

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import nltk
import re # regular expression (for removing special charachters)

# we use encoding here to encode the text, data like emoji
df=pd.read_csv('/content/drive/MyDrive/datasets/twitter_validation.csv',encoding='ISO-8859-1',header=None)
df
```

	0	1	2	3
0	3364	Facebook	Irrelevant	I mentioned on Facebook that I was struggling ...
1	352	Amazon	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...
2	8312	Microsoft	Negative	@Microsoft Why do I pay for WORD when it funct...
3	4371	CS-GO	Negative	CSGO matchmaking is so full of closet hacking,...
4	4433	Google	Neutral	Now the President is slapping Americans in the...
...	...	...	...	...
995	4891	GrandTheftAuto(GTA)	Irrelevant	â€œToronto is the arts and culture capital...
996	4359	CS-GO	Irrelevant	tHIS IS ACTUALLY A GOOD MOVE TOT BRING MORE VI...
997	2652	Borderlands	Positive	Today sucked so itâ€™s time to drink wine n pl...
998	8069	Microsoft	Positive	Bought a fraction of Microsoft today. Small wins.
999	6960	johnson&johnson	Neutral	Johnson & Johnson to stop selling talc baby po...

1000 rows x 4 columns

```
df.columns=['ID','location','target','text']
df
```

	ID	location	target	text
0	3364	Facebook	Irrelevant	I mentioned on Facebook that I was struggling ...
1	352	Amazon	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...
2	8312	Microsoft	Negative	@Microsoft Why do I pay for WORD when it funct...
3	4371	CS-GO	Negative	CSGO matchmaking is so full of closet hacking,...
4	4433	Google	Neutral	Now the President is slapping Americans in the...
...	...	...	...	...
995	4891	GrandTheftAuto(GTA)	Irrelevant	â€œToronto is the arts and culture capital...
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997	2652	Borderlands	Positive	Today sucked so itâ€™s time to drink wine n pl...
998	8069	Microsoft	Positive	Bought a fraction of Microsoft today. Small wins.
999	6960	johnson&johnson	Neutral	Johnson & Johnson to stop selling talc baby po...

1000 rows x 4 columns

