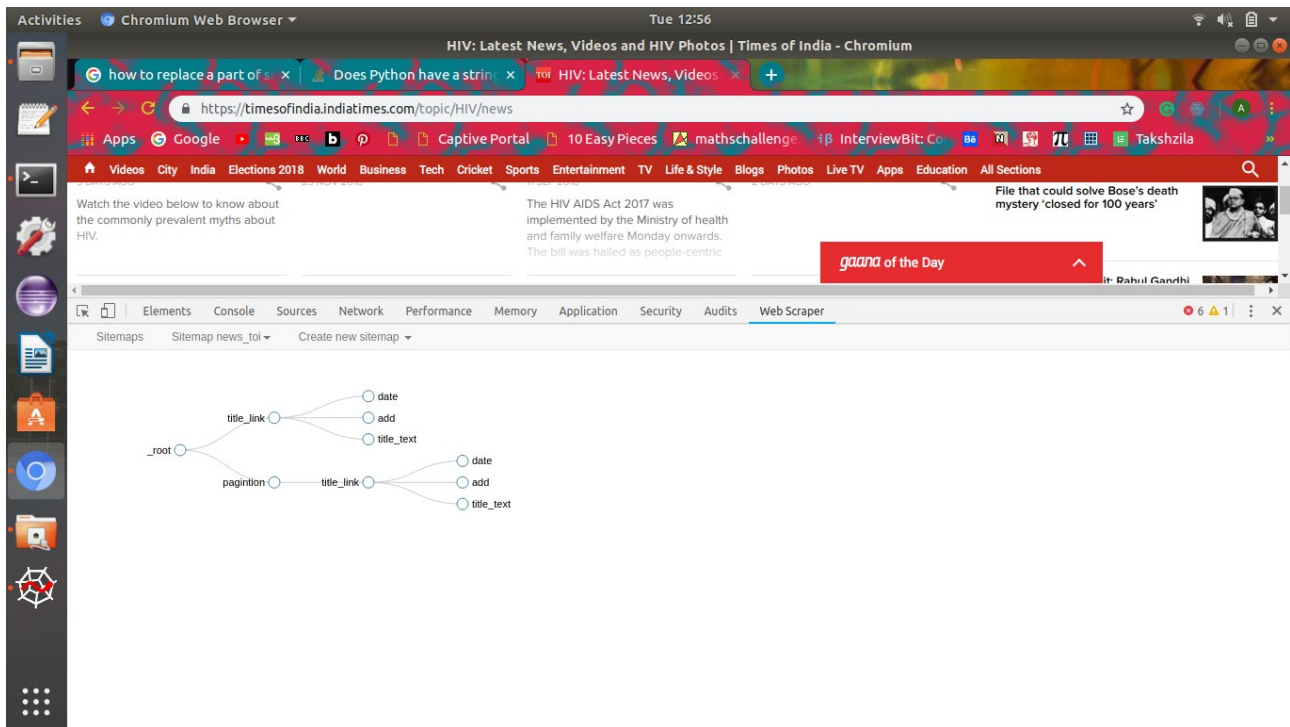


# Assignment Report

## 1. Web Scraping using Chrome Extension

I have attached the screenshot of the sitemap selector graph for web scraping.



After this I have exported the file in CSV (Comma Separated Values) format for further analysis.

The screenshot shows the Web Scraper Chrome extension interface with the 'Web Scraper' tab selected. The 'Export' button is visible, and the 'CSV' option is chosen. The 'Exported CSV' table is displayed, showing the scraped data in CSV format.

