```
In [1]: #pip install spaCy
        Collecting spaCv
          Downloading spacy-3.4.3-cp39-cp39-win_amd64.whl (11.9 MB)
        Collecting catalogue<2.1.0,>=2.0.6
          Downloading catalogue-2.0.8-py3-none-any.whl (17 kB)
        Requirement already satisfied: tqdm<5.0.0,>=4.38.0 in c:\users\asus\anaconda3\lib\site-packages (from spaCy) (4.62.3)
        Requirement already satisfied: numpy>=1.15.0 in c:\users\asus\anaconda3\lib\site-packages (from spaCy) (1.20.3)
        Requirement already satisfied: packaging>=20.0 in c:\users\asus\anaconda3\lib\site-packages (from spaCy) (21.3)Note: you may ne
        ed to restart the kernel to use updated packages.
        Collecting wasabi<1.1.0,>=0.9.1
          Downloading wasabi-0.10.1-py3-none-any.whl (26 kB)
        Requirement already satisfied: setuptools in c:\users\asus\anaconda3\lib\site-packages (from spaCy) (58.0.4)
        Collecting langcodes<4.0.0,>=3.2.0
          Downloading langcodes-3.3.0-py3-none-any.whl (181 kB)
        Requirement already satisfied: jinja2 in c:\users\asus\anaconda3\lib\site-packages (from spaCy) (2.11.3)
        Collecting preshed<3.1.0,>=3.0.2
          Downloading preshed-3.0.8-cp39-cp39-win_amd64.whl (96 kB)
        Collecting typer<0.8.0,>=0.3.0
          Downloading typer-0.7.0-py3-none-any.whl (38 kB)
        Collecting spacy-legacy<3.1.0,>=3.0.10
          Downloading spacy_legacy-3.0.10-py2.py3-none-any.whl (21 kB)
        Collecting thinc<8.2.0,>=8.1.0
          Downloading thinc-8.1.5-cp39-cp39-win_amd64.whl (1.3 MB)
        Collecting srsly<3.0.0,>=2.4.3
          Downloading srsly-2.4.5-cp39-cp39-win_amd64.whl (481 kB)
        Collecting murmurhash<1.1.0,>=0.28.0
          Downloading murmurhash-1.0.9-cp39-cp39-win amd64.whl (18 kB)
        Collecting spacy-loggers<2.0.0,>=1.0.0
          Downloading spacy_loggers-1.0.3-py3-none-any.whl (9.3 kB)
        Collecting cymem<2.1.0,>=2.0.2
          Downloading cymem-2.0.7-cp39-cp39-win_amd64.whl (30 kB)
        Requirement already satisfied: requests 3.0.0, >= 2.13.0 in c:\users\asus\anaconda3\lib\site-packages (from spaCy) (2.26.0)
        Collecting pathy>=0.3.5
          Downloading pathy-0.8.1-py3-none-any.whl (46 kB)
        Collecting pydantic!=1.8,!=1.8.1,<1.11.0,>=1.7.4
          Downloading pydantic-1.10.2-cp39-cp39-win amd64.whl (2.1 MB)
        Requirement already satisfied: pyparsing!=3.0.5,>=2.0.2 in c:\users\asus\anaconda3\lib\site-packages (from packaging>=20.0->spa
        Cy) (3.0.4)
        Collecting smart-open<6.0.0,>=5.2.1
          Downloading smart_open-5.2.1-py3-none-any.whl (58 kB)
        Requirement already satisfied: typing-extensions>=4.1.0 in c:\users\asus\anaconda3\lib\site-packages (from pydantic!=1.8,!=1.8.
        1,<1.11.0,>=1.7.4->spaCy) (4.3.0)
        Requirement already satisfied: idna<4,>=2.5 in c:\users\asus\anaconda3\lib\site-packages (from requests<3.0.0,>=2.13.0->spaCy)
        Requirement already satisfied: urllib3<1.27,>=1.21.1 in c:\users\asus\anaconda3\lib\site-packages (from requests<3.0.0,>=2.13.0
        ->spaCy) (1.26.7)
        Requirement already satisfied: certifi>=2017.4.17 in c:\users\asus\anaconda3\lib\site-packages (from requests<3.0.0,>=2.13.0->s
        paCy) (2022.9.24)
        Requirement already satisfied: charset-normalizer~=2.0.0 in c:\users\asus\anaconda3\lib\site-packages (from requests<3.0.0,>=2.
        13.0->spaCy) (2.0.4)
        Collecting confection<1.0.0,>=0.0.1
          Downloading confection-0.0.3-py3-none-any.whl (32 kB)
        Collecting blis<0.8.0,>=0.7.8
          Downloading blis-0.7.9-cp39-cp39-win amd64.whl (7.0 MB)
        Requirement already satisfied: colorama in c:\users\aus\anaconda3\lib\site-packages (from tqdm<5.0.0,>=4.38.0->spaCy) (0.4.4)
        Requirement already satisfied: click<9.0.0,>=7.1.1 in c:\users\asus\anaconda3\lib\site-packages (from typer<0.8.0,>=0.3.0->spaC
        Requirement already satisfied: MarkupSafe>=0.23 in c:\users\asus\anaconda3\lib\site-packages (from jinja2->spaCy) (1.1.1)
        Installing collected packages: catalogue, srsly, pydantic, murmurhash, cymem, wasabi, typer, smart-open, preshed, confection, b
        lis, thinc, spacy-loggers, spacy-legacy, pathy, langcodes, spaCy
        Successfully installed blis-0.7.9 catalogue-2.0.8 confection-0.0.3 cymem-2.0.7 langcodes-3.3.0 murmurhash-1.0.9 pathy-0.8.1 pre
        shed-3.0.8 pydantic-1.10.2 smart-open-5.2.1 spaCy-3.4.3 spacy-legacy-3.0.10 spacy-loggers-1.0.3 srsly-2.4.5 thinc-8.1.5 typer-
        0.7.0 wasabi-0.10.1
In [3]: import nltk
        import numpy as np
        import pandas as pd
        import matplotlib.pyplot as plt
        import seaborn as sns
        import re
```

```
import spacy
import string
%matplotlib inline
import warnings
warnings.filterwarnings('ignore')
```

```
In [4]: full_df = pd.read_csv('twcs.csv',nrows = 5000)
          df = full_df[['text']]
          df['text'] = df['text'].astype(str)
          full_df.head()
Out[4]:
              tweet_id author_id inbound
                                                               created at
                                                                                                                    text response_tweet_id in_response_to_tweet_id
                                     False Tue Oct 31 22:10:47 +0000 2017
                     1 sprintcare
                                                                               @115712 I understand. I would like to assist y...
                          115712
                                      True Tue Oct 31 22:11:45 +0000 2017
                                                                              @sprintcare and how do you propose we do that
                                                                                                                                       NaN
                                                                                                                                                                  1.0
                                      True Tue Oct 31 22:08:27 +0000 2017
           2
                          115712
                                                                             @sprintcare I have sent several private messag...
                                                                                                                                                                 4.0
                                     False Tue Oct 31 21:54:49 +0000 2017 @115712 Please send us a Private Message so th...
                                                                                                                                          3
                                                                                                                                                                 5.0
                        sprintcare
                          115712
                                      True Tue Oct 31 21:49:35 +0000 2017
                                                                                                        @sprintcare I did.
                                                                                                                                                                 6.0
```

