

GeBNLP 2022

**The 4th Workshop on Gender Bias
in Natural Language Processing**

Proceedings of the Workshop

July 15, 2022

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ISBN 978-1-955917-68-1

Preface

This volume contains the proceedings of the Fourth Workshop on Gender Bias in Natural Language Processing, held in conjunction with the 2022 Conference of the North American Chapter of the Association for Computational Linguistics – Human Language Technologies (NAACL-HLT2022). This year, the organization committee changed membership: Kellie Webster made way for Christine Basta and Gabriel Stanovsky. Kellie has been one of the main reasons for the success of this workshop and we would like to thank her for her valuable and enthusiastic contribution to this workshop. We are glad to welcome our two co-organizers and look forward to sharing their insights and expertise.

This year, the workshop received 33 submissions of technical papers (12 long papers, 21 short papers), of which 28 were accepted (11 long, 17 short), for an acceptance rate of 84%. We are pleased to see an increased interest compared to our previous editions in the last three years: the submissions have increased this year to 33 papers compared to 18 papers last year and 19 papers in 2019 and 2020. Furthermore, the high quality of the submissions allowed us to have a higher acceptance rate this year of 84% compared to the previous years, where the acceptance rate was 63%, 68% and 67% respectively. Once more, we thank the Programme Committee members, who provided extremely valuable reviews in terms of technical content and bias statements, for the high-quality selection of research works.

The accepted papers cover a wide range of natural language processing research areas. From the core tasks of NLP, the papers include language modeling and generation, annotation, machine translation, word embeddings, and evaluation. New aspects regarding the analysis and the debiasing mechanisms are introduced and we are excited about the discussions these will inspire. Besides English, we have interesting studies targeting Inuktitut, Hindi and Marathi as well as Chinese, Italian, French and Spanish. All papers cover a variety of gender (and intersectional) bias studies as well as a taxonomy definition.

Finally, the workshop has two keynotes by speakers of high standing: Kellie Webster and Kevin Robinson, Google Research, and Kai-Wei Chang, University of California (UCLA-CS). We also have a panel under the theme of Evaluating gender bias in NLP and we are looking forward to the insights of this panel.

We are very pleased to keep the high interest that this workshop has generated over the last three editions and we look forward to an enriching discussion on how to address bias problems in NLP applications when we meet at a hybrid event on 15 July 2022!

July 2022

Christine Basta, Marta R. Costa-jussà, Hila Gonen, Christian Hardmeier and Gabriel Stanovsky

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Hila Gonen, Meta AI and University of Washington

Christian Hardmeier, IT University of Copenhagen / Uppsala University

Gabriel Stanovsky, Hebrew University of Jerusalem

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Table of Contents

<i>Analyzing Hate Speech Data along Racial, Gender and Intersectional Axes</i> Antonis Maronikolakis, Philip Baader and Hinrich Schütze	1
<i>Analysis of Gender Bias in Social Perception and Judgement Using Chinese Word Embeddings</i> Jiali Li, Shucheng Zhu, Ying Liu and Pengyuan Liu	8
<i>Don't Forget About Pronouns: Removing Gender Bias in Language Models Without Losing Factual Gender Information</i> Tomasz Limisiewicz and David Mareček	17
<i>Uncertainty and Inclusivity in Gender Bias Annotation: An Annotation Taxonomy and Annotated Datasets of British English Text</i> Lucy Havens, Beatrice Alex, Benjamin Bach and Melissa Terras	30
<i>Debiasing Neural Retrieval via In-batch Balancing Regularization</i> Yuantong Li, Xiaokai Wei, Zijian Wang, Shen Wang, Parminder Bhatia, Xiaofei Ma and Andrew Arnold	58
<i>Gender Biases and Where to Find Them: Exploring Gender Bias in Pre-Trained Transformer-based Language Models Using Movement Pruning</i> Przemyslaw Joniak and Akiko Aizawa	67
<i>Gendered Language in Resumes and its Implications for Algorithmic Bias in Hiring</i> Prasanna Parasurama and João Sedoc	74
<i>The Birth of Bias: A case study on the evolution of gender bias in an English language model</i> Oskar Van Der Wal, Jaap Jumelet, Katrin Schulz and Willem Zuidema	75
<i>Challenges in Measuring Bias via Open-Ended Language Generation</i> Afra Feyza Akyürek, Muhammed Yusuf Kocyigit, Sejin Paik and Derry Tanti Wijaya	76
<i>Worst of Both Worlds: Biases Compound in Pre-trained Vision-and-Language Models</i> Tejas Srinivasan and Yonatan Bisk	77
<i>Assessing Group-level Gender Bias in Professional Evaluations: The Case of Medical Student End-of-Shift Feedback</i> Emmy Liu, Michael Henry Tessler, Nicole Dubosh, Katherine Hiller and Roger Levy	86
<i>On the Dynamics of Gender Learning in Speech Translation</i> Beatrice Savoldi, Marco Gaido, Luisa Bentivogli, Matteo Negri and Marco Turchi	94
<i>Fewer Errors, but More Stereotypes? The Effect of Model Size on Gender Bias</i> Yarden Tal, Inbal Magar and Roy Schwartz	112
<i>Unsupervised Mitigating Gender Bias by Character Components: A Case Study of Chinese Word Embedding</i> Xiuying Chen, Mingzhe Li, Rui Yan, Xin Gao and Xiangliang Zhang	121
<i>An Empirical Study on the Fairness of Pre-trained Word Embeddings</i> Emeralda Sesari, Max Hort and Federica Sarro	129
<i>Mitigating Gender Stereotypes in Hindi and Marathi</i> Neeraja Kirtane and Tanvi Anand	145

