

jupyter quotes (autosaved)

File Edit View Insert Cell Kernel Widgets Help

Not Trusted Python 3

## Assignment 2 - DS4Biz Y63

### TextScraping\_Classification

#### Team Detail

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URL: <https://quotes.toscrape.com/>

```
In [2]: import pandas as pd
```

Requests

```
In [3]: import requests
url = "https://quotes.toscrape.com/"
data = requests.get(url)
print(data.text)
```

```
<!DOCTYPE html>
<html lang="en">
<head>
    <meta charset="UTF-8">
    <title>Quotes to Scrape</title>
    <link rel="stylesheet" href="/static/bootstrap.min.css">
    <link rel="stylesheet" href="/static/main.css">
</head>
<body>
    <div class="container">
        <div class="row header-box">
            <div class="col-md-8">
                <h1>
                    <a href="/" style="text-decoration: none">Quotes to Scrape</a>
                </h1>
            </div>
            <div class="col-md-4">
                <p>
```

Beautiful Soup

```
In [4]: from bs4 import BeautifulSoup
soup = BeautifulSoup(data.text, 'html.parser')
print(soup.prettify())
```

```
<!DOCTYPE html>
<html lang="en">
<head>
    <meta charset="utf-8" />
    <title>Quotes to Scrape</title>
    <link href="/static/bootstrap.min.css" rel="stylesheet"/>
    <link href="/static/main.css" rel="stylesheet"/>
</head>
<body>
    <div class="container">
        <div class="row header-box">
            <div class="col-md-8">
                <h1>
                    <a href="/" style="text-decoration: none">Quotes to Scrape</a>
                </h1>
            </div>
            <div class="col-md-4">
                <p>
```

