

```
In [ ]: # Ahmad Sharif
# DATA.STAT.840-2023-2024-1 Statistical Methods for Text Data Analysis
# K436765
```

```
In [51]: import requests
import bs4
import urllib.request

from nltk.tokenize import word_tokenize
from nltk.stem import WordNetLemmatizer
```

```
In [52]: webpage_url = "https://www.sis.uta.fi/~tojape/"
webpage_html = requests.get(webpage_url)
webpage_parsed_html = bs4.BeautifulSoup(webpage_html.content, 'html.parse')
# webpage_parsed_html
```

1. It can crawl the same page multiple times, if a link on a later crawled page points to the already-crawled page.
2. It inserts all links from each page in order as pages to be crawled. If some page contains thousands of links, the crawling will crawl those first and may never get to the links from the next page, especially if the total number of pages are limited. To fix this duplicate issue, at first before insert into the list, I check if the url already exist list data- structure.

```
In [53]: def getpageurls(webpage_parsed):
    pagelinkelements=webpage_parsed.find_all('a')
    pageurls = [];
    for pagelink in pagelinkelements:
        pageurl_isok=1
        try:
            pageurl = pagelink['href']
        except:
            pageurl_isok=0
        if (pageurl.find('.pdf') !=-1)|(pageurl.find('.ps')!=-1):
            pageurl_isok = 0
        if (pageurl.find('http') ==-1 )|(pageurl.find('.fi')== -1):
            pageurl_isok = 0
        if pageurl_isok == 1 and pageurl not in pageurls: # Before Append
            pageurls.append(pageurl)

    return(pageurls)
mywebpage_urls = getpageurls(webpage_parsed_html)
for x in mywebpage_urls:
    print(x)
# print(mywebpage_urls)
```