## **Removal of Punctuations**

In [5]: |df['text\_lower'] = df['text'].str.lower()

```
In [6]:
    df.drop(["text_lower"],axis = 1,inplace = True)
    PUNCT_TO_REMOVE = string.punctuation
    def remove_punctuation(text):
        return text.translate(str.maketrans('','',PUNCT_TO_REMOVE))
    df['text_w/o_punct'] = df['text'].apply(lambda text: remove_punctuation(text))
    df.head()
```

Out[6]:	text		text_w/o_punct	
	0	@115712 I understand. I would like to assist y	115712 I understand I would like to assist you	
	1	@sprintcare and how do you propose we do that	sprintcare and how do you propose we do that	
	2	@sprintcare I have sent several private messag	sprintcare I have sent several private message	
	3	@115712 Please send us a Private Message so th	115712 Please send us a Private Message so tha	
	4	@sprintcare I did.	sprintcare I did	

## Removal of StopWords

```
In [9]: from nltk.corpus import stopwords
", ".join(stopwords.words('english'))
Out[9]: "i, me, my, myself, we, our, ours, ourselves, you, you're, you've, you'll, you'd, your, yours, yourself, yourselves, he, him, h
    is himself she she's her hers herself it it's its itself they them their themselves what which who wh
```

is, himself, she, she's, her, hers, herself, it, it's, its, itself, they, them, their, theirs, themselves, what, which, who, wh om, this, that, that'll, these, those, am, is, are, was, were, be, been, being, have, has, had, having, do, does, did, doing, a, an, the, and, but, if, or, because, as, until, while, of, at, by, for, with, about, against, between, into, through, during, before, after, above, below, to, from, up, down, in, out, on, off, over, under, again, further, then, once, here, there, when, where, why, how, all, any, both, each, few, more, most, other, some, such, no, nor, not, only, own, same, so, than, too, very, s, t, can, will, just, don, don't, should, should've, now, d, ll, m, o, re, ve, y, ain, aren, aren't, couldn, couldn't, didn, d idn't, doesn, doesn't, hadn, hadn't, hasn, hasn't, haven, haven't, isn, isn't, ma, mightn, mightn't, mustn, mustn't, needn, nee dn't, shan, shan't, shouldn, shouldn't, wasn, wasn't, weren, weren't, won, won't, wouldn, wouldn't"

```
In [10]:
stop_words = set(stopwords.words('english'))
def remove_stopwords(text):
    return " ".join([word for word in str(text).split() if word not in stop_words])
df['text_w/o_sw'] = df['text'].apply(lambda text: remove_stopwords(text))
df.head()
```

Out[10]:		text	text_w/o_punct	text_w/o_sw
	0	@115712 I understand. I would like to assist y	115712 I understand I would like to assist you	@115712 I understand. I would like assist you
	1	@sprintcare and how do you propose we do that	sprintcare and how do you propose we do that	@sprintcare propose
	2	@sprintcare I have sent several private messag	sprintcare I have sent several private message	@sprintcare I sent several private messages on
	3	@115712 Please send us a Private Message so th	115712 Please send us a Private Message so tha	@115712 Please send us Private Message assist
	4	@sprintcare I did.	sprintcare I did	@sprintcare I did.

