



Lab 4. Collecting Text Data with Web Scraping and APIs

Overview

This lab introduces you to the concept of web scraping. You will first learn how to extract data (such as text, images, lists, and tables) from pages that are written using HTML. You will then learn about the various types of semi-structured data used to create web pages (such as JSON and XML) and extract data from them. Finally, you will use APIs for data extraction from Twitter, using the `tweepy` package.

Collecting Data by Scraping Web Pages

The basic building block of any web page is HTML (Hypertext Markup Language) a markup language that specifies the structure of your content. HTML is written using a series of tags, combined with optional content. The basic HTML structure and commonly used tags are shown and explained as follows:

```
1  <!DOCTYPE html>
2  <html>
3  <head>
4      <meta charset="utf-8">
5      <title>My Page</title>
6  </head>
7  <body>
8      <p>Hello, World!</p>
9  </body>
10 </html>
```

Exercise 4.01: Extraction of Tag-Based Information from HTML Files

In this exercise, we will extract addresses, quotes, text written in bold, and a table present in an HTML file.

Follow these steps to implement this exercise:

1. Open a Jupyter Notebook.
2. Insert a new cell and add the following code to import the `BeautifulSoup` library:

```
from bs4 import BeautifulSoup
```

`BeautifulSoup` is a Python library for pulling data out of HTML and XML files. It provides a parser for HTML/XML formats, allowing us to navigate, search, and modify the parsed tree.

3. Create an object of the `BeautifulSoup` class and pass the location of the HTML file to it:

```
soup = BeautifulSoup(open('../data/sample_doc.html'), \
                      'html.parser')
```

In the preceding line, `html.parser` is Python's built-in standard library parser. `BeautifulSoup` also supports third-party parsers such as `html5lib`, `lxml`, and others.

4. Add the following code to check the text contents of the `sample_doc.html` file:

```
soup.text
```

The preceding code generates the following output:

```
'\n\n\n A sample HTML Page \n\n\nI am staying at  Mess on No. 72, Banamali Naskar Lane, Kolkata. \nS\nherlock  stays at 221B, Baker Street, London, UK. \nHamlet said to Horatio,  There are more things\nin heaven and earth, Horatio,  Than are dreamt of in your philosophy. \n A table denoting details of\nstudents\n\n\nname\n\nqualification\n\nadditional qualification\n\nother qualification\n\n\n\nGangaram\n\nB.Te\nch\n\nNA\n\nNA\n\n\n\nGanga\n\nB.A.\n\nNA\n\nNA\n\n\n\nRam\n\nB.Tech\n\nM.Tech\n\nNA\n\n\n\nRamlal\n\nB.Music\n\nNA\n\nDiploma i\nn Music\n\n\n\n\n'
```

5. Similarly, to see the contents, you can simply write the following code:

```
soup.contents
```

```
['html', '\n', '<html>\n<head>\n<title> A sample HTML Page </title>\n</head>\n<body>\nI am staying at <address> Mess on No. 72, Banamali Naskar Lane, Kolkata.</address> <br/>\n<b>Sherlock </b> stays at <address>221B, Baker Street, London, UK.</address> <br/>\n<b>Hamlet</b> said to <b>Horatio</b>, <br/> <q> There are more things in heaven and earth, Horatio,\n<br/> Than are dreamt of in your philosophy. </q>\n']
```

6. To find the addresses from the document, insert a new cell and add the following code:

```
soup.find('address')
```

The preceding code generates the following output:

```
<address> Mess on No. 72, Banamali Naskar Lane, Kolkata.</address>
```

7. To locate all the `address` tags within the given content, write the following code:

```
soup.find_all('address')
```

The preceding code generates the following output:

```
[<address> Mess on No. 72, Banamali Naskar Lane, Kolkata.</address>,\n<address>221B, Baker Street, London, UK.</address>]
```