<https://www.tuni.fi/en>  
<https://www.tuni.fi/en/about-us/faculty-information-technology-and-communication-sciences>  
<https://www.tuni.fi/en/about-us/computing-sciences>  
<http://cs.aalto.fi/en/>  
<http://www.cis.hut.fi/projects/mi>  
<http://users.ics.aalto.fi/jtpelto/>  
<http://research.ics.aalto.fi/coin/>  
<https://www.tuni.fi/en/study-with-us/computing-sciences-data-science?navref=curated--list>  
<https://www.tuni.fi/en/study-with-us/computing-sciences-statistical-data-analytics?navref=curated--list>  
<https://www.tuni.fi/studentsguide/curriculum/degree-programmes/uta-tohjelm-a-1717?year=2019>  
<https://www.tuni.fi/studentsguide/curriculum/course-units/otm-d42bf3fb-ecd7-43ee-919e-3a18e0b7d885?year=2020&q=null>  
<https://www.tuni.fi/studentsguide/curriculum/course-units/otm-386280c0-c76b-b4837-b4e3-61a9d53130b4?year=2020>  
<https://www.tuni.fi/studentsguide/curriculum/course-units/uta-ykoodi-48003?year=2019>  
<https://www.tuni.fi/studentsguide/curriculum/course-units/uta-ykoodi-48010?year=2019>  
<https://www.tuni.fi/studentsguide/curriculum/course-units/uta-ykoodi-38903?year=2019>  
<https://www10.uta.fi/opas/teaching/course.htm?id=32034>  
<https://www10.uta.fi/opas/teaching/course.htm?id=32030>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=34169>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=32033>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=32030>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=29901>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=29910>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=29909>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=25061>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=24888>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=27922>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=23239>  
<https://www10.uta.fi/opas/opetusohjelma/marjapuuro.htm?id=20713>  
<https://noppa.aalto.fi/noppa/kurssi/t-61.2020/etusivu>  
<https://noppa.aalto.fi/noppa/kurssi/t-61.5010/etusivu>  
<https://noppa.aalto.fi/noppa/kurssi/t-61.3050/etusivu>  
<https://noppa.aalto.fi/noppa/kurssi/t-61.6040/etusivu>  
<https://noppa.tkk.fi/noppa/kurssi/t-61.6040/etusivu>  
<https://noppa.tkk.fi/noppa/kurssi/t-61.3040/etusivu>  
<https://www.tuni.fi/en/mykola-andrushchenko>  
<http://people.uta.fi/~kauppinen.joonas.t/>  
<https://people.uta.fi/~olli.kuparinen/>  
<http://users.ics.aalto.fi/ziyuang/>  
<http://users.ics.aalto.fi/hani/>  
<http://users.ics.aalto.fi/jstrahl/>  
<https://www.tuni.fi/en/elizaveta-zimina>  
<http://users.ics.aalto.fi/zhexie/>  
<http://users.ics.tkk.fi/faisal/>  
<https://www.tuni.fi/en/joni-pajarinen>  
<http://users.ics.tkk.fi/lgillber/>  
<http://users.ics.aalto.fi/msandhol/>  
<https://www.tuni.fi/en/essi-syrjala>  
<http://users.ics.tkk.fi/kongeo/>  
<http://users.ics.tkk.fi/jviinika/>  
<http://users.ics.aalto.fi/mlosoi/>

```

https://journal.fi/sananjalka/article/view/80056
http://www.cis.hut.fi/projects/mi/abstracts/jmlr10.html
http://www.cis.hut.fi/projects/mi/abstracts/ida09b.html
http://www.cis.hut.fi/projects/mi/abstracts/csda09.html
http://www.cis.hut.fi/projects/mi/abstracts/tnn04.html
http://www.cis.hut.fi/projects/mi/abstracts/nn04.html
http://www.cis.hut.fi/projects/mi/abstracts/trnn00.html
http://research.ics.aalto.fi/mi/software/ne/index.shtml
http://www.cis.hut.fi/projects/mi/abstracts/icassp10.html
http://www.cis.hut.fi/projects/mi/abstracts/wsom09.html
http://www.cis.hut.fi/projects/mi/abstracts/icassp09_snerv.html
http://www.cis.hut.fi/projects/mi/abstracts/ecml07.html
http://www.cis.hut.fi/projects/mi/abstracts/mlsp07.html
http://www.cis.hut.fi/projects/mi/abstracts/pmsb2006.html
http://www.cis.hut.fi/projects/mi/abstracts/icml04.html
http://www.cis.hut.fi/projects/mi/abstracts/wsom03b.html
http://www.cis.hut.fi/projects/mi/abstracts/icml03.html
http://www.cis.hut.fi/projects/mi/abstracts/ecml03.html
http://www.cis.hut.fi/projects/mi/abstracts/iconip02.html
http://www.cis.hut.fi/projects/mi/abstracts/icann02.html
http://www.cis.hut.fi/projects/mi/abstracts/ijcnn01.html
https://politiikasta.fi/parlamentaarisen-politiikan-ajat/
http://www.cis.hut.fi/projects/mi/abstracts/nips08_lms_rsl.html
http://www.nbl.fi/~nbl924/renkula/
http://www.cis.hut.fi/projects/mi/abstracts/nips06_did.html
http://www.cis.hut.fi/projects/mi/abstracts/nips06_lce.html
http://www.cis.hut.fi/projects/mi/abstracts/eccb06poster.html
http://lib.hut.fi/Diss/2004/isbn9512273454/

```

```

In [54]: webpage_url = "https://gutenberg.org/browse/scores/top"
webpage_html = requests.get(webpage_url)
webpage_parsed_html = bs4.BeautifulSoup(webpage_html.content, 'html.parse

```

## 2) a)

```

In [55]: pageList = webpage_parsed_html.find("h2", {"id": "books-last30"})
ol = pageList.find_next_sibling("ol")
book_list = {}

def collect_all_download_link(count):
    index = 0
    for x in (ol.findAll('li')):
        index = index + 1
        url = x.a['href']

        book_id = url.split('/')[2]
        book_name = x.a.text
        download_link = 'https://www.gutenberg.org/files/' + book_id + '/'
        print(index, " : ", download_link)
        if(index < count):
            book_list[book_id] = {
                "book_name": book_name,
                "download_link": download_link
            }
    collect_all_download_link(20)

```

```
print(len(book_list))  
# 20
```

1 : <https://www.gutenberg.org/files/84/84-0.txt>  
2 : <https://www.gutenberg.org/files/1513/1513-0.txt>  
3 : <https://www.gutenberg.org/files/1342/1342-0.txt>  
4 : <https://www.gutenberg.org/files/25344/25344-0.txt>  
5 : <https://www.gutenberg.org/files/11/11-0.txt>  
6 : <https://www.gutenberg.org/files/345/345-0.txt>  
7 : <https://www.gutenberg.org/files/174/174-0.txt>  
8 : <https://www.gutenberg.org/files/5200/5200-0.txt>  
9 : <https://www.gutenberg.org/files/64317/64317-0.txt>  
10 : <https://www.gutenberg.org/files/2542/2542-0.txt>  
11 : <https://www.gutenberg.org/files/1952/1952-0.txt>  
12 : <https://www.gutenberg.org/files/1080/1080-0.txt>  
13 : <https://www.gutenberg.org/files/2701/2701-0.txt>  
14 : <https://www.gutenberg.org/files/844/844-0.txt>  
15 : <https://www.gutenberg.org/files/43/43-0.txt>  
16 : <https://www.gutenberg.org/files/98/98-0.txt>  
17 : <https://www.gutenberg.org/files/41/41-0.txt>  
18 : <https://www.gutenberg.org/files/1661/1661-0.txt>  
19 : <https://www.gutenberg.org/files/6130/6130-0.txt>  
20 : <https://www.gutenberg.org/files/408/408-0.txt>  
21 : <https://www.gutenberg.org/files/1232/1232-0.txt>  
22 : <https://www.gutenberg.org/files/1260/1260-0.txt>  
23 : <https://www.gutenberg.org/files/1400/1400-0.txt>  
24 : <https://www.gutenberg.org/files/28054/28054-0.txt>  
25 : <https://www.gutenberg.org/files/2591/2591-0.txt>  
26 : <https://www.gutenberg.org/files/1399/1399-0.txt>  
27 : <https://www.gutenberg.org/files/26184/26184-0.txt>  
28 : <https://www.gutenberg.org/files/46/46-0.txt>  
29 : <https://www.gutenberg.org/files/76/76-0.txt>  
30 : <https://www.gutenberg.org/files/2554/2554-0.txt>  
31 : <https://www.gutenberg.org/files/16328/16328-0.txt>  
32 : <https://www.gutenberg.org/files/3207/3207-0.txt>  
33 : <https://www.gutenberg.org/files/219/219-0.txt>  
34 : <https://www.gutenberg.org/files/4300/4300-0.txt>  
35 : <https://www.gutenberg.org/files/205/205-0.txt>  
36 : <https://www.gutenberg.org/files/2814/2814-0.txt>  
37 : <https://www.gutenberg.org/files/16/16-0.txt>  
38 : <https://www.gutenberg.org/files/7370/7370-0.txt>  
39 : <https://www.gutenberg.org/files/23/23-0.txt>  
40 : <https://www.gutenberg.org/files/1184/1184-0.txt>  
41 : <https://www.gutenberg.org/files/1727/1727-0.txt>  
42 : <https://www.gutenberg.org/files/27827/27827-0.txt>  
43 : <https://www.gutenberg.org/files/2600/2600-0.txt>  
44 : <https://www.gutenberg.org/files/1497/1497-0.txt>  
45 : <https://www.gutenberg.org/files/41445/41445-0.txt>  
46 : <https://www.gutenberg.org/files/74/74-0.txt>  
47 : <https://www.gutenberg.org/files/15399/15399-0.txt>  
48 : <https://www.gutenberg.org/files/10007/10007-0.txt>  
49 : <https://www.gutenberg.org/files/55/55-0.txt>  
50 : <https://www.gutenberg.org/files/768/768-0.txt>  
51 : <https://www.gutenberg.org/files/5740/5740-0.txt>  
52 : <https://www.gutenberg.org/files/45/45-0.txt>  
53 : <https://www.gutenberg.org/files/932/932-0.txt>  
54 : <https://www.gutenberg.org/files/2000/2000-0.txt>  
55 : <https://www.gutenberg.org/files/58585/58585-0.txt>  
56 : <https://www.gutenberg.org/files/996/996-0.txt>  
57 : <https://www.gutenberg.org/files/1998/1998-0.txt>  
58 : <https://www.gutenberg.org/files/2148/2148-0.txt>  
59 : <https://www.gutenberg.org/files/244/244-0.txt>

```
60 : https://www.gutenberg.org/files/67098/67098-0.txt
61 : https://www.gutenberg.org/files/120/120-0.txt
62 : https://www.gutenberg.org/files/2680/2680-0.txt
63 : https://www.gutenberg.org/files/33283/33283-0.txt
64 : https://www.gutenberg.org/files/2852/2852-0.txt
65 : https://www.gutenberg.org/files/8800/8800-0.txt
66 : https://www.gutenberg.org/files/514/514-0.txt
67 : https://www.gutenberg.org/files/20203/20203-0.txt
68 : https://www.gutenberg.org/files/30254/30254-0.txt
69 : https://www.gutenberg.org/files/6133/6133-0.txt
70 : https://www.gutenberg.org/files/4363/4363-0.txt
71 : https://www.gutenberg.org/files/600/600-0.txt
72 : https://www.gutenberg.org/files/42324/42324-0.txt
73 : https://www.gutenberg.org/files/38065/38065-0.txt
74 : https://www.gutenberg.org/files/35/35-0.txt
75 : https://www.gutenberg.org/files/158/158-0.txt
76 : https://www.gutenberg.org/files/36/36-0.txt
77 : https://www.gutenberg.org/files/779/779-0.txt
78 : https://www.gutenberg.org/files/5827/5827-0.txt
79 : https://www.gutenberg.org/files/521/521-0.txt
80 : https://www.gutenberg.org/files/161/161-0.txt
81 : https://www.gutenberg.org/files/3825/3825-0.txt
82 : https://www.gutenberg.org/files/10/10-0.txt
83 : https://www.gutenberg.org/files/8492/8492-0.txt
84 : https://www.gutenberg.org/files/3296/3296-0.txt
85 : https://www.gutenberg.org/files/1250/1250-0.txt
86 : https://www.gutenberg.org/files/147/147-0.txt
87 : https://www.gutenberg.org/files/44956/44956-0.txt
88 : https://www.gutenberg.org/files/31284/31284-0.txt
89 : https://www.gutenberg.org/files/11030/11030-0.txt
90 : https://www.gutenberg.org/files/35899/35899-0.txt
91 : https://www.gutenberg.org/files/730/730-0.txt
92 : https://www.gutenberg.org/files/100/100-0.txt
93 : https://www.gutenberg.org/files/203/203-0.txt
94 : https://www.gutenberg.org/files/209/209-0.txt
95 : https://www.gutenberg.org/files/236/236-0.txt
96 : https://www.gutenberg.org/files/24869/24869-0.txt
97 : https://www.gutenberg.org/files/4217/4217-0.txt
98 : https://www.gutenberg.org/files/1251/1251-0.txt
99 : https://www.gutenberg.org/files/851/851-0.txt
100 : https://www.gutenberg.org/files/6753/6753-0.txt
19
```

```
In [6]: ## 2 > b Name And Link
index = 0
for x in book_list:
    index = index + 1
    print(index, "Book Name      :", book_list[x]["book_name"])
    print("  Download Link :", book_list[x]["download_link"])
    print()
```