<i>Choose Your Lenses: Flaws in Gender Bias Evaluation</i>	
Hadas Orgad and Yonatan Belinkov	151
<i>A Taxonomy of Bias-Causing Ambiguities in Machine Translation</i>	
Michal Měchura	168
<i>On Gender Biases in Offensive Language Classification Models</i>	
Sanjana Marcé and Adam Poliak	174
<i>Gender Bias in BERT - Measuring and Analysing Biases through Sentiment Rating in a Realistic Downstream Classification Task</i>	
Sophie Jentzsch and Cigdem Turan	184
<i>Occupational Biases in Norwegian and Multilingual Language Models</i>	
Samia Touileb, Lilja Øvrelid and Erik Velldal	200
<i>Looking for a Handsome Carpenter! Debiasing GPT-3 Job Advertisements</i>	
Conrad Borchers, Dalia Gala, Benjamin Gilbert, Eduard Oravkin, Wilfried Bounsi, Yuki M Asano and Hannah Kirk	212
<i>HeteroCorpus: A Corpus for Heteronormative Language Detection</i>	
Juan Vásquez, Gemma Bel-Enguix, Scott Andersen and Sergio-Luis Ojeda-Trueba	225
<i>Evaluating Gender Bias Transfer from Film Data</i>	
Amanda Bertsch, Ashley Oh, Sanika Natu, Swetha Gangu, Alan W. Black and Emma Strubell	235
<i>Indigenous Language Revitalization and the Dilemma of Gender Bias</i>	
Oussama Hansal, Ngoc Tan Le and Fatiha Sadat	244
<i>What changed? Investigating Debiasing Methods using Causal Mediation Analysis</i>	
Sullam Jeoung and Jana Diesner	255
<i>Why Knowledge Distillation Amplifies Gender Bias and How to Mitigate from the Perspective of DistilBERT</i>	
Jaimeen Ahn, Hwaran Lee, Jinhwa Kim and Alice Oh	266
<i>Incorporating Subjectivity into Gendered Ambiguous Pronoun (GAP) Resolution using Style Transfer</i>	
Kartikey Pant and Tanvi Dadu	273

Program

Friday, July 15, 2022

08:30 - 08:40 *Opening Remarks*

08:40 - 09:25 *Keynote 1: Kellie Webster and Kevin Robinson, Google Research*

09:30 - 10:00 *Oral papers 1*

Challenges in Measuring Bias via Open-Ended Language Generation

Afra Feyza Akyürek, Muhammed Yusuf Kocyigit, Sejin Paik and Derry Tanti Wijaya

Looking for a Handsome Carpenter! Debiasing GPT-3 Job Advertisements

Conrad Borchers, Dalia Gala, Benjamin Gilbert, Eduard Oravkin, Wilfried Bounsi, Yuki M Asano and Hannah Kirk

10:00 - 10:30 *Break*

10:30 - 11:15 *Keynote 2: Kai-Wei Chang, UCLA Computer Science*

11:15 - 12:00 *Oral papers 2*

Fewer Errors, but More Stereotypes? The Effect of Model Size on Gender Bias

Yarden Tal, Inbal Magar and Roy Schwartz

Analysis of Gender Bias in Social Perception and Judgement Using Chinese Word Embeddings

Jiali Li, Shucheng Zhu, Ying Liu and Pengyuan Liu

On the Dynamics of Gender Learning in Speech Translation

Beatrice Savoldi, Marco Gaido, Luisa Bentivogli, Matteo Negri and Marco Turchi

12:00 - 13:30 *Lunch break*

13:30 - 14:30 *Poster session*

Analyzing Hate Speech Data along Racial, Gender and Intersectional Axes

Antonis Maronikolakis, Philip Baader and Hinrich Schütze

Friday, July 15, 2022 (continued)

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14:30 - 15:00 *Oral papers 3*

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Worst of Both Worlds: Biases Compound in Pre-trained Vision-and-Language Models

Tejas Srinivasan and Yonatan Bisk

15:00 - 15:30 *Break*

15:30 - 16:15 *Panel discussion*

Friday, July 15, 2022 (continued)

16:15 - 16:45 *Oral papers 4*

Evaluating Gender Bias Transfer from Film Data

Amanda Bertsch, Ashley Oh, Sanika Natu, Swetha Gangu, Alan W. Black and
Emma Strubell

Choose Your Lenses: Flaws in Gender Bias Evaluation

Hadas Orgad and Yonatan Belinkov

16:30 - 17:00 *Discussion and closing*