8. To find the quotes in the document, add the following code:

```
soup.find_all('q')
```

The preceding code generates the following output:

```
[<q> There are more things in heaven and earth, Horatio, <br/>\nThan are dreamt of in your philosophy. </q>]
```

9. To check all the bold items, write the following command:

```
soup.find_all('b')
```

The preceding code generates the following output:

```
[<b>Sherlock </b>, <b>Hamlet</b>, <b>Horatio</b>]
```

10. Write the following command to extract the tables in the document:

```
table = soup.find('table')
table
```

The preceding code generates the following output:

```
<table>
<tr>
<th>name</th>
<th>qualification</th>
<th>additional qualification</th>
<th>other qualification</th>
</tr>
<tr>
<td>Gangaram</td>
<td>B.Tech</td>
<td>NA</td>
<td>NA</td>
</tr>
<tr>
<td>Ganga</td>
<td>B.A.</td>
<td>NA</td>
<td>NA</td>
</tr>
```

11. You can also view the contents of `table` by looping through it. Insert a new cell and add the following code to implement this:

```
for row in table.find_all('tr'):
    columns = row.find_all('td')
    print(columns)
```

The preceding code generates the following output:

```
[ ]
[<td>Gangaram</td>, <td>B.Tech</td>, <td>NA</td>, <td>NA</td>]
[<td>Ganga</td>, <td>B.A.</td>, <td>NA</td>, <td>NA</td>]
[<td>Ram</td>, <td>B.Tech</td>, <td>M.Tech</td>, <td>NA</td>]
[<td>Ramlal</td>, <td>B.Music</td>, <td>NA </td>, <td>Diploma in Music</td>]
```

12. You can also locate specific content in the table. To locate the value at the intersection of the third row and the second column, write the following command:

```
table.find_all('tr')[3].find_all('td')[2]
```

The preceding code generates the following output:

```
<td>M.Tech</td>
```

We have learned how to extract tag-based information from an HTML file.

Requesting Content from Web Pages

To fetch content, you can use the `get()` method, which, as the name suggests, sends a `GET` request to the web page from which you want to fetch data. Let's perform a simple exercise now to get a better idea of how we can implement this in Python.

Exercise 4.02: Collecting Online Text Data

In this exercise, we will be fetching the web content with the help of `requests`. We will be pulling a text file from *Project Gutenberg*, the free e-book website, specifically, from the text file for Charles Dickens' famous book, *David Copperfield*. Follow these steps to complete this exercise:

1. Use the `requests` library to request the content of a book available online with the following set of commands:

```
import requests
"""
Let's read the text version of david copper field
available online
"""
r = requests.get('https://www.gutenberg.org/files/766/766-0.txt')
r.status_code
```

The preceding code generates the following output:

```
200
```

When the browser visits the website, it fetches the content of the specified URL. Similarly, using `requests`, we get the content from the specified URL and all the information gets stored in the `r` object. `200` indicates that we received the right response from the URL.

2. Locate the text content of the fetched file by using the `requests` object `r` and referring to the `text` attribute. Write the following code for this:

```
r.text[:1000]
```

The preceding code generates the following output:

The Project Gutenberg eBook of David Copperfield, by Charles Dickens\r\n\r\nThis eBook is for the use
 of anyone anywhere at no cost and with\r\nalmost no restrictions whatsoever. You may copy it, give it awa
 y or\r\nre-use it under the terms of the Project Gutenberg license included\r\nwith this eBook or online a
 t www.gutenberg.org\r\n\r\n\r\nTitle: David Copperfield\r\n\r\nAuthor: Charles Dickens\r\n\r\nRelease Dat
 e: December, 1996 [Etext #766]\r\n\r\nPosting Date: November 24, 2009\r\n\r\nLast Updated: September 25, 2016\r\n\r\n\r\nLanguage: English\r\n\r\nCharacter set encoding: UTF-8\r\n\r\n*** START OF THIS PROJECT GUTENBERG EBOO
 K DAVID COPPERFIELD ***\r\n\r\n\r\n\r\n\r\nProduced by Jo Churcher\r\n\r\n\r\n\r\n\r\n\r\nDAVID COPPERFIEL
 D\r\n\r\n\r\n\r\nBy Charles Dickens\r\n\r\n\r\n\r\n\r\n\r\nAFFECTIONATELY INSCRIBED TO\r\n\r\n\r\nTHE HON. Mr. AND MRS. RICHARD WATSON,\r\n\r\nOF ROCKINGHAM, NORTHAMPTONSHIRE.\r\n\r\n\r\n\r\n\r\nCONTE
 NTS\r\n\r\n\r\n\r\nI. I Am Born\r\n\r\nII. I Observe\r\n\r\nIII. I Have a Change\r\n\r\nI
 V. I Fall into Disgrace\r\n\r\nV. '

3. Now, write the fetched content into a text file. To do this, add the following code:

```
from pathlib import Path
open(Path("../data/David_Copperfield.txt"), 'w', \
      encoding='utf-8').write(r.text)
```

The preceding code generates the following output:

2033139

We have just learned how to collect data from online sources with the help of the `requests` library.

Now, let's look at analyzing HTML content from Jupyter Notebooks.

Exercise 4.03: Analyzing the Content of Jupyter Notebooks (in HTML Format)

In this exercise, we will analyze the content of a Jupyter Notebook. We will count the number of images, list the packages that have been imported, and check the models and their performance.

Follow these steps to complete this exercise:

1. Import `BeautifulSoup` and pass the location of the given HTML file using the following commands:

```
from bs4 import BeautifulSoup
soup = BeautifulSoup(open('../data/text_classifier.html'), \
                      'html.parser')
soup.text[:100]
```

Here, we are loading HTML using `BeautifulSoup` and printing parsed content. The preceding code generates the following output:

```
'\n\n\nCh3_Activity7_Developing_end_to_end_Text_Classifiers\n\n\n\n/*!\n*\n* Twitter Bootstrap\n*\n*/\n*!\n*'
```

2. Use the `img` tag to count the number of images:

```
len(soup.find_all('img'))
```

The output shows that there are three `img` tags:

3

3. If you open the HTML file in the text editor or your web browser's console, you will see all `import` statements have the `class` attribute set to `nn`. So, to list all the packages that are imported, add the following code, referring to finding the `span` element with an `nn` class attribute:

```
[i.get_text() for i in soup.find_all(\n('span',attrs={"class":"nn"}))]
```

The preceding code generates the following output:

```
['pandas',\n 'pd',\n 'seaborn',\n 'sns',\n 'matplotlib.pyplot',\n 'plt',\n 're',\n 'string',\n 'nltk',\n 'nltk.corpus',\n 'nltk.stem',\n 'sklearn.feature_extraction.text',\n 'sklearn.model_selection',\n 'pylab',\n 'nltk',\n 'warnings',\n 'sklearn.metrics',\n 'sklearn.linear_model',\n 'sklearn.ensemble',\n 'xgboost']
```

4. To extract the models and their performance, look at the HTML document and see which `class` attribute the models and their performance belong to. You will see the `h2` and `div` tags with the `class` attribute `output_subarea output_stream output_stdout output_text`. Add the following code to extract the models:

```
for md,i in zip(soup.find_all('h2'), \n soup.find_all('div',\n attrs={"class":"output_subarea output_stream "\n "output_stdout output_text"})): \n    print("Model: ",md.get_text()) \n    print(i.get_text()) \n    print("-----\\n\\n\\n")
```

The preceding code generates the following output:

Model: Logistic Regression

confusion matrix:

```
[[28705  151]
 [ 1663 1396]]
```

accuracy: 0.943161522794924

classification report:

	precision	recall	f1-score	support
0	0.95	0.99	0.97	28856
1	0.90	0.46	0.61	3059
micro avg	0.94	0.94	0.94	31915
macro avg	0.92	0.73	0.79	31915
weighted avg	0.94	0.94	0.93	31915

Area under ROC curve for validation set: 0.911224422146723

So, in the preceding output, we have extracted a classification report from the HTML file using `BeautifulSoup` by referring to the `<h2>` and `<div>` tags.

