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SPRÅKBANKEN **TEXT**

A First Attempt at Unreliable News Detection in Swedish

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Unreliable News Detection



Let's take news article A



Does it come from a source that usually presents COVID-19 information in an unreliable way?



Can we actually detect this?

Our Data



The original dataset comes from Kokkinakis (2021)



Contains news articles in Swedish related to the COVID-19 pandemic



The data comes from from medical and governmental outlets to conspiracy theory blogs

Our Data

- The original dataset has eight different domain labels
- We grouped them into two classes, according to their source:
 - Reliable
 - Unreliable





Our Data - Caveats

- There are no fact-checking agencies in Sweden
- The dataset is very small (~2K articles)
- The dataset is very unbalanced (one unreliable article for every ten reliable ones)

Our Solution – Data Augmentation

Subsampling

Generates a more balanced dataset by leaving out reliable articles but makes the dataset size problem worse

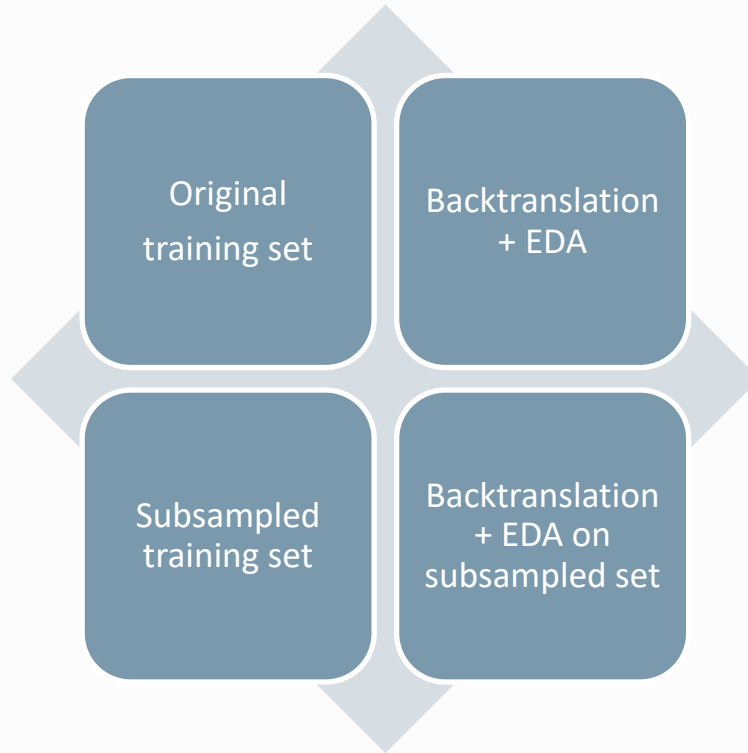
Backtranslation

Synthetic data is generated by translating the original article to English and then back into Swedish

Easy Data Augmentation (EDA)

Uses four simple operations to alter the text – synonym replacement and random insertions, swaps, and deletions

Training Datasets



Our Models

Classical Machine Learning

- Logistic Regression
- Support Vector Machine (SVM)

Deep Learning

- LSTM + word2vec
- BERT

Results

Model	Balanced	EDA	Accuracy	F1-Score
LogReg (Baseline)	No	No	0.922	0.631
LogReg	Yes	Yes	0.953	0.866
SVM	No	Yes	0.956	0.837
LSTM	No	No	0.943	0.824
BERT	Yes	Yes	0.952	0.837



Takeaways

- EDA greatly improved the performance of the classical machine learning approaches
- The F1 Score for the unreliable news was very low compared to the for reliable news ones
- Subsampling did not have an easily interpretable pattern

Future Directions

- Create a larger dataset of mis/disinformation in Swedish
 - More systematic data retrieval
 - Article and source-level annotations
 - Different kinds of mis- and disinformation
- Use linguistic and psycholinguistic features
 - Have proven to be useful both with smaller and larger datasets
 - Allow for the use of feature importance
- Alter the EDA algorithm to better deal with longer form text and with sequential models



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