- 1 Book Name : Frankenstein; Or, The Modern Prometheus by Mary Wollstonecraft Shelley (83654)  
Download Link : <https://www.gutenberg.org/files/84/84-0.txt>
- 2 Book Name : Romeo and Juliet by William Shakespeare (63125)  
Download Link : <https://www.gutenberg.org/files/1513/1513-0.txt>
- 3 Book Name : Pride and Prejudice by Jane Austen (54666)  
Download Link : <https://www.gutenberg.org/files/1342/1342-0.txt>
- 4 Book Name : The Scarlet Letter by Nathaniel Hawthorne (37534)  
Download Link : <https://www.gutenberg.org/files/25344/25344-0.txt>
- 5 Book Name : Alice's Adventures in Wonderland by Lewis Carroll (30517)  
Download Link : <https://www.gutenberg.org/files/11/11-0.txt>
- 6 Book Name : Dracula by Bram Stoker (29837)  
Download Link : <https://www.gutenberg.org/files/345/345-0.txt>
- 7 Book Name : The Picture of Dorian Gray by Oscar Wilde (25794)  
Download Link : <https://www.gutenberg.org/files/174/174-0.txt>
- 8 Book Name : Metamorphosis by Franz Kafka (24788)  
Download Link : <https://www.gutenberg.org/files/5200/5200-0.txt>
- 9 Book Name : The Great Gatsby by F. Scott Fitzgerald (24469)  
Download Link : <https://www.gutenberg.org/files/64317/64317-0.txt>
- 10 Book Name : A Doll's House : a play by Henrik Ibsen (22998)  
Download Link : <https://www.gutenberg.org/files/2542/2542-0.txt>
- 11 Book Name : The Yellow Wallpaper by Charlotte Perkins Gilman (22426)  
Download Link : <https://www.gutenberg.org/files/1952/1952-0.txt>
- 12 Book Name : A Modest Proposal by Jonathan Swift (21398)  
Download Link : <https://www.gutenberg.org/files/1080/1080-0.txt>
- 13 Book Name : Moby Dick; Or, The Whale by Herman Melville (19991)  
Download Link : <https://www.gutenberg.org/files/2701/2701-0.txt>
- 14 Book Name : The Importance of Being Earnest: A Trivial Comedy for Serious People by Oscar Wilde (19579)  
Download Link : <https://www.gutenberg.org/files/844/844-0.txt>
- 15 Book Name : The Strange Case of Dr. Jekyll and Mr. Hyde by Robert Louis Stevenson (19402)  
Download Link : <https://www.gutenberg.org/files/43/43-0.txt>
- 16 Book Name : A Tale of Two Cities by Charles Dickens (18363)  
Download Link : <https://www.gutenberg.org/files/98/98-0.txt>
- 17 Book Name : The Legend of Sleepy Hollow by Washington Irving (17234)  
Download Link : <https://www.gutenberg.org/files/41/41-0.txt>
- 18 Book Name : The Adventures of Sherlock Holmes by Arthur Conan Doyle (16994)

