

# Ball or Bike?

An exploration of NLP



# r/motorcycle vs r/soccer

	r/motorcycle	r/soccer
Total Posts	912	848
Vocabulary	2178	3014
Joint	536	

Bayes Naive Multinomial

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.996212
<b>1</b>	CountVector	test	0.970455

Logistic Regression

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	1.000000
<b>1</b>	CountVector	test	0.929545
<b>2</b>	TfidfVector	train	0.998485
<b>3</b>	TfidfVector	test	0.956818
<b>4</b>	HashVector	train	0.992424
<b>5</b>	HashVector	test	0.938636

# Hello, perfection!

Not a good  
thing.

Why so good?

r/motorcycle

	Coef
<b>motorcycle</b>	2.093084
<b>bike</b>	1.954092
<b>ride</b>	1.553761
<b>my</b>	1.515368
<b>bikes</b>	1.252222
<b>motorcycles</b>	1.201626
<b>help</b>	1.073407
<b>question</b>	1.068964
<b>riding</b>	1.041370
<b>honda</b>	1.015670
<b>anyone</b>	0.923839
<b>what</b>	0.898917
<b>gear</b>	0.862775
<b>brake</b>	0.783643
<b>can</b>	0.783247

r/football

	Coef
<b>fc</b>	-1.639545
<b>penalty</b>	-1.523775
<b>league</b>	-1.502097
<b>united</b>	-1.468713
<b>goal</b>	-1.286430
<b>match</b>	-1.219060
<b>city</b>	-1.173773
<b>football</b>	-1.144133
<b>madrid</b>	-1.138840
<b>messi</b>	-1.124645
<b>barcelona</b>	-1.113783
<b>club</b>	-1.096615
<b>argentina</b>	-1.058382
<b>real</b>	-1.048201
<b>al</b>	-0.989193

# r/soccer vs r/MLS

	r/soccer	r/MLS
Total Posts	848	942
Vocabulary	3014	2913
Joint	987	

Bayes Naive Multinomial

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.967958
<b>1</b>	CountVector	test	0.886161

Logistic Regression

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.984352
<b>1</b>	CountVector	test	0.859375
<b>2</b>	TfidfVector	train	0.972429
<b>3</b>	TfidfVector	test	0.868304
<b>4</b>	HashVector	train	0.958271
<b>5</b>	HashVector	test	0.837054

# r/MLS vs r/SoundersFC

	r/MLS	r/SoundersFC
Total Posts	942	994
Vocabulary	2913	2112
Joint	933	

Bayes Naive Multinomial

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.956612
<b>1</b>	CountVector	test	0.853306

Logistic Regression

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.982782
<b>1</b>	CountVector	test	0.840909
<b>2</b>	TfidfVector	train	0.954545
<b>3</b>	TfidfVector	test	0.857438
<b>4</b>	HashVector	train	0.943526
<b>5</b>	HashVector	test	0.836777

# Multiclass Logistic and Bayes Naive

	mc	fb	mls	ssfc
mc	215	1	0	12
fb	12	165	18	17
mls	11	15	175	35
ssfc	27	3	28	190

Bayes Naive Multinomial

	vector	set	score
0	CountVector	train	0.952742
1	CountVector	test	0.834416

Logistic Regression

	vector	set	score
0	CountVector	train	0.976190
1	CountVector	test	0.806277
2	TfidfVector	train	0.955267
3	TfidfVector	test	0.819264
4	HashVector	train	0.934704
5	HashVector	test	0.798701

# K-Nearest Neighbors



A different tact:  
Story time!



# r/talesfromretail vs r/talesfromyourserver

	r/tfr	r/tfys
Total Posts	391	986
Vocabulary	888	1789
Joint	424	

Bayes Naive Multinomial

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.956612
<b>1</b>	CountVector	test	0.853306

Logistic Regression

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.937016
<b>1</b>	CountVector	test	0.736232
<b>2</b>	TfidfVector	train	0.771318
<b>3</b>	TfidfVector	test	0.721739
<b>4</b>	HashVector	train	0.776163
<b>5</b>	HashVector	test	0.730435

# r/talesfromyoursever vs r/bartender

	r/tfys	r/bar
Total Posts	986	958
Vocabulary	1789	2081
Joint	370	

Bayes Naive Multinomial

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.956612
<b>1</b>	CountVector	test	0.853306

Logistic Regression

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.954047
<b>1</b>	CountVector	test	0.732510
<b>2</b>	TfidfVector	train	0.941015
<b>3</b>	TfidfVector	test	0.736626
<b>4</b>	HashVector	train	0.923868
<b>5</b>	HashVector	test	0.716049