Finding Tags and Scrape

```
In [5]: url = "http://quotes.toscrape.com/page/%i/" # url format to follow
page = 1 # page numbers for the url
stop = False # parameter to stop our crawl when necessary
lst_page = [] # list to append scraped info to
scrape = []
while stop == False:
    req = requests.get("http://quotes.toscrape.com/page/%i/" % page)
    soup = BeautifulSoup(req.content)
    if soup.find("div", {"class": "quote"}) == None:
        stop = True
    else:
        for quote in soup.find_all("div", {"class": "quote"}):
            d = {} # dictionary for our scraped information
            d['quote'] = quote.find("span", {"class": "text"}).text
            tags = []
            for tag in quote.find_all("a", {"class": "tag"}):
                tags.append(tag.text)
            d['tags'] = tags
            lst_page.append(d)
            scrape.append(d)
    page += 1
```

```
In [6]: lst_page
```

```
Out[6]: [{"quote": "The world as we have created it is a process of our thinking. It cannot be changed without changing our thinking.", "tags": ["change", "deep-thoughts", "thinking", "world"]}, {"quote": "It is our choices, Harry, that show what we truly are, far more than our abilities.", "tags": ["abilities", "choices"]}, {"quote": "There are only two ways to live your life. One is as though nothing is a miracle. The other is as though everything is a miracle.", "tags": ["inspirational", "life", "live", "miracle", "miracles"]}, {"quote": "The person, be it gentleman or lady, who has not pleasure in a good novel, must be intolerably stupid.", "tags": ["aliteracy", "books", "classic", "humor"]}, {"quote": "Imperfection is beauty, madness is genius and it's better to be absolutely ridiculous than absolutely boring.", "tags": ["be-yourself", "inspirational"]}, {"quote": "Try not to become a man of success. Rather become a man of value.", "tags": ["adulthood", "success", "value"]}, {"quote": "It is better to be hated for what you are than to be loved for what you are not.", "tags": ["life", "love"]}, {"quote": "I've had not failed. I've just found 10,000 ways that won't work.", "tags": ["edison", "failure", "inspirational", "paraphrased"]}, {"quote": "A woman is like a tea bag; you never know how strong it is until it's in hot water.", "tags": ["woman", "strength", "hot-water"]}]
```

```
In [110]: #run Loop เพื่อรัน page
```

```

lstpage = [] #สร้าง List สำหรับเก็บ Link ของหน้าเว็บ
for i in range(1,11): #เพิ่ม Link แห่งหนึ่งต่อไปใน List
    req = "http://quotes.toscrape.com/page/"+ str(i)
    lstpage.append(req)
    i += 1

In [11]: lstpage
Out[11]: ['http://quotes.toscrape.com/page/1',
 'http://quotes.toscrape.com/page/2',
 'http://quotes.toscrape.com/page/3',
 'http://quotes.toscrape.com/page/4',
 'http://quotes.toscrape.com/page/5',
 'http://quotes.toscrape.com/page/6',
 'http://quotes.toscrape.com/page/7',
 'http://quotes.toscrape.com/page/8',
 'http://quotes.toscrape.com/page/9',
 'http://quotes.toscrape.com/page/10']

In [9]: df = pd.DataFrame(scrape)
df #ดูผลลัพธ์ที่ได้จากการ scrape

Out[9]:
   quote          Tags
0  "The world as we have created it is a process ... [change, deep-thoughts, thinking, world]
1  "It is our choices, Harry, that show what we t... [abilities, choices]
2  "There are only two ways to live your life. On... [inspirational, life, live, miracle, miracles]
3  "The person, be it gentleman or lady, who has ... [aliteracy, books, classic, humor]
4  "Imperfection is beauty, madness is genius and... [be-yourself, inspirational]
...
95  "You never really understand a person until yo... [better-life-empathy]
96  "You have to write the book that wants to be w... [books, children, difficult, grown-ups, write...]
97  "Never tell the truth to people who are not wo... [truth]
98  "A person's a person, no matter how small." [inspirational]
99  "... a mind needs books as a sword needs a whe... [books, mind]

100 rows x 2 columns

In [10]: quote = '\n'.join(df.quote)
with open("quote.txt", "w", encoding="utf-8") as f:
    f.write(quote)

In [11]: with open('quote.txt', 'r', encoding='utf-8') as f:
line = f.read()
line = line.split('\n') #au /n au

In [12]: line #ดึงข้อความ quote ที่ต้องการ line
Out[12]: ['"The world as we have created it is a process of our thinking. It cannot be changed without changing our thinking."',
'"It is our choices, Harry, that show what we truly are, far more than our abilities."',
'"There are only two ways to live your life. One is as though nothing is a miracle. The other is as though everything is a m iracle."',
'"The person, be it gentleman or lady, who has not pleasure in a good novel, must be intolerably stupid."',
'"Imperfection is beauty, madness is genius and it's better to be absolutely ridiculous than absolutely boring."',
'"Try not to become a man of success. Rather become a man of value."',
'"It is better to be hated for what you are than to be loved for what you are not."',
'"I have not failed. I've just found 10,000 ways that won't work."',
'"A woman is like a tea bag; you never know how strong it is until it's in hot water."',
'"A day without sunshine is like, you know, night."',
'"This life is what you make it. No matter what, you're going to mess up sometimes, it's a universal truth. But the good part is you get to decide how you're going to mess it up. Girls will be your friends - they'll act like it anyway. But just remember, some come, some go. The ones that stay with you through everything - they're your true best friends. Don't let go of them. Also remember, sisters make the best friends in the world. As for lovers, well, they'll come and go too. And baby, I hate to say it, most of them - actually pretty much all of them are going to break your heart, but you can't give up because if you give up, you'll never find your soulmate. You'll never find that half who makes you whole and that goes for everything. Just because you fail once, doesn't mean you're gonna fail at everything. Keep trying, hold on, and always, always, always believe in yourself, because if you don't, then who will, sweetie? So keep your head high, keep your chin up, and most importantly, never give up."']