web-scraper-order	web-scraper-start-url	title_link	title_link-href	pagination	pagination-href
1543754725-973	https://timesofindia.indiatimes.com/topic/HIV/news	HIV positive woman marries twice, kills first husband with the help of second 23 Feb 2018In a sensational incident from Bhadohi district of Uttar Pradesh, an HIV infected woman (name withheld to protect identity) has been arrested for conspiring with her second husband to kill her first husband.	https://timesofindia.indiatimes.com/india/hiv-positive-women-marries-twice-kills-first-husband-with-the-help-of-second/articleshow/63043159.cms	15	https://timesofindia.indiatimes.com/topic/HIV/news/15
1543754725-974	https://timesofindia.indiatimes.com/topic/HIV/news	HIV positive woman marries twice, kills first husband with the help of second 23 Feb 2018In a sensational incident from Bhadohi district of Uttar Pradesh, an HIV infected woman (name withheld to protect identity) has been arrested for conspiring with her second husband to kill her first husband.	https://timesofindia.indiatimes.com/india/hiv-positive-women-marries-twice-kills-first-husband-with-the-help-of-second/articleshow/63043159.cms	15	https://timesofindia.indiatimes.com/topic/HIV/news/15

The extracted CSV file is shown below.

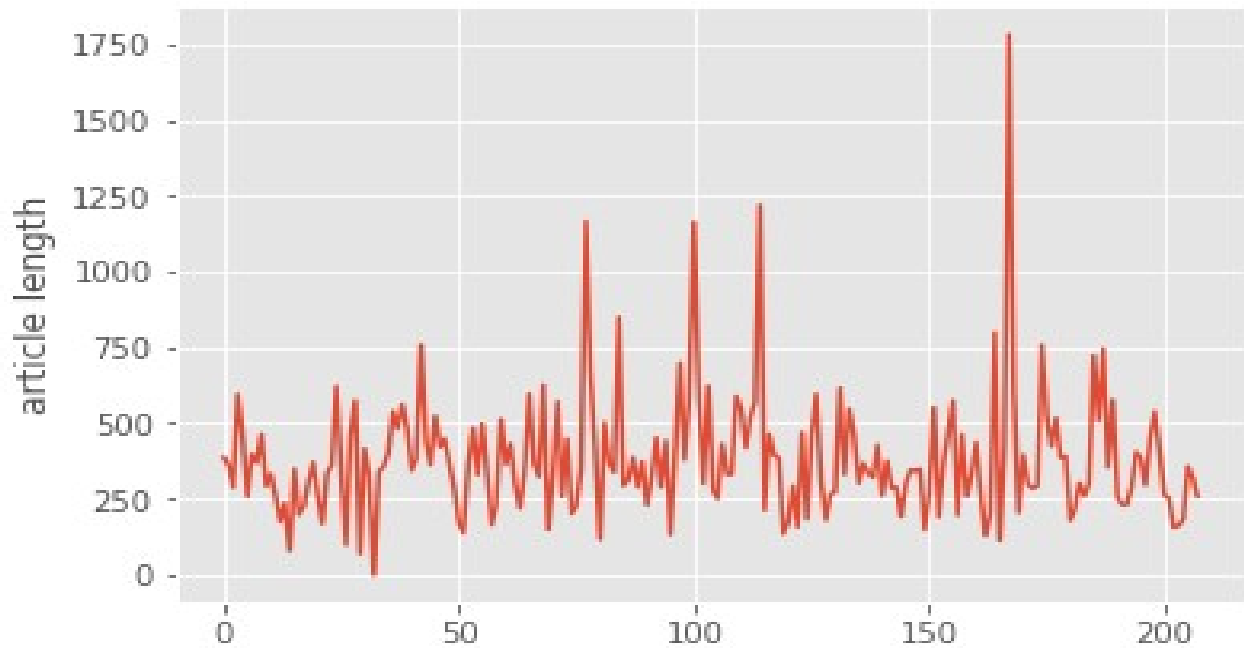
A	B	C
web-scraping-order	web-scraping-start-url	title_link
1543754725-973	https://timesofindia.indiatimes.com/topic/HIV/news	HIV positive woman marries twice, kills first husband with the help of second
1543756303-1845	https://timesofindia.indiatimes.com/topic/HIV/news	23 Feb 2018In a sensational incident from Bhadohi district of Uttar Pradesh, an HIV infected woman (name withheld to protect identity)!
1543755442-1512	https://timesofindia.indiatimes.com/topic/HIV/news	Why Narasinghpur sees most accident deaths every year
1543755696-1788	https://timesofindia.indiatimes.com/topic/HIV/news	Section 377: After long battle, it'll be another fight for right to marry or adopt
1543754813-1010	https://timesofindia.indiatimes.com/topic/HIV/news	11 Jul 2018An HIV-positive dream hits house hurdle in Kolkata
