

SUPPLEMENTARY MATERIALS

Algorithmic Thinking in the Public Interest: Navigating Technical, Legal, and Ethical Hurdles to Web Scraping in the Social Sciences

Alex Luscombe · Kevin Dick · Kevin Walby

Abstract These supplementary materials contain several examples of scrapers developed to accomplish tasks ranging from the very simple to the increasingly complex. All source code for these examples can be found at the following GitHub repository for use by the broader research community github.com/CAIJ-UW/automated-access.

Alex Luscombe
Centre for Criminology & Sociolegal Studies
University of Toronto
Toronto, Ontario, Canada M5S 3K9
ORCID: [0000-0002-3052-5401](https://orcid.org/0000-0002-3052-5401)

Kevin Dick
Department of Systems and Computer Engineering
Carleton University
Ottawa, Ontario, Canada K1S 5B6
ORCID: [0000-0003-3931-523X](https://orcid.org/0000-0003-3931-523X)

Kevin Walby
Department of Criminal Justice
University of Winnipeg
Winnipeg, Manitoba, Canada R3B 2E9
ORCID: [0000-0002-5107-2309](https://orcid.org/0000-0002-5107-2309)

```

1 """ Example 1
2 """
3 import requests
4 r = requests.get('https://example-website.com/file.json')
5 print(r.json())

```

Supplementary Algorithm 1 Example Usage of Python's Requests Library to Download a Single JSON File.

```

1 """ Example 2
2 """
3 from bs4 import BeautifulSoup
4 import urllib2
5
6 url = "https://www.example-website.com"
7 content = urllib2.urlopen(url).read()
8 soup = BeautifulSoup(content)
9
10 print (soup.prettify())
11
12 # Print all the links that appear on this page
13 for link in soup.find_all('a'):
14     print (link.get('href'))

```

Supplementary Algorithm 2 Example Usage of Python's BeautifulSoup Library to obtain all URL Links that Appear on the Target Webpage.

```

1 """ Example 3
2 """
3 from bs4 import BeautifulSoup
4 import urllib2
5
6 target_urls = ['www.example-website-1.com',
7               'www.example-website-2.com',
8               'www.example-website-3.com',
9               ...,
10              'www.example-website-n.com']
11 for url in target_urls:
12     content = urllib2.urlopen(url).read({})
13     soup = BeautifulSoup(content)
14     print (soup.prettify())
15
16 # Print all the links that appear on this page
17 for link in soup.find_all('a'):
18     print (link.get('href'))

```

Supplementary Algorithm 3 Extended Example Using BeautifulSoup to obtain all URL Links that Appear on Several Target Webpages.

```
1 """ Example 4:
2     Given that many government websites bury their data in drill-
3     down menus or tables, a multi-level navigation is required and
4     Selenium is used to automate the click-through navigation to
5     finally arrive to the specific data of interest. These data
6     are scraped using Python and saved as a JSON file for
7     subsequent analysis.
8     ---
9     Adapted from a Tutorial by Dave Gray
10    Original: https://bit.ly/30Q05Ns
11    Scraped Source: http://kanview.ks.gov/PayRates/PayRates\_Agency.aspx
12 """
13 from selenium import webdriver
14 from selenium.webdriver.common.keys import Keys
15 from bs4 import BeautifulSoup
16 import re
17 import pandas as pd
18 from tabulate import tabulate
19 import os
20
21 # Specify the URL for the target URL
22 url = "http://kanview.ks.gov/PayRates/PayRates_Agency.aspx"
23
24 # Initialize a Firefox session
25 driver = webdriver.Firefox()
26 driver.implicitly_wait(30)
27 driver.get(url)
28
29 # After opening the url above, Selenium clicks the specific agency
30 # link
31 python_btn = driver.find_element_by_id('
32     MainContent_uxLevel1_Agencies_uxAgencyBtn_33')
33 python_btn.click() # click the link that corresponds to FHSU
34
35 # Selenium provides the page to BeautifulSoup which can then be
36 # parsed
37 soup_level_1 = BeautifulSoup(driver.page_source, 'lxml')
38
39 # Create an empty list
40 data = []
41
42 # BeautifulSoup finds all Job Title links on the agency page and
43 # the loop begins
44 for link in soup_level_1.find_all('a', id=re.compile("^
45     MainContent_uxLevel2_JobTitles_uxJobTitleBtn_")):
46     # Selenium visits each Job Title page
47     python_btn = driver.find_element_by_id('
48     MainContent_uxLevel2_JobTitles_uxJobTitleBtn_' + str(len(data)
49     ))
50     python_btn.click() #click Link
51
52     #Selenium hands of the source of the specific job page to
53     #Beautiful Soup
54     soup_level_2=BeautifulSoup(driver.page_source, 'lxml')
55
56     # BeautifulSoup grabs the HTML table on the page
57     table = soup_level_2.find_all('table')[0]
```

```

45     # Giving the HTML table to pandas to put in a dataframe object
46     df = pd.read_html(str(table), header=0)
47
48     # Store the dataframe in a list
49     data.append(df[0])
50
51     # Use Selenium to navigate back by clicking the back button
52     driver.execute_script("window.history.go(-1)")
53
54 # Loop ends, data are collected, close the Selenium browser
55 session
56 driver.quit()
57
58 # Combine the pandas dataframes into a single large dataframe
59 result = pd.concat([pd.DataFrame(data[i]) for i in range(len(data)
60                        )], ignore_index=True)
61
62 # Convert the pandas dataframe to JSON
63 json_data = result.to_json(orient='records')
64
65 # Pretty print the results using tabulate (convert to an ascii
66 table)
67 print(tabulate(result, headers=["Employee Name", "Job Title", "
68      Overtime Pay", "Total Gross Pay"], tablefmt='psql'))
69
70 # Save to file in current working directory
71 open("fhsu_payroll_data.json", "w").write(json_data)
72
73 # That's all folks!