In [13]: with open("tag.txt", "w", encoding="utf-8") as f:
for i in df['Tags']:
    text = ''
    for j in i:
        text += j + ","
    print(text)
    f.write(text+'\n')

In [14]: fin = open('tag.txt', 'r', encoding='UTF-8') #ทำการอ่านไฟล์ และอ่านไฟล์
raw = fin.readlines() #อ่านไฟล์
rawdata = ''
for i in raw:
    text = i.rstrip()
    rawdata += text
print(rawdata)

change,deep-thoughts,thinking,world,abilities,choices,inspirational,life,love,miracle,miracles,aliteracy,books,classic,human,be -youself,inspirational,adulthood,success,value,love,edison,failure,inspirational,paraphrased,misattributed,eleanor-roosevelt,humor,obvious,simile,friends,heartbreak,inspiration,life,love,sisters,courage,friends,simplicity,understand,love,fantasy,life,navigation,activism,apathy,hate,indifference,inspirational,love,opposite,philosophy,friendship,lack-of-friendship,lack-of -love,love,marriage,unhappy-marriage,books,contentment,friends,friendship,life,fate,life,misattributed,john-leonard,planning,plan s,love,poetry,happiness,attributed-no-source,humor,religion,humor,comedy,life,yourself,children,fairy-tales,imagination,music,learning,reading,seuss,dumbledore,friendship,misattributed-to-mother-teresa,paraphrased,death,inspirational,chocolate,food,humor,misattributed-to-c-s-lewis,reading,knowledge,learning,understanding,wisdom,books,library,inspirational,read,readers,reading,r eading-books,books,inspirational,reading,tea,girls,love,life,simile,love,attributed-no-source,hope,inspirational,dumbledore,lov e,friendship,love,attributed,fear,inpiration,attributed-no-source,education,troubles,friendship,love,human,humor,open-mind,t smile,books,friends,novelist,quotes,inspirational,inspirational,life,yourself,alcohol,the-hunger-games,human,love,bilbo,journ y,lost,quest,travel,wander,live-death-love,good,writing,life,regrets,education,troubles,friendship,love,human,humor,open-mind,t hinking,humor,philosophy,authors,books,literature,reading,writing,humor,inanity,lies,lying,self-indulgence,truth,beatles,connec tion,dreamers,dreaming,dreams,hope,inspirational,peace,humor,sinister,books,classic,reading,mistakes,humor,love,romantic,wome n,integrity,books,library,reading,elizabeth-bennet,jane-austen,age,fairytale,growing-up,death,life,misattributed-mark-twai nt,truth,christianity,fairytale,faith,religion,sun,truth,death,life,adventure,love,courage,life,better-life-empathy,books,children,diffic ult,grown-ups,write,writers,writing,truth,inspirational,books,mind

In [15]: from sklearn.feature_extraction.text import CountVectorizer
tokenize = CountVectorizer().build_tokenizer() #เมื่อที่นี่ก็สามารถsplit สำหรับคำว่าคำมาแล้วง่ายๆ
# convert to Lowercase, then tokenize
tokens1 = tokenize(rawdata.lower())
print(tokens1)

['change', 'deep', 'thoughts', 'thinking', 'world', 'abilities', 'choices', 'inspirational', 'life', 'live', 'miracle', 'miracles', 'aliteracy', 'books', 'classic', 'human', 'be -youself', 'inspirational', 'adulthood', 'success', 'value', 'life', 'lov e', 'edison', 'failure', 'inspirational', 'paraphrased', 'misattributed', 'eleanor', 'roosevelt', 'humor', 'obvious', 'simile', 'friends', 'heartbreak', 'inspirational', 'life', 'love', 'sisters', 'courage', 'friends', 'simplicity', 'understand', 'love', 'fantasy', 'life', 'navigation', 'activism', 'apathy', 'hate', 'indifference', 'inspirational', 'love', 'opposite', 'philosoph y', 'learning', 'reading', 'seuss', 'dumbledore', 'friendship', 'life', 'yourself', 'children', 'fairy-tales', 'imagination', 'music', 'learning', 'reading', 'books', 'library', 'inspirational', 'read', 'readers', 'reading', 'reading', 'books', 'books', 'inspirational', 'reading', 'tea', 'girls', 'love', 'life', 'simile', 'love', 'attributed', 'fear', 'inspiration', 'attributed', 'no -source', 'hope', 'inspirational', 'dumbledore', 'love', 'friendship', 'life', 'yourself', 'alcohol', 'the', 'hunger', 'games', 'humor', 'love', 'bilbo', 'journey', 'lost', 'quest', 'travel', 'wander', 'live', 'death', 'love', 'good', 'writing', 'life', 'regrets', 'education', 'troubles', 'friendship', 'love', 'humor', 'open', 'mind', 'thinking', 'humor', 'philosophy', 'authors', 'books', 'literature', 'reading', 'writing', 'humor', 'inanity', 'lies', 'lying', 'self', 'indulgence', 'truth', 'beatles', 'connection', 'dreamers', 'dreaming', 'dreams', 'hope', 'inspirational', 'peace', 'humor', 'sinister', 'books', 'classic', 'reading', 'mistakes', 'humor', 'love', 'romantic', 'wome n', 'integrity', 'books', 'library', 'reading', 'elizabeth', 'bennet', 'jane', 'austen', 'age', 'fairytale', 'growing', 'up', 'god', 'death', 'life', 'misattributed', 'mark', 'twain', 'truth', 'christianit y', 'faith', 'religion', 'sun', 'truth', 'death', 'life', 'adventure', 'love', 'courage', 'life', 'better', 'life', 'empathy', 'books', 'children', 'difficult', 'grown', 'ups', 'write', 'writers', 'writing', 'truth', 'inspirational', 'books', 'mind']

In [13]: lst_tags = [] #สร้าง List สำหรับเก็บ tag
for i in lstpage:
    req = requests.get(i)
    soup = BeautifulSoup(req.content, 'html.parser')
    quotes = soup.find_all('div', class_="quote")
    for q in quotes:
        print(q.find_all('a'))
        tag = []