Download Link : <https://www.gutenberg.org/files/1661/1661-0.txt>

19 Book Name : The Iliad by Homer (16269)

Download Link : <https://www.gutenberg.org/files/6130/6130-0.txt>

In [50]: *# 2 ) c) Use the processing pipeline described on the lecture to tokenize*

```
import nltk
from nltk.tokenize import word_tokenize
from nltk.stem import WordNetLemmatizer
import urllib

crawled_lemmatize_word_list = []
book_id = list(book_list.keys())[0]
url = "https://www.gutenberg.org/files/" + book_id + "/" + book_id + "-0."
book_content = urllib.request.urlopen(url).read().decode('utf-8')

# print(book_content)

# Tokenize
book_word_list = word_tokenize(book_content)
# print(book_word_list)

# Lemmatize
lemmatizer = WordNetLemmatizer()
for word in book_word_list:
    l = lemmatizer.lemmatize(word).lower()
    nltk_text = nltk.Text(l)
    crawled_lemmatize_word_list.append(l)
```

In [29]: 

```
'''for x in crawled_lemmatize_word_list:
    print(x)'''
```

Out[29]: 

```
'for x in crawled_lemmatize_word_list:\n    print(x)'
```

In [36]: *# 2.2 s) (d) Create a unified vocabulary from the ebooks; report the top-*

```
import numpy as np
from nltk.probability import FreqDist

r = np.unique(crawled_lemmatize_word_list, return_inverse=True)

print(r[0][130:230])

vocabulary = sorted(set(r[0]))
# print(vocab)
```



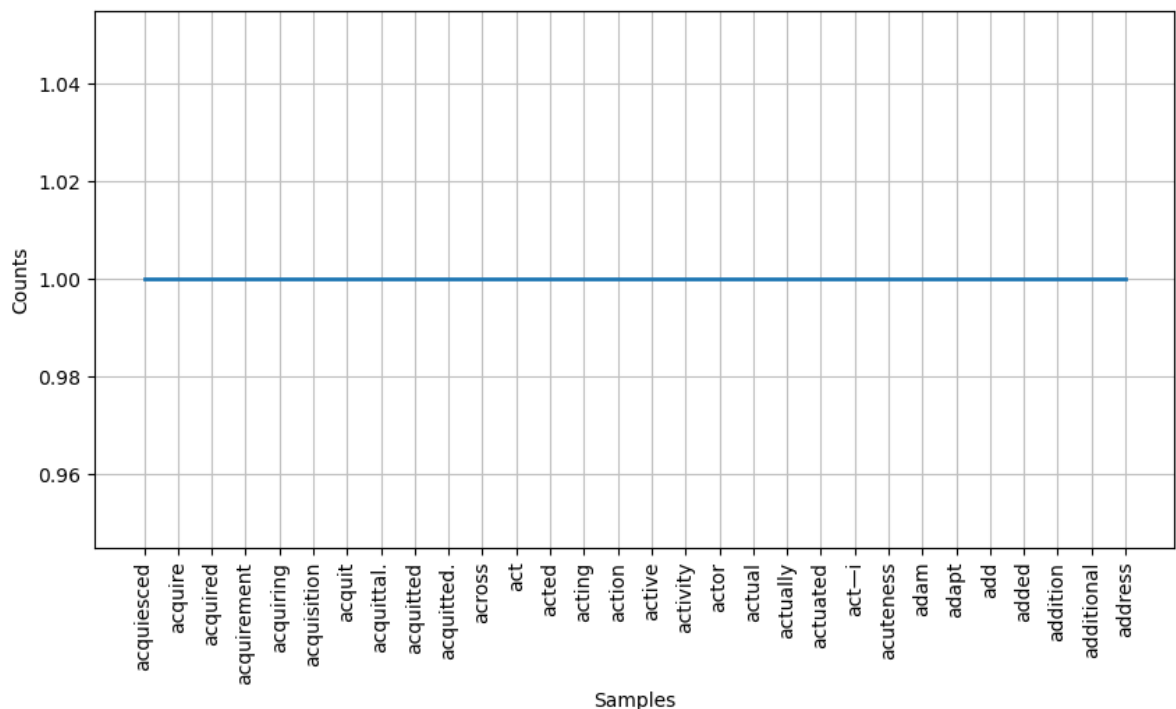
```
[ 'abandoned' 'abbey' 'abhor' 'abhorred' 'abhorred.' 'abhorrence'
'abhorrent' 'abide' 'ability' 'abject' 'able' 'aboard' 'abode' 'abortion'
'abortive' 'about' 'above' 'abroad' 'abrupt' 'absence' 'absence.'
'absent' 'absolute' 'absolutely' 'absolution' 'absorbed' 'absorbing'
'abstained' 'abstruse' 'abyss' 'acceded' 'accent' 'accept' 'acceptance'
'accepted' 'accepting' 'access' 'accessed' 'accessible' 'accident'
'accidentally' 'accompanied' 'accompany' 'accomplish' 'accomplished'
'accomplishment' 'accordance' 'accorded' 'according' 'accordingly'
'account' 'accounted' 'accumulated' 'accumulation' 'accuracy' 'accurate'
'accursed' 'accusation' 'accuse' 'accused' 'accuses' 'accustomed'
'achieve' 'achieved' 'achievement' 'aching' 'acknowledged' 'acorn'
'acquaintance' 'acquainted' 'acquiesced' 'acquire' 'acquired'
'acquirement' 'acquiring' 'acquisition' 'acquit' 'acquittal.' 'acquitted'
'acquitted.' 'across' 'act' 'acted' 'acting' 'action' 'active' 'activity'
'actor' 'actual' 'actually' 'actuated' 'act-i' 'acuteness' 'adam' 'adapt'
'add' 'added' 'addition' 'additional' 'address']
```

```
In [41]: # Exercise 2.3: Zipf's law.
        """ Use the top-20 books from Project Gutenberg to examine whether Zipf's
        (a) Compute a plot of the frequencies of all words in the vocabulary (= c
        divided by the total count of all words together), sorted by frequency. R

import matplotlib.pyplot as plt
from nltk.probability import FreqDist

freq_dist = FreqDist(vocabulary[200:230])
sorted_freq = sorted(freq_dist.items(), key=lambda item: item[1], reverse

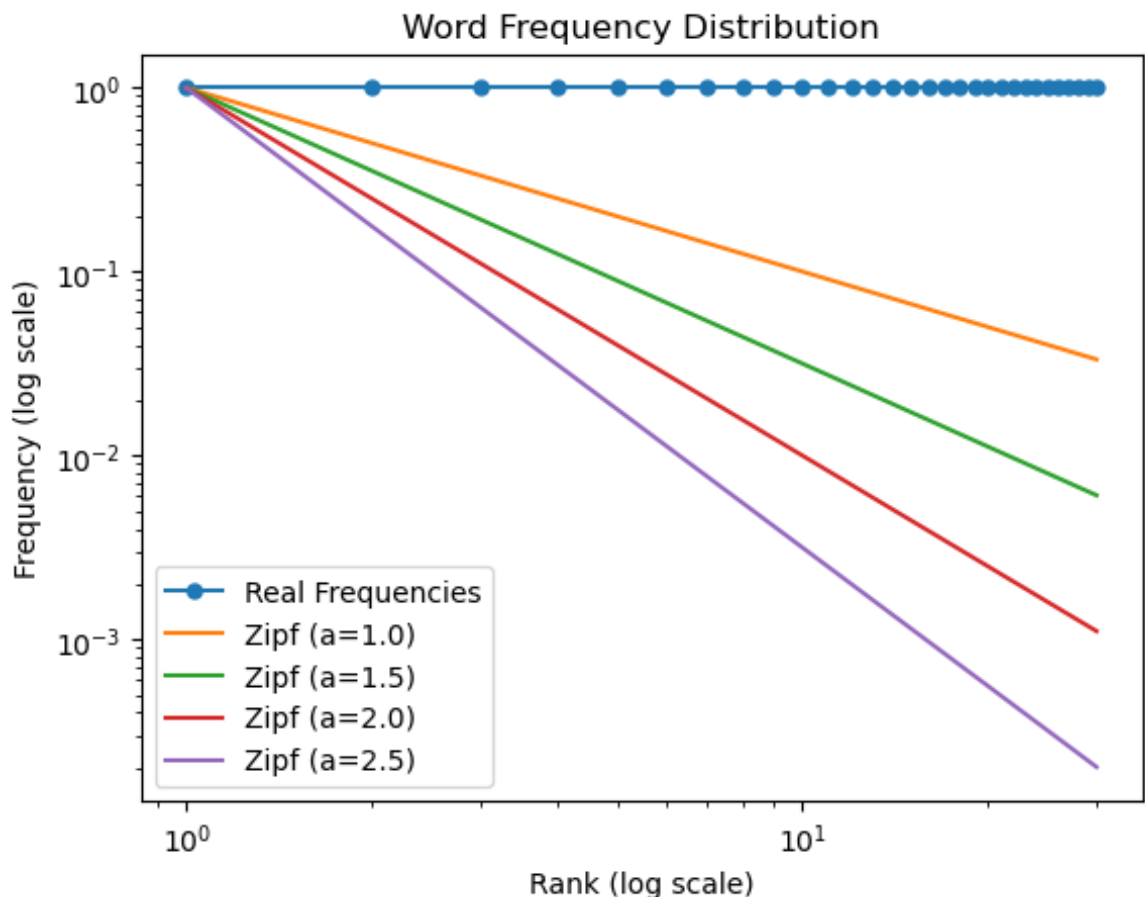
# Create a plot
plt.figure(figsize=(10, 5))
