

## Artificial Intelligence Project

### Title:

News Classification using Natural Language Processing

### Abstract:

Natural Language Processing techniques are used in this project to categorize news stories. The code examines the articles' content, collects pertinent information, and then applies a classification algorithm to assign a category. The outcome is a precise news classification system that can be applied to media monitoring and customized news recommendations.

### Objective:

The objective is to make use of Natural Language Processing tools to classify news stories according to their content for use in practical applications and to train and assess the effectiveness of the classification model, using a sizable dataset.

### Introduction:

Being up to date on the most recent news has become challenging for people in the modern digital age due to the abundance of fake news content available online. Systems for news recommendations have been developed to offer readers personalized news based on their interests, but before doing so, these systems must reliably categorize news articles into different groups. Natural language processing (NLP) enters the picture in this situation. It is feasible to examine the text of news stories using NLP techniques and extract pertinent attributes to correctly categorise them.

This project aims to develop a news classification system using Natural Language Processing (NLP) techniques to accurately categorize news articles based on their content. A large dataset of news articles will be collected and used to train and evaluate the performance of the classification model. The outcome will be an accurate and scalable news classification system that can be used for personalized news recommendation systems and media monitoring tools.

### Methodology:

- **NLP Libraries:** For this project, NLTK (Natural Processing Tool Kit) is the library used which is an essential tool for NLP and ML. It supports tasks such as classification, stemming, tagging, semantic reasoning, and tokenization in Python.
- **Data Collection:** A large dataset of news articles from various sources and categories is collected in excel sheet format.
- **Text Pre-processing:** The collected news articles are pre-processed to remove unwanted elements such as stop words, punctuation, and special characters. This helps improve the accuracy of the classification model.
- **Tokenization:** The pre-processed news articles will be tokenized, i.e. large piece of continuous text is divided into distinct units or tokens so that they can easily be processed by the NLP algorithms.
- **Stemming:** This helps remove suffixes of tokens and reduce different forms of a word to a core root.
- **Stopword removal:** This helps remove the most commonly used words that the search engine has been programmed to ignore.

- **Vectorization:** Using this technique textual data or here, the tokenized data is converted into a numerical format. A matrix is created where each column represents a feature and each row represents an individual review.
- **Classification Algorithms:**
  1. **Logistic Regression:** This is an ML algorithm used for the classification of problems and is a predictive analysis algorithm based on the concept of probability. The logistic function normalizes everything between 0 and 1 and then interprets the received number as a probability.
  2. **Passive Aggressive:** It is one of the available incremental learning algorithms and very simple to implement. Passive: If the prediction is correct, keep the model and do not make any changes. Aggressive: If the prediction is incorrect, make changes to the model.
- **Model evaluation:** The performance of the classification model will be evaluated using various metrics such as accuracy, precision, recall, and F1-score. The evaluation will be carried out using a test set of news articles that were not used for training the model.

#### Code:

##### #Importing Libraries

```
pip install nltk
```

```
import nltk
```

```
nltk.download()
```

```
import pandas as pd
```

##### #Data Collection

```
fake = pd.read_csv("Fake.csv")
```

```
genuine = pd.read_csv("True.csv")
```

```
display(fake.info())
```

```
display(genuine.info())
```

```
display(genuine.head(10))
```

```
display(fake.subject.value_counts())
```

```
display(genuine.subject.value_counts())
```

```
fake['target'] = 0
```

```
genuine['target'] = 1
```

```
display(genuine.head(10))
```

```
display(fake.head(10))
```

```
data = pd.concat([fake,genuine],axis=0)
```

```
date=data.reset_index(drop=True)
```

```
data=data.drop(['subject','date','title'],axis=1)
```

```
print(data.columns)
```

### **#Tokenization**

```
from nltk.tokenize import word_tokenize
```

```
data['text']=data['text'].apply(word_tokenize)
```

```
print(data.head(10))
```