```
df.shape

(1000, 4)
```

```
df.tail()
```

IDlocationtargettext

df.head()

IDlocationtargettext

03364FacebookIrrelevantI mentioned on Facebook that I was struggling ...

1352AmazonNeutralBBC News - Amazon boss Jeff Bezos rejects clai...

28312MicrosoftNegative@Microsoft Why do I pay for WORD when it funct...

34371CS-GONegativeCSGO matchmaking is so full of closet hacking,...

44433GoogleNeutralNow the President is slapping Americans in the...

df.isna().sum()

ID0

location0

target0

text0

dtype: int64

df.dtypes

IDint64

locationobject

targetobject

textobject

dtype: object

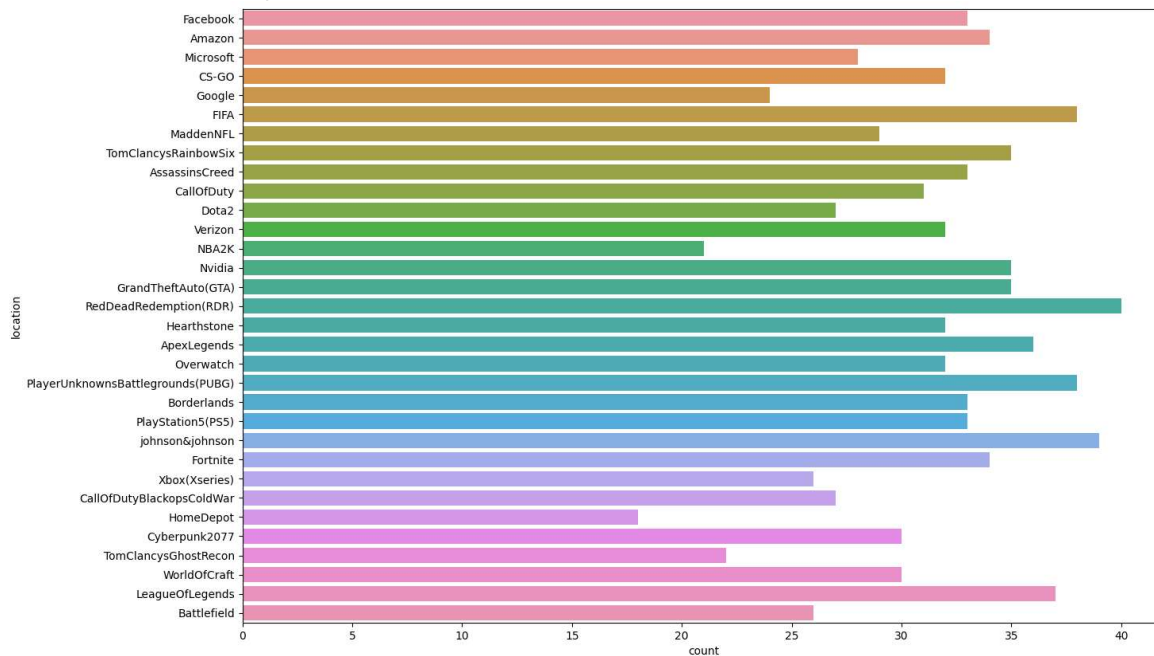
loc=df['location'].value\_counts()

loc

RedDeadRedemption(RDR)	40
johnson&johnson	39
FIFA	38
PlayerUnknownsBattlegrounds(PUBG)	38
LeagueOfLegends	37
ApexLegends	36
TomClancysRainbowSix	35
Nvidia	35
GrandTheftAuto(GTA)	35
Amazon	34
Fortnite	34
Facebook	33
PlayStation5(PS5)	33
AssassinsCreed	33
Borderlands	33
Overwatch	32
Hearthstone	32
Verizon	32
CS-GO	32
CallOfDuty	31
Cyberpunk2077	30
WorldOfCraft	30
MaddenNFL	29
Microsoft	28
Dota2	27
CallOfDutyBlackopsColdWar	27
Xbox(Xseries)	26
Battlefield	26
Google	24
TomClancysGhostRecon	22
NBA2K	21
HomeDepot	18
Name: location, dtype: int64	

```
plt.figure(figsize=(15,10))
sns.countplot(y=df['location'])
```

<Axes: xlabel='count', ylabel='location'>

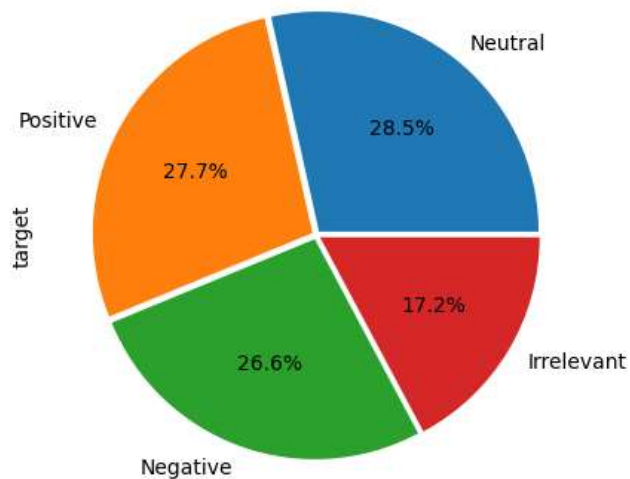


```
tar=df['target'].value_counts()
tar
```

```
Neutral      285
Positive     277
Negative     266
Irrelevant   172
Name: target, dtype: int64
```