```

```

for j in q.findall('a',class_="tag"):
    tag.append(j.text)
tags.append(tag) #fun tag ลุ้นๆ quote

[<a href="/author/Albert-Einstein">(about)</a>, <a class="tag" href="/tag/change/page/1/">change</a>, <a class="tag" href="/tag/deep-thoughts/page/1/">deep-thoughts</a>, <a class="tag" href="/tag/thinking/page/1/">thinking</a>, <a class="tag" href="/tag/world/page/1/">world</a>]
[<a href="/author/J.-K-Rolling">(about)</a>, <a class="tag" href="/tag/abilities/page/1/">abilities</a>, <a class="tag" href="/tag/choices/page/1/">choices</a>]
[<a href="/author/Albert-Einstein">(about)</a>, <a class="tag" href="/tag/inspirational/page/1/">inspirational</a>, <a class="tag" href="/tag/life/page/1/">life</a>, <a class="tag" href="/tag/miracles/page/1/">miracles</a>]
[<a href="/author/Jane-Austen">(about)</a>, <a class="tag" href="/tag/aliteracy/page/1/">aliteracy</a>, <a class="tag" href="/tag/books/page/1/">books</a>, <a class="tag" href="/tag/classic/page/1/">classic</a>, <a class="tag" href="/tag/humor/page/1/">humor</a>]
[<a href="/author/Marilyn-Monroe">(about)</a>, <a class="tag" href="/tag/be-yourself/page/1/">be-yourself</a>, <a class="tag" href="/tag/inspirational/page/1/">inspirational</a>]
[<a href="/author/Albert-Einstein">(about)</a>, <a class="tag" href="/tag/adulthood/page/1/">adulthood</a>, <a class="tag" href="/tag/success/page/1/">success</a>, <a class="tag" href="/tag/value/page/1/">value</a>]
[<a href="/author/André-Gide">(about)</a>, <a class="tag" href="/tag/life/page/1/">life</a>, <a class="tag" href="/tag/love/page/1/">love</a>]
[<a href="/author/Thomas-A-Edison">(about)</a>, <a class="tag" href="/tag/edison/page/1/">edison</a>, <a class="tag" href="/tag/failure/page/1/">failure</a>, <a class="tag" href="/tag/inspirational/page/1/">inspirational</a>, <a class="tag" href="/ta

