

# CS224N Assignment 3

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## 1 A window into NER

- (a) (i.)
- **Papa Johns** make the best pizzas in America.
  - **The Goldman Sachs** are the leading global investment banking, securities and investment management firm.
- (ii.) The word itself might be ambiguous and it may convey different meaning. Thus using features, gives an overall meaning.
- (iii.)
- Part of speech (POS) tags
  - Context words
- (b) (i.)

$$\begin{aligned} \mathbf{e}^{(t)} &: (2w+1)D \\ \mathbf{W} &: (2w+1)DH \\ \mathbf{U} &: HC \end{aligned}$$

(ii.)

$$T \cdot [(2w+1)D + (2w+1)DH + HC + C]$$

(c) `q1_windoq.py`

(d) i. BEST  $F_1$  score:

	P	R	$F_1$
Entity-level	0.81	0.85	0.83

Confusion Matrix

Table 1: My caption

go\gu	Per	Org	Loc	Misc	0
PER	2937.00	60.00	81.00	17.00	54.00
ORG	129.00	1671.00	117.00	57.00	118.00
LOC	39.00	107.00	1861.00	32.00	55.00
MISC	35.00	72.00	43.00	1011.00	107.00
O	38.00	55.00	19.00	30.00	42617.00

Mostly the model makes mistakes by recognizing PER as LOC, ORG as PER, LOC as ORG.

ii. The training data is skewed, as most of the words are O.

- Misclassification of ORG as PER  
`x : Papa Johns make the best pizzas in America.`  
`y*: ORG ORG 0 0 0 0 0 LOC`  
`y': PER PER 0 0 0 0 0 LOC`
- Misclassification of LOC as ORG  
`x : New York city.`  
`y*: LOC LOC 0`  
`y': ORG LOC 0`

## 2 Recurrent neural nets for NER

- (a) i. Rnn has an extra parameter of  $H^2$  for  $W_h$  and a parameter of  $(2W + 1)$  less for  $W_x$   
 ii.  $T(VD + H^2 + DH + 2H + HC + C)$
- (b)
- (c) it is hard to directly optimize for F1 because it requires predictions from the entire corpus to compute, making it very difficult to batch and parallelize.
- (d) `q2_rnn.py`
- (e) i. Without masking, the loss and gradient of the model would be evaluated on many non-existent data. The gradients from the padding input would flow through the hidden state and affect the learning of the parameters.  
 ii. `q2_rnn.py`
- (f) `q2_rnn.py`
- (g) `q2_rnn.py`