```
tar.plot(kind='pie',explode=(0.02,0.02,0.02,0.02),autopct='%1.1f%%')
```

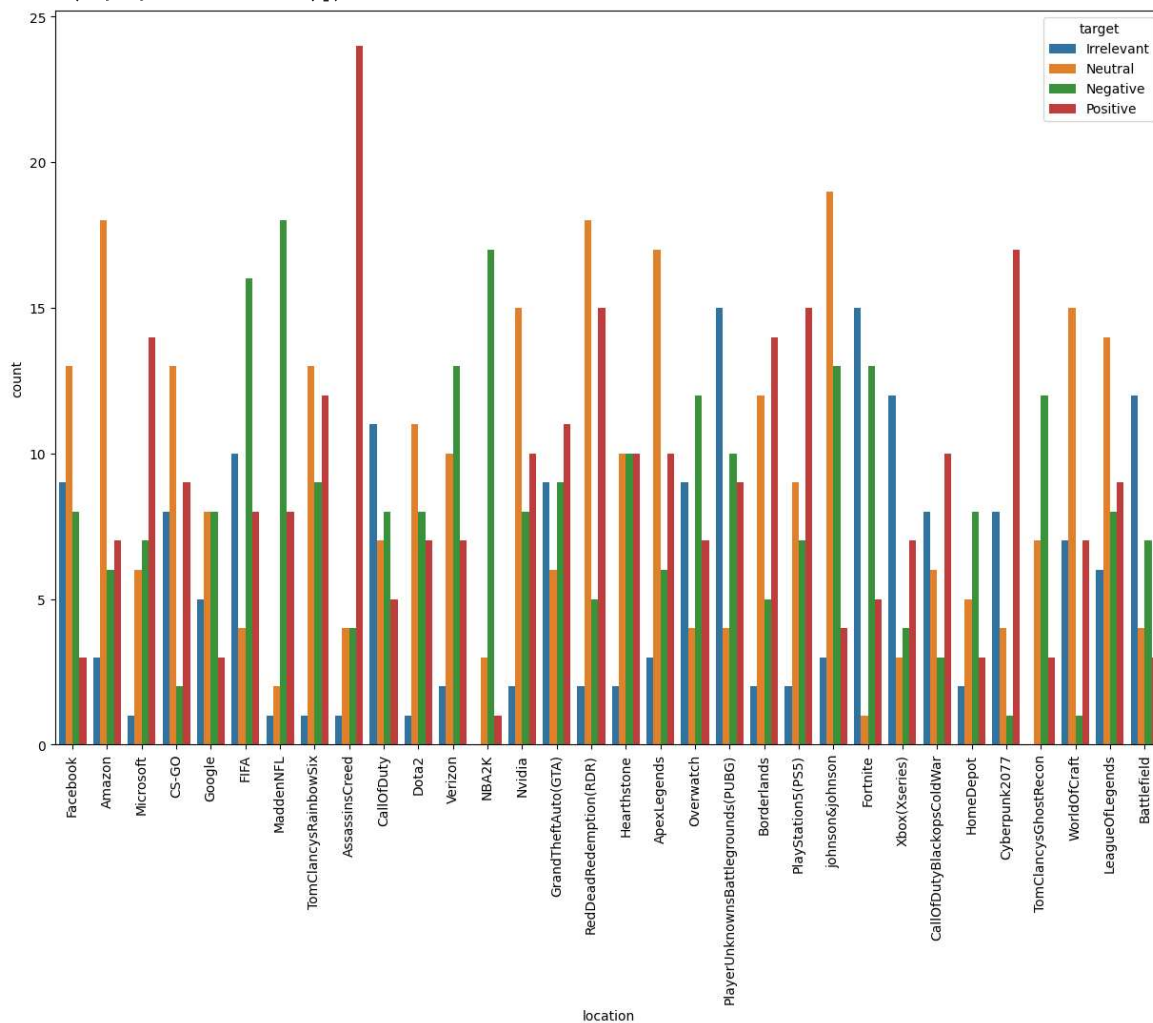
<Axes: ylabel='target'>



```
plt.figure(figsize=(15,10))
sns.countplot(x='location',data=df,hue='target')
plt.xticks(rotation=90)
```

