





Leibniz Institute for the Social Sciences

Predicting Structured Metadata from Text

We describe a framework to predict structured metadata values from text in order to improve the quality and quantity of experimental metadata. We demonstrate our framework using gene expression metadata from the GEO database.

Approach

We use Latent Dirichlet Allocation (LDA) to discover latent topics present in unstructured metadata. Topic models drastically reduce document description length as compared to traditional methods and they produce semantically meaningful features as latent topics.

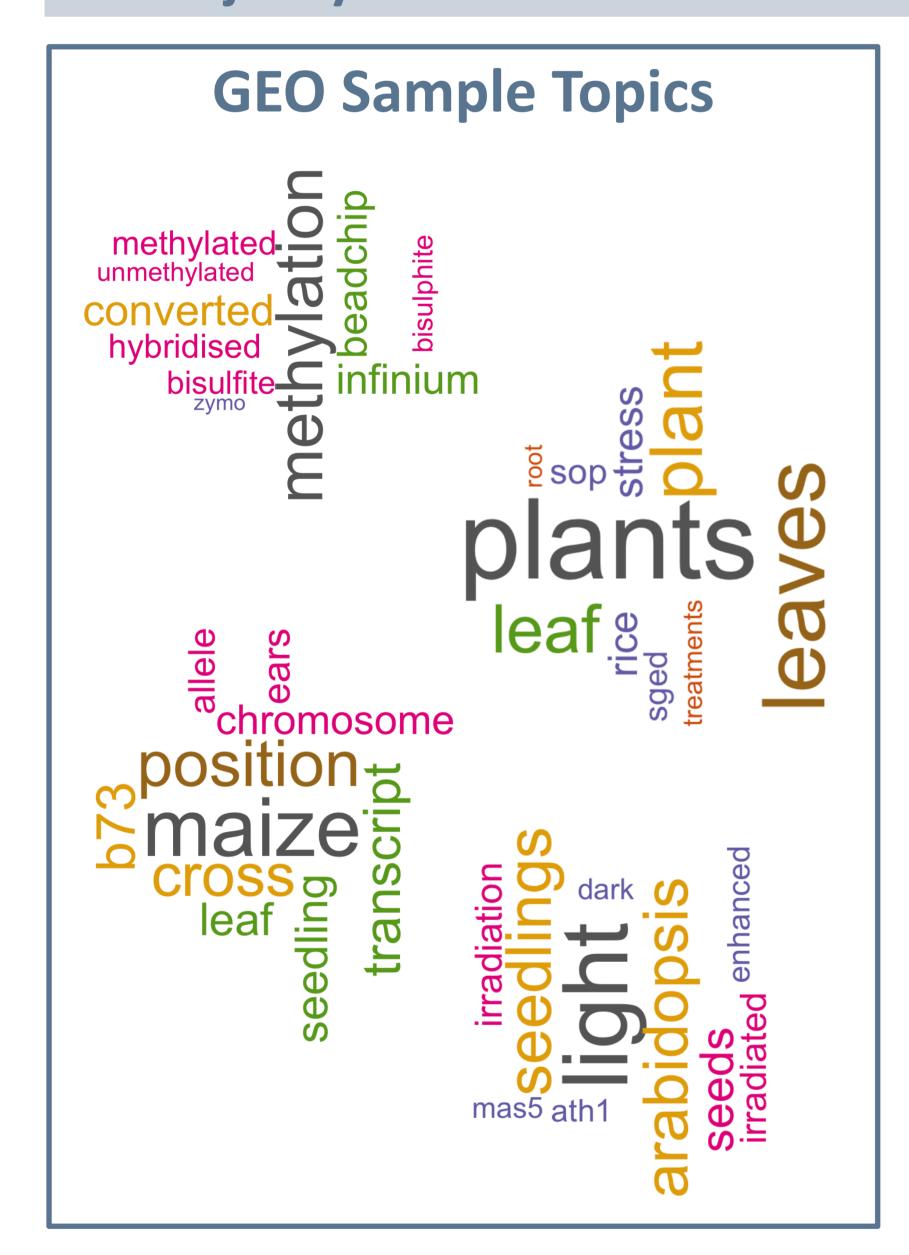
We compare the performance of a Support Vector Machine (SVM) trained with LDA or TF-IDF against the majority classifier.

