 2020 and DS 2021 were online-only events while DS 2022 and DS 2023 were located in Montpellier, France and Porto, Portugal, respectively.

DS 2024 received 121 international submissions, of which 25 were for the SoBigData++ track, a track dedicated to the usage of data and data science in science celebrating the conclusion of the SoBigData++ project, a sponsor of DS 2024. For each track, each submission was reviewed by at least two Program Committee (PC) members (some PC acted for both tracks) in a single-blind review process using the Microsoft CMT system. The PC decided to accept 45 papers for the regular research track of DS 2024 and 9 papers for the SoBigData++ track, for a total of 54 papers. This resulted in an overall acceptance rate of 45%. One paper was withdrawn two weeks before the beginning of the conference. Thus, during the conference, 53 papers were presented and included in these volumes.

The conference included three keynote talks: Roberto Navigli (Sapienza University of Rome and Babelscape) contributed a talk titled “What Is Missing in Today’s Large Language Models?”; Carlos Castillo (ICREA and Universitat Pompeu Fabra) gave a presentation titled “Human Factors and Algorithmic Fairness”; and Francesca Toni (Imperial College London) contributed a talk titled “Bridging Explainable AI and Contestability”. Abstracts of the invited talks are included in the front matter of these proceedings. Besides the presentation of the regular research papers and SoBigData++ papers in the main program, the conference offered two poster sessions titled “Late Breaking Contributions” and “Doctoral Consortium”, featuring posters of very recent research results and PhD theses on topics related to Discovery Science.

We are grateful to Springer for their continued long-term support. Springer publishes the conference proceedings, as well as a regular special issue of the Machine Learning journal on Discovery Science. The latter offers authors a chance of publishing in this prestigious journal significantly extended and reworked versions of their DS conference papers, while being open to all submissions on DS conference topics.

On the program side, we would like to thank all the authors of the submitted papers and the PC members for their efforts in evaluating the submitted papers, as well as the keynote speakers. On the organization side, we would like to thank all the members of the Organizing Committee, in particular Roberto Pellungrini, Francesca Naretto, Vittorio Romano, Francesco Spinnato, Lorenzo Mannocci, Daniele Fadda and Rosalba Lubino for the smooth preparation and organization of all conference-associated activities. We are also grateful to the people behind Microsoft CMT for developing the conference organization system which has proved to be an essential tool in the paper submission and evaluation process.

October 2024

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Anna Monreale
Riccardo Guidotti
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Keynote Talks

What Is Missing in Today's Large Language Models?

Roberto Navigli

Sapienza University of Rome and Babelscape, Italy

Large Language Models (LLMs) like GPT-4 have demonstrated remarkable capabilities in generating human-like text, understanding context, and performing a wide range of tasks across various domains. However, despite their impressive performance, LLMs exhibit critical limitations that restrict their applicability and reliability in real-world scenarios. This talk delves into the key areas where LLMs fall short, including the lack of true understanding and reasoning, susceptibility to biases, difficulties with long-term context retention, and challenges in generating accurate outputs in non-predominant domains. I will also touch upon research directions that can provide potential solutions to enhance the capabilities and trustworthiness of future LLMs, such as performing lexical and sentence-level semantics, intersecting knowledge and results obtained from different tasks, improving training data diversity, and supporting factuality.

Human Factors and Algorithmic Fairness

Carlos Castillo

ICREA and Universitat Pompeu Fabra, Spain

In this talk, we present ongoing research on human factors of decision support systems that has consequences from the perspective of algorithmic fairness. We study two different settings: a game and a high-stakes scenario. The game is an exploratory “oil drilling” game, while the high-stakes scenario is the prediction of criminal recidivism. In both cases, a decision support system helps a human make a decision. We observe that in general users of such systems must thread a fine line between algorithmic aversion (completely disregarding the algorithmic support) and automation bias (completely disregarding their own judgment). The talk presents joint work led by David Solans and Manuel Portela.

Bridging Explainable AI and Contestability

Francesca Toni

Imperial College London, UK

AI has become pervasive in recent years, and the need for explainability is widely agreed upon as crucial towards safe and trustworthy deployment of AI systems. However, state-of-the-art AI and eXplainable AI (XAI) approaches mostly neglect the need for AI systems to be contestable, as advocated instead by AI guidelines (e.g. by the OECD) and regulation of automated decision-making (e.g. GDPR in the EU and UK). In this talk I will advocate forms of contestable AI that can (1) interact to progressively explain outputs and/or reasoning, (2) assess grounds for contestation provided by humans and/or other machines, and (3) revise decision-making processes to redress any issues successfully raised during contestation. I will then explore how contestability can be achieved computationally, starting from various approaches to explainability, including some drawn from the field of computational argumentation. Specifically, I will overview a number of approaches to (argumentation-based) XAI for neural models and for causal discovery and their uses to achieve contestability.

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