## Sentiment Analysis\_WordCloud

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**@Status: In-Progress** 

#### In [1]:

```
### Import Relevant Libraries
import os
import pandas as pd
import numpy as np
import collections
import datetime as dt
import requests
import json
import re
import time
import matplotlib.pyplot as plt
import matplotlib.cm as cm
import seaborn as sns
from scipy.stats import norm
import string
import re
import nltk
from nltk.util import ngrams
from nltk import pos tag, word tokenize
from nltk.corpus import stopwords
from nltk.tokenize import WhitespaceTokenizer
from nltk.stem import WordNetLemmatizer,PorterStemmer
from wordcloud import WordCloud, STOPWORDS, ImageColorGenerator
from sklearn.ensemble import RandomForestClassifier
from sklearn.preprocessing import StandardScaler
from sklearn import metrics
from sklearn.metrics import accuracy score
from sklearn.metrics import classification report, confusion matrix
from sklearn.feature extraction.text import TfidfVectorizer, CountVectorizer
```

```
In [2]:
```

```
### Build a get date function to convert date format
#### Build a data creation function to read json data into pandas dataframe
def get date(created):
    return dt.datetime.fromtimestamp(created)
def data creation(subreddit) :
    with open('submissions_'+subreddit+'.json') as f:
        data = json.loads("[" +
            f.read().replace("}\n{", "},\n{") +
        "1")
    data =pd.DataFrame(data)
    reddit data = data[['author','over 18','title','selftext','num comments', 's
core', 'full link', 'created utc']]
    reddit data = reddit data.dropna()
    timestamp = reddit data["created utc"].apply(get date)
    reddit data = reddit data.assign(timestamp = timestamp)
    reddit_data['over_18'] = reddit_data['over 18'].astype('str')
    reddit data['subreddit']= subreddit
    reddit data['title with selftext'] = reddit data['title'] + reddit data['self
text']
    # Do one more extra cleaning : keep updating this part
    reddit data=reddit data[~reddit data['title with selftext'].isin([ '[removed
]', '[deleted]',''])]
    subreddit = reddit data
    return subreddit
def empty words clean(text):
    text = text.replace('[removed]','')
    text= text.replace('[deleted]','')
    text= text.replace('\n','')
    return (text)
```

#### In [3]:

```
pd.set_option('display.max_columns', 500)
pd.set_option('display.max_rows', 500)
```

#### In [4]:

```
### Dataframing 4 subreddit Datasets
SuicideWatch_df = data_creation('SuicideWatch')
depressed_df = data_creation('depressed')
happy_df = data_creation('happy')
selfimprovement_df = data_creation('selfimprovement')

### Concat all 4 dataframes into one merged file
all_subreddit_df = pd.concat([SuicideWatch_df,depressed_df,happy_df,selfimprovement_df])
all_subreddit_df.head(2)
```

#### Out[4]:

	author	over_18	title	selftext	num_comments	score	
0	DespressoCafe	False	I don't know where to go or what to do. I can'	Let's make it quick. I'm almost 20. I've been	5	1	https://www.reddit.com/r/
1	LifeisCrumbling	False	I'm having an existencial crisis	If I only helped people either as a defense me	1	1	https://www.reddit.com/r/

#### In [5]:

```
SuicideWatch_df["title_with_selftext_cleaned"] = SuicideWatch_df["title_with_sel
ftext"].apply(lambda x: empty_words_clean(x))
depressed_df["title_with_selftext_cleaned"] = depressed_df["title_with_selftext"
].apply(lambda x: empty_words_clean(x))
happy_df["title_with_selftext_cleaned"] = happy_df["title_with_selftext"].apply(
lambda x: empty_words_clean(x))
selfimprovement_df["title_with_selftext_cleaned"] = selfimprovement_df["title_with_selftext"].apply(lambda x: empty_words_clean(x))
```

# **Sentiment Analysis**

### -Word Cloud

# Word Cloud on most frequent Words/Nouns/Adjectives for each subreddit

• Spot the different topics/terms for each subreddit

#### 1. Suicide Watch

#### In [6]:

```
## All Words
```

#### In [7]:

SuicideWatch\_df.head(2)

