## COLING 2020

# The 28th International Conference on Computational Linguistics

**Proceedings of the Industry Track** 

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### Preface

We welcome you to the 28th International Conference on Computational Linguistics (COLING 2020) Industry Track. This year marks the first in which COLING has a dedicated track for research related to computational linguistics deployed in real-world settings. In recent years, industrial research has been increasingly influential in the field of computational linguistics—both in the form of research departments that contribute to the advancement of computational linguistics, and also by way of the knowledgeable inventors and developers of innovative language and speech products.

The goals of this session are to foster connections between industry practitioners, share insights from industry research to the broader community, and increase engagement with academia on research questions of high priority in industry. This session will showcase commercially-driven research from diverse angles, including the challenges of doing applied research at scale, production scalability, and a shifting data landscape.

We received 124 submissions (79 long and 45 short) and had an acceptance rate of 23%.<sup>1</sup> Based on the first author's affiliation, an estimated 76% of submissions came from industry and 24% from academia. Geographically, most submissions were from North America (44%), 27–28% from Europe and Asia (respectively), and 1% from Africa.

We thank the many people who have made this track a success. We are grateful to Donia Scott, general chair, for her support and for providing us with this opportunity. Thank you to program chairs Núria Bel and Chengqing Zong; local chairs Leo Wanner, Horacio Saggion, and Mónica Domínguez; publication chairs Derek Wong, Liang Huang, and Yang Zhao; web chairs Laura Pérez-Mayos and Amita Misra; virtual infrastructure chairs Paul Piwek, Lluís Padró Cirera, and Luis Espinosa Anke; publicity chairs Ghazaleh Kazeminejad, Tiejun Zhao, Ted Pedersen, and Anna Rogers; and all other members of the organizing committee. We were inspired by the success of the NAACL 2018 and 2019 industry tracks, and we thank Anastassia Loukin and the organizers of the NAACL 2019 Industry Track for their guidance. We are grateful to area chairs Juri Ganitkevitch and Greg Hanneman, and the program committee, whose dedication and hard work made this program possible.

Organizers COLING 2020 Industry Track

<sup>&</sup>lt;sup>1</sup>Not including 17 desk rejects and 13 withdrawals.

#### **Industry Track Chairs**

Ann Clifton, Spotify, USA Courtney Napoles, Grammarly, USA

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Juri Ganitkevitch, Apple, USA Greg Hanneman, Amazon, USA

#### **Program Committee**

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- 16:12–16:18 Leveraging User Paraphrasing Behavior In Dialog Systems To Automatically Collect Annotations For Long-Tail Utterances Tobias Falke, Markus Boese, Daniil Sorokin, Caglar Tirkaz and Patrick Lehnen
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- 16:18–16:24 Towards building a Robust Industry-scale Question Answering System
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  - 16:12–16:18 hinglishNorm A Corpus of Hindi-English Code Mixed Sentences for Text Normalization
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  - 16:24–16:30 *Extreme Model Compression for On-device Natural Language Understanding* Kanthashree Mysore Sathyendra, Samridhi Choudhary and Leah Nicolich-Henkin
  - 16:30–16:33 Scalable Cross-lingual Treebank Synthesis for Improved Production Dependency Parsers
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