# **N\_Gram Analysis of Oz**

In this project we will use the spacy and sklearn libraries to do some n\_gram analysis of The Stories of Oz from project gutenburg. The start of this text is kept in a pickle file and will need to be extracted. Prior to starting this analysis the libraries and english core word library from spacy are installed.

The code, along with the files necessary and versions of packages in this instance can be found on this repo: <a href="https://github.com/Benjamin-Siebold/MSDS-682-Text-Analytics">https://github.com/Benjamin-Siebold/MSDS-682-Text-Analytics</a>)

```
In [9]: import spacy
import nltk
nlp = spacy.load('en_core_web_lg')
from wordcloud import WordCloud
from PIL import Image

import pandas as pd
import numpy as np
import pickle
import matplotlib.pyplot as plt
from sklearn.feature_extraction.text import CountVectorizer
```

## 1 Import functions and text

The first step in this analysis is to create the definitions and import the text necessary for analysis. Additionally, the text will need to be cleaned for POS tagging. For this, we will only look at numbers or words and remove punctuation from our analysis

```
In [11]: woo = []
with open('C:\\Users\\bsieb\\Documents\\GitHub\\MSDS-682-Text-Analytics\\We
woo.append(pickle.load(oz))

In [12]: oz = [sentence for chapter in woo for sentence in chapter]

In [13]: oz_text = ' '.join(oz)

In [40]: nlp_oz = nlp(oz_text)

In [41]: words = []
pos = []
for word in nlp_oz:
    if word.is_alpha or word.is_digit:
        words.append(word.lower_)
        pos.append(word.pos_)
    oz_df = pd.DataFrame({'word':words, 'pos':pos})
```

```
In [37]: oz_df
```

_			- ~		-	
<i>ر</i> ،	11:	- 1	1 4	_ /	- 1	
v	u		ı	•	- 1	

	word	pos
0	in	ADP
1	the	DET
2	splendid	ADJ
3	palace	NOUN
4	of	ADP
5	the	DET
6	emerald	PROPN
7	city	PROPN
8	which	PRON
9	is	AUX
10	in	ADP

```
In [38]: oz_df['pos'].value_counts()
```

```
Out[38]: NOUN
                   1717
         VERB
                   1593
         DET
                   1331
         PRON
                   1265
         ADP
                   1066
         ADV
                    778
         ADJ
                    764
         AUX
                    665
         PROPN
                    659
         CCONJ
                    567
         PART
                    249
          SCONJ
                    245
         NUM
                     81
                     21
          INTJ
         Х
```

Name: pos, dtype: int64

1

```
In [30]: | oz_df.groupby('word')['pos'].value_counts()#.sort values(by='word')
Out[30]: word
                         pos
                                   284
          а
                         DET
                         ADV
                                     1
                                     2
          able
                         ADJ
          aboard
                         ADP
                                     1
                         ADV
                                     1
          abounded
                         VERB
                                     1
          about.
                                     5
                         ADP
                                     3
                         ADV
                         ADJ
                                     1
          above
                         ADP
                                     1
                         ADV
                                     1
          accident
                         NOUN
                                     2
          accidentally
                         ADV
                                     1
          accompany
                         VERB
                                     1
          accomplish
                         VERB
                                     2
          accomplished
                                     1
                         VERB
                                     1
          accustomed
                         VERB
          across
                         ADP
                                     7
```

## 2 - Apply N\_Gram counts for 2, 3 and 4 ngrams

Next, we will use the sklearn package to look at n\_gram analysis of the oz text. We will create n\_grams for 2, 3, and 4 grams, in addition to this, word clouds for each gram will be built, along with Zipfs Plots for each gram

```
In [83]: vectorizer_2 = CountVectorizer(ngram_range = (2,2))
    vectorizer_3 = CountVectorizer(ngram_range = (3,3))
    vectorizer_4 = CountVectorizer(ngram_range = (4,4))

In [62]: ngram_2_counts = vectorizer_2.fit_transform([oz_text])
    oz_2_counts = np.array(ngram_2_counts.todense()).flatten()
    ngrams_2 = vectorizer_2.vocabulary_

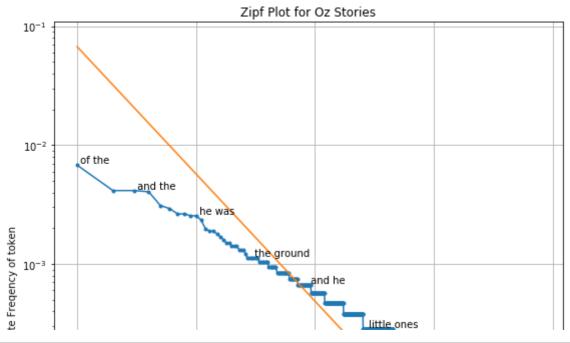
In [89]: oz_2_counts

Out[89]: array([1, 1, 1, ..., 1, 1], dtype=int64)
```

```
In [131]: ngrams 2
Out[131]: {'in the': 3087,
            'the splendid': 6102,
           'splendid palace': 5517,
           'palace of': 4553,
           'of the': 4255,
           'the emerald': 5935,
           'emerald city': 1774,
           'city which': 1267,
           'which is': 7349,
           'is in': 3182,
           'the center': 5892,
           'center of': 1223,
           'the fairy': 5942,
           'fairy land': 1893,
           'land of': 3430,
           'of oz': 4235,
           'oz is': 4493,
           'is great': 3180,
           'great throne': 2372,
In [75]: freq dict 2 = {}
          for v, i in vectorizer_2.vocabulary_.items():
              freq_dict_2[v] = oz_2_counts[i]
In [107]: from scipy.stats import zipf
          counts 2 = np.array(list(freq dict 2.values()))
          tokens 2 = list(freq dict 2.keys())
          ranks 2 = np.arange(1, len(counts) +1)
          indices 2 = np.argsort(-counts)
          frequency_2 = counts[indices]
          normalized_frequencies_2 = counts[indices] / sum(counts)
```

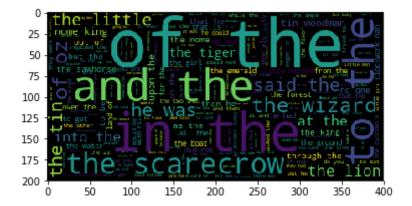
```
from collections import OrderedDict
          sorted_dict_2 = OrderedDict(sorted(freq_dict_2.items(), key=lambda kv: kv[1
          sorted_dict_2
Out[128]: OrderedDict([('of the', 72),
                        ('in the', 44),
                        ('and the', 44),
                        ('to the', 43),
                        ('the scarecrow', 33),
                        ('the wizard', 31),
                        ('of oz', 28),
                        ('said the', 28),
                        ('the tin', 27),
                        ('he was', 27),
                        ('the little', 25),
                        ('the lion', 21),
                        ('into the', 20),
                        ('at the', 20),
                        ('the tiger', 19),
                        ('tin woodman', 18),
                        ('nome king', 17),
                        ('upon the', 16),
                         ('the sawhorse', 16),
```

From the above, there are a few 2 ngrams that aren't very benificial to help with what is being talked about. The top 4 are all multiple stop words in succession. After that, however; combinations such as "nome king" and "little wizard" let us get some insight to the types of characters in the book. Additionally, we can see many of the character involved in the stories, from "the tiger" to "the lion".



```
In [76]: wc = WordCloud()
   plt.imshow(wc.generate_from_frequencies(freq_dict_2))
```

Out[76]: <matplotlib.image.AxesImage at 0x212077d2da0>



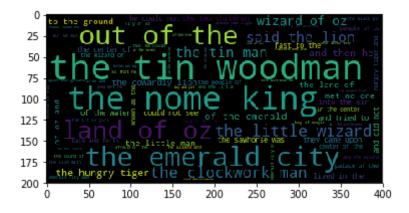
#### 3 Grams

```
In [64]: ngram 3 counts = vectorizer 3.fit transform([oz_text])
          oz_3_counts = np.array(ngram_3_counts.todense()).flatten()
          ngrams 3 = vectorizer 3.vocabulary
 In [65]: ngrams 3
Out[65]: {'in the splendid': 3849,
            'the splendid palace': 7779,
           'splendid palace of': 6873,
           'palace of the': 5767,
           'of the emerald': 5344,
           'the emerald city': 7408,
           'emerald city which': 2236,
           'city which is': 1658,
           'which is in': 9534,
           'is in the': 3986,
           'in the center': 3826,
           'the center of': 7348,
           'center of the': 1607,
           'of the fairy': 5345,
           'the fairy land': 7415,
           'fairy land of': 2364,
           'land of oz': 4291,
           'of oz is': 5293,
           'oz is great': 5698,
 In [77]: freq_dict_3 = {}
          for v, i in vectorizer 3.vocabulary .items():
              freq_dict_3[v] = oz_3_counts[i]
In [134]: sorted dict 3 = OrderedDict(sorted(freq dict 3.items(), key=lambda kv: kv[1
          sorted dict 3
Out[134]: OrderedDict([('the tin woodman', 18),
                        ('the nome king', 15),
                        ('the emerald city', 10),
                        ('out of the', 10),
                        ('land of oz', 9),
                        ('the little wizard', 9),
                        ('the clockwork man', 8),
                        ('said the lion', 8),
                        ('the tin man', 7),
                        ('wizard of oz', 6),
                        ('the hungry tiger', 6),
                        ('and then he', 6),
                        ('of the emerald', 5),
                        ('the cowardly lion', 5),
                        ('of oz and', 5),
                        ('met no one', 5),
                        ('the little man', 5),
                        ('the land of', 5),
                        ('to the ground', 5),
```

The 3 gram frequency distribution does show some interesting bits about the text. One, there are many instances of an adjective following a noun in the top appearances. Another interesting piece is the top occurance of the two gram doesn't occur until the third in the 3 gram.

```
In [78]: wc = WordCloud()
plt.imshow(wc.generate_from_frequencies(freq_dict_3))
```

Out[78]: <matplotlib.image.AxesImage at 0x21216ffa0f0>



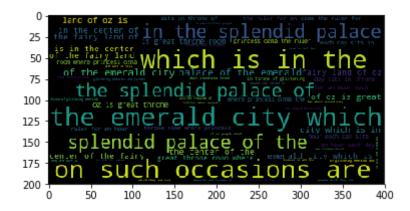
### 4 Grams

```
In [84]: ngram 4 counts = vectorizer 4.fit transform([oz text])
         oz 4 counts = np.array(ngram 3 counts.todense()).flatten()
         ngrams 4 = vectorizer 4.vocabulary
In [85]: ngrams 4
Out[85]: {'in the splendid palace': 3979,
           'the splendid palace of': 8115,
           'splendid palace of the': 7117,
           'palace of the emerald': 5981,
           'of the emerald city': 5525,
          'the emerald city which': 7682,
           'emerald city which is': 2324,
           'city which is in': 1735,
          'which is in the': 9950,
          'is in the center': 4122,
          'in the center of': 3955,
          'the center of the': 7605,
           'center of the fairy': 1681,
          'of the fairy land': 5526,
          'the fairy land of': 7690,
          'fairy land of oz': 2455,
          'land of oz is': 4441,
           'of oz is great': 5473,
           'oz is great throne': 5909,
```

```
In [86]: freq dict 4 = {}
          for v, i in vectorizer_4.vocabulary_.items():
              freq_dict_4[v] = oz_4_counts[i]
          IndexError
                                                     Traceback (most recent call las
          t)
          <ipython-input-86-c1c947408d24> in <module>
                1 freq_dict_4 = {}
                2 for v, i in vectorizer_4.vocabulary_.items():
                      freq dict_4[v] = oz_4_counts[i]
          IndexError: index 10256 is out of bounds for axis 0 with size 10080
In [138]: sorted dict 4 = OrderedDict(sorted(freq dict 4.items(), key=lambda kv: kv[1
          sorted_dict_4
                        ('palace of the emerald', 1),
                        ('of the emerald city', 1),
                        ('emerald city which is', 1),
                        ('city which is in', 1),
                        ('is in the center', 1),
                        ('in the center of', 1),
                        ('the center of the', 1),
                        ('center of the fairy', 1),
                        ('of the fairy land', 1),
                        ('the fairy land of', 1),
                        ('fairy land of oz', 1),
                        ('land of oz is', 1),
                        ('of oz is great', 1),
                        ('oz is great throne', 1),
                        ('is great throne room', 1),
                        ('great throne room where', 1),
                        ('throne room where princess', 1),
                        ('room where princess ozma', 1),
                        ('where princess ozma the', 1),
                        ('princess ozma the ruler', 1),
```

```
In [87]: wc = WordCloud()
plt.imshow(wc.generate_from_frequencies(freq_dict_4))
```

Out[87]: <matplotlib.image.AxesImage at 0x2120106de48>



From above, it can be seen that a 4 gram analysis does not provide very much value. BEcause the most amount of times a gram appears is 2, it does not provide a whole lot of benefit to what is appearing the most. The 3 gram analysis does give some insight to word combinations.