Activity 4.01: Extracting Information from an Online HTML Page

In this activity, we will extract data about Rabindranath Tagore from the Wikipedia page about him.

After extracting the data, we will analyze information from the page. This should include the list of headings in the *Works* section, the list of his works, and the list of universities named after him. Follow these steps to implement this activity:

1. Open a Jupyter Notebook.
2. Import the `requests` and `BeautifulSoup` libraries.
3. Fetch the Wikipedia page from https://en.wikipedia.org/wiki/Rabindranath_Tagore using the `get` method of the `requests` library.
4. Convert the fetched content into HTML format using an HTML parser.
5. Print the list of headings in the *Works* section.
6. Print the list of original works written by Tagore in Bengali.
7. Print the list of universities named after Tagore.

Note: The solution to this activity in the current directory.

We are now well-versed in extracting generic data from HTML pages. Let's perform another activity now, where we'll be using regular expressions.

Dealing with Semi-Structured Data

A dataset is said to be semi-structured if it is not in a row-column format but, if required, can be converted into a structured format that has a definite number of rows and columns. JSON and XML are the most popularly used instances of semi-structured data.

JSON

JSON files are used for storing and exchanging data. JSON is human-readable and easy to interpret. The datatype of values of JSON objects must be any of the following:

- A string
- A number
- Another JSON object
- An array
- A boolean
- Null

NoSQL databases (such as MongoDB) store data in the form of JSON objects. Most APIs return JSON objects. The following figure depicts what a JSON file looks like:


```

{
  "stones": [
    {
      "name": "Space Stone",
      "movies": ["Thor", "Captain America", "The Avengers"]
    },
    {
      "name": "Mind Stone",
      "movies": ["The Avengers", "The Winter Soldier", "Age of Ultron", "Civil War"]
    },
    {
      "name": "Reality Stone",
      "movies": ["The Dark World"]
    },
    {
      "name": "Power Stone",
      "movies": ["Guardians of the Galaxy"]
    },
    {
      "name": "Time Stone",
      "movies": ["Dr. Strange"]
    },
    {
      "name": "Soul Stone"
    }
  ]
}

```

Exercise 4.04: Working with JSON Files

In this exercise, we will extract details such as the names of students, their qualifications, and additional qualifications from a JSON file.

Follow these steps to complete this exercise:

1. Open a Jupyter Notebook.
2. Insert a new cell and import `json`. Pass the location of the file mentioned using the following commands:

```

import json
from pprint import pprint
data = json.load(open('../data/sample_json.json'))
pprint(data)

```

In the preceding code, we are importing Python's built-in `json` module and loading the local JSON file using the standard I/O operation of Python. This turns JSON into the Python `dict` object. The preceding code generates the following output:

```
{'students': [{ 'name': 'Gangaram', 'qualification': 'B.Tech'},
               { 'name': 'Ganga', 'qualification': 'B.A.'},
               { 'additional qualification': 'M.Tech',
                 'name': 'Ram',
                 'qualification': 'B.Tech'},
               { 'name': 'Ramlal',
                 'other qualification': 'Diploma in Music',
                 'qualification': 'B.Music'}]}
```

3. To extract the names of the students, add the following code:

```
[dt['name'] for dt in data['students']]
```

The preceding code generates the following output:

```
['Gangaram', 'Ganga', 'Ram', 'Ramlal']
```

4. To extract their respective qualifications, enter the following code:

```
[dt['qualification'] for dt in data['students']]
```

The preceding code generates the following output:

```
['B.Tech', 'B.A.', 'B.Tech', 'B.Music']
```

5. To extract their additional qualifications, enter the following code. Remember, not every student will have additional qualifications. Thus, we need to check this separately. Add the following code to implement this:

```
[dt['additional qualification'] if 'additional qualification' \
in dt.keys() else None for dt in data['students']]
```

The preceding code generates the following output:

```
[None, None, 'M.Tech', None]
```

As JSON objects are similar to the dictionary data structure of Python, they are widely used on the web to send and receive data across web applications.

