Can LLMs Really Learn to Translate a Low-Resource Language from One Grammar Book?

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Machine Translation from One Book

> ½ of languages have a grammar book available

Kalamang (kgv) – 200 speakers, first grammar published in 2022 Therefore **unseen** by LLMs during training

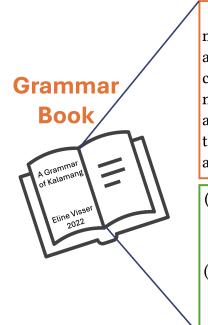
Tanzer et al. (2024):

Claim: Given the grammar book in-context, LLMs can learn to translate kgv

Really?

Linguistic knowledge rarely helps NLP task performance (Opitz et al. 2024) — is this an exception?





Clitics are mainly inflectional, and include postpositions as well as aspect and mood markers. Among the derivational clitics are attributive =ten, which derives adjectives from verbs but is also attested in non-verbal predicates (§6.3.5), and causative ma= (§11.4.4). Cliticisation always occurs after affixation. A derived noun, for example, can carry a postposition. Lenget 'villager' from leng 'village' and agent nominaliser -et becomes lenget=at when it is the last constituent of the object NP, as in (17). Amkeiret 'birth parent' from amkeit 'to give birth' and agent nominaliser -et can be inflected with animate lative =kongga, as in (18).

- (17) ma sontum leng-et=at merengguen
 3sG person village-NMLZ=OBJ gather
 'He gathered the village people.'
- (18) don wa me se amkeit-et=kongga thing PROX TOP IAM give_birth-NMLZ=AN.LAT 'This thing comes from the birth parent.'

Prompt

Here is a grammar book: Book, / Book,

Now translate X into Kalamang:



Book parallel

Research Questions

1. Where does LLMs' translation ability stem from: explanations or examples?

2. Which tasks does grammatical information help?

3. What kind of grammatical information is most useful?

Q1: Explanations or Examples for translation?

For Q1: We separate parallel sentences + glosses ($Book_{parallel (p)}$) from grammatical explanations ($Book_{non-parallel (\neg p)}$) for prompting and fine-tuning

Test set: Kalamang—English (100 examples); Nepali and Guarani FLORES (see paper)

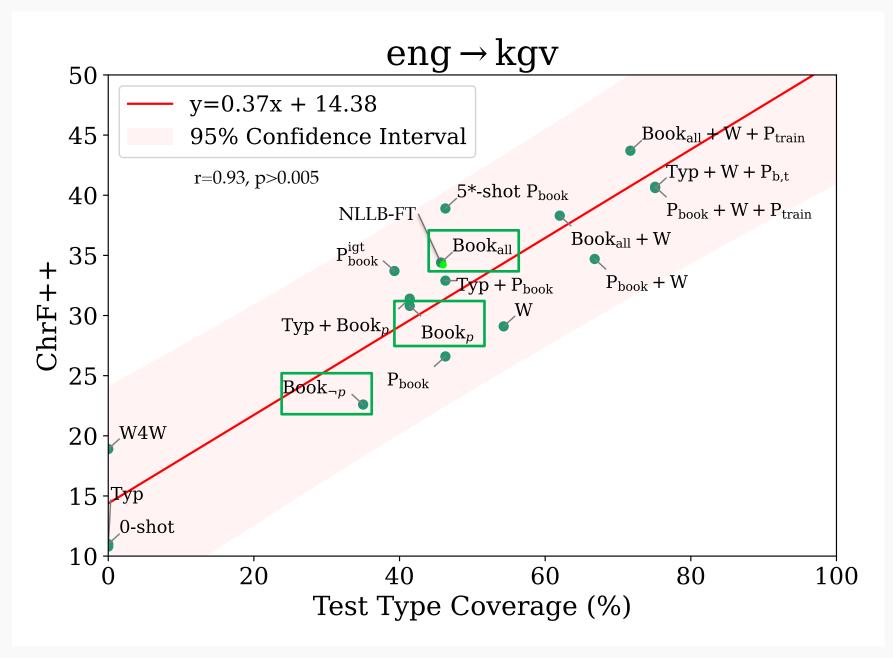
Evaluation: ChrF++ for character and word-level information

Models: Gemini-1.5-Flash, Llama-3.1-8B (see paper), NLLB-1.3B (fine-tuned)

Translation with Book_{parallel} beats Book_{non-parallel}

In kgv-eng, Book_{parallel} also beats Book_{all}

LLMs fail to exploit grammar for translation



English to Kalamang Translation with Gemini-1.5-Flash

Which tasks?

Grammaticality Judgment

Prompt LLM to choose original sentence given:

Grammar subset +

Kalamang sentence

Corrupted Kalamang sentence – swapped adjacent words, random words, or shuffled

Interlinear Gloss Prediction

Prompt LLM to generate Interlinear Gloss given:

Grammar book subset +

Segmented Kalamang sentence

English translation

What kind of grammar?

Grammatical explanations of rules and exceptions, Booknon-parallel

Typology: describes high-level grammatical features of a language

ID	Grambank Typological Feature	Specification
GB020	Are there definite or specific articles?	No
GB130	What is the order of S and V in intransitive clauses?	SV
GB159	Are nouns reduplicated?	Yes

Summarise features in textual form as a prompt replacement for Book_{non-parallel}

For both gloss prediction and grammaticality judgment, Book_{parallel} > Book_{all} >> Book_{non-parallel}

Best performing prompt is Typology + Book_{parallel}

So LLMs can exploit grammar for linguistic tasks

Summary

LLMs fail to exploit grammatical explanations for translation

Parallel examples are most helpful for translation, and fine-tuning on parallel data matches long-context LLMs

Typological prompting outperforms explanations (Book_{non-parallel}), for linguistic tasks

Task-appropriate data is key

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