### **#Stemming**

```
from nltk.stem.snowball import SnowballStemmer
```

```
porter = SnowballStemmer("english")
```

```
def stem_it(text):
```

```
    return [porter.stem(word) for word in text]
```

```
data['text']=data['text'].apply(stem_it)
```

```
print(data.head(10))
```

### **#Stopword removal**

```
def stop_it(t):
```

```
    dt=[word for word in t if len(word)>2]
```

```
    return dt
```

```
data['text']=data['text'].apply(stop_it)
```

```
print(data.head(10))
```

```
data['text']=data['text'].apply(' '.join)
```

```
from sklearn.model_selection import train_test_split
```

```
X_train,X_test,y_train,y_test=train_test_split(data['text'],data['target'], test_size=0.25)
```

```
display(X_train.head())
```

```
print('\n')
```

```
display(y_train.head())
```

### **#Vectorization**

```
from sklearn.feature_extraction.text import TfidfVectorizer
```

```
my_tfidf = TfidfVectorizer(max_df=0.7)
```

```
tfidf_train = my_tfidf.fit_transform(X_train)
```

```
tfidf_test = my_tfidf.transform(X_test)
```

```
print(tfidf_train)
```

### **#Logistic Regression algorithm**

```
from sklearn.linear_model import LogisticRegression
from sklearn.metrics import accuracy_score
model_1=LogisticRegression(max_iter=900)
model_1.fit(tfidf_train,y_train)
pred_1 = model_1.predict(tfidf_test)
cr1  = accuracy_score(y_test,pred_1)
print(cr1*100)
```

### **#Passive Aggressive algorithm**

```
from sklearn.linear_model import PassiveAggressiveClassifier
model = PassiveAggressiveClassifier(max_iter=50)
```

### **#Model Evaluation**

```
model.fit(tfidf_train, y_train)
y_pred = model.predict(tfidf_test)
accscore = accuracy_score(y_test, y_pred)
print('The accuracy of prediction is ',accscore*100)
```

### **Conclusion:**

In conclusion, this project successfully developed a news classification system using Natural Language Processing techniques to accurately categorize news articles based on their content.

In addition to emphasizing the value of gathering and processing huge datasets for creating precise machine-learning models, this study demonstrates the effectiveness of NLP techniques in addressing practical issues. By offering consumers accurate and pertinent news information based on their interests and preferences, the proposed news classification system has the potential to completely change the way people consume news.