XML

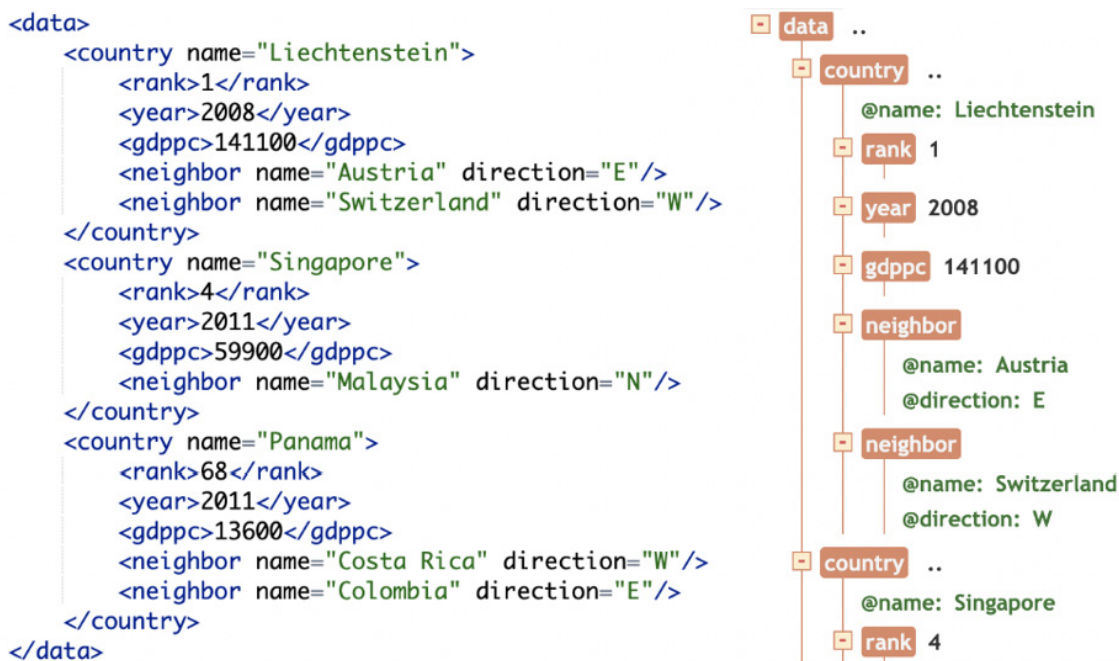
Just like HTML, XML is another kind of markup language that stores data in between tags. It is human-readable and extensible; that is, we have the liberty to define our own tags. The following figure depicts what an XML file looks like:

```

<?xml version="1.0"?>
<data>
  <country name="Liechtenstein">
    <rank>1</rank>
    <year>2008</year>
    <gdppc>141100</gdppc>
    <neighbor name="Austria" direction="E"/>
    <neighbor name="Switzerland" direction="W"/>
  </country>
  <country name="Singapore">
    <rank>4</rank>
    <year>2011</year>
    <gdppc>59900</gdppc>
    <neighbor name="Malaysia" direction="N"/>
  </country>
  <country name="Panama">
    <rank>68</rank>
    <year>2011</year>
    <gdppc>13600</gdppc>
    <neighbor name="Costa Rica" direction="W"/>
    <neighbor name="Colombia" direction="E"/>
  </country>
</data>

```

The following figure clearly differentiates between an original XML file and a tree representation of an XML file:



Exercise 4.05: Working with an XML File

In this exercise, we will parse an XML file and print the details from it, such as the names of employees, the organizations they work for, and the total salaries of all employees.