```
(array([ 0,  1,  2,  3,  4,  5,  6,  7,  8,  9, 10, 11, 12, 13, 14, 15, 16,
        17, 18, 19, 20, 21, 22, 23, 24, 25, 26, 27, 28, 29, 30, 31]),
```

```
[Text(0, 0, 'Facebook'),
Text(1, 0, 'Amazon'),
Text(2, 0, 'Microsoft'),
Text(3, 0, 'CS-GO'),
Text(4, 0, 'Google'),
Text(5, 0, 'FIFA'),
Text(6, 0, 'MaddenNFL'),
Text(7, 0, 'TomClancysRainbowSix'),
Text(8, 0, 'AssassinsCreed'),
Text(9, 0, 'CallOfDuty'),
Text(10, 0, 'Dota2'),
Text(11, 0, 'Verizon'),
Text(12, 0, 'NBA2K'),
Text(13, 0, 'Nvidia'),
Text(14, 0, 'GrandTheftAuto(GTA)'),
Text(15, 0, 'RedDeadRedemption(RDR)'),
Text(16, 0, 'Hearthstone'),
Text(17, 0, 'ApexLegends'),
Text(18, 0, 'Overwatch'),
Text(19, 0, 'PlayerUnknownsBattlegrounds(PUBG)'),
Text(20, 0, 'Borderlands'),
Text(21, 0, 'PlayStation5(PS5)'),
Text(22, 0, 'johnson&johnson'),
Text(23, 0, 'Fortnite'),
Text(24, 0, 'Xbox(Xseries)'),
Text(25, 0, 'CallOfDutyBlackopsColdWar'),
Text(26, 0, 'HomeDepot'),
Text(27, 0, 'Cyberpunk2077'),
Text(28, 0, 'TomClancysGhostRecon'),
Text(29, 0, 'WorldOfCraft'),
Text(30, 0, 'LeagueOfLegends'),
Text(31, 0, 'Battlefield')])
```



```
text=df['text'].value_counts()
text

Wow
2
I mentioned on Facebook that I was struggling for motivation to go for a run the other day, which has been translated by Tomâ€™s
great auntie as â€œHayley canâ€™t get out of bedâ€œ and told to his grandma, who now thinks Iâ€™m a lazy, terrible person ðŸ¤£
1
Update: I actually finished Odyssey. I wish the three-ponged questline structure was communicated a bit more clearly but that game
is a lot of fun once it hits its stride. twitter.com/iv_javy/statusâ€¦
1
Know Your History...unless it involves China....because like....we have investors and shit...
1
Congratulations to @ninamanning78 on publication day. Hope you have a fabulous day and that your book flies ðŸššðŸššðŸššðŸšš
1

..
eSports: Curiosities you probably didnâ€™t know about Red Dead RedemptionÂ 2 goalsn.com/2020/02/esportâ€¦| https://t.co/JMLBSxAUou
1
Nvidia GeForce Now: Google Stadia rival suffers anotherÂ blow news89.net/nvidia-geforceâ€¦| https://t.co/9ijNjV7L4C
1
I SAW A TWEET ABOUT HOW IT'S A STORY TOLD OVER AND OVER CUZ THEY'RE MAD MEN DIED IN THE WAR AND IT DIDN'T HAVE BATTLEFIELD 1
TREATMENT, I CAN'T EVEN THINK OF ANOTHER WW1 MOVIE PPL WOULD EVEN KNOW
1
Bro I had an abusive internet boyfriend that used to call me a stupid bitch whenever niggas used to like my pics on facebook and I
used to beg him to not be mad at me. I was such a stupid bitch FOR REAL
1
Johnson & Johnson to stop selling talc baby powder in U.S. and Canada j.mp/3e1YtDV (Reuters) https://t.co/dsaUTgb5p9
1
Name: text, Length: 999, dtype: int64
```

