

**CS60075 - NATURAL LANGUAGE PROCESSING**  
**ASSIGNMENT-4 POS-TAGGING**  
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**(1) FEATURES:**

**Word - The Word Itself**

**Word.Lower()** - The Word reduced to lowercase  
**Word.isTitle()** - True if first character is in UpperCase  
**Word.isUpper()** - True if all characters are Uppercase  
**Word.isDigit()** - True if all characters are Digits  
**Suffix-3** - Word[-3:]  
**Prefix-3** - Word[:3]  
**has\_Hyphen** - Whether word has hyphen in it

**BOS** - If word is the beginning of the Sentence

**-1:Word.Lower()** - Previous Word reduced to Lowercase  
**-1:Word.isTitle()** - True if previous word's first character is in uppercase  
**-1:Word.isUpper()** - True if all characters of the previous word are uppercase

**EOS** - If word is the end of the Sentence

**-1:Word.Lower()** - next Word reduced to Lowercase  
**-1:Word.isTitle()** - True if next word's first character is in uppercase  
**-1:Word.isUpper()** - True if all characters of the next word are uppercase

**(2) MOST AND LEAST COMMON TRANSITIONS**

```
print_10_most_common(x_train,y_train,"Training-set")  
print_10_least_common(x_train,y_train,"Training-set")
```

Top 10 Most Common POS Transition Features:

```
----- Training-set -----  
ADJ    =>  NOUN    3.99639  
PROPN  =>  PROPN   3.91982  
VERB   =>  AUX     3.88266  
NOUN   =>  VERB    2.71304  
NOUN   =>  ADP     2.63396  
DET    =>  NOUN    2.54572  
NUM    =>  NOUN    2.53846  
ADJ    =>  VERB    2.33121  
PROPN  =>  ADP     2.28136  
NOUN   =>  NOUN    2.17695
```

Top 10 Least Common POS Transition Features:

```
----- Training-set -----  
COMMA  =>  ADP     -1.34458  
ADJ    =>  PRON    -1.41543  
DET    =>  CCONJ   -1.47929  
ADP    =>  AUX     -1.49491  
ADP    =>  CCONJ   -1.62925  
ADP    =>  COMMA   -1.68510  
ADJ    =>  ADP     -1.80175  
AUX    =>  ADP     -1.80568  
CCONJ  =>  AUX     -1.92248  
DET    =>  ADP     -2.49674
```

### (3) MODEL PREDICTION ON TRAINING DATA

MODEL PREDICTION ON TRAINING DATA				
	precision	recall	f1-score	support
ADJ	1.00	1.00	1.00	570
ADP	1.00	1.00	1.00	1387
ADV	0.97	0.98	0.98	111
AUX	0.99	1.00	0.99	730
CCONJ	0.99	1.00	1.00	150
COMMA	1.00	1.00	1.00	114
DET	1.00	0.99	0.99	231
NOUN	1.00	1.00	1.00	1597
NUM	1.00	1.00	1.00	152
PART	1.00	1.00	1.00	163
PRON	1.00	1.00	1.00	431
PROPN	1.00	1.00	1.00	708
PUNCT	1.00	1.00	1.00	564
SCONJ	0.98	1.00	0.99	61
VERB	1.00	0.98	0.99	640
X	1.00	1.00	1.00	2
accuracy			1.00	7611
macro avg	1.00	1.00	1.00	7611
weighted avg	1.00	1.00	1.00	7611
precision:	0.9968742916302722			
recall:	0.9968466692944422			
f1-score:	0.9968472460628419			
accuracy:	0.9968466692944422			

### (4) MODEL PREDICTION ON TEST DATA

MODEL PREDICTION ON TEST DATA				
	precision	recall	f1-score	support
ADJ	0.67	0.79	0.73	94
ADP	0.95	0.98	0.96	309
ADV	0.71	0.48	0.57	21
AUX	0.94	0.95	0.95	139
CCONJ	1.00	1.00	1.00	25
DET	0.86	0.89	0.88	36
NOUN	0.77	0.90	0.83	329
NUM	1.00	0.92	0.96	25
PART	1.00	0.97	0.98	33
PRON	0.87	0.85	0.86	65
PROPN	0.65	0.44	0.53	145
PUNCT	1.00	0.84	0.92	135
SCONJ	0.50	0.67	0.57	3
VERB	0.86	0.82	0.84	99
accuracy			0.85	1458
macro avg	0.84	0.82	0.83	1458
weighted avg	0.85	0.85	0.85	1458
precision:	0.8513723498048027			
recall:	0.8511659807956105			
f1-score:	0.8466764320151978			
accuracy:	0.8511659807956105			