MRL 2021

# The 1st Workshop on Multilingual Representation Learning

**Proceedings of the Conference** 

November 11, 2021

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# Message from the General Chair

Multilingual representation learning methods have recently been found to be extremely efficient in learning features useful for transfer learning between languages and demonstrating potential in achieving successful adaptation of natural language processing (NLP) models into languages or tasks with little to no training resources. On the other hand, there are many aspects of such models which have the potential for further development and analysis in order to prove their applicability in various context. These contexts include different NLP tasks and also understudied language families, which face important obstacle in achieving practical advances that could improve the state-of-the-art in NLP of various low-resource or underrepresented languages.

The aim of this workshop is to form the first research community in multilingual representation learning providing the rapidly growing number of researchers working on the topic with a means of communication and an opportunity to present their work and exchange ideas. The main objectives of the workshop are constructing and presenting a wide array of multilingual representation learning methods, including their theoretical formulation and analysis, practical aspects such as the application of current state-of-the-art approaches in transfer learning to different tasks or studies on adaptation into previously under-studied context; providing a better understanding on how the language typology may impact the applicability of these methods and motivate the development of novel methods that are more generic or competitive in different languages; and promoting collaborations in developing novel software libraries or benchmarks in implementing or evaluating multilingual models that would accelerate progress in the field.

The proceedings presents the collection of original research contributions submitted by various and greatly diverse parts of the community which advance the conventional approaches to understanding and implementing multi-lingual representation learning methods, immediately extending their applicability as well as proposing previously unexplored ideas. As the organizing committee we are deeply grateful to the engagement and response from the community and hope to continue to foster the collaborative environment the workshop achieves at its first organization.

# **Message from the Program Chairs**

Having been organized for the first time in an emerging area of cutting-edge research, the Workshop on Multilingual Representation Learning has received a large amount of interest from the community, with 56 submissions to the program. 50 of these submissions were long papers describing original research and 6 presented ongoing or previously published work in the form of extended abstracts. Our program committee consisted of 55 experts in the area from all over the world, conducting research in the industry as well as academia. The committee worked throughly on every submission and selected 19 research papers and 5 extended abstracts to be presented at the workshop. We are glad to present our proceedings gathering the products of a great collaborative effort which we hope will inspire many new ideas to be presented at future events of our workshop with increasing capacity in the years to come.

### **Organizing Committee**

Duygu Ataman, New York University Alexandra Birch, University of Edinburgh Alexis Conneau, Google Orhan Firat, Google Sebastian Ruder, Deepmind Gozde Gul Sahin, TU Darmstadt

## **Program Committee**

Badr Abdullah, University of Saarland David Ifeoluwa Adelani, Saarland University Gustavo Aguliar, Amazon Roee Aharoni, Google Orevaoghene Ahia, InstaDeep Chantal Amrhein, University of Zurich Timothy Baldwin, University of Melbourne Ankur Bapna, Google Chistos Baziotis, University of Edinburgh Eleftheria Briakou, University of Maryland Marcel Bollman, Jonkoping University Iacer Calixto, University of Amsterdam Mona Diab, Facebook Sumanth Doddapaneni, IIT Madras Steffen Eger, TU Darmstadt Akiko Eriguchi, Microsoft Xavier Garcia, Google Ankush Garg, Google Goran Glavas, University of Mannheim Hila Gonen, Facebook Naman Goyal, Facebook Melvin Johnson, Google Yova Kementchedihieva, University of Copenhagen Simran Khanuja, Google Christopher Klamm, TU Darmstadt Sneha Kudugunta, Google Surafel Melaku Lakew, Amazon Kaushal Kumar Maurya, Indian Institute of Techonlogy Hyderabad Stephen Mayhew, Duolingo Todor Mihaylov, Facebook Jamshidbek Mirzakhalov, University of South Florida Ji-Ung Lee, TU Darmstadt Graham Neubig, Carnegie Mellon University Dmitry Nikolaev, Stockholm University Yusuke Oda, LegalForce Atul Kr. Ojha, National University of Ireland Galway Arturo Oncevay, University of Edinburgh Kelechi Ogueji, InstaDeep Rajaswa Patil, TCS Research Jonas Pfeiffer, TU Darmstadt Leonardo Ribeiro, TU Darmstadt Phillip Rust, University of Copenhagen

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# **Conference Program**

#### Thursday November 11, 2021

#### 10:00-10:30

Language Models are Few-shot Multilingual Learners

Genta Indra Winata, Andrea Madotto, Zhaojiang Lin, Rosanne Liu, Jason Yosinski and Pascale Fung

#### 10:30-11:00

Learning Contextualised Cross-lingual Word Embeddings and Alignments for Extremely Low-Resource Languages Using Parallel Corpora Takashi Wada, Tomoharu Iwata, Yuji Matsumoto, Timothy Baldwin and Jey Han Lau

#### 11:00-12:00

*Clustering Monolingual Vocabularies to Improve Cross-Lingual Generalization* Riccardo Bassani, Anders Søgaard and Tejaswini Deoskar

Do not neglect related languages: The case of low-resource Occitan cross-lingual word embeddings Lisa Woller, Viktor Hangya and Alexander Fraser

*Specializing Multilingual Language Models: An Empirical Study* Ethan C. Chau and Noah A. Smith

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Multilingual and Multilabel Emotion Recognition using Virtual Adversarial Training Vikram Gupta

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Identifying the Importance of Content Overlap for Better Cross-lingual Embedding Mappings Réka Cserháti and Gábor Berend

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*On the Cross-lingual Transferability of Contextualized Sense Embeddings* Kiamehr Rezaee, Daniel Loureiro, Jose Camacho-Collados and Mohammad Taher Pilehvar

Small Data? No Problem! Exploring the Viability of Pretrained Multilingual Language Models for Low-resourced Languages Kelechi Ogueji, Yuxin Zhu and Jimmy Lin

#### 13:45-14:15

*Mr. TyDi: A Multi-lingual Benchmark for Dense Retrieval* Xinyu Zhang, Xueguang Ma, Peng Shi and Jimmy Lin

#### 14:15-14:45

*VisualSem: a high-quality knowledge graph for vision and language* Houda Alberts, Ningyuan Huang, Yash Deshpande, Yibo Liu, Kyunghyun Cho, Clara Vania and Iacer Calixto

#### 14:45-15:45

#### *Vyākarana: A Colorless Green Benchmark for Syntactic Evaluation in Indic Languages*

Rajaswa Patil, Jasleen Dhillon, Siddhant Mahurkar, Saumitra Kulkarni, Manav Malhotra and Veeky Baths

*Improving the Diversity of Unsupervised Paraphrasing with Embedding Outputs* Monisha Jegadeesan, Sachin Kumar, John Wieting and Yulia Tsvetkov

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# Multilingual Code-Switching for Zero-Shot Cross-Lingual Intent Prediction and Slot Filling

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