Follow these steps to complete this exercise:

1. Open a Jupyter Notebook.
2. Insert a new cell, import `xml.etree.ElementTree`, and pass the location of the XML file using the following code:

```
import xml.etree.ElementTree as ET
tree = ET.parse('../data/sample_xml_data.xml')
root = tree.getroot()
root
```

The preceding code generates the following output:

```
<Element 'records' at 0.112291710>
```

3. To check the tag of the fetched element, type the following code:

```
root.tag
```

The preceding code generates the following output:

```
'records'
```

4. Look for the `name` and `company` tags in the XML and print the data enclosed within them:

```
for record in root.findall('record')[:20]:
    print(record.find('name').text, "---", \
          record.find('company').text)
```

The preceding code generates the following output:

```
Peter Brewer --- Erat Ltd
Wallace Pace --- Sed Nunc Industries
Arthur Ray --- Amet Faucibus Corp.
Judah Vaughn --- Nunc Quis Arcu Inc.
Talon Combs --- Leo Elementum Ltd
Hall Bruce --- Proin Non Massa Consulting
Ronan Grant --- Scelerisque Sed Inc.
Dennis Whitaker --- Scelerisque Neque Foundation
Bradley Oconnor --- Aliquet Corporation
Forrest Alvarez --- Et Eros Institute
Ignatius Meyers --- Facilisis Lorem Limited
Bert Randolph --- Facilisis LLP
Victor Stevenson --- Lacinia Vitae Sodales Incorporated
Jamal Cummings --- Litora Ltd
Samson Estrada --- Lacinia Vitae Sodales Industries
Ira Spencer --- Duis Associates
Kevin Henson --- Sagittis Limited
Melvin Mccarthy --- Ipsum Suspendisse Company
Kieran Underwood --- Quisque Porttitor Eros Ltd
Cedric Phelps --- Lorem Vehicula Corp.
```

5. To find the sum of the salaries, create a list consisting of the salaries of all employees by iterating over each record and finding the `salary` tag in it. Next, remove the `$` and `,` from the string of salary content, and finally, type cast into the integer to get the sum at the end. Add the following code to do so:

```
sum([int(record.find('salary').text.replace('$', '').\
replace(',', '')) for record in root.findall('record')])
```

The preceding code generates the following output:

```
745609
```

Thus, we can see that the sum of all the salaries is \$745,609. We just learned how to extract data from a local XML file. When we request data, many URLs return an XML file.

Note

In the next section, we will look at how APIs can be used to retrieve real-time data.

Using APIs to Retrieve Real-Time Data

API stands for **Application Programming Interface**. To understand what an API is, let's consider a real-life example. Suppose you have a socket plug in the wall, and you need to charge your cellphone using it. How will you do it? You will have to use a charger/adaptor, which will enable you to connect the cellphone to the socket. Here, this adaptor is

acting as a mediator that connects the cellphone and the socket, thus enabling the smooth transfer of electricity between them.

Exercise 4.06: Collecting Data Using APIs

In this exercise, we will use the Currency Exchange Rates API to convert USD to another currency rate. Follow these steps to implement this exercise:

1. Open a Jupyter Notebook.
2. Import the necessary packages. Add the following code to do so:

```
import json
import pprint
import requests
import pandas as pd
```

3. Load the `json` data. Add the following code to do this:

```
r = requests.get("https://api.exchangerate-api.com/"\
                 "v4/latest/USD")

data = r.json()
pprint.pprint(data)
```