```
df=df.drop(df.index[(df['target']=='Irrelevant')],axis=0)
df
```

	ID	location	target	text
1	352	Amazon	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...
2	8312	Microsoft	Negative	@Microsoft Why do I pay for WORD when it funct...
3	4371	CS-GO	Negative	CSGO matchmaking is so full of closet hacking,...
4	4433	Google	Neutral	Now the President is slapping Americans in the...
5	6273	FIFA	Negative	Hi @EAHelp Iâ€™ve had Madeleine McCann in my c...
...	...	...	...	...
993	314	Amazon	Negative	Please explain how this is possible! How can t...
994	9701	PlayStation5(PS5)	Positive	Good on Sony. As much as I want to see the new...
997	2652	Borderlands	Positive	Today sucked so itâ€™s time to drink wine n pl...
998	8069	Microsoft	Positive	Bought a fraction of Microsoft today. Small wins.
999	6960	johnson&johnson	Neutral	Johnson & Johnson to stop selling talc baby po...

828 rows × 4 columns

```
# reset index values
df.reset_index(drop=True,inplace=True)
df
```

	ID	location	target	text	
0	352	Amazon	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...	
1	8312	Microsoft	Negative	@Microsoft Why do I pay for WORD when it funct...	
2	4371	CS-GO	Negative	CSGO matchmaking is so full of closet hacking,...	
3	4433	Google	Neutral	Now the President is slapping Americans in the...	
4	6273	FIFA	Negative	Hi @EAHelp Iâve had Madeleine McCann in my c...	
...	...	...	...	...	
823	314	Amazon	Negative	Please explain how this is possible! How can t...	
824	9701	PlayStation5(PS5)	Positive	Good on Sony. As much as I want to see the new...	

```
df=df.drop(['ID','location'],axis=1)
df
```

	target	text	
0	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...	
1	Negative	@Microsoft Why do I pay for WORD when it funct...	
2	Negative	CSGO matchmaking is so full of closet hacking,...	
3	Neutral	Now the President is slapping Americans in the...	
4	Negative	Hi @EAHelp Iâve had Madeleine McCann in my c...	
...	...	...	
823	Negative	Please explain how this is possible! How can t...	
824	Positive	Good on Sony. As much as I want to see the new...	
825	Positive	Today sucked so itâs time to drink wine n pl...	
826	Positive	Bought a fraction of Microsoft today. Small wins.	
827	Neutral	Johnson & Johnson to stop selling talc baby po...	

828 rows  $\times$  2 columns

```
# df['target']=df['target'].str.replace('Neutral','0')
# df['target']=df['target'].str.replace('Negative','-1')
# df['target']=df['target'].str.replace('Positive','1')
# df['target']=df['target'].astype(int)
# df

# using map function

df['target']=df['target'].map({'Positive':1,'Negative':-1,'Neutral':0})
```

df.dtypes

```
target      int64
text        object
dtype: object
```

```
nltk.download('wordnet')
nltk.download('stopwords')
nltk.download('punkt')
nltk.download('omw-1.4')
```

```
[nltk_data] Downloading package wordnet to /root/nltk_data...
[nltk_data]   Package wordnet is already up-to-date!
[nltk_data] Downloading package stopwords to /root/nltk_data...
[nltk_data]   Package stopwords is already up-to-date!
[nltk_data] Downloading package punkt to /root/nltk_data...
[nltk_data]   Package punkt is already up-to-date!
[nltk_data] Downloading package omw-1.4 to /root/nltk_data...
[nltk_data]   Package omw-1.4 is already up-to-date!
True
```

```
tweets=df.text
tweets
```

```

0      BBC News - Amazon boss Jeff Bezos rejects clai...
1      @Microsoft Why do I pay for WORD when it funct...
2      CSGO matchmaking is so full of closet hacking,...
3      Now the President is slapping Americans in the...
4      Hi @EAHelp Iâve had Madeleine McCann in my c...

...

