dfkinit2b at CheckThat! 2025: Leveraging LLMs and Ensemble of Methods for Multilingual Claim Normalization

Tatiana Anikina, <u>Ivan Vykopal</u>, Sebastian Kula, Ravi Kiran Chikkala, Natalia Skachkova, Jing Yang, Veronika Solopova, Vera Schmitt, Simon Ostermann

Ivan Vykopal

CLEF CheckThat! 2025, 11.09.2025 ivan.vykopal@kinit.sk









Misinformation is spreading rapidly on social media







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Normalized claim

Thousands of drones lift a truck.



Fact-checking pipeline



















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- Multilingual dimension adds complexity



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Two settings:

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 Monolingual: 13 languages with full datasets (train, dev, test)

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Two settings:

- Monolingual: 13 languages with full datasets (train, dev, test)
- Zero-shot: 7 unseen languages, test set only

Monolingual Output O

Zero-shot

Normalized claim







Data are sourced from Google Fact-Check Explorer via ClaimReview



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Challenges



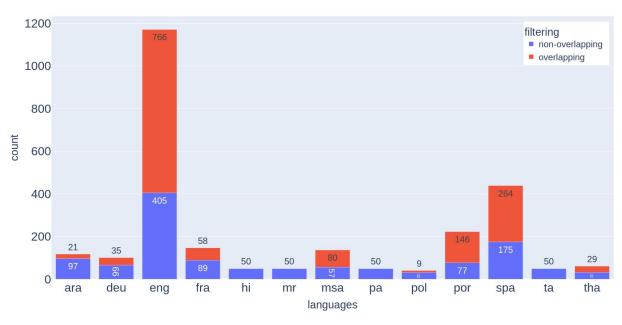
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Challenges

Mixed languages in post/claim



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Claim overlap between the gold train and development data.

Challenges

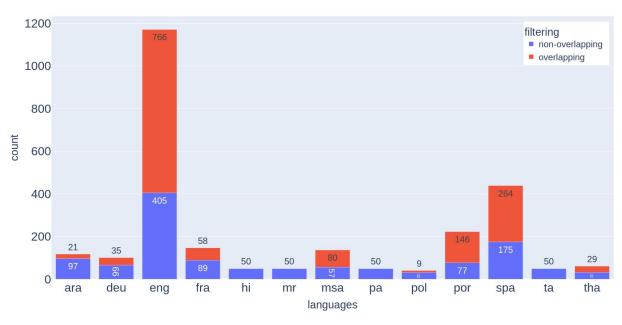
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Challenges

- Mixed languages in post/claim
- Duplicates across train/dev

Claim overlap between the gold train and development data.

Pre-processing: de-duplication & similarity filtering (discarded if cos. sim < 0.05)







9 LLMs

Model	# Params	# Langs	Citation	LoRA	Prompting
Llama3.1 Instruct	405 B	8	Grattafiori et al. [27]		√
Llama3.1 Nemotron Ultra	253 B	8	Bercovich et al. [28]		\checkmark
Qwen2.5 Instruct	72 B	29	Yang et al. [29]		\checkmark
Llama3.3 Instruct	70 B	8	Grattafiori et al. [27]		\checkmark
Qwen3	32 B	100+	Yang et al. [30]		\checkmark
Gemma3 IT	27 B	140+	Team et al. [31]	\checkmark	\checkmark
Qwen3	14 B	100+	Yang et al. [30]	\checkmark	
Bielik Instuct v2.3	11 B	1	Ociepa et al. [32]		\checkmark
Qwen3	8 B	100+	Yang et al. [30]		\checkmark







Approaches

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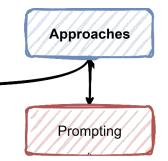
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PEFT (LoRA)

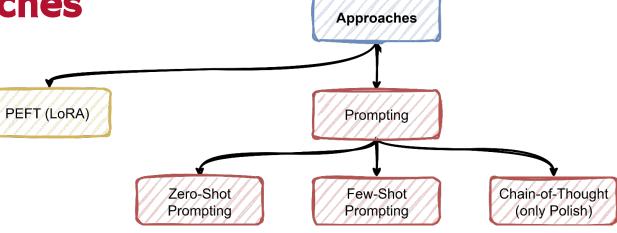


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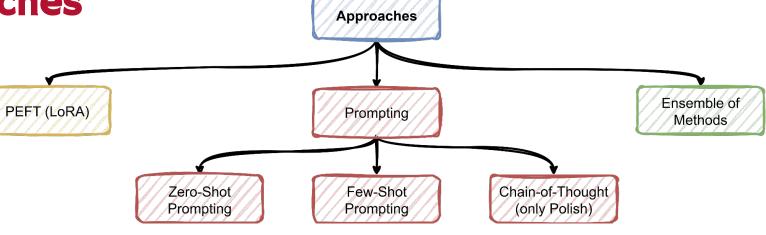


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unsloth

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 - Translation-based augmentation (translation from English data)



Zero-Shot Prompting

 Task description + characteristics of normalized claims







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Few-Shot Prompting

- Demonstration selection via similarity (mGTE-base)
- Experimented with 1, 2, 5 and 10 examples







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Translated Prompts (Zero- & Few-Shot)

 Instructions translated to the target language via Google Translate API







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Experiments with Polish

- Polish-CoT vs. Few-shot prompting
- Experiments also with the Polish LLM







Ensemble of Methods

Original social media posts paraphrase-multilingual-MiniLM-L12-v2 Qwen3-32B (3) compute centroid Llama3.1 (average) embedding for (2) embed top-5 normalized claims Qwen3-LoRA Gemma3 Llama3.3 (1) generate normalized claims with 5 top-performing models (4) select the candidate with the highest cossim to the centroid embedding







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Monolingual Setting







 Preliminary results with Gemma3 27B, final submission with Qwen3 14B



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Approach	ara	deu	eng	fra	hi	mr	msa	ра	pol	por	spa	ta	tha
Zero-shot	0.305	0.161	0.244	0.265	0.224	0.275	0.219	0.311	0.194	0.294	0.268	0.340	0.054
LoRA-target	0.361	0.298	0.658	0.439	0.290	0.311	0.599	0.352	0.267	0.509	0.518	0.450	0.217
LoRA-all-balanced	0.390	0.293	N/A	0.454	0.285	0.287	0.570	0.309	0.265	0.510	0.531	0.438	0.213
LoRA-translated	0.379	0.302	N/A	0.430	0.254	0.297	0.551	0.290	0.236	0.497	0.509	0.332	0.175
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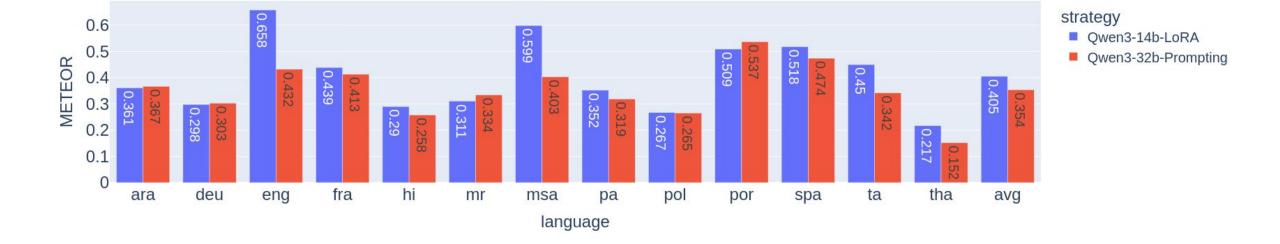
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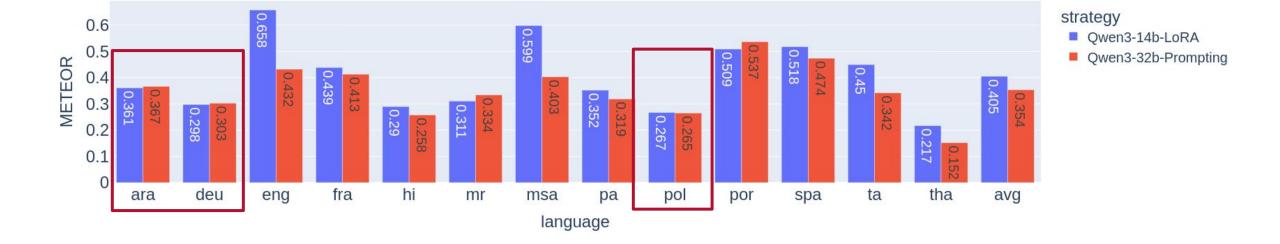
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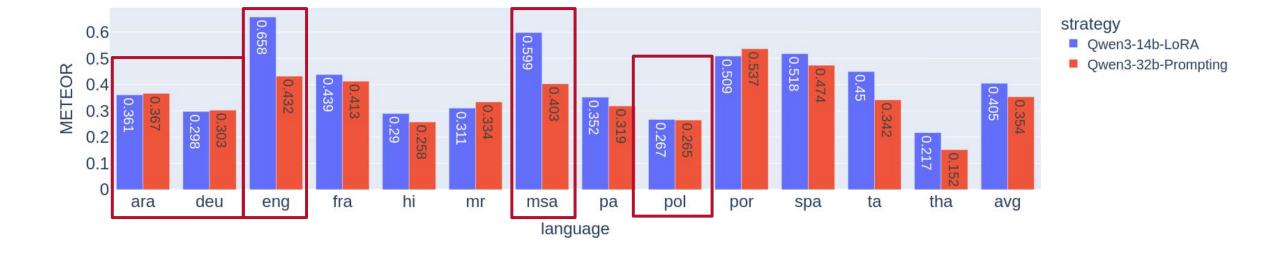
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LoRA offers negligible gains for some languages but larger improvements for others

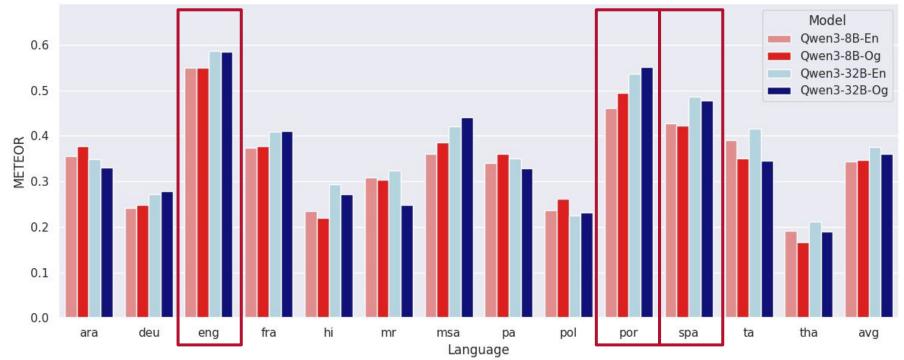








High-resource European languages demonstrated consistently strong performance



Performance of Qwen3 in the monolingual setting on the dev set using 10-shot prompting with unfiltered data for sample selection.







Multilingual models outperform the Polish LLM

Model	Prompt Type	Dev Set	Test Set
Bielik Instuct v2.3	Polish-CoT	0.198	N/A
	3-shot	0.282	0.297
Llama3.1 Nemotron Ultra	3-shot	0.254	N/A
	10-shot	0.296	0.347
Llama3.1 405B	10-shot	0.271	0.393
	20-shot	N/A	0.396







Overall Results





Language	Arabic (ara)	German (deu)	English (eng)	French (fra)	Hindi (hi)	Marathi (mr)	Indonesian (msa)	Punjabi (pa)	Polish (pol)	Portuguese (por)
Best Score	0.504	0.386	0.457	0.527	0.328	0.389	0.565	0.331	0.407	0.577
Our Score	0.504	0.347	0.457	0.470	0.328	0.389	0.502	0.331	0.396	0.574
Δ (Ours vs Best)	0	-0.039	0	-0.057	0	0	-0.063	0	-0.011	-0.003
Our Strategy	Ensemble	Qwen3-32b	Ensemble	Qwen3 $LoRA$	Ensemble	Qwen3 $LoRA$	Qwen 3_{LoRA}	Qwen3-8b	Llama3.1	Ensemble
Our Rank	1	2	1	2	1	1	2	1	2	2
Language	Spanish (spa)	Tamil (ta)	Thai (tha)	Bengali _{zero} (ben)	Czech _{zero} (ces)	${f Greek}_{zero} \ {f (ell)}$	Korean _{zero} (kor)	Dutch _{zero} (ndl)	Romanian $_{zero}$ (ron)	Telugu _{zero} (te)
Language Best Score										
1000	(spa)	(ta)	(tha)	(ben)	(ces)	(ell)	(kor)	(ndl)	(ron)	(te)
Best Score	(spa) 0.608	(ta) 0.632	(tha) 0.586	(ben) 0.378	(ces) 0.252	(ell) 0.262	(kor) 0.134	(ndl) 0.200	(ron) 0.295	(te) 0.526
Best Score Our Score	(spa) 0.608 0.554	0.632 0.632	(tha) 0.586 0.300	(ben) 0.378 0.378	0.252 0.252	(ell) 0.262 0.262	0.134 0.134	(ndl) 0.200 0.200	(ron) 0.295 0.295	0.526 0.526







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Best strategies - Gemma3 prompting & Ensemble method







LoRA adapters are efficient for low-resource languages



- LoRA adapters are efficient for low-resource languages
- Prompting works well with high-resource languages



- LoRA adapters are efficient for low-resource languages
- Prompting works well with high-resource languages
- English prompts outperform target language in zero-shot



- LoRA adapters are efficient for low-resource languages
- Prompting works well with high-resource languages
- English prompts outperform target language in zero-shot
- Ensemble smooths out model variance and achieves the best performance in 11 out of 20 languages (5 out 7 cases in the zero-shot setting)



Current Challenges

Dataset imbalance and overlap between splits



Current Challenges

- Dataset imbalance and overlap between splits
- Missing context (especially visual, e.g., images or videos)



Future Directions

Use LLMs for data augmentation







Future Directions

- Use LLMs for data augmentation
- Evaluate the impact of normalized claims in fact-checking tasks









Thank you!



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