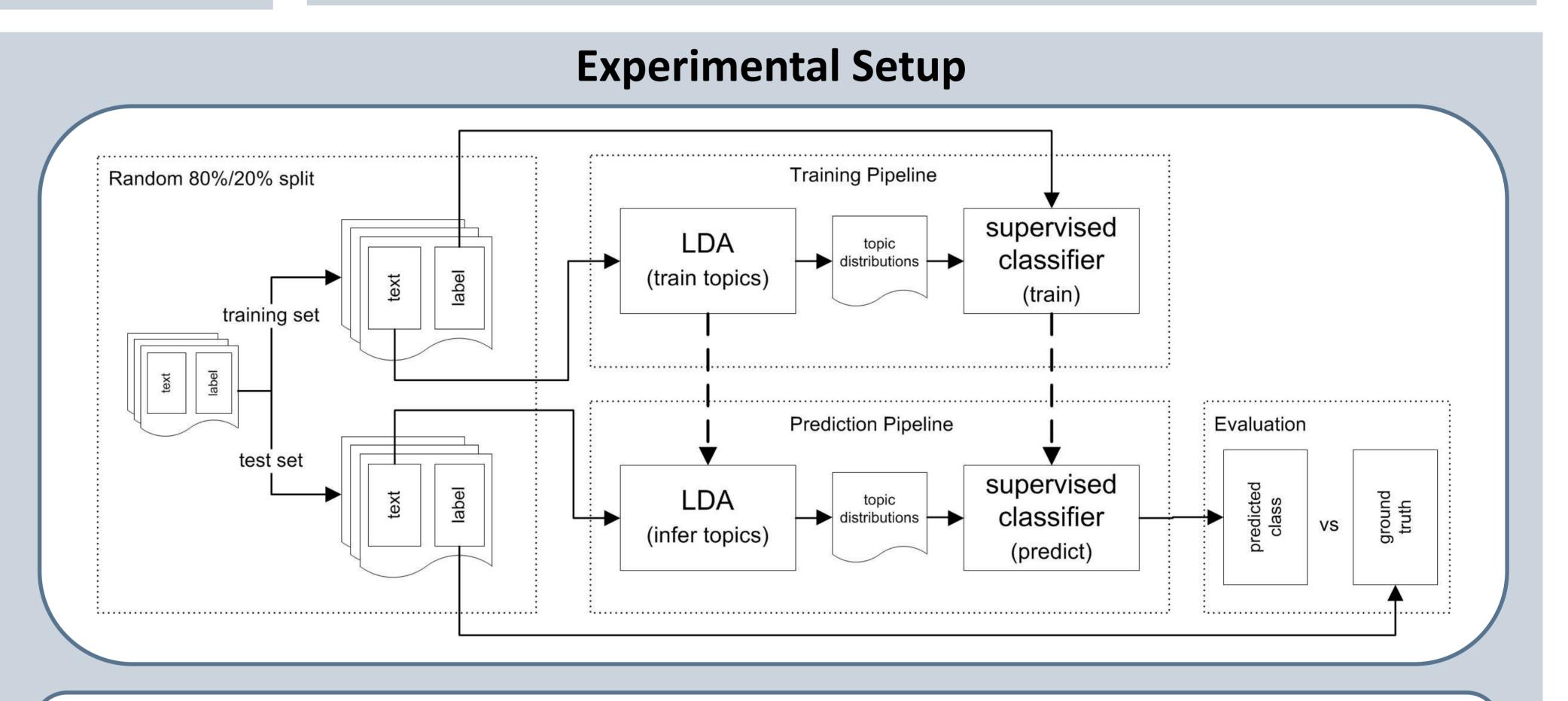
Conclusions

Unstructured metadata elements contain information which can be successfully exploited using either LDA or TF-IDF for predicting structured metadata elements well beyond the majority classifier.

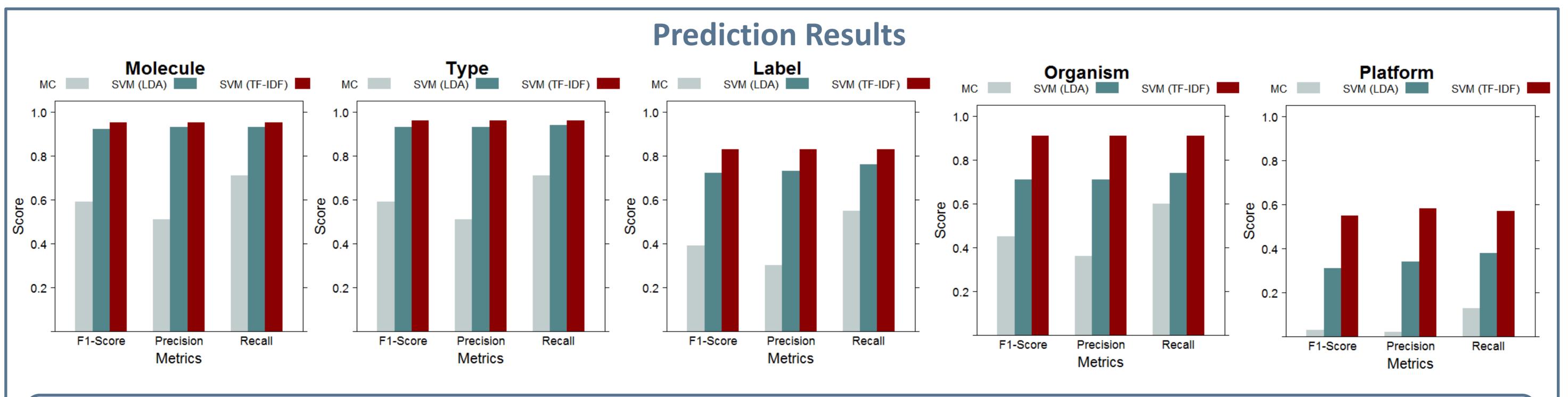
Limitations:

- Not all classes were predicted with equal accuracy.
- Our results are limited to a subset of structured metadata from GEO, infrequently used (<0.1% of the dataset) values are excluded.
- More work is required to understand the applicability to other metadata.
- LDA is a parametric topic model (predefined number of topics).





Experimental setup: Preprocessing and train/test set split, training the LDA model as well as the supervised classifier, inferring the per-document topic distributions and predicting the classes, and evaluation of the predictions. The setup for the classifiers using TF-IDF features is analogous (with TF-IDF values for document representation).



Weighted class averages for precision, recall and F1-Score for each structured element. Results are reported for linear SVM with LDA features, linear SVM with TF-IDF features and for the majority classifier (MC) baseline.