The preceding code generates the following output:

```
{'base': 'USD',
 'date': '2020-01-26',
 'rates': {'AED': 3.672058,
           'ARS': 60.073152,
           'AUD': 1.462619,
           'BGN': 1.772324,
           'BRL': 4.175311,
           'BSD': 1,
           'CAD': 1.313949,
           'CHF': 0.970542,
           'CLP': 775.032232,
           'CNY': 6.937035,
           'COP': 3356.26087,
           'CZK': 22.774105,
           'DKK': 6.769282,
           'DOP': 53.200551,
```

4. To create the DataFrame of the fetched data and print it, add the following code:

```
df = pd.DataFrame(data)
df.head()
```


The preceding code generates the following output:

	base	date	time_last_updated	rates
AED	USD	2020-01-26	1579997437	3.672058
ARS	USD	2020-01-26	1579997437	60.073152
AUD	USD	2020-01-26	1579997437	1.462619
BGN	USD	2020-01-26	1579997437	1.772324
BRL	USD	2020-01-26	1579997437	4.175311

Note that you will get a different output depending on the present currency exchange rates. We just learned how to collect data using APIs.

Extracting data from Twitter Using the OAuth API

The Twitter API requires authentication and authorization to interact with its services using the `OAuth` method. To access Twitter data and services using an API, you would need to register using a Twitter developer account.

You can collect data from Twitter using their Python module, named `Tweepy`. `Tweepy` is a Python library for accessing the Twitter API. It is great for simple automation and creating Twitter bots. It provides abstraction to communicate with Twitter and use its API to ease interactions, which makes this approach more efficient than using the `requests` library and Twitter API endpoints.

To use the `Tweepy` library, simply go to <https://dev.twitter.com/apps/new> and fill in the form; you'll need to complete the necessary fields, such as App Name, Website URL, Callback URL, and App Usage. Once you've done this, submit and receive the keys and tokens, which you can use for extracting tweets and more. However, before you do any of this, you'll first need to import the `tweepy` library.

Your Python code should look like this:

```
import tweepy
consumer_key = 'your consumer key here'
consumer_secret = 'your consumer secret key here'
access_token = 'your access token here'
access_token_secret = 'your access token secret here'
auth = tweepy.OAuthHandler(consumer_key, consumer_secret)
auth.set_access_token(access_token, access_token_secret)
api = tweepy.API(auth)
```

The preceding code uses `auth` instantiation from `OAuthHandler`, which takes in our consumer token and secret keys that were obtained during app registration. `OAuthHandler` handles interaction with Twitter's `OAuth` system.

To search for a query named `randomquery` using `tweepy`, you can use the `Cursor` object as follows:

```
tweepy.Cursor(api.search, q='randomquery', lang="en")
```

`Cursor` handles all the iterating-over-pages work for us behind the scenes, whereas the `api.search` method provides tweets that match a specified query given with the `q` parameter.

Let's do an activity now, to put our knowledge into practice.

Activity 4.02: Extracting Data from Twitter

In this activity, you will extract 100 tweets containing the hashtag *#climatechange* from Twitter, using the Twitter API via the *tweepy* library, and load them into a pandas DataFrame. The following steps will help you implement this activity:

1. Log in to your Twitter account with your credentials.
2. Visit <https://dev.twitter.com/apps/new> and fill in the form by completing the necessary fields, such as `App Name`, providing `Website URL`, `Callback URL`, and `App Usage`.
3. Submit the form and receive the keys and tokens.
4. Use these keys and tokens in your application when making an API call for *#climatechange*.
5. Import the necessary libraries.
6. Fetch the data using the keys and tokens.
7. Create a DataFrame consisting of tweets.

Note: The full solution to this activity can be found in the current directory.

Summary

In this lab, we have learned various ways to collect data by scraping web pages. We also successfully scraped data from semi-structured formats such as JSON and XML and explored different methods of retrieving data in real time from a website without authentication. In the next lab, you will learn about topic modeling an unsupervised natural language processing technique that helps group documents according to the topics that it detects in them.