823    Please explain how this is possible! How can t...
824    Good on Sony. As much as I want to see the new...
825    Today sucked so itâs time to drink wine n pl...
826    Bought a fraction of Microsoft today. Small wins.
827    Johnson & Johnson to stop selling talc baby po...
Name: text, Length: 828, dtype: object

```

# preprocessing

```

from nltk.tokenize import TweetTokenizer
tk=TweetTokenizer()
tweets=tweets.apply(lambda x:tk.tokenize(x)).apply(lambda x:" ".join(x))
tweets

```

```

0      BBC News - Amazon boss Jeff Bezos rejects clai...
1      @Microsoft Why do I pay for WORD when it funct...
2      CSGO matchmaking is so full of closet hacking ...
3      Now the President is slapping Americans in the...
4      Hi @EAHelp Iâ ve had Madeleine McCann in m...

...

823    Please explain how this is possible ! How can ...
824    Good on Sony . As much as I want to see the ne...
825    Today sucked so itâ s time to drink wine n...
826    Bought a fraction of Microsoft today . Small w...
827    Johnson & Johnson to stop selling talc baby po...
Name: text, Length: 828, dtype: object

```

# special charachter remove  
# re : regular expression we remove special charachters

```

tweets=tweets.str.replace('[^a-zA-Z-0-9]+',' ')
tweets

```

```

<ipython-input-124-d387f0562dfc>:4: FutureWarning: The default value of regex will change from True to False in a future version.
tweets=tweets.str.replace('[^a-zA-Z-0-9]+',' ')
0      BBC News - Amazon boss Jeff Bezos rejects clai...
1      Microsoft Why do I pay for WORD when it funct...
2      CSGO matchmaking is so full of closet hacking ...
3      Now the President is slapping Americans in the...
4      Hi EAHelp I ve had Madeleine McCann in my cell...

...

823    Please explain how this is possible How can th...
824    Good on Sony As much as I want to see the new ...
825    Today sucked so it s time to drink wine n play...
826    Bought a fraction of Microsoft today Small wins
827    Johnson Johnson to stop selling talc baby powd...
Name: text, Length: 828, dtype: object

```

# example for removal of special charachters

```

str1='wonderful @@@@peacock!12345#@!'
str2=re.sub('[^a-zA-Z-0-9]+',' ',str1)          # sub = replace
str2                                             # '[^a-zA-Z-0-9]+' here '^' denotes 'not in the string'
                                                #             here '+' denotes 'replace the combination of symbols'

'wonderful peacock 12345 '

```

# stemming or lematization

```

from nltk.stem import SnowballStemmer
ss=SnowballStemmer('english')
tweets=tweets.apply(lambda x:[ss.stem(i.lower()) for i in tk.tokenize(x)]).apply(lambda x:" ".join(x))
tweets

```

```

0      bbc news - amazon boss jeff bezo reject claim ...
1      microsoft whi do i pay for word when it functi...
2      csgo matchmak is so full of closet hack it s a...
3      now the presid is slap american in the face th...
4      hi eahelp i ve had madelein mccann in my cella...

...

823    pleas explain how this is possibl how can they...
824    good on soni as much as i want to see the new ...

```

```

825    today suck so it s time to drink wine n play b...
826        bought a fraction of microsoft today small win
827    johnson johnson to stop sell talc babi powder ...
Name: text, Length: 828, dtype: object

```

```
# stopwords
```

```

nltk.download('stopwords')
from nltk.corpus import stopwords
sw=stopwords.words('english')
tweets=tweets.apply(lambda x:[i for i in tk.tokenize(x) if i not in sw]).apply(lambda x:' '.join(x))
tweets

```

```

[nltk_data] Downloading package stopwords to /root/nltk_data...
[nltk_data] Package stopwords is already up-to-date!
0    bbc news - amazon boss jeff bezo reject claim ...
1    microsoft whi pay word function poor samsungus...
2        csgo matchmak full closet hack truli aw game
3    presid slap american face realli commit unlaw ...
4    hi eahelp madelein mccann cellar past 13 year ...
...
823    pleas explain possibl let compani overcharg sc...
824    good soni much want see new ps5 go right much ...
825    today suck time drink wine n play borderland s...
826        bought fraction microsoft today small win
827    johnson johnson stop sell talc babi powder u c...
Name: text, Length: 828, dtype: object

```

```
# vectorization
```

```

from sklearn.feature_extraction.text import TfidfVectorizer
vec=TfidfVectorizer()
train_data=vec.fit_transform(tweets)
print(train_data)      #x

```

```

(0, 739)      0.2456282916977699
(0, 524)      0.2456282916977699
(0, 3629)     0.19717097284763976
(0, 883)      0.11802111433875656
(0, 1063)     0.2456282916977699
(0, 1193)     0.22139963227270484
(0, 2103)     0.12503547156807654
(0, 342)      0.2135997461023189
(0, 913)      0.16343698819954885
(0, 857)      0.2018385048310212
(0, 2902)     0.2456282916977699
(0, 612)      0.2456282916977699
(0, 1930)     0.23145543449136263
(0, 679)      0.2135997461023189
(0, 412)      0.14270670721218175
(0, 2404)     0.365996231282465
(0, 581)      0.46291086898272527
(1, 847)      0.4055823664694651
(1, 3039)     0.4055823664694651
(1, 2693)     0.3821800909185634
(1, 1479)     0.4055823664694651
(1, 3849)     0.36557591217188057
(1, 2595)     0.3126902562590763
(1, 3808)     0.26216072802580975
(1, 2266)     0.24555654927912696
:
(825, 677)    0.22981061112100945
(825, 1056)   0.2315686698425631
(825, 3532)   0.21750175079084832
(825, 3380)   0.2904718522758868
(825, 2661)   0.17148706662740873
(826, 1453)   0.5079831062080814
(826, 3222)   0.47867226429410115
(826, 682)    0.4174215841659411
(826, 3819)   0.353278941165688
(826, 3542)   0.34523850330234374
(826, 2266)   0.3075542453642147
(827, 222)    0.3085327836746446
(827, 1195)   0.3085327836746446
(827, 2950)   0.3085327836746446
(827, 166)    0.3085327836746446
(827, 2341)   0.3085327836746446
(827, 760)    0.2602967814546125
(827, 3096)   0.24766572568673034
(827, 3428)   0.24766572568673034

```



```
(827, 3347)    0.21723219669277322
(827, 1776)    0.14999073362910845
(827, 2711)    0.23368360020019152
(827, 547)     0.22309506625787626
(827, 1952)    0.37089519596031884
(827, 883)     0.14824588278342318
```