freq_dist.plot(30, cumulative=False)
plt.show()
```



```
In [42]: x = np.arange(1, len(sorted_freq) + 1)
        y_real = [freq for word, freq in sorted_freq]
        plt.plot(x, y_real, label="Real Frequencies", marker='o', markersize=5)
```

```
# Try different values of the exponent 'a'
for a in [1.0, 1.5, 2.0, 2.5]:
    y_zipf = [1 / (rank ** a) for rank in x]
    plt.plot(x, y_zipf, label=f'Zipf (a={a})')

plt.yscale('log')
plt.xscale('log')
plt.xlabel('Rank (log scale)')
plt.ylabel('Frequency (log scale)')
plt.legend()
plt.title("Word Frequency Distribution")
plt.show()
```



Exercise 2.4: Why is Zipf's law important? The lectures introduced Zipf's law, but why is it important? (a) Ask an AI chatbot what the importance of Zipf's law is; report what chatbot you used, your query, and the chatbot's answer. (If you use several queries and answers, report them all.)

(b) Improve the chatbot's answer - rewrite it to add more insights. Try to provide at least three more insights that Zipf's law could provide. Report your modified answer with the modified parts of text highlighted.

2. a) In short, Zipf's law is important because it provides a mathematical model for the uneven distribution of elements in various datasets, from word frequencies in language to income distribution in economics. It's used in linguistics, information theory, data analysis, recommendation systems, and more to understand and model real-world phenomena with unequal distributions.

From <https://chat.openai.com/>

b)

1. It gives an mathematical model of word distribution and frequencies.
2. In addition, this laws also applicable in population size, city size, birth rate, death, online usage and many more