1543754098-641	https://timesofindia.indiatimes.com/topic/HIV/news	04 Mar 2018NHRC notice to UP govt over spread of HIV among prisoners in jails
1543754958-1117	https://timesofindia.indiatimes.com/topic/HIV/news	NGO gives helping hand, 200 patients get free treatment
1543754725-957	https://timesofindia.indiatimes.com/topic/HIV/news	26 Dec 2017School life gets a little easier for HIV students
1543754954-1107	https://timesofindia.indiatimes.com/topic/HIV/news	07 Aug 2017State board students up to Class X, who stay with HIV-positive parents or carry the virus themselves, will now be classified
1543756182-1836	https://timesofindia.indiatimes.com/topic/HIV/news	HIV positive woman marries twice, kills first husband with the help of second
1543755176-1226	https://timesofindia.indiatimes.com/topic/HIV/news	23 Feb 2018In a sensational incident from Bhadohi district of Uttar Pradesh, an HIV infected woman (name withheld to protect identity)!
1543753977-591	https://timesofindia.indiatimes.com/topic/HIV/news	China approves first home made anti-HIV drug
1543753973-585	https://timesofindia.indiatimes.com/topic/HIV/news	06 Jun 2018China has approved the first domestically developed, long-acting injectable HIV drug Abuvirtide which could be a boon to the
1543755528-1636	https://timesofindia.indiatimes.com/topic/HIV/news	On medicines for 16 years, youth stresses on family support
1543755315-1289	https://timesofindia.indiatimes.com/topic/HIV/news	03 Sep 2018Man jabbed syringe with HIV+ mother's blood into his wife
1543755342-1343	https://timesofindia.indiatimes.com/topic/HIV/news	20 Sep 2017HIV due to transfusion: Kid tests negative in Chennai
		03 Nov 2017However, reliable sources from the RCC said the status of the disease can be confirmed only after the final result is obtained
		Women's panel shifts HIV positive woman, infant to Gandhi Bhavan
		06 Dec 2017An HIV positive woman, who delivered a baby at SAT hospital last week, was shifted to Gandhi Bhavan in Pathanapuram c
		Private Blood bank sealed in Jalandhar amid serious irregularities
		04 Aug 201862% jump in HIV/AIDS deaths in Mumbai in 1 year: Health ministry
		19 May 2018AIDS control trust to reach out to HIV+ blood donors
		07 Jun 2018

