Analyzing use of masculine generics by LLMs in French

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1. Introduction

- Masculine generics (MG) in gender-marked languages (e.g., French, German, Dutch): use of the masculine form as a default/neutral form to refer to (a) mixed group of men/women or (b) people whose gender is unknown. Examples in French:
 - (a) « Les étudiants sont partis. » (Students [masc.] left.)
 - (b) « Un **athlète** doit s'entrainer régulièrement pour progresser. » (An **athlete** [masc.] needs to train regularly to progress.)
- Psycholinguistics studies show that MG induce gender bias and amplify male-centric mental representations^[1-3]
- Gender bias widely studied in instruct-based LLMs^[4], but never with generic instructions or in unconstrained contexts

2. Methodology

Focus on French, but applicable to any language with MG given human noun and instruction datasets

- **a.** Create a French human noun (HN) dataset from available French lexical resources to detect occurrences of MG and evaluate the ratio of MG to HN uses
 - Filter with custom ML binary HN classification pipeline



- **b.** Analyze MG use in 6 LLMs' outputs to generic instructions
 - Use human/Al-written generic instruction datasets and remove specific contexts with spaCy^[5] (dependency parsing and NER)



Pourquoi Paris est si populaire ? (Why is Paris so popular?)



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Comment fixer une télé au mur ? (How to mount a TV to the wall?)





Qui est Albert Camus? (Who is Albert Camus?)



⊙ Sample 10,000 instructions and send them to LLMs

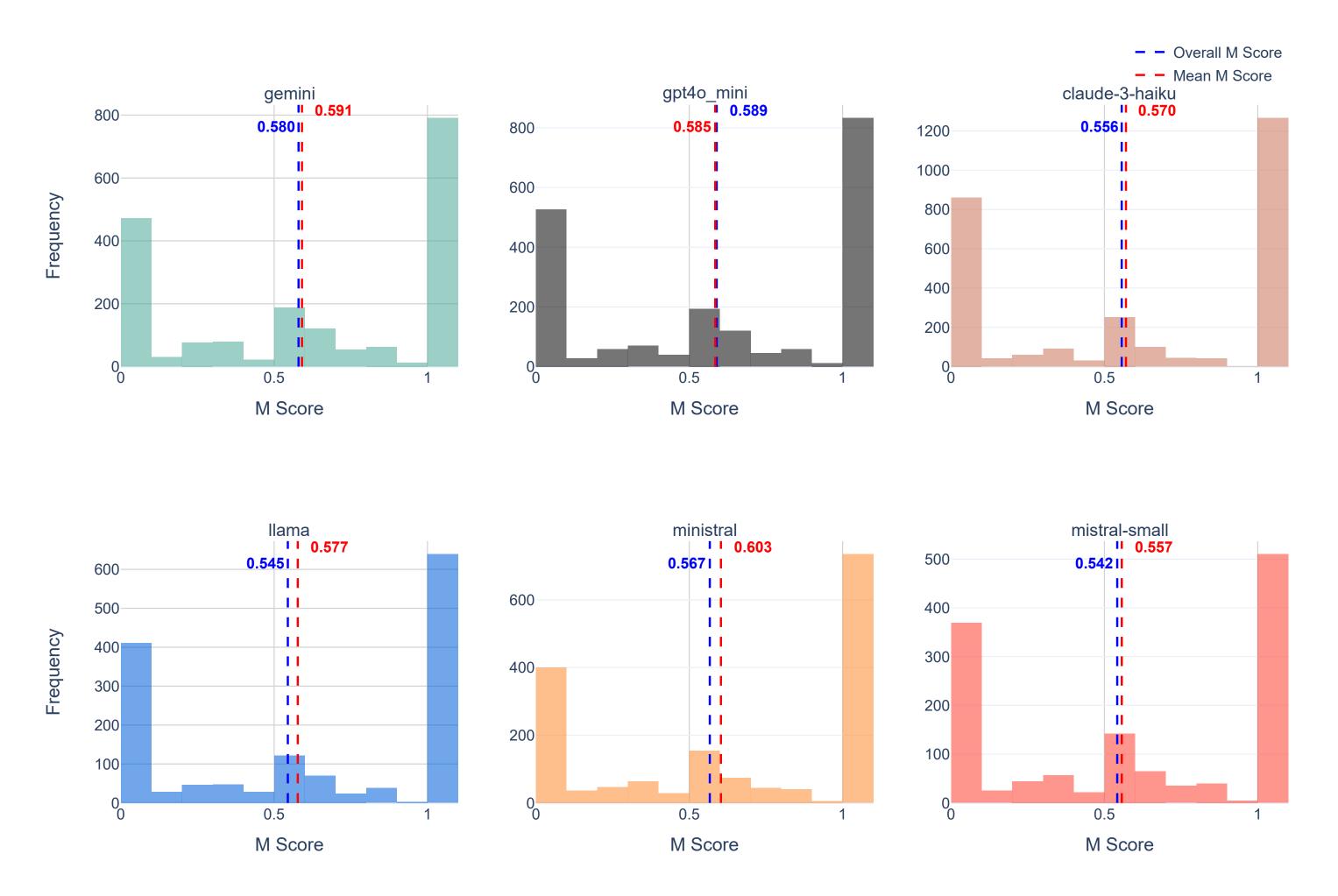


- Like instructions, filter responses to remove specific contexts
- Validate HNs in outputs using GPT-4o mini, JSON-constrained
- Compute score for each text; as well as mean (average bias per text) and overall (average bias per LLM) scores

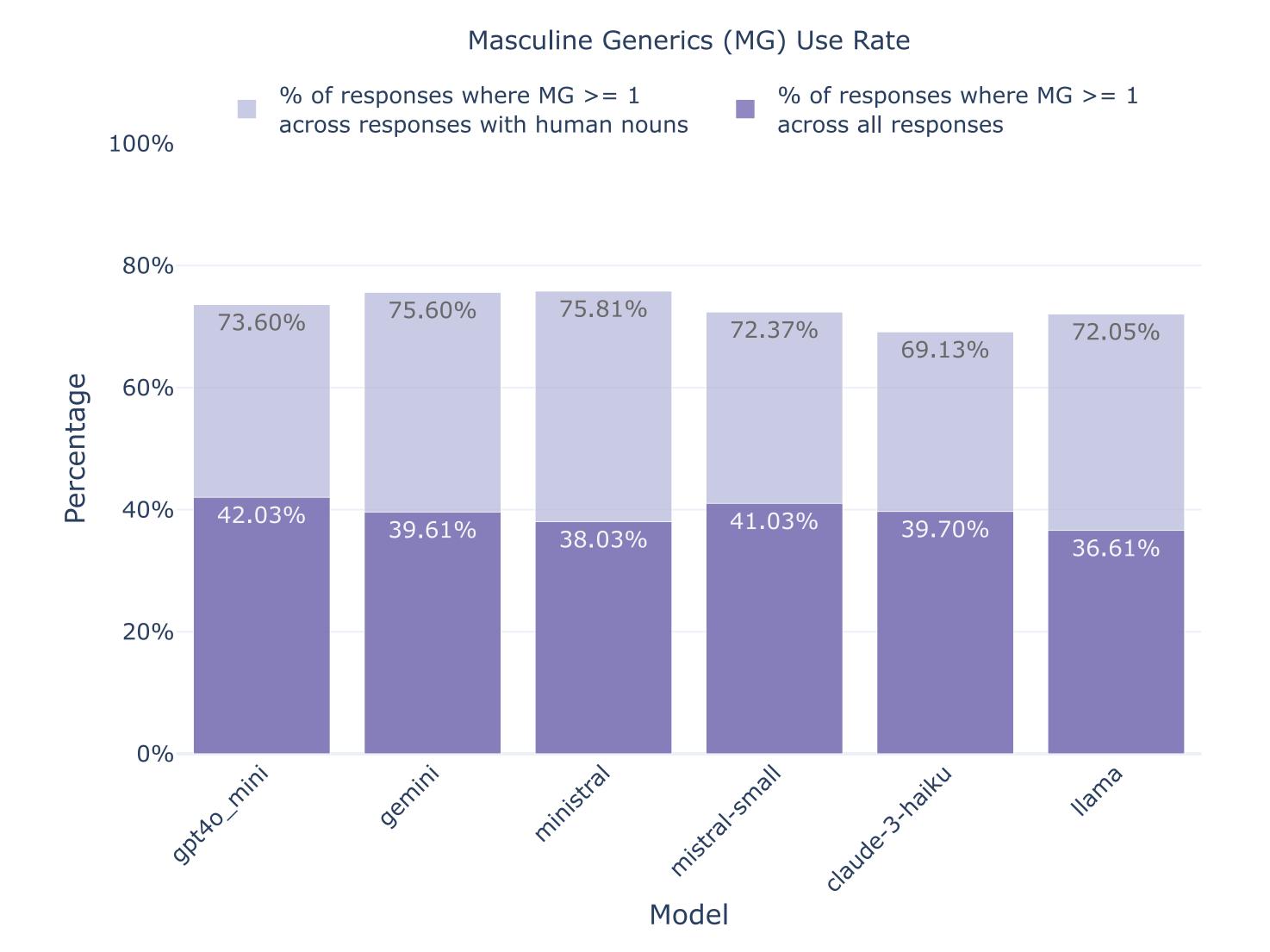
3. Results and Findings

- LLMs use MG in \approx 39.5% of all their responses on average (\approx 73.1% of responses with HNs)
- GPT-4o mini and Ministral generally the most biased models
- Llama 3 8B, Claude 3 Haiku and Mistral Small 3 generally the least biased models
- LLMs reluctant to using gender-fair language (GFL) spontaneously, Llama 3 8B being the model with highest GFL use (see preprint for details)

MScore



MG Use Rate



4. Takeaways

- LLMs largely exhibit MG bias when generating responses to generic, contextually unconstrained instructions
- Fairness in language should be attentively considered when training LLMs in heavily gender-marked languages

References

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- [3] Rothermund, P., & Strack, F. (2024). Reminding May Not Be Enough: Overcoming the Male Dominance of the Generic Masculine. Journal of Language and Social Psychology, 43(4), 468–485.
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