In [ ]:

## **Removal of Frequent Keywords**

```
In [28]: from collections import Counter
            cnt = Counter()
            for text in df['text w/o sw'].values:
                for word in text.split():
                      cnt[word] += 1
            cnt.most_common(10)
Out[28]: [('I', 1431),
             ('us', 658),
             ('DM', 436),
             ('Please', 372),
             ('We', 338),
('get', 277),
('like', 228),
             ('@Tesco', 222),
             ("I'm", 221),
             ('Hi', 218)]
In [31]: freqwords = set(w for (w,wc) in cnt.most_common(10))
            def remove_freqwords(text):
                return " ".join([word for word in str(text).split() if word not in freqwords])
            df['text_w/o_freqwords'] = df['text'].apply(lambda text: remove_freqwords(text))
           df.head()
Out[31]:
                                                                               text_w/o_punct
                                                                                                                         text_w/o_sw
                                                                                                                                                           text_w/o_freqwords
                    @115712 I understand. I would like to
                                                         115712 I understand I would like to assist
                                                                                                @115712 I understand. I would like assist
                                                                                                                                        @115712 understand. would to assist you.
            0
                 @sprintcare and how do you propose we
                                                        sprintcare and how do you propose we do
                                                                                                                                       @sprintcare and how do you propose we do
                                                                                                                  @sprintcare propose
                                               do that
                   @sprintcare I have sent several private
                                                            sprintcare I have sent several private
                                                                                                       @sprintcare I sent several private
                                                                                                                                             @sprintcare have sent several private
                                             messag...
                                                                                   message...
                                                                                                                       messages on...
                                                                                                                                                                   messages...
                       @115712 Please send us a Private
                                                       115712 Please send us a Private Message
                                                                                                       @115712 Please send us Private
                                                                                                                                         @115712 send a Private Message so that
                                       Message so th...
                                                                                      so tha ...
                                                                                                                    Message assist ...
                                                                                                                                                                     we can ...
            4
                                      @sprintcare I did.
                                                                                sprintcare I did
                                                                                                                     @sprintcare I did
                                                                                                                                                               @sprintcare did.
In [43]: rarewords = set(w for (w,wc) in cnt.most_common()[:-11:-1])
            def remove_rarewords(text):
                 return " ".join([word for word in str(text).split() if word not in rarewords])
            df['text_w/o_rarewords'] = df['text'].apply(lambda text: remove_rarewords(text))
            df.head()
Out[43]:
                                                             text w/o punct
                                                                                              text w/o sw
                                                                                                                         text w/o freqwords
                                                                                                                                                           text w/o rarewords
                                        text
                @115712 I understand. I would
                                                                              @115712 I understand. I would
                                                                                                                @115712 understand, would to
                                                                                                                                               @115712 I understand. I would like
                                               115712 I understand I would like
                                                                                           like assist you...
                                                                                                                           assist you. would...
                              like to assist y ...
                                                              to assist you...
                                                                                                                                                                   to assist y...
                  @sprintcare and how do you
                                                    sprintcare and how do you
                                                                                                                   @sprintcare and how do you
                                                                                                                                                     @sprintcare and how do you
                                                                                        @sprintcare propose
                           propose we do that
                                                          propose we do that
                                                                                                                           propose we do that
                                                                                                                                                             propose we do that
                @sprintcare I have sent several
                                                  sprintcare I have sent several
                                                                                   @sprintcare I sent several
                                                                                                                 @sprintcare have sent several
                                                                                                                                                  @sprintcare I have sent several
                             private messag...
                                                           private message...
                                                                                      private messages on...
                                                                                                                          private messages...
                                                                                                                                                              private messag...
                    @115712 Please send us a
                                              115712 Please send us a Private
                                                                                   @115712 Please send us
                                                                                                             @115712 send a Private Message
                                                                                                                                               @115712 Please send us a Private
            3
                       Private Message so th...
                                                                                    Private Message assist ...
                                                            Message so tha...
                                                                                                                             so that we can ...
                                                                                                                                                               Message so th...
                            @sprintcare I did.
                                                              sprintcare I did
                                                                                          @sprintcare I did.
                                                                                                                             @sprintcare did.
                                                                                                                                                              @sprintcare I did.
```