After this step I extracted the articles using BeautifulSoup Web scraping module in Python.

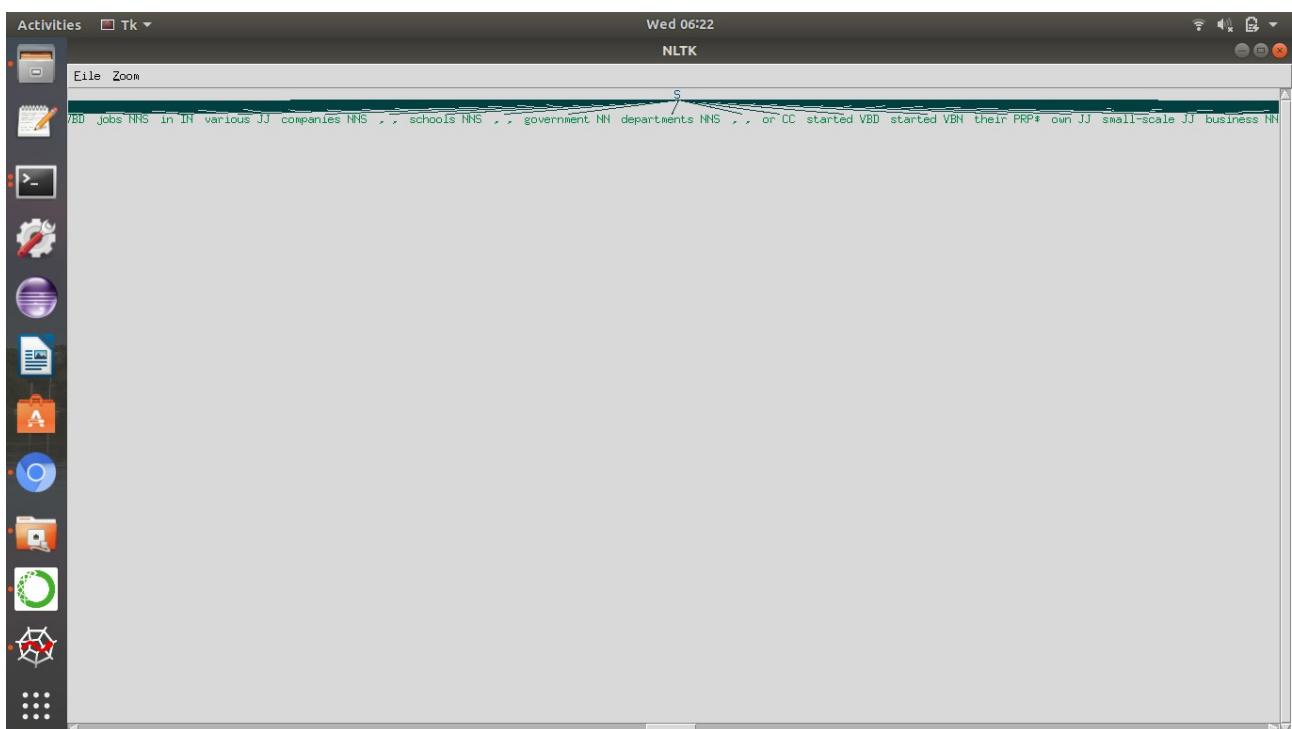


## 2. Analysing data

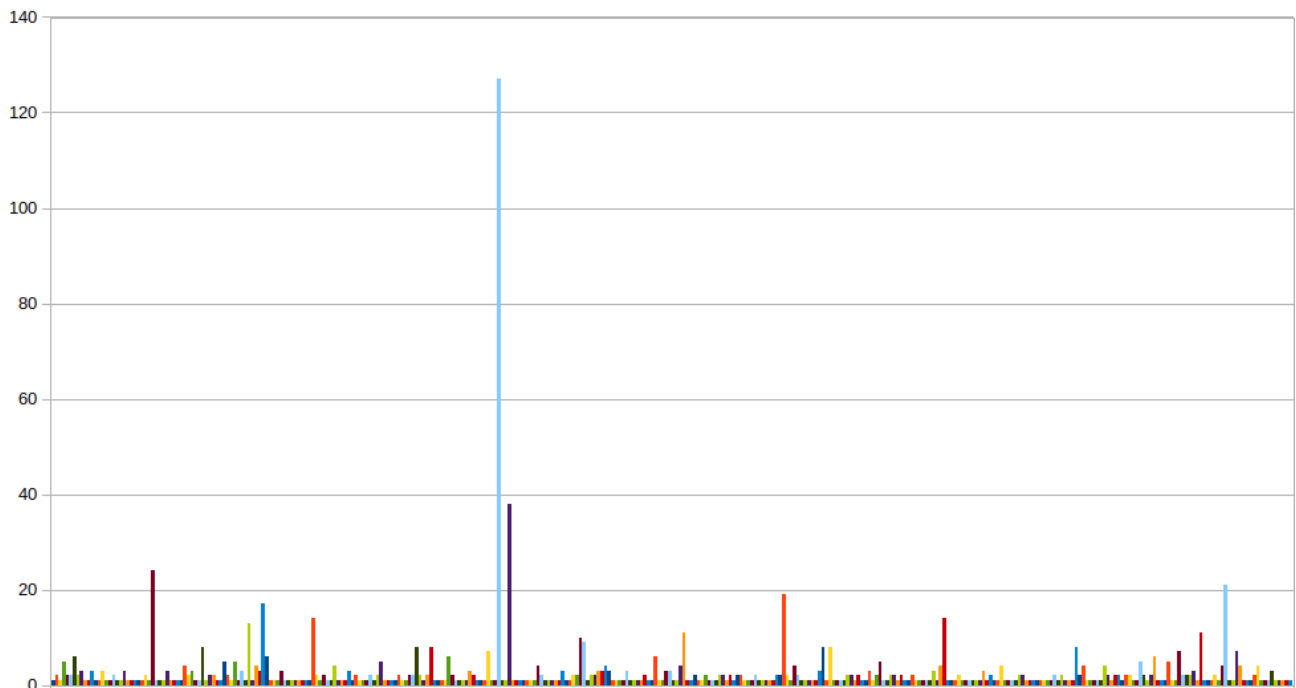
The average word length of articles is 383 words with a maximum of 1782 words. The following graph shows an analysis on word length of articles.



The NLTK tree for an article is shown below.



Frequency distribution for city names mentioned in articles with their legends.



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These named entities are extracted using the IO\_tag and parts of speech(POS) tag in NLTK.

### **3. Modules Used:**

1. BeautifulSoup4 Module(bs4)
2. Pandas
3. Requests
4. JSON Module
5. Natural Language Toolkit (NLTK)
6. os Module
7. Matplotlib

### **4. Python Scripts**

#### **For Data Analysis**

```
import requests
import pandas as pd
import bs4
import json

url_list=[]

field=["title_link-href"]

data=pd.read_csv(r"/home/arushi/
news_toi.csv",skipinitialspace=True,usecols=field,index_col=None)

list1=data.iloc[:,0].tolist()

#print(dic[:30])

title=[]
d_time=[]
content=[]

print(len(list1))
print("\n\n")

for i in range(len(list1)):
    res=requests.get(list1[i])

    print(i)
    print("-----****res.text length****-----\n")
    print(len(res.text))
    print("\n")
    soup=bs4.BeautifulSoup(res.text)
```

```

ele_text=soup.select("div .Normal")
ele_date=soup.select("time")
ele_title=soup.select("arttitle")
#print(ele_date)
#print(ele_title)
# print(type(ele_text))
print(ele_date[0].attrs)
print(ele_title[0].getText())
print(ele_text[0].getText())
print("-----new article-----\n\n")
#append lists
title.append(ele_title[0].getText())
d_time.append(ele_date[0].attrs)
content.append(ele_text[0].getText())
x=title[i-1152]
if "HIV/AIDS" in x:
    y=x.replace("HIV/AIDS","HIV-AIDS")
toi2=open(r"/home/arushi/toi_news_articles/%s"%y,"w")
toi2.write(json.dumps(d_time[i])+"\n")
toi2.write(content[i])

```

```

print(len(title))
print(title)
print("\n")

```

```

print(len(d_time))
print(d_time)
print("\n")

```

```

print(len(content))
print(content)
print("\n")

```

```

new_file=[title,d_time,content]
zip(*new_file)
print(zip(*new_file))

```

```

for t,d,c in zip(*new_file):
    print(t)
    print(d)
    print(c)

```

```

x=title[0]
print(content[0])
toi2=open(r"/home/arushi/toi_news_articles/%s"%x,"w")
toi2.write(json.dumps(d_time[0])+"\n")
toi2.write(content[0])

