# Project

- You are going to explore something new (could be reproduction study)
- Max 5 pages ACL style files: https://github.com/acl-org/acl-style-files
- Bibliography and appendix do not count
- Result should be close to a publishable paper!

- ➤ You should focus on Named Entity Recognition (NER) or Relation Extraction (RE)
- You can pick one of the topics proposed by us, or propose your own
- ▶ If you plan to propose your own topic, get in touch with Rob
- Every group is required to implement a Baseline; for NER we'll use the EWT, for RE we'll use CrossRE

- ► More advanced than most-frequent class (O)
- Could be viterbi, CNN, LSTM, BERT, etc.
- ► For one of the projects, a machine learning classifier could be the best fit
- ► Solution to week 5 assignments will be posted, so code from week 3, 5 and 6 can be used as a starting point

#### NER task:

```
| Barack | Obama | was | born | in | Hawaii |
| B-PER | I-PER | O | O | O | B-LOC |
```

Note that entities can be nested:

```
Wozniacki vinder iik australian open Wozniacki vinder ikke Australian Open
```

#### **Datasets**

- ► EWT: https: //aclanthology.org/2021.findings-acl.158.pdf
- ► Tweebank: https://aclanthology.org/2022.lrec-1.780.pdf
- ▶ DaN+: https://aclanthology.org/2020.coling-main.583.pdf
- CrossNER: https://ojs.aaai.org/index.php/AAAI/ article/view/17587/17394
- ▶ WikiAnn, MultiCoNER II: Use with caution (silver data!)

### **Datasets**

### Varieties:

Name	Langs	Domains	Nested	Human	# labels
EWT	EN	5 web	Υ	Υ	12
Tweebank	EN	Social	N	Υ	4
DaN+	DA	News,Social	Υ	Υ	12
CrossNER	EN	5 wiki	N	Υ	39
WikiAnn	295	wiki	N	N	3
MultiCoNER II	12	wiki	N	N	33

### **Datasets**

If these are insufficient for your research question: find another or make one!

Can we improve NER systems?

- ► Might be hard
- Find challenging situations to focus on
- ► Incorporate POS tags?

#### Checklist evaluation

Checklists have been proposed to do controlled evaluation of classification systems:



https://aclanthology.org/2020.acl-main.442.pdf

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- Can they be used for span-based tasks?

### Cross-dataset NER (language/domain)

- ▶ How to exploit the strengths of multiple datasets for NER?
- They have different amounts of qualitaty and different annotation guidelines

#### NER for new language/domain

- ▶ I.E.: Can we build an NE tagger for Frisian social media data?
- ► Annotate a small dev/test set, transfer from other train set(s)
- Evaluate existing model(s)

### Quality check of silver (or gold) data

- ► Re-annotate existing data
- ► Find difficult cases for humans, do they overlap with the difficult cases for automatic systems?

#### **Emerging NEs**

- Most datasets have overlapping entities between train and test splits
- ▶ Performance is much lower if these are separated (40%)
- ► How can we overcome this gap?
  - gazeteers
  - data augmentation
  - pre-training?
  - self-training?

#### Unsupervised NER

- ▶ Remove the assumption of training data
- ► Start with easy cases, bootstrap from there
- ► Capitalization or embeddings spaces can be used for example

#### Active learning for spans

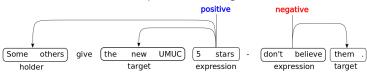
- Active learning = human-in-the-loop
- Automatically select new batch of training samples to annotate after every N annotations.
- https://aclanthology.org/W15-1511.pdf
- Propose to use SVM for POS tagging, and focus only on ambiguous cases.
- ► For NER, the ambiguity problem is less important, but the labels have to be in the correct order!
  - ▶ I would suggest to ignore BIO labels, and add them post-hoc

#### How to do nested NER

- Nested NER has a different structure as a task
- ➤ The second layer has much lower scores (https: //aclanthology.org/2020.coling-main.583.pdf table 5)
- ► Hard to improve, as they are scarce!

For the ambitious: Relation Extraction

#### Relation extraction as sequence labeling



### Pipeline versus sequence labeling

- ► Identify spans (span-labeling)
- ▶ Binary identification of relations
- ► Labeling of relations

#### VS.

Convert task to sequence labeling