```

```

In [106]: file = open('C:/Users/thunyaluck/Desktop/quote/datasource/quotes.txt','w',encoding='utf-8')
for i in line:
    file.writelines(i+'\n')
file.close()

In [107]: fin = open('C:/Users/thunyaluck/Downloads/ds4biz-assign2/datasource/quotes.txt', 'r', encoding='UTF-8') #ทำการอ่านไฟล์ และอ่านไฟล์
raw = fin.readlines() #อ่านไฟล์
fin.close()
print("Read %d raw text documents" % len(raw))

Read 100 raw text documents

In [108]: file = open('C:/Users/thunyaluck/Desktop/quote/target/tag.txt','w',encoding='utf-8')
for i in tags:
    x = ','.join(str(x) for x in i)
    file.writelines(x+'\n')
file.close()

In [109]: fin = open('C:/Users/thunyaluck/Downloads/ds4biz-assign2/target/tag.txt', 'r', encoding='UTF-8') #ทำการอ่านไฟล์ และอ่านไฟล์
raw = fin.readlines() #อ่านไฟล์
fin.close()
print("Read %d raw text documents" % len(raw))

Read 100 raw text documents

```

## Term Weighting

```

In [17]: from sklearn.feature_extraction.text import TfidfVectorizer
# we can pass in the same preprocessing parameters
vectorizer = TfidfVectorizer(stop_words="english",min_df = 5) #ทำการกรองคำที่ไม่ใช่stop wordsหรือคำศัพท์ที่มีจำนวนน้อยกว่าห้าของงา
X = vectorizer.fit_transform(line)
# display some sample weighted values
print(X)

(0, 19)      1.0
(2, 7)       0.6592779466037926
(2, 9)       0.7518993211340775
(3, 3)       1.0
(7, 4)       1.0
(8, 5)       0.7297599850512536
(8, 8)       0.6837034183167392
(9, 1)       0.6037284973895782
(9, 5)       0.581753649270407
(9, 8)       0.545604151303377056
(10, 15)     0.22712786304351262
(10, 6)       0.22712786304351262
(10, 2)       0.45425572668702525
(10, 18)     0.21797049755805145
(10, 11)     0.42007685352238897
(10, 8)       0.19678211989527714
(10, 4)       0.4359409951161829
(10, 3)       0.21003802676119449
(10, 7)       0.3822403824850753

```

## สร้างโมเดล โดยใช้วิธีการ Holdout Splitting

```

In [18]: #ดู tag และจำนวนคำใน 0, 1
from sklearn.preprocessing import MultiLabelBinarizer
mlb = MultiLabelBinarizer()
binary_labels=pd.DataFrame(mlb.fit_transform(tags),columns=mlb.classes_)
df = df.merge(binary_labels, how="Inner", left_index=True, right_index=True)
df

Out[18]:
   quote          Tags abilities activism adulthood adventure age alcohol aliteracy apathy ... unhappy_marriage value wander wisdom women wo
0   "The world as we have created it is a process ..." [change, life, thoughts, thinking, world] 0 0 0 0 0 0 0 0 ... 0 0 0 0 0 0
1   "It is our choices, Harry, that show what we ... [abilities, choices] 1 0 0 0 0 0 0 0 0 ... 0 0 0 0 0 0
2   "There are only two ways to live your life. On the one hand, [inspirational, life, live, miracle, miracles] 0 0 0 0 0 0 0 0 ... 0 0 0 0 0 0

```

### Top 15 Tags

```

In [19]: #หด tag top 15
df.iloc[:,12: ].sum().nlargest(15)

Out[19]:
love           14
inspirational  13
life            13
humor           12
books           11
reading         7
friendship      5
friends          4
truth            4
death            3
smile            3
writing          3
children         2
classic          2
courage          2
dtype: int64