```

Supplementary Algorithm 4 Full Example Using Multiple Scraping Libraries for Complex Website navigation and Data Extraction.

```

1 """
2 Description: A Selenium-based scraper to download the
3 PDFs listed on the DocumentCloud of Muckrock-Canada.
4 """
5 import os
6 from selenium import webdriver
7 import requests
8 import argparse
9
10 parser = argparse.ArgumentParser(description='')
11 parser.add_argument('-o', '--output_dir', required=True,
12                     help='output directory for the PDFs')
13 parser.add_argument('-v', '--verbose', action='store_true',
14                     help='increase verbosity')
15 args = parser.parse_args()
16
17 # EXAMPLE: python3 selenium_documentcloud_ATIPs.py -o ./Muckrock-
18           Canada/ -v
19
20 # Constants for the scraping project
21 BASE_URL = 'https://www.documentcloud.org/public/search/Group:%20
22           muckrock-canada'
23 MATCH_URL = 'documentcloud.org/document'
24 DRIVER = '/usr/local/bin/chromedriver' # Specify the location
25           of your own chromedriver installation
26 MAX_PAGES = 478
27
28 def get_page_links(driver, url):
29     """ get_page_links
30     With the created driver, navigate to the next page
31     and get all ahref links that match the MATCH_URL.
32     ---
33     Input: <driver> driver, instantiated driver
34     Output: <list> links, all page links matching the MATCH_URL
35     """
36     driver.get(url)
37     links = []
38
39     # Obtain a list of the links on this page
40     elems = driver.find_elements_by_xpath("//a[@href]")
41     for elem in elems:
42         link = elem.get_attribute("href")
43         if MATCH_URL in link:
44             if args.verbose: print(f'adding {link}')
45             links.append(link)
46     return links
47
48 def main():
49     """ main function """
50     driver = webdriver.Chrome(DRIVER)
51     all_links = []
52
53     for i in range(1, MAX_PAGES + 1):
54         page = f'{BASE_URL}/p{i}'
55         if args.verbose: print(f'acquiring page: {page}')
56         links = get_page_links(driver, page)
57         for link in links:
58             download = link.replace('html', 'pdf')

```

```

56     filename = download.split('/')[-1]
57
58     if args.verbose: print(f'Downloading: {download}')
59     doc = requests.get(download)
60     if args.verbose: print(f'Saving: {download}')
61     open(os.path.join(args.output_dir, filename), 'wb').write(
        doc.content)
62     driver.quit()
63
64 if __name__ == "__main__": main()

```

Supplementary Algorithm 5 Full Example Using the Selenium Library to Automatically Navigate a Document Repository and Extract PDFs.

```

1  """
2  Description: Scrapes the Springer PDFs from
3  the Free-Springer-Ebooks.csv file
4  """
5  import os
6  from bs4 import BeautifulSoup
7  import requests
8  import argparse
9
10 parser = argparse.ArgumentParser(description='')
11 parser.add_argument('-i', '--input', required=False, default='Free
    -Springer-Ebooks.csv',
12                     help='input csv containing info on free
    Springer books')
13 parser.add_argument('-o', '--output_dir', required=False, default=
    './pdfs/',
14                     help='output file')
15 parser.add_argument('-v', '--verbose', action='store_true',
16                     help='increase verbosity')
17 args = parser.parse_args()
18
19 # EXAMPLE: python3 springer_scraper.py -v
20
21 def get_download_link(url):
22     html = requests.get(url).text
23     bs = BeautifulSoup(html)
24     for link in bs.find_all('a'):
25         if link.has_attr('href'):
26             if 'content' in link.attrs['href'] and 'pdf' in link.
                attrs['href']: return 'https://link.springer.com' + link.attrs
                ['href']
27
28
29 def main():
30     """ main function """
31     if not os.path.exists(args.output_dir): os.mkdir(args.output_dir
    )
32     for book in open(args.input, 'r').readlines():
33         title = '-'.join(book.split(',')[1].split())
34         author = '-'.join(book.split(',')[2].split())
35         year = '-'.join(book.split(',')[3].split())
36         url = book.split(',')[4].strip()
37         isbn = url.split('isbn=')[1]
38         filename = '-'.join([title, author, year]) + '.pdf'

```

```
39     download = get_download_link(url)
40
41     if args.verbose: print('Title: {}\nAuthor: {}\nYear: {}\nURL:
42     {}\nISBN: {}\nFilename: {}\nDownload: {}\n'.format(title,
43     author, year, url, isbn, filename, download))
44
45     cmd = 'curl {} --output {}'.format(download, os.path.join(args
46     .output_dir, filename))
47     if args.verbose: print('Downloading {}\n'.format(filename))
48     os.system(cmd)
49
50 if __name__ == "__main__": main()
```

Supplementary Algorithm 6 Full Example Using the BeautifulSoup Library to Automatically Parse a Collection of Document Links to then Extract the Desired PDFs.