Screenshots:

```
Home x news-classification - Jupyter N. x +
localhost8888/notebooks/news-classification.ipynb
jupyter news-classification Last Checkpoint: 01/18/2023 (unsaved changes)
File Edit View Insert Cell Kernel Widgets Help Not Trusted Python 3 (ipykernel)
In [1]: pip install nltk
Requirement already satisfied: nltk in c:\users\ayush\anaconda3\lib\site-packages (3.6.5)
Note: you may need to restart the kernel to use updated packages.
Requirement already satisfied: click in c:\users\ayush\anaconda3\lib\site-packages (from nltk) (8.0.3)
Requirement already satisfied: joblib in c:\users\ayush\anaconda3\lib\site-packages (from nltk) (1.1.0)
Requirement already satisfied: regex>=2021.8.3 in c:\users\ayush\anaconda3\lib\site-packages (from nltk) (2021.8.3)
Requirement already satisfied: tqdm in c:\users\ayush\anaconda3\lib\site-packages (from nltk) (4.62.3)
Requirement already satisfied: colorama in c:\users\ayush\anaconda3\lib\site-packages (from click->nltk) (0.4.4)

In [2]: import nltk

In [3]: nltk.download()
showing info https://raw.githubusercontent.com/nltk/nltk_data/gh-pages/index.xml

Out[3]: True

In [4]: import pandas as pd

In [5]: fake = pd.read_csv("Fake.csv")
genuine = pd.read_csv("True.csv")

In [7]: display(fake.info())
```

```
Home x news-classification - Jupyter N. x +
localhost8888/notebooks/news-classification.ipynb
jupyter news-classification Last Checkpoint: 01/18/2023 (autosaved)
File Edit View Insert Cell Kernel Widgets Help Not Trusted Python 3 (ipykernel)
In [6]: display(fake.info())
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 23481 entries, 0 to 23480
Data columns (total 4 columns):
 # Column Non-Null Count Dtype
---
0 title 23481 non-null object
1 text 23481 non-null object
2 subject 23481 non-null object
3 date 23481 non-null object
dtypes: object(4)
memory usage: 733.9+ KB

None

In [7]: display(genuine.info())
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 21417 entries, 0 to 21416
Data columns (total 4 columns):
 # Column Non-Null Count Dtype
---
0 title 21417 non-null object
1 text 21417 non-null object
2 subject 21417 non-null object
3 date 21417 non-null object
dtypes: object(4)
memory usage: 669.4+ KB

None
```

```
Home x news-classification - Jupyter N. x +
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jupyter news-classification Last Checkpoint: 01/18/2023 (unsaved changes)
File Edit View Insert Cell Kernel Widgets Help Not Trusted Python 3 (ipykernel)
In [8]: display(genuine.head(10))


|   | title                                              | text                                               | subject      | date              |
|---|----------------------------------------------------|----------------------------------------------------|--------------|-------------------|
| 0 | As U.S. budget fight looms, Republicans flip t...  | WASHINGTON (Reuters) - The head of a conserv...    | politicsNews | December 31, 2017 |
| 1 | U.S. military to accept transgender recruits o...  | WASHINGTON (Reuters) - Transgender people will...  | politicsNews | December 29, 2017 |
| 2 | Senior U.S. Republican senator: 'Let Mr. Musell... | WASHINGTON (Reuters) - The special counsel riv...  | politicsNews | December 31, 2017 |
| 3 | FBI Russia probe helped by Australian diplomat...  | WASHINGTON (Reuters) - Trump campaign advisor ...  | politicsNews | December 30, 2017 |
| 4 | Trump wants Postal Service to charge 'much mor...  | SEATTLE-WASHINGTON (Reuters) - President Donal...  | politicsNews | December 29, 2017 |
| 5 | White House, Congress prepare for talks on spe...  | WEST PALM BEACH, Fla./WASHINGTON (Reuters) - T...  | politicsNews | December 29, 2017 |
| 6 | Trump says Russia probe will be fair, but time...  | WEST PALM BEACH, Fla. (Reuters) - President Don... | politicsNews | December 29, 2017 |
| 7 | Factbox: Trump on Twitter (Dec 29) - Approval ...  | The following statements were posted to the ve...  | politicsNews | December 29, 2017 |
| 8 | Trump on Twitter (Dec 28) - Global Warming         | The following statements were posted to the ve...  | politicsNews | December 29, 2017 |
| 9 | Alabama official to certify Senator-elect Jon...   | WASHINGTON (Reuters) - Alabama Secretary of St...  | politicsNews | December 28, 2017 |



In [9]: display(fake.subject.value_counts())
News 9050
politics 6841
left-news 4459
Government News 1570
US_News 783
Middle-east 778
Name: subject, dtype: int64
```

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In [8]: `display(genuine.head(10))`