```

```
#str1=data[1:1]
#print(str1+"hello")
```

```
res=requests.get(r"https://timesofindia.indiatimes.com/india/hiv-positive-
women-marries-twice-kills-first-husband-with-the-help-of-second/articleshow/
63043159.cms")
```

```
print(type(res))
```

```
soup=bs4.BeautifulSoup(res.text)
print(type(soup))
```

```
ele_text=soup.select("div .Normal")
ele_date=soup.select("time")
print(ele_date)
ele_title=soup.select("arttitle")
print(ele_title)
```

```
print(type(ele_text))
```

```
print(ele_text[0].getText())
```

```
import nltk
from nltk.tokenize import sent_tokenize, word_tokenize
from nltk import ne_chunk, pos_tag
import os
import matplotlib.pyplot as plt
```

```
plt.style.use('ggplot')
from nltk import conlltags2tree, tree2conlltags
```

```
#from spacy.en import English
```

```
#new fuction definition
def entities(text):
    return ne_chunk(
        pos_tag(
            word_tokenize(text)))
```

```
#nltk.download('words')
```

```

#nltk.download('punkt')
#nltk.download('maxent_ne_chunker')
#nltk.download('averaged_perceptron_tagger')

path=r"/home/arushi/toi_news_articles"

len_art=[]
city_name=[]

for filename in os.listdir(path):
    print(filename)
    toi2=open(r"/home/arushi/toi_news_articles/"+filename,"r")
    data=toi2.read().replace('\n', '')
    #len_art.append(len(data.split()))
    words=word_tokenize(data)

    #print(nltk.pos_tag(words))

    tree=entities(data)
    iob_tags = tree2conlltags(tree)
    #print(iob_tags)

    for tup in iob_tags:
        if(tup[2]=="B-GPE" or tup[2]=="O_GPE" or tup[2]=="I-GPE"):
            city_name.append(tup[0])

    #print(tree)
    #tree.draw()

print(city_name)

import pandas as pd
df = pd.DataFrame(city_name, columns=["columnn"])
df.to_csv('city_list.csv', index=False)

city_set=set(city_name)
word_tag_fd=nltk.FreqDist(words)

plt.hist(city_name)

fig_size = plt.rcParams["figure.figsize"]
fig_size[0] = 12
fig_size[1] = 9
plt.rcParams["figure.figsize"] = fig_size
plt.xticks(city_set)
plt.show()

```



```
'''
print(len_art)
plt.plot(len_art)
plt.ylabel('article length')
plt.show()

print(max(len_art))
print(min(len_art))
print(sum(len_art)/len(len_art))
'''
```

## **Neural Network Model**

```
import pandas as pd
import numpy as np
import pickle
from keras.preprocessing.text import Tokenizer
from keras.models import Sequential
from keras.layers import Activation, Dense, Dropout
from sklearn.preprocessing import LabelBinarizer
import sklearn.datasets as skds
from pathlib import Path

# For reproducibility
np.random.seed(1237)

# Source file directory
path_train = "/home/arushi/toi_news_articles/'85% Raj rural women don't know about HIV-AIDS'"

files_train = skds.load_files(path_train,load_content=False)

label_index = files_train.target
label_names = files_train.target_names
labelled_files = files_train filenames

data_tags = ["filename","category","news"]
data_list = []

# Read and add data from file to a list
i=0
for f in labelled_files:
    fmodel = Sequential()
    model.add(Dense(512, input_shape=(vocab_size,)))
    model.add(Activation('relu'))
    model.add(Dropout(0.3))
    model.add(Dense(512))
    model.add(Activation('relu'))
    model.add(Dropout(0.3))
    model.add(Dense(num_labels))
    model.add(Activation('softmax'))
    model.summary()
```

```

model.compile(loss='categorical_crossentropy',
              optimizer='adam',
              metrics=['accuracy'])

history = model.fit(x_train, y_train,
                  batch_size=batch_size,
                  epochs=30,
                  verbose=1,
                  validation_split=0.1)
for f, label_index in zip(data_list, label_names):
    data_list.append((f, label_index, Path(f).read_text()))
    i += 1

# We have training data available as dictionary filename, category, data
data = pd.DataFrame.from_records(data_list, columns=data_tags)

encoder = LabelBinarizer()
encoder.fit(train_tags)
y_train = encoder.transform(train_tags)
y_test = encoder.transform(test_tags)

```