```

ทำการฟิตเนติ้ก x คันต้า y ของ tags และดูว่ามี accuracy เท่าไหร่บ้าง

```

In [198]: Y = df['love']

In [191]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y, test_size=0.3, random_state=101) #แบ่งชุดข้อมูลเป็น训练, test

```

### K-Nearest Neighbors

```
In [192]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))
```

Accuracy of KNN = 76.67 percent

Naive Bayes

```
In [193]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))
```

Accuracy of KNN = 73.33 percent

SVM

```
In [194]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))
```

Accuracy of SVM = 80.00 percent

Decision Tree

```
In [195]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test, decision_tree_pred)*100))
```

Accuracy of Decision tree = 83.33 percent

```
In [20]: Y1 = df['inspirational']
```

```
In [21]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y1, test_size=0.3, random_state=101) #սայթը մասնակի պահում է այս տվյալները
```

K-Nearest Neighbors

```
In [22]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))
```

Accuracy of KNN = 83.33 percent

Naive Bayes

```
In [23]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))
```

Accuracy of KNN = 70.00 percent

SVM

```
In [24]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))
```

Accuracy of SVM = 83.33 percent

Decision Tree

```
In [25]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test, decision_tree_pred)*100))
```

Accuracy of Decision tree = 70.00 percent

```
In [27]: Y2 = df['life']
```

```
In [28]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y2, test_size=0.3, random_state=101) #սայթը մասնակի պահում է այս տվյալները
```

K-Nearest Neighbors

```
In [29]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))
```

Accuracy of KNN = 83.33 percent

Naive Bayes

```
In [30]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))
```

Accuracy of KNN = 86.67 percent

SVM

```
In [31]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))
```

Accuracy of SVM = 80.00 percent

Decision Tree

```
In [32]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test, decision_tree_pred)*100))
```

Accuracy of Decision tree = 86.67 percent

```
In [33]: Y3 = df['humor']
```

```
In [34]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y3, test_size=0.3, random_state=101) #սայթը մասնակի պահում է այս տվյալները
```

#### K-Nearest Neighbors

```
In [35]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,classifier_pred)*100))

Accuracy of KNN = 96.67 percent
```

#### Naive Bayes

```
In [36]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,naive_pred)*100))

Accuracy of KNN = 90.00 percent
```

#### SVM

```
In [37]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test,svm_pred)*100))

Accuracy of SVM = 96.67 percent
```

#### Decision Tree

```
In [38]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test,decision_tree_pred)*100))

Accuracy of Decision tree = 83.33 percent
```

```
In [39]: Y4 = df['books']
```

```
In [40]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y4, test_size=0.3, random_state=101) #սայթը պահպանում է տվյալները
```

#### K-Nearest Neighbors

```
In [41]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,classifier_pred)*100))

Accuracy of KNN = 93.33 percent
```

#### Naive Bayes

```
In [42]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,naive_pred)*100))

Accuracy of KNN = 93.33 percent
```

#### SVM

```
In [43]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test,svm_pred)*100))

Accuracy of SVM = 93.33 percent
```

#### Decision Tree

```
In [44]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test,decision_tree_pred)*100))

Accuracy of Decision tree = 96.67 percent
```

```
In [45]: Y5 = df['reading']
```

```
In [46]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y5, test_size=0.3, random_state=101) #սայթը պահպանում է տվյալները
```

#### K-Nearest Neighbors

```
In [47]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,classifier_pred)*100))

Accuracy of KNN = 96.67 percent
```

#### Naive Bayes

```
In [48]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,naive_pred)*100))

Accuracy of KNN = 96.67 percent
```

#### SVM

```
In [49]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test,svm_pred)*100))

Accuracy of SVM = 96.67 percent
```