# r/tfys vs r/bar title + text

	r/tfys	r/bar
Total Posts	986	958
Vocabulary	1789	6515
Joint	656	

Bayes Naive Multinomial

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.925240
<b>1</b>	CountVector	test	0.808642

Logistic Regression

	<b>vector</b>	<b>set</b>	<b>score</b>
<b>0</b>	CountVector	train	0.993141
<b>1</b>	CountVector	test	0.880658
<b>2</b>	TfidfVector	train	0.953361
<b>3</b>	TfidfVector	test	0.876543
<b>4</b>	HashVector	train	0.940329
<b>5</b>	HashVector	test	0.878601

# GridSearch

# One Model, two results

## **r/tfys + r/bar, text and title**

```
params={  
    'cvec__stop_words': ['english'],  
    'cvec__max_features': [2000],  
    'cvec__ngram_range': [(1,1)],  
    'cvec__max_df': [.5],  
    'Lr__penalty': ['l2'],  
    'Lr__solver': ['lbfgs'],  
    'Lr__max_iter': [10]  
}
```

Train: .8882

Test: .9012

## **r/motorcycle, r/soccer**

```
params={  
    'cvec__stop_words': [None],  
    'cvec__max_features': [3000],  
    'cvec__ngram_range': [(1,1)],  
    'cvec__max_df': [0.06],  
    'Lr__penalty': ['l2'],  
    'Lr__solver': ['sag'],  
    'Lr__max_iter': [100]  
}
```

Train: .9318

Test: .9318

# Observations

1. Initial high levels of overfitting
2. Better Test performance on tuned parameters
3. Affect of shared words list size
4. Models are data source specific

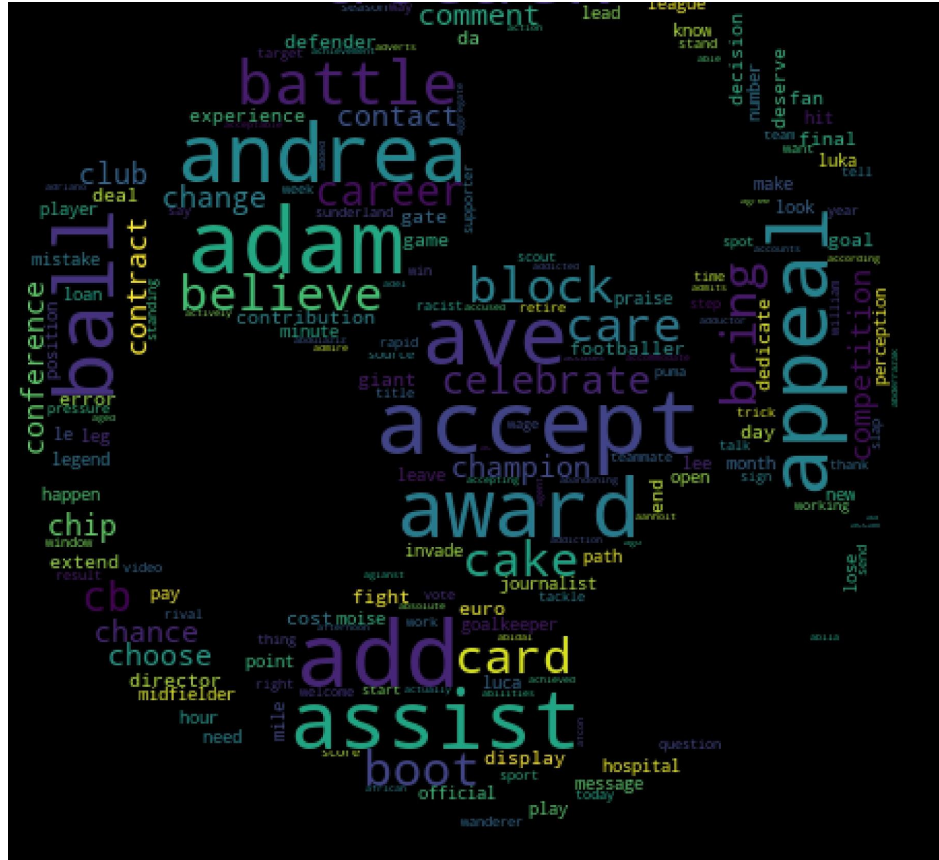
# Lessons Learned

1. Better data checking (duplicates)
2. Different models
3. Subject matter didn't affect as much as anticipated
4. NLP REALLY overfits
5. Multi-class vs. boolean didn't matter
6. Better understand metrics and what they are saying





# Ball shaped cloud?



The best possible thing....