#### Out[7]:

	author	over_18	title	selftext	num_comments	score	
0	DespressoCafe	False	I don't know where to go or what to do. I can'	Let's make it quick. I'm almost 20. I've been	5	1	https://www.reddit.com/r/
1	LifeisCrumbling	False	I'm having an existencial crisis	If I only helped people either as a defense me	1	1	https://www.reddit.com/r/

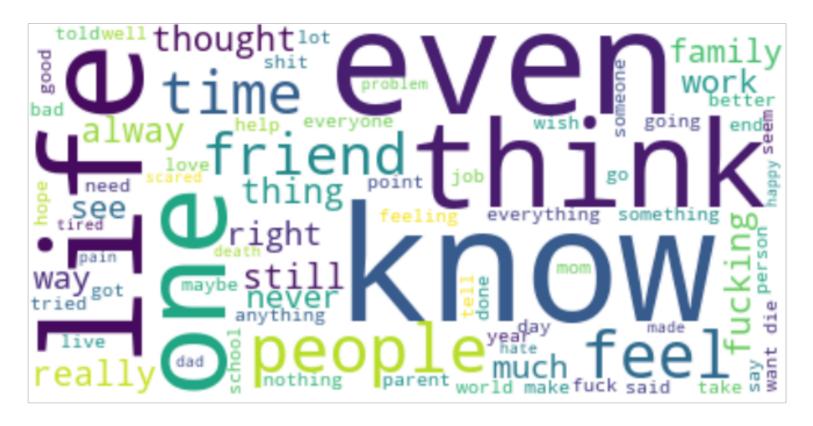
```
In [8]:
```

```
cachedStopWords = set(stopwords.words("english"))
####Keep Updating custom stop words
cachedStopWords.update(('nt', 'wo', 're', 'im', 'yall','u','ca','ive', 'wan','na
','gon','nov','x200b','amp',\
                        'www.youtubecomwatch', 'http', 'vbjkbl5olvm8', 'lt', 'br', '
gt', 'amp', 'tsp', 'tbsp', 'nbsp', 'le'))
def alpha filter(w):
    pattern = re.compile('^[^a-z]+$')
    if (pattern.match(w)):
        return True
    else:
        return False
## ### Because of relatively huge dataset, we need to perform random sampling of
10% for now
sampleSuicideWatch list = SuicideWatch df.sample(frac=0.5, replace=True, random
SuicideWatch list = sampleSuicideWatch list['title with selftext cleaned'].tolis
t()
SuicideWatch list lower = [tok.lower() for i in SuicideWatch list for tok in nlt
k.word tokenize(i)]
nltk stopwords = set(stopwords.words('english'))
SuicideWatch list lower stop = [x for x in SuicideWatch list lower if not x in n
ltk stopwords]
SuicideWatch list lower stop pun = [y for y in SuicideWatch list lower stop if n
ot alpha filter(y)]
SuicideWatch list lower stop pun extra = [''.join(x for x in par if x not in str
ing.punctuation) for par in\
                                          SuicideWatch list lower stop pun]
porter = WordNetLemmatizer()
SuicideWatch list lower stop pun extra lemmatized = []
for a in SuicideWatch list lower stop pun extra:
    SuicideWatch list lower stop pun extra lemmatized.append(porter.lemmatize(a)
)
SuicideWatch list = [x for x in SuicideWatch list lower stop pun extra lemmatize
d if not x in cachedStopWords]
# Combining all the posts in the list to one single element to generate the Word
Cloud
SuicideWatch allWords =(" ").join(SuicideWatch list)
```

#### In [57]:

```
print('SuicideWatch All words WordCloud')
# Generating a word cloud image for a sample of SuicideWatch:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Suicide Watch_allWords)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### SuicideWatch All words WordCloud



#### In [ ]:

```
#Findings:

#pain #tried #shit #fucking #fuck #end #life #hate #die #death #school #help #sc
ared

#positive words mentioned in the negative sense - #good #hope #happy #love #wish

#better #live

#Don't mention a lot about sadness because they have passed that phase.

#The mention of "school" tells us that school students and teens are highly suic
ide driven. Schools need to take

#necessary measures and monitor each students' mental health condition
```

#### In [10]:

# SuicideWatch WordClouds for Nouns and Adjectives

#### In [11]:

```
SuicideWatch_pos = nltk.pos_tag(SuicideWatch_list)
# generate Noun list and adjective
SuicideWatch_NN_list = []
SuicideWatch_AJ_list = []
for i,j in SuicideWatch_pos:
    #print(i)
    if j == 'NN' or j == 'NNS' or j == 'NNP' or j == 'NNPS':
        SuicideWatch_NN_list.append(i)
    elif j == 'JJ' or j == 'JJS' or j == 'JJR':
        SuicideWatch_AJ_list.append(i)
print('There are',len(SuicideWatch_NN_list),'nouns in the list ')
print('There are',len(SuicideWatch_AJ_list),'adjectives in the list')
```

There are 627019 nouns in the list There are 302035 adjectives in the list

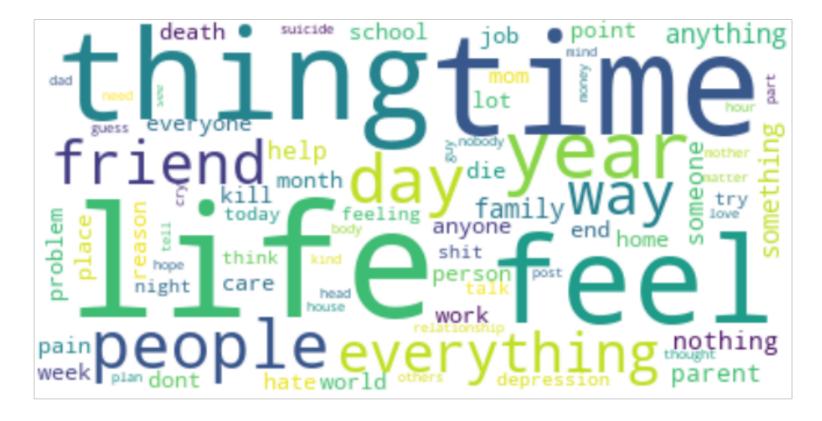
#### In [12]:

```
# Combining all the posts to one single list
SuicideWatch_NN_text = (" ").join(SuicideWatch_NN_list)
```

#### In [53]:

```
print('SuicideWatch WordCloud for Nouns')
# Generating a word cloud image for a sample of SuicideWatch:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Suicide
Watch_NN_text)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### SuicideWatch WordCloud for Nouns



#### In [ ]:

#The presence of the word "dont" explain the presence of positive words mentione d in the negative sense

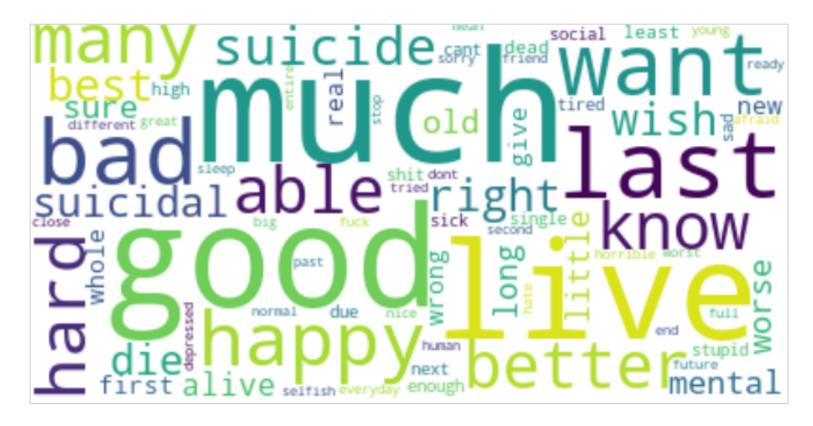
#### In [14]:

```
# Combining all the posts to one single list
SuicideWatch_AJ_text =(" ").join(SuicideWatch_AJ_list)
```

#### In [54]:

```
print('SuicideWatch WordCloud for Adjectives')
# Generating a word cloud image for a sample of SuicideWatch:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Suicide
Watch_AJ_text)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### SuicideWatch WordCloud for Adjectives



#### In [ ]:

#suicide #suicidal #worse #afraid #dead #sick #sad #depressed #bad #wrong #shit #hard #hate #horrible

#The term good is used more than bad but most possibly in the negative way

In [ ]:			
In [ ]:			
In [ ]:			

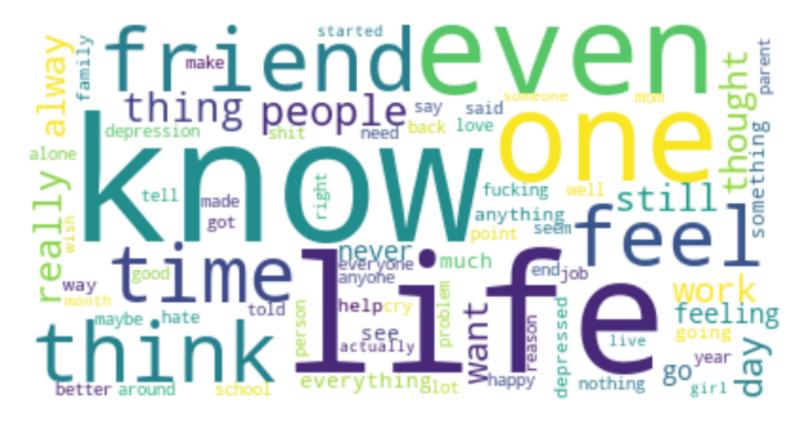
```
In [16]:
```

```
cachedStopWords = set(stopwords.words("english"))
####Keep Updating custom stop words
cachedStopWords.update(('nt', 'wo', 're', 'im', 'yall', 'u', 'ca', 'ive', 'wan', 'na
','gon','nov','x200b','amp',\
                        'wwwyoutubecomwatch', 'http', 'vbjkbl5olvm8', 'lt', 'br', '
gt', 'amp','tsp','tbsp','nbsp', 'le'))
def alpha filter(w):
    pattern = re.compile('^[^a-z]+$')
    if (pattern.match(w)):
        return True
    else:
        return False
## ### Because of relatively huge dataset, we need to perform random sampling of
10% for now
sampleDepression list = depressed df.sample(frac=0.5, replace=True, random state
Depression list = sampleDepression list['title with selftext cleaned'].tolist()
Depression list lower = [tok.lower() for i in Depression list for tok in nltk.wo
rd tokenize(i)]
nltk stopwords = set(stopwords.words('english'))
Depression list lower stop = [x for x in Depression list lower if not x in nltk
stopwords]
Depression list lower stop pun = [y for y in Depression list lower stop if not a
lpha filter(y)]
Depression_list_lower_stop_pun_extra = [''.join(x for x in par if x not in strin
g.punctuation) for par in\
                                          Depression list lower stop pun]
porter = WordNetLemmatizer()
Depression list lower stop pun extra lemmatized = []
for a in Depression list lower stop pun extra:
    Depression_list_lower_stop_pun_extra_lemmatized.append(porter.lemmatize(a))
Depression list = [x for x in Depression list lower stop pun extra lemmatized if
not x in cachedStopWords]
# Combining all the posts in the list to one single element to generate the Word
Cloud
Depression allWords =(" ").join(Depression list)
```

#### In [58]:

```
print('Depression All words WordCloud')
# Generating a word cloud image for a sample of Depression:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Depression_allWords)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### Depression All words WordCloud



#### In [ ]:

```
#friend #family #mom #school #parent #day #month #year #hate #depression
#We see the repetition of terms related to relationships such as friend, parent,
family etc. Are the relationships
#the reason why the person is depressed? Or he/she starts to think about them wh
en they are depressed?
#The term happy is mentioned more than sad but most possibly in the negative sen
se
#Again, they don't talk a lot about sadness because they seem to have passed tha
t phase
```

#### In [18]:

# Depression WordClouds for Nouns and Adjectives

#### In [19]:

```
Depression_pos = nltk.pos_tag(Depression_list)
# generate Noun list and adjective
Depression_NN_list = []
Depression_AJ_list = []
for i,j in Depression_pos:
    #print(i)
    if j == 'NN' or j == 'NNS' or j == 'NNP' or j == 'NNPS':
        Depression_NN_list.append(i)
    elif j == 'JJ' or j == 'JJS' or j == 'JJR':
        Depression_AJ_list.append(i)
print('There are',len(Depression_NN_list),'nouns in the list ')
print('There are',len(Depression_AJ_list),'adjectives in the list')
```