#### Decision Tree

```
In [50]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test,decision_tree_pred)*100))

Accuracy of Decision tree = 96.67 percent
```

```
In [51]: Y6 = df['friendship']
```

```
In [52]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y, test_size=0.3, random_state=101) #սայթը ամենավայրէն է այս տարրությունում
K-Nearest Neighbors
```

```
In [53]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))
Accuracy of KNN = 93.33 percent
```

Naive Bayes

```
In [54]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))
Accuracy of KNN = 86.67 percent
```

SVM

```
In [55]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))
Accuracy of SVM = 93.33 percent
```

Decision Tree

```
In [56]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test, decision_tree_pred)*100))
Accuracy of Decision tree = 90.00 percent
```

```
In [58]: Y7 = df['friends']
```

```
In [59]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y7, test_size=0.3, random_state=101) #սայթը ամենավայրէն է այս տարրությունում
K-Nearest Neighbors
```

```
In [60]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))
Accuracy of KNN = 96.67 percent
```

Naive Bayes

```
In [61]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))
Accuracy of KNN = 93.33 percent
```

SVM

```
In [62]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))
Accuracy of SVM = 96.67 percent
```

Decision Tree

```
In [63]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test, decision_tree_pred)*100))
Accuracy of Decision tree = 80.00 percent
```

```
In [64]: Y8 = df['truth']
```

```
In [65]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y8, test_size=0.3, random_state=101) #սայթը ամենավայրէն է այս տարրությունում
K-Nearest Neighbors
```

```
In [66]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))
Accuracy of KNN = 96.67 percent
```

Naive Bayes

```
In [67]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))
Accuracy of KNN = 96.67 percent
```

SVM

```
In [68]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))
Accuracy of SVM = 96.67 percent
```

Decision Tree

```
In [69]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test, decision_tree_pred)*100))
Accuracy of Decision tree = 96.67 percent
```

```

Accuracy of decision tree = 96.67 percent

In [70]: Y9 = df['death']

In [71]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y9, test_size=0.3, random_state=101) #սայթը պահպանում է այս տվյալները

K-Nearest Neighbors

In [72]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))

Accuracy of KNN = 96.67 percent

Naive Bayes

In [73]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))

Accuracy of KNN = 100.00 percent

SVM

In [74]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))

Accuracy of SVM = 96.67 percent

Decision Tree

In [75]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test, decision_tree_pred)*100))

Accuracy of Decision tree = 96.67 percent

In [76]: Y10 = df['smile']

In [77]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y10, test_size=0.3, random_state=101) #սայթը պահպանում է այս տվյալները

K-Nearest Neighbors

In [78]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))

Accuracy of KNN = 100.00 percent

Naive Bayes

In [79]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))

Accuracy of KNN = 100.00 percent

SVM

In [80]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))

Accuracy of SVM = 100.00 percent

Decision Tree

In [81]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test, decision_tree_pred)*100))

Accuracy of Decision tree = 100.00 percent

In [82]: Y11 = df['writing']

In [83]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y11, test_size=0.3, random_state=101) #սայթը պահպանում է այս տվյալները

K-Nearest Neighbors

In [84]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, classifier_pred)*100))

Accuracy of KNN = 93.33 percent

Naive Bayes

In [85]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test, naive_pred)*100))

Accuracy of KNN = 100.00 percent

SVM

In [86]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test, svm_pred)*100))

Accuracy of SVM = 100.00 percent

Decision Tree

In [87]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()

```

```
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test,decision_tree_pred)*100))
```

Accuracy of Decision tree = 93.33 percent

```
In [88]: Y12 = df['children']
```

```
In [89]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y12, test_size=0.3, random_state=101) #սարքավորման train,test
```

K-Nearest Neighbors

```
In [90]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,classifier_pred)*100))
```

Accuracy of KNN = 100.00 percent

Naive Bayes

```
In [91]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,naive_pred)*100))
```

Accuracy of KNN = 100.00 percent

SVM

```
In [92]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test,svm_pred)*100))
```

Accuracy of SVM = 100.00 percent

Decision Tree

```
In [93]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test,decision_tree_pred)*100))
```

