# Bake-off 3

5/6/2019 Moritz and Xin CS224u

## Task

- Developing really effective relation extraction systems using distant supervision.
- Relations: adjoins, author, capital, contains, film\_performance, founders, genre, has\_sibling, has\_sponse, is\_a, nationality, parents, place\_of\_birth, place\_of\_death, profession, worked\_at
- Report macro-average F1 score for all relations.

#### **Results Histogram**





#### **Top Performing Systems**

Featurizers >> Model Architecture !

Top 2 systems both used LogisticRegression but had 8+ different featurizers.

#### Top 15 Systems

On average, just over 5 featurizers.

- Play madlibs with words like "left", "right", "middle", "directional", "POS", "bigram", "trigram"
- If you're only allowed to feature functions, which should it be? middle\_bigram\_pos\_tag\_featurizer, directional\_bag\_of\_words\_featurizer

#### 66% LogisticRegression, 33% RandomForest

• Not uncommon to see groups experiment with other classifiers... but they keep coming back to LogReg



### Kaan, Tyler, and Kutay

featurizers = [simple bag of words featurizer, directional bag of words featurizer, middle bigram pos tag featurizer, left bag of words featurizer, right bag of words featurizer, middle length featurizer, dir left sent bag\_of\_words\_featurizer, dir\_right\_sent\_bag\_of\_words featurizer, dir glove entity featurizer, dir glove middle sum featurizer, dir glove middle example featurizer]





featurizers = [add\_unigrams, add\_bigrams, add\_trigrams, add\_selected\_unigrams, add\_POS\_unigrams, add\_POS\_tag\_bigrams, add\_left\_right\_features ]



#### The less Magnificent Systems...

Not a lot of feature juice...

```
featurizers = [middle_length_featurizer]
[middle_bigram_pos_tag_featurizer]
[middle_trigram_pos_tag_featurizer]
[middle_bigram_pos_tag_featurizer] + [middle_length_featurizer]
[middle_bigram_featurizer]
```

Tried fancier models...

Model = [SVC(gamma=2, C=1)] [neural\_classifier = lambda: MLPClassifier(alpha=1)] [model\_factory\_orig = lambda: AdaBoostClassifier()] [lambda: SGDClassifier(loss = 'modified\_huber', alpha=1e-4, epsilon =1e-1)]