There are 396471 nouns in the list There are 186827 adjectives in the list

#### In [20]:

```
# Combining all the posts to one single list
Depression_NN_text =(" ").join(Depression_NN_list)
```

#### In [61]:

```
print('Depression WordCloud for Nouns')
# Generating a word cloud image for a sample of Depression:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Depression_NN_text)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### Depression WordCloud for Nouns



#### In [ ]:

```
#friend #family #dad #feeling #relationship #home #parent #mom
#cry #anxiety #hate #die #issue #idea
#college #school #job #work
#We say that words in this pool are more expressive compared to that in SuicideW
atch
```

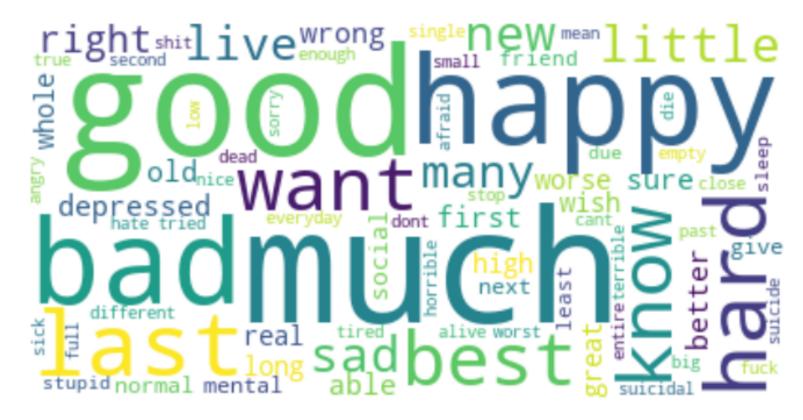
#### In [22]:

```
# Combining all the posts to one single list
Depression_AJ_text =(" ").join(Depression_AJ_list)
```

#### In [60]:

```
print('Depression WordCloud for Adjectives')
# Generating a word cloud image for a sample of SuicideWatch:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Depress
ion_AJ_text)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### Depression WordCloud for Adjectives



#### In [ ]:

In [ ]:

#Ironically, good and happy are the most frequently occuring words. People tend to use them a lot in the negative sense
#We see suicide and suicidal in this pool too indicating that people are in the stage of suicide ideation in this stage

In [ ]:		
In [ ]:		

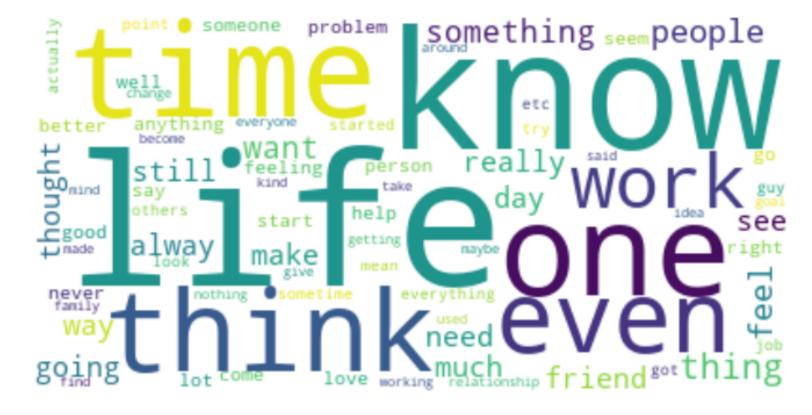
```
In [24]:
```

```
cachedStopWords = set(stopwords.words("english"))
####Keep Updating custom stop words
cachedStopWords.update(('nt', 'wo', 're', 'im', 'yall', 'u', 'ca', 'ive', 'wan', 'na
','gon','nov','x200b','amp',\
                        'wwwyoutubecomwatch', 'http', 'vbjkbl5olvm8', 'lt', 'br', '
gt', 'amp','tsp','tbsp','nbsp', 'le'))
def alpha filter(w):
    pattern = re.compile('^[^a-z]+$')
    if (pattern.match(w)):
        return True
    else:
        return False
## ### Because of relatively huge dataset, we need to perform random sampling of
10% for now
sampleSelfImprovement list = selfimprovement df.sample(frac=0.5, replace=True, r
andom state=1)
SelfImprovement list = sampleSelfImprovement list['title with selftext cleaned']
.tolist()
SelfImprovement list lower = [tok.lower() for i in SelfImprovement list for tok
in nltk.word tokenize(i)]
nltk stopwords = set(stopwords.words('english'))
SelfImprovement list lower stop = [x for x in SelfImprovement list lower if not
x in nltk stopwords]
SelfImprovement list lower stop pun = [y for y in SelfImprovement list lower sto
p if not alpha filter(y)]
SelfImprovement list lower stop pun extra = [''.join(x for x in par if x not in
string.punctuation) for par in\
                                          SelfImprovement list lower stop pun]
porter = WordNetLemmatizer()
SelfImprovement list lower stop pun extra lemmatized = []
for a in SelfImprovement_list_lower_stop_pun_extra :
    SelfImprovement list lower stop pun extra lemmatized.append(porter.lemmatize
(a))
SelfImprovement list = [x for x in SelfImprovement list lower stop pun extra lem
matized if not x in cachedStopWords]
# Combining all the posts in the list to one single element to generate the Word
Cloud
SelfImprovement allWords =(" ").join(SelfImprovement list)
```