Accuracy of Decision tree = 93.33 percent

```
In [94]: Y13 = df['classic']
```

```
In [95]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y13, test_size=0.3, random_state=101) #սարքավորման train,test
```

K-Nearest Neighbors

```
In [96]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,classifier_pred)*100))
```

Accuracy of KNN = 96.67 percent

Naive Bayes

```
In [97]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,naive_pred)*100))
```

Accuracy of KNN = 96.67 percent

SVM

```
In [98]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test,svm_pred)*100))
```

Accuracy of SVM = 96.67 percent

Decision Tree

```
In [99]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test,decision_tree_pred)*100))
```

Accuracy of Decision tree = 96.67 percent

```
In [100]: Y14 = df['courage']
```

```
In [101]: from sklearn.model_selection import train_test_split
from sklearn import metrics
X_train, X_test, y_train, y_test = train_test_split(X, Y14, test_size=0.3, random_state=101) #սարքավորման train,test
```

K-Nearest Neighbors

```
In [102]: from sklearn.neighbors import KNeighborsClassifier
classifier = KNeighborsClassifier()
classifier.fit(X_train, y_train)
classifier_pred = classifier.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,classifier_pred)*100))
```

Accuracy of KNN = 100.00 percent

Naive Bayes

```
In [103]: from sklearn.naive_bayes import BernoulliNB
naive = BernoulliNB(alpha=0.2)
naive.fit(X_train, y_train)
naive_pred = naive.predict(X_test)
print("Accuracy of KNN = %.2f percent" % (metrics.accuracy_score(y_test,naive_pred)*100))
```

Accuracy of KNN = 100.00 percent

SVM

```
In [104]: from sklearn import svm
svm = svm.SVC(C=1, kernel='linear')
svm.fit(X_train, y_train)
svm_pred = svm.predict(X_test)
print("Accuracy of SVM = %.2f percent" % (metrics.accuracy_score(y_test,svm_pred)*100))
```

Accuracy of SVM = 100.00 percent

Decision Tree

```
In [105]: from sklearn.tree import DecisionTreeClassifier
decision_tree = DecisionTreeClassifier()
decision_tree.fit(X_train, y_train)
decision_tree_pred = decision_tree.predict(X_test)
print("Accuracy of Decision tree = %.2f percent" % (metrics.accuracy_score(y_test,decision_tree_pred)*100))

Accuracy of Decision tree = 100.00 percent
```

## สรุปผล

Target	K-Nearest-Neighbors	Naive Bayes	SVM	Decision Tree
love	76.67 %	73.33 %	80.00 %	83.33 %
inspirational	83.33 %	70.00 %	83.33 %	70.00 %
life	83.33 %	86.67 %	80.00 %	86.67 %
humor	96.67 %	90.00 %	96.67 %	83.33 %
books	93.33 %	93.33 %	93.33 %	96.67 %
reading	96.67 %	96.67 %	96.67 %	96.67 %
friendship	93.33 %	86.67 %	93.33 %	90.00 %
friends	96.67 %	93.33 %	96.67 %	80.00 %
truth	96.67 %	96.67 %	96.67 %	96.67 %
death	96.67 %	100.00 %	96.67 %	96.67 %
simile	100.00 %	100.00 %	100.00 %	100.00 %
writing	93.33 %	100.00 %	93.33 %	93.33 %
children	100.00 %	100.00 %	100.00 %	93.33 %
classic	96.67 %	96.67 %	96.67 %	96.67 %
courage	100.00 %	100.00 %	100.00 %	100.00 %
Total	93.56 %	92.22 %	93.56 %	90.89 %

จากผลการทดสอบ model ได้รับ accuracy ที่ดีมากถึง 100.00% แต่เมื่อเทียบกับความถูกต้อง ระหว่าง K-Nearest-Neighbors และ SVM ที่ได้ accuracy อยู่ที่ 93.56% ซึ่งมากกว่า Naive Bayes และ Decision Tree

In [ ]: