# Fine-tuning a pretrained machine learning model to identify declension errors in CELANDIC By Isak Grimsson, supervised by Matthew Yee-King

ABATRA OF In this paper we fine-tuned a BERT model for declension error detection (DED). We present our method to create synthetic data to retrain our model, and analyse the results.

# MONTH VATION Declension governs

how words change their form dependent on the context of the sentence. Latin, a famously declension-happy language, has twenty declension patterns. Icelandic has seventy-three. Making minor declension errors does occasionally occur for native Icelandic speakers, but for non-natives, they are a constant source of frustration and/or embarrassment. At the start of this project and until the addition of Icelandic into ChatGPT-4 there were no tools available for DED.

DATAEF Originally we had a dataset of 35,000 CEFATION correctly and 1000 incorrectly declined sentences. But that was not enough data for the model to effectively learn, so we created a synthetic dataset for the model to use, by combining the original dataset with a database of declensions, we algorithmically created multiple incorrect sentences for each correct sentence in our original dataset.

| Correct sentences              |             |  |  |
|--------------------------------|-------------|--|--|
| Sentence                       | Label       |  |  |
| Hann er Hestur<br>Hann er Kind |             |  |  |
| <br>Lorem ipsum                | <br>correct |  |  |

| Word<br>ID | Word   | Case       |
|------------|--------|------------|
| 1          | Hestur | Nominative |
| 1          | Hest   | Genitive   |
| 1          | Hesti  | Dative     |
| 1          | Hests  | Accusative |
| 2          | Kind   | Nominative |
| 2          | Kind   | Genitive   |
| _          | 1.61   | D 11       |

Kindar Accusative

Declension database Incorrect sentences

| Text            | Label         |
|-----------------|---------------|
| Hann er hest    | incorrect     |
| Hann er hesti   | incorrect     |
| Hann er hests   | incorrect     |
| Hann er kindar  | incorrect     |
| <br>Lorem ipmus | <br>incorrect |
|                 |               |

### What does fine tuning a pretrained model mean?

A pretrained BERT model has been slowly trained on a lot of data, and has a rich understanding of how words are connected, but it's not very useful, it's trained to predict a missing word, for example:

'This is a [missing word] example sentence" Input

Output ['simple' 60%, 'clear' 25%, 'confusing" 10%, 'unclear" 5%]

To create a more useful model, we fine-tuned it for DED by using the pretrained model as a starting point and providing it with new data so it could be trained to classify sentences as correct or incorrect.

## REXULTX

Our Model's ChatGPT-4's F-1 score = 0.7865 F-1 score = 0.9214

|                 |          | Actual Class |          |
|-----------------|----------|--------------|----------|
|                 |          | Positive     | Negative |
| Predicted Class | Positive | 2691         | 693      |
|                 | Negative | 768          | 343      |

|                 |          | Actual Class |          |
|-----------------|----------|--------------|----------|
|                 |          | Positive     | Negative |
| Predicted Class | Positive | 3430         | 556      |
|                 | Negative | 29           | 480      |

# CONCLUZIONZ AND FUTURE WORK

The DED model has very promising results, convincingly outperforming ChatGPT-4.

Possible future improvements:

- A way to reliably source or generate correct sentences
- Fine-tuning a classification threshold (AUC-ROC curve)
- Making the model available for use online
- Comparing the model's performance with native and non-native Icelandic speakers.