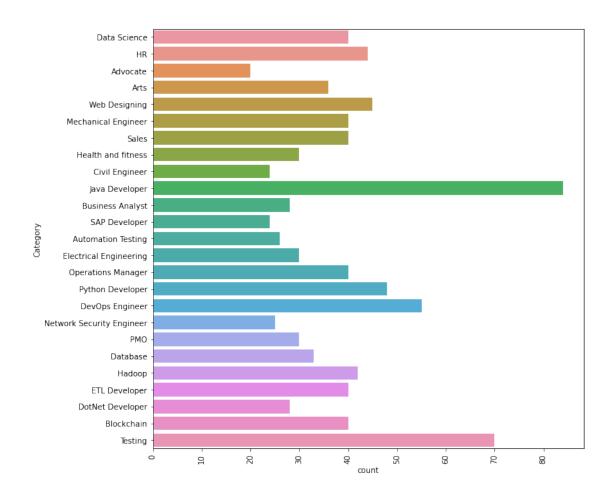
Resume Cleaning using NLP Techniques

```
Neccessary Imports
import numpy as np
import pandas as pd
import re
import nltk
from nltk.corpus import stopwords
import string
from wordcloud import WordCloud
import seaborn as sns
import matplotlib.pyplot as plt
%matplotlib inline
nltk.download('wordnet')
[nltk data] Downloading package wordnet to
[nltk data]
                C:\Users\hp\AppData\Roaming\nltk data...
              Package wordnet is already up-to-date!
[nltk data]
True
Importing the dataset
df = pd.read csv(r'Resume Data.csv', encoding = 'utf-8')
df['Cleaned Resume'] = ''
Exploratory Data Analysis
df.head()
       Category
                                                             Resume \
  Data Science Skills * Programming Languages: Python (pandas...
1 Data Science Education Details \r\nMay 2013 to May 2017 B.E...
2 Data Science Areas of Interest Deep Learning, Control Syste...
3 Data Science Skills â(¢ R â(¢ Python â(¢ SAP HANA â(¢ Table...
4 Data Science Education Details \r\n MCA YMCAUST, Faridab...
  Cleaned Resume
0
1
2
3
print("Resume Categories")
print(df['Category'].value counts())
Resume Categories
Java Developer
                             84
Testing
                             70
```

```
DevOps Engineer
                              55
Python Developer
                              48
Web Designing
                              45
HR
                              44
Hadoop
                              42
Data Science
                              40
                              40
Blockchain
ETL Developer
                              40
Operations Manager
                              40
Mechanical Engineer
                              40
Sales
                              40
Arts
                              36
                              33
Database
Electrical Engineering
                              30
PM0
                              30
Health and fitness
                              30
                              28
DotNet Developer
Business Analyst
                              28
Automation Testing
                              26
Network Security Engineer
                              25
Civil Engineer
                              24
                              24
SAP Developer
Advocate
                              20
Name: Category, dtype: int64
Visualizing types of people who have given the resume
plt.figure(figsize = (10, 10))
# Setting size of plot
plt.xticks(rotation = 90)
# Rotating plot to organize horizontally
sns.countplot(y = 'Category', data = df)
# Deciding which column of Dataframe will the source for plot
<AxesSubplot:xlabel='count', ylabel='Category'>
```

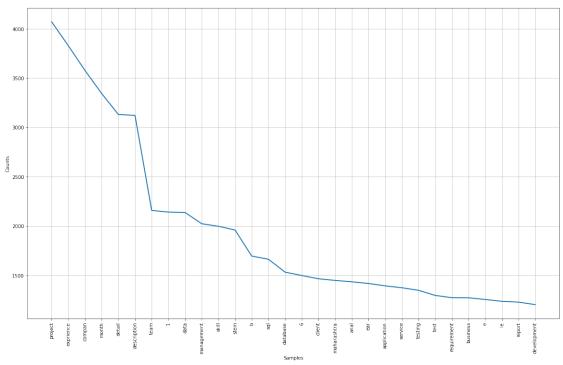


Data Cleaning

```
def Clean_Resume(resumeText):
    Removals = [
# Deciding weeds in resume
        'http\S+\s*',
# Web URLs
        'RT|cc',
# Regular characters
        '#\S+',
# Hashtags
         '@\S+'
# Emails
        '\s+'
    ]
    for weed in Removals: resumeText = re.sub(weed, ' ', resumeText)
# Removing weeds using regular expression
    resumeText = re.sub('[%s]'%re.escape("""!"#$%&'_=-+()[];:,./?
^*@{}|\~"""), ' ', resumeText)
    resumeText = re.sub(r'[^x00-x7f]', r' ', resumeText)
    return resumeText
```

```
df['Cleaned Resume'] = df.Resume.apply(lambda x: Clean Resume(x))
df.head()
       Category
                                                            Resume
                                                                   \
  Data Science Skills * Programming Languages: Python (pandas...
1
  Data Science Education Details \r\nMay 2013 to May 2017 B.E...
  Data Science Areas of Interest Deep Learning, Control Syste...
  Data Science Skills â(¢ R â(¢ Python â(¢ SAP HANA â(¢ Table...
4 Data Science Education Details \r\n MCA YMCAUST, Faridab...
                                      Cleaned Resume
  Skills
            Programming Languages P thon pandas...
1 Education Details Ma 2013 to Ma 2017 B E UIT...
  Areas of Interest Deep Learning Control S ste...
3 Skills
                               SAP HANA
                    P thon
                                           Table...
4 Education Details MCA YMCAUST Faridabad Har ...
corpus = ''
for i in range(len(df)): corpus += df['Cleaned Resume'][i]
corpus [450:1000]
'ticSearch D3 js DC js Plotl
                                kibana
                                        matplotlib ggplot Tableau
Others Regular Expression HTML CSS Angular 6 Logstash Kafka P
                                           Open CV and understanding
thon Flask Git Docker computer vision
of Deep learning Education Details Data Science Assurance Associate
Data Science Assurance Associate
                                  Ernst Young LLP Skill Details
JAVASCRIPT Exprience
                        24 months iOuer
                                         Exprience
                                                      24 months P thon
            24 monthsCompan Details compan
Exprience
                                              Ernst
                                                       Young LLP
             Fraud Investigations and Dispute Services Assurance TEC'
description
Creating the Tokenizer and Tokenizing
tokenizer = nltk.tokenize.RegexpTokenizer('\w+')
tokens = tokenizer.tokenize(corpus)
# Tokenizing the text into individual words
words = [word.lower() for word in tokens]
# Transforming all words to lowercase
print(len(words))
423116
Fetching English Stop Words
stopwords = nltk.corpus.stopwords.words('english')
Removing Stop words
words new = [
   word
    for word in words
   if word not in stopwords
1
```

```
len(words new)
326374
Lemmatization
from nltk.stem import WordNetLemmatizer
wnl = WordNetLemmatizer()
lem words = [
    wnl.lemmatize(word)
    for word in words new
]
same=0
diff=0
for i in range(0,1832):
    if(lem_words[i] == words_new[i]):
        same=same+1
    elif(lem words[i]!=words new[i]):
        diff=diff+1
print('Number of words Lemmatized=', diff)
print('Number of words not Lemmatized=', same)
Number of words Lemmatized= 311
Number of words not Lemmatized= 1521
freq dist = nltk.FreqDist(lem_words)
plt.subplots(figsize=(20,12))
freq dist.plot(30)
```



```
<AxesSubplot:xlabel='Samples', ylabel='Counts'>
mostcommon = freq dist.most common(50)
mostcommon
[('project', 4071),
 ('exprience', 3829),
 ('compan', 3578),
 ('month', 3344), ('detail', 3132),
 ('description', 3122),
 ('team', 2159),
 ('1', 2142),
 ('data', 2138),
 ('management', 2024),
 ('skill', 1998),
 ('stem', 1960),
 ('b', 1696),
 ('sql', 1664),
 ('database', 1533),
 ('6', 1499),
 ('client', 1466),
 ('maharashtra', 1449),
 ('anal', 1435),
('ear', 1418),
 ('application', 1394),
 ('service', 1375),
('testing', 1349),
 ('test', 1297),
('requirement', 1274),
 ('business', 1273),
 ('e', 1256),
 ('le', 1237),
 ('report', 1229),
 ('development', 1204),
 ('server', 1196),
 ('developer', 1194),
 ('customer', 1178),
 ('ltd', 1177),
 ('process', 1163),
 ('using', 1124),
 ('c', 1088),
 ('januar', 1086),
('java', 1076),
 ('engineering', 1055),
 ('work', 1038),
 ('pune', 1026),
 ('role', 969),
('ing', 925),
('user', 916),
 ('operation', 895),
```

```
('software', 886),
 ('pvt', 879),
 ('responsibility', 866),
 ('sale', 845)]
res=' '.join([i for i in lem_words if not i.isdigit()])
import os
os.system('pip install wordcloud')
0
plt.subplots(figsize=(16,10))
wordcloud = WordCloud(
                           background_color='black',
                           max words=\overline{200},
                           width=1400,
                           height=1200
                          ).generate(res)
plt.imshow(wordcloud)
plt.title('Resume Text WordCloud (100 Words)')
plt.axis('off')
plt.show()
```



df

	(Category	
Resume \			
0	Data	Science	Skills * Programming Languages: Python (pandas
1	Data	Science	Education Details \r\nMay 2013 to May 2017 B.E
2	Data	Science	Areas of Interest Deep Learning, Control Syste
3 4			Skills $\hat{a}(\varphi R \hat{a}(\varphi Python \hat{a}(\varphi SAP HANA \hat{a}(\varphi Table Education Details \r\n MCA YMCAUST, Faridab$
			•••
957		Testing	Computer Skills: â(¢ Proficient in MS office (
958		Testing	â $□$ Willingness to accept the challenges. â $□$
959		Testing	PERSONAL SKILLS â(¢ Quick learner, â(¢ Eagerne

```
Testing COMPUTER SKILLS & SOFTWARE KNOWLEDGE MS-Power ...
960
961
         Testing Skill Set OS Windows XP/7/8/8.1/10 Database MY...
                                       Cleaned Resume
0
    Skills
             Programming Languages P thon pandas...
    Education Details Ma 2013 to Ma 2017 B E UIT...
1
2
    Areas of Interest Deep Learning Control S ste...
3
    Skills
               R
                     P thon
                                SAP HANA
                                             Table...
    Education Details MCA YMCAUST Faridabad Har ...
4
957
    Computer Skills
                         Proficient in MS office
958
        Willingness to a ept the challenges
959
    PERSONAL SKILLS
                        Quick learner
                                           Eagerne...
                      SOFTWARE KNOWLEDGE MS Power ...
960
    COMPUTER SKILLS
    Skill Set OS Windows XP 7 8 8 1 10 Database MY...
961
[962 rows x 3 columns]
```