	title	text	subject	date
0	As U.S. budget fight looms, Republicans flip t...	WASHINGTON (Reuters) - The head of a conservat...	politicsNews	December 31, 2017
1	U.S. military to accept transgender recruits o...	WASHINGTON (Reuters) - Transgender people will...	politicsNews	December 29, 2017
2	Senior U.S. Republican senator 'let Mr. Muell...	WASHINGTON (Reuters) - The special counsel inv...	politicsNews	December 31, 2017
3	FBI Russia probe helped by Australian diplomat...	WASHINGTON (Reuters) - Trump campaign adviser ...	politicsNews	December 30, 2017
4	Trump wants Postal Service to charge 'much mor...	SEATTLE/WASHINGTON (Reuters) - President Donal...	politicsNews	December 29, 2017
5	White House, Congress prepare for talks on spo...	WEST PALM BEACH, Fla./WASHINGTON (Reuters) - T...	politicsNews	December 29, 2017
6	Trump says Russia probe will be fair, but time...	WEST PALM BEACH, Fla (Reuters) - President Don...	politicsNews	December 29, 2017
7	Factbox: Trump on Twitter (Dec 29) - Approval ...	The following statements were posted to the ve...	politicsNews	December 29, 2017
8	Trump on Twitter (Dec 28) - Global Warming	The following statements were posted to the vo...	politicsNews	December 29, 2017
9	Alabama official to certify Senator-elect Jone...	WASHINGTON (Reuters) - Alabama Secretary of St...	politicsNews	December 28, 2017

In [9]: `display(fake.subject.value_counts())`

subject	count
politics	9050
politicsNews	6841
left news	4459
Government News	1570
US News	783
Middle-east	778

Name: subject, dtype: int64

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In [10]: `display(genuine.subject.value_counts())`

subject	count
politicsNews	11772
worldnews	18145

Name: subject, dtype: int64

In [11]: `fake['target'] = 0`  
`genuine['target'] = 1`

In [12]: `display(genuine.head(10))`

	title	text	subject	date	target
0	As U.S. budget fight looms, Republicans flip t...	WASHINGTON (Reuters) - The head of a conservat...	politicsNews	December 31, 2017	1
1	U.S. military to accept transgender recruits o...	WASHINGTON (Reuters) - Transgender people will...	politicsNews	December 29, 2017	1
2	Senior U.S. Republican senator 'let Mr. Muell...	WASHINGTON (Reuters) - The special counsel inv...	politicsNews	December 31, 2017	1
3	FBI Russia probe helped by Australian diplomat...	WASHINGTON (Reuters) - Trump campaign adviser ...	politicsNews	December 30, 2017	1
4	Trump wants Postal Service to charge 'much mor...	SEATTLE/WASHINGTON (Reuters) - President Donal...	politicsNews	December 29, 2017	1
5	White House, Congress prepare for talks on spo...	WEST PALM BEACH, Fla./WASHINGTON (Reuters) - T...	politicsNews	December 29, 2017	1
6	Trump says Russia probe will be fair, but time...	WEST PALM BEACH, Fla (Reuters) - President Don...	politicsNews	December 29, 2017	1
7	Factbox: Trump on Twitter (Dec 29) - Approval ...	The following statements were posted to the ve...	politicsNews	December 29, 2017	1
8	Trump on Twitter (Dec 28) - Global Warming	The following statements were posted to the ve...	politicsNews	December 29, 2017	1
9	Alabama official to certify Senator-elect Jone...	WASHINGTON (Reuters) - Alabama Secretary of St...	politicsNews	December 28, 2017	1

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In [13]: `display(fake.head(10))`

	title	text	subject	date	target
0	Donald Trump Sends Out Embarrassing New Year'	Donald Trump just couldn't wish all Americans...	News	December 31, 2017	0
1	Drunk Bragging Trump Staffer Started Russian ...	House Intelligence Committee Chairman Devin Nu...	News	December 31, 2017	0
2	Sheriff David Clarke Becomes An Internet Joke	On Friday, it was revealed that former Milwauk...	News	December 30, 2017	0
3	Trump Is So Obsessed He Even Has Obama's Name	On Christmas day, Donald Trump announced that...	News	December 29, 2017	0
4	Pope Francis Just Called Out Donald Trump Dur...	Pope Francis used his annual Christmas Day mes...	News	December 25, 2017	0
5	Racist Alabama Cops Brutalize Black Boy While	The number of cases of cops brutalizing and ki...	News	December 25, 2017	0
6	Fresh Off The Golf Course, Trump Lashes Out A...	Donald Trump spent a good portion of his day a...	News	December 23, 2017	0
7	Trump Said Some INSANELY Racist Stuff Inside ...	In the wake of yet another court decision tha...	News	December 23, 2017	0
8	Former CIA Director Slams Trump Over UN Bully	Many people have raised the alarm regarding th...	News	December 22, 2017	0
9	WATCH: Brand-New Pro-Trump Ad Features So Muc...	Just when you might have thought we'd get a br...	News	December 21, 2017	0

In [14]: `data = pd.concat([fake, genuine], axis=0)`

In [15]: `data = data.reset_index(drop=True)`

In [16]: `data = data.drop(['subject', 'date', 'title'], axis=1)`

In [17]: `print(data.columns)`

Index(['text', 'target'], dtype='object')

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```
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In [17]: print(data.columns)
Index(['text', 'target'], dtype='object')

In [18]: from nltk.tokenize import word_tokenize

In [19]: data['text']=data['text'].apply(word_tokenize)

In [20]: print(data.head(10))

   text target
0 [Donald, Trump, just, couldn, t, wish, all, Am... 0
1 [House, Intelligence, Committee, Chairman, Dev... 0
2 [On, Friday, , , it, was, revealed, that, forme... 0
3 [On, Christmas, day, , , Donald, Trump, announc... 0
4 [Pope, Francis, used, his, annual, Christmas, ... 0
5 [The, number, of, cases, of, cops, brutalizing... 0
6 [Donald, trump, spent, a, good, portion, of, h... 0
7 [In, the, wake, of, yet, another, court, decis... 0
8 [Many, people, have, raised, the, alarm, regar... 0
9 [Just, when, you, might, have, thought, we, d... 0

In [21]: from nltk.stem.snowball import SnowballStemmer
porter = SnowballStemmer("english")

In [22]: def stem_it(text):
return [porter.stem(word) for word in text]
```

```
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In [21]: from nltk.stem.snowball import SnowballStemmer
porter = SnowballStemmer("english")

In [22]: def stem_it(text):
return [porter.stem(word) for word in text]

In [23]: data['text']=data['text'].apply(stem_it)

In [24]: print(data.head(10))

   text target
0 [donald, trump, just, couldn, t, wish, all, am... 0
1 [hous, intellig, committe, chairman, devin, nu... 0
2 [on, friday, , , it, was, reveal, that, forme... 0
3 [on, christmas, day, , , donald, trump, announc... 0
4 [pope, franci, use, his, annual, christma, day... 0
5 [the, number, of, case, of, cop, brutal, and, ... 0
6 [donald, trump, spent, a, good, portion, of, h... 0
7 [in, the, wake, of, yet, anoth, court, decis, ... 0
8 [mani, peopl, have, rais, the, alarm, regard, ... 0
9 [just, when, you, might, have, thought, we, d... 0

In [25]: def stop_it(t):
dt=[word for word in t if len(word)>2]
return dt

In [26]: data['text']=data['text'].apply(stop_it)
```

```
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In [26]: data['text']=data['text'].apply(stop_it)

In [27]: print(data.head(10))

   text target
0 [donald, trump, just, couldn, wish, all, ameri... 0
1 [hous, intellig, committe, chairman, devin, nu... 0
2 [friday, was, reveal, that, former, milwaukee, ... 0
3 [christma, day, donald, trump, announc, that, ... 0
4 [pope, franci, use, his, annual, christma, day... 0
5 [the, number, case, cop, brutal, and, kill, pe... 0
6 [donald, trump, spent, good, portion, his, day... 0
7 [the, wake, yet, anoth, court, decis, that, de... 0
8 [mani, peopl, have, rais, the, alarm, regard, ... 0
9 [just, when, you, might, have, thought, get, b... 0

In [28]: data['text']=data['text'].apply(' '.join)

In [29]: from sklearn.model_selection import train_test_split
X_train,X_test,y_train,y_test=train_test_split(data['text'],data['target'], test_size=0.25)
display(X_train.head())
print('\n')
display(y_train.head())

22890 21st centuri wire say .from may day riot desig...
19208 can anyon imagin sit republican senat call for...
8209 consid left-lean monie still sign joe scarboro...
10151 washington reuter presid barack obama monday 1...
10355 jess watter gop can drain the swamp when their...
Name: text, dtype: object
```

```
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jupyter news-classification Last Checkpoint: 01/18/2023 (unsaved changes) Logout
File Edit View Insert Cell Kernel Widgets Help Not Trusted Python 3 (ipykernel) O
In [29]: from sklearn.model_selection import train_test_split
X_train,X_test,y_train,y_test=train_test_split(data['text'],data['target'], test_size=0.25)
display(X_train.head())
print('\n')
display(y_train.head())

22890 21st centuri wire say .from may day riot desig...
19208 can anyon imagin sit republican senat call for...
8209 consid left-lean music still sign joe scarboro...
10151 washington reuter presid barack obama monday l...
10355 jess watter gop can drain the swamp when their...
Name: text, dtype: object

22890 0
19208 0
8209 0
10151 1
10355 0
Name: target, dtype: int64

In [30]: from sklearn.feature_extraction.text import TfidfVectorizer
my_tfidf = TfidfVectorizer(max_df=0.7)

tfidf_train = my_tfidf.fit_transform(X_train)
tfidf_test = my_tfidf.transform(X_test)

In [31]: print(tfidf_train)
```

```
jupyter news-classification Last Checkpoint: 01/18/2023 (unsaved changes) Logout
File Edit View Insert Cell Kernel Widgets Help Not Trusted Python 3 (ipykernel) O
In [31]: print(tfidf_train)

(0, 83842) 0.10506180073366947
(0, 53670) 0.05676994271158182
(0, 13526) 0.06370224814239053
(0, 78620) 0.1064233353804637
(0, 89630) 0.04985603097045665
(0, 61305) 0.046961570086322665
(0, 31875) 0.11468968857035121
(0, 55618) 0.03814401699104735
(0, 58140) 0.06009424701536585
(0, 65987) 0.10325568545882793
(0, 40372) 0.1568768668803044
(0, 82157) 0.07001811915386722
(0, 16190) 0.14057906339508635
(0, 49807) 0.09079895749957058
(0, 35279) 0.24982391536178666
(0, 51076) 0.11382192986261715
(0, 47065) 0.08922114019385904
(0, 59139) 0.07238806018191683
(0, 79571) 0.08293612540641093
(0, 32188) 0.09569469103465986
(0, 30995) 0.09317050805238049
(0, 19540) 0.12059675058771188
(0, 53387) 0.11657341021218971
(0, 51454) 0.0965432820891465
(0, 62965) 0.14166007291939217
:
:
(33672, 13199) 0.033578863683986826
(33672, 81431) 0.023157495146104292
(33672, -09593) 0.032096208476141171
```

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jupyter news-classification Last Checkpoint: 01/18/2023 (unsaved changes) Logout
File Edit View Insert Cell Kernel Widgets Help Not Trusted Python 3 (ipykernel) O
In [32]: from sklearn.linear_model import LogisticRegression
from sklearn.metrics import accuracy_score

In [33]: model_1=LogisticRegression(max_iter=900)
model_1.fit(tfidf_train,y_train)
pred_1 = model_1.predict(tfidf_test)
cr1 = accuracy_score(y_test,pred_1)
print(cr1*100)

98.78841870824053

In [34]: from sklearn.linear_model import PassiveAggressiveClassifier
model = PassiveAggressiveClassifier(max_iter=50)
model.fit(tfidf_train, y_train)

Out[34]: PassiveAggressiveClassifier(max_iter=50)

In [35]: y_pred = model.predict(tfidf_test)
accscore = accuracy_score(y_test, y_pred)
print('The accuracy of prediction is ',accscore*100)

The accuracy of prediction is 99.691046706014

In [ ]:
```