#### In [62]:

```
print('SelfImprovement All words WordCloud')
# Generating a word cloud image for a sample of SuicideWatch:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(SelfImp
rovement_allWords)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### SelfImprovement All words WordCloud



#### In [ ]:

#### In [26]:

# Self-Improvement WordClouds for Nouns and Adjectives

#### In [27]:

```
SelfImprovement_pos = nltk.pos_tag(SelfImprovement_list)
# generate Noun list and adjective
SelfImprovement_NN_list = []
SelfImprovement_AJ_list = []
for i,j in SelfImprovement_pos:
    #print(i)
    if j == 'NN' or j == 'NNS' or j == 'NNP' or j == 'NNPS':
        SelfImprovement_NN_list.append(i)
    elif j == 'JJ' or j == 'JJS' or j == 'JJR':
        SelfImprovement_AJ_list.append(i)
print('There are',len(SelfImprovement_NN_list),'nouns in the list ')
print('There are',len(SelfImprovement_AJ_list),'adjectives in the list')
```

There are 851924 nouns in the list There are 405758 adjectives in the list

#### In [28]:

```
# Combining all the posts to one single list
SelfImprovement_NN_text = (" ").join(SelfImprovement_NN_list)
```

#### In [63]:

```
print('SelfImprovement WordCloud for Nouns')
# Generating a word cloud image for a sample of Self-Improvement:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(SelfImp rovement_NN_text)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### SelfImprovement WordCloud for Nouns



#### In [ ]:

#Positive words - #care #advice #change #kind #goal #experience #example #others #world #family #friend #Again, like we saw in Depression, we see relations frequently repeating in this

#### In [ ]:

#### In [30]:

```
# Combining all the posts to one single list
SelfImprovement_AJ_text =(" ").join(SelfImprovement_AJ_list)
```

#### In [64]:

```
print('SelfImprovement WordCloud for Adjectives')
# Generating a word cloud image for a sample of SelfImprovement:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(SelfImp
rovement_AJ_text)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### SelfImprovement WordCloud for Adjectives



#### In [ ]:

#social #good #best #possible #important #successful #confident #positive #healt hy #best #great #better #happy #great #low #difficult #negative #little #anxious #stop #worse #We see a range of positive and words used while being motivated

# In [ ]: In [ ]:

#### In [ ]:

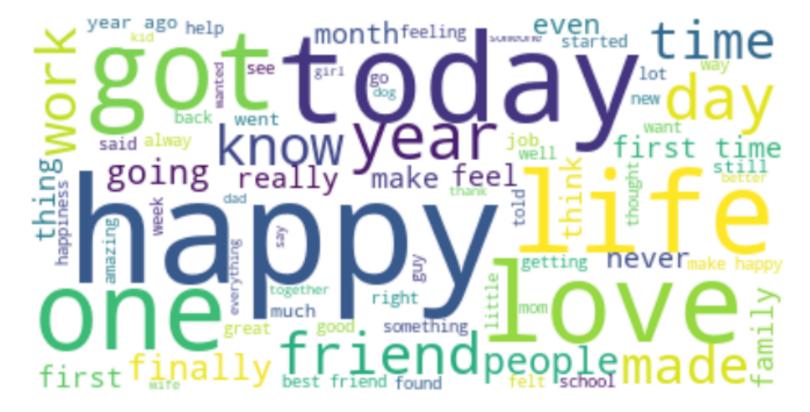
```
In [32]:
```

```
cachedStopWords = set(stopwords.words("english"))
####Keep Updating custom stop words
cachedStopWords.update(('nt', 'wo', 're', 'im', 'yall', 'u', 'ca', 'ive', 'wan', 'na
','gon','nov','x200b','amp',\
                        'wwwyoutubecomwatch', 'http', 'vbjkbl5olvm8', 'lt', 'br', '
gt', 'amp','tsp','tbsp','nbsp', 'le'))
def alpha filter(w):
    pattern = re.compile('^[^a-z]+$')
    if (pattern.match(w)):
        return True
    else:
        return False
## ### Because of relatively huge dataset, we need to perform random sampling of
10% for now
sampleHappy list = happy df.sample(frac=0.5, replace=True, random state=1)
Happy list = sampleHappy list['title with selftext cleaned'].tolist()
Happy list lower = [tok.lower() for i in Happy list for tok in nltk.word tokeniz
e(i)]
nltk stopwords = set(stopwords.words('english'))
Happy list lower stop = [x for x in Happy list lower if not x in nltk stopwords]
Happy list lower stop pun = [y for y in Happy list lower stop if not alpha filte
r(y)
Happy_list_lower_stop_pun_extra = [''.join(x for x in par if x not in string.pun
ctuation) for par in\
                                          Happy list lower stop pun]
porter = WordNetLemmatizer()
Happy list lower stop pun extra lemmatized = []
for a in Happy_list_lower_stop_pun_extra :
    Happy list lower stop pun extra lemmatized.append(porter.lemmatize(a))
Happy list = [x for x in Happy list lower stop pun extra lemmatized if not x in
cachedStopWords]
# Combining all the posts in the list to one single element to generate the Word
Cloud
Happy_allWords =(" ").join(Happy_list)
```

#### In [65]:

```
print('Happy All words WordCloud')
# Generating a word cloud image for a sample of Happy:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Happy_a
llWords)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### Happy All words WordCloud



#### In [ ]:

```
#dad #mom #friend #wife #dog #family #together
#great #good #amazing #happiness #thank #love
#year #week #month
#Things are going great over a period of time
```

#### In [34]:

```
# Happy WordClouds for Nouns and Adjectives
```

#### In [35]:

```
Happy_pos = nltk.pos_tag(Happy_list)
# generate Noun list and adjective
Happy_NN_list = []
Happy_AJ_list = []
for i,j in Happy_pos:
    #print(i)
    if j == 'NN' or j == 'NNS' or j == 'NNP' or j == 'NNPS':
        Happy_NN_list.append(i)
    elif j == 'JJ' or j == 'JJS' or j == 'JJR':
        Happy_AJ_list.append(i)
print('There are',len(Happy_NN_list),'nouns in the list ')
print('There are',len(Happy_AJ_list),'adjectives in the list')
```

There are 178383 nouns in the list There are 86253 adjectives in the list

#### In [36]:

```
# Combining all the posts to one single list
Happy_NN_text = (" ").join(Happy_NN_list)
```

#### In [66]:

```
print('Happy WordCloud for Nouns')
# Generating a word cloud image for a sample of Happy:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Happy_N
N_text)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

#### Happy WordCloud for Nouns



#### In [ ]:

#### In [38]:

```
# Combining all the posts to one single list
Happy_AJ_text =(" ").join(Happy_AJ_list)
```

#### In [67]:

```
print('Happy WordCloud for Adjectives')
# Generating a word cloud image for a sample of SuicideWatch:
wordcloud = WordCloud(background_color="white", max_words = 75).generate(Happy_A
J_text)
# Display the generated image:
# the matplotlib way:
plt.rcParams["figure.figsize"] = (12,6)
plt.imshow(wordcloud, interpolation = 'bilinear')
plt.axis("off")
plt.show()
```

#### Happy WordCloud for Adjectives



#### In [ ]:

#proud #happiest #wonderful #positive #special #lucky #wish #favorite #healthy #
super #awesome #smile #nice #high #perfect
#rough #abusive #bad
#birthday #anniversary