```
train_data.shape
```

```
(828, 3961)
```

```
y=df['target'].values
```

```
y
```

```
array([ 0, -1, -1,  0, -1,  1,  1,  1, -1,  1,  1, -1,  0, -1,  1,  1, -1,
        1, -1, -1,  0, -1,  0,  0, -1, -1,  1,  1, -1,  1, -1,  0,  0,  1,
        0,  1,  0,  0,  0,  1,  0, -1, -1, -1,  0,  1, -1, -1,  1,  1,  1,
        1,  1, -1, -1,  1,  1, -1,  0, -1,  0, -1,  1, -1, -1,  1,  1,  1,
        0,  0,  0,  1,  1,  0,  1,  0, -1, -1,  0,  0, -1,  1, -1, -1, -1,
        0,  1,  0, -1,  1,  1,  0,  1,  0,  1, -1,  0,  0,  0, -1,  0, -1,
        0,  0,  1,  1,  0, -1, -1,  1, -1,  0, -1,  1,  0, -1,  0,  1,  0,
        1,  1,  0,  0,  0,  0,  1,  0,  1,  1, -1,  0,  0,  0,  0, -1,  0,
        1, -1,  0, -1,  0, -1, -1, -1,  1,  1,  1,  0,  0,  1,  0,  0,  0,
        1,  0, -1, -1,  0,  1,  1,  0,  1,  1,  0,  0, -1, -1, -1, -1,  1,
        0,  0,  1,  1,  1,  1, -1,  1,  1,  0, -1, -1, -1,  1,  1, -1, -1,
        1,  1, -1,  1,  1, -1,  1,  0, -1,  0,  0,  1, -1,  1,  1,  0,  1,
       -1, -1,  1,  1,  1,  1,  0,  0,  1, -1,  0,  1,  0, -1,  0,  0, -1,
        1,  1, -1,  0,  1,  0, -1,  0, -1,  1,  1, -1, -1, -1,  1, -1,  0,
        1,  0,  0, -1,  1, -1,  1, -1,  0,  0,  1, -1,  0, -1,  1, -1,  1,
        1,  1,  1,  1,  1, -1, -1,  1, -1,  0,  0,  0,  1,  0,  1, -1,  0,
        0,  0,  0, -1,  1, -1, -1,  1,  1,  0,  0, -1, -1, -1,  0,  1,  0,
       -1,  1,  0, -1, -1, -1,  1,  0,  0, -1,  1,  1,  0,  1,  0,  0,  1,
        1, -1,  0,  1,  1,  0, -1, -1,  1,  1,  1,  0, -1,  0,  1,  0,
        1, -1,  0,  1, -1,  0, -1,  1, -1,  1,  1, -1, -1, -1,  1, -1,  0,
        1,  0,  0, -1,  1,  1,  0,  0, -1,  1,  1,  0,  0, -1,  1, -1,  1,
        1,  0,  0, -1,  1,  1,  0,  0, -1,  1,  1,  0,  0,  1,  0,  1,  1,
        1,  0, -1,  0,  1,  1, -1,  1, -1,  1,  1,  0, -1,  0,  0, -1,
       -1,  1,  0,  0,  1,  1,  0,  0, -1,  1,  1,  0,  0,  1,  1,  1,  0,
        1, -1,  0,  1,  1,  1,  0,  0, -1,  1,  1,  0,  0, -1,  1,  1,  0,
        1,  0,  0,  0,  0,  0,  0,  0, -1,  1,  1,  0,  0,  0,  0, -1,
       -1,  0,  1,  0,  0, -1,  0,  1,  0,  0,  0,  0,  0,  0,  1,  0,  1,  1,
        1,  0, -1,  1,  0,  0, -1,  1,  0,  0, -1,  0, -1,  0,  1, -1,  1,
       -1, -1,  0,  0,  0,  0,  0,  0,  0, -1, -1,  1,  1,  0, -1, -1,  1,
        1, -1,  1,  1,  1,  1,  0, -1, -1,  1, -1, -1,  0,  0,  1,
        0, -1,  1, -1,  0,  0,  1,  0,  0, -1,  1,  0, -1, -1,  0,  0,
        1,  1,  1, -1,  0, -1,  0, -1,  0,  0,  1,  1,  0, -1,  1,  1,
        1, -1, -1, -1, -1, -1, -1, -1,  0, -1,  0,  0,  0,  1,  0,  0,
        0, -1,  0,  1,  0, -1, -1,  1,  0,  1,  0,  1,  0, -1,  1,  1,  1,
        1, -1, -1,  1,  0,  0,  0,  0,  0, -1, -1, -1,  1, -1,  0,
        1,  0, -1,  1,  1, -1,  1,  0,  0,  1, -1,  0, -1,  0,  1,  1,  0,
        1,  0,  1,  0, -1,  0, -1,  1,  0, -1, -1,  1,  1, -1,  0, -1,
        0,  0,  0,  0,  0,  0,  1,  0,  1,  1,  1, -1,  0,  1,  0,  1,  0,
        1,  0,  1,  0, -1, -1,  1,  1,  1,  1,  0, -1,  1,  1, -1, -1,
        0,  1,  0,  1,  1,  0,  1, -1,  1,  1,  1,  0]])
```

```
# train test split
```

```
from sklearn.model_selection import train_test_split
```

```
x_train,x_test,y_train,y_test=train_test_split(train_data,y,test_size=0.30,random_state=42)
```

```
print(x_train)
```

```
(0, 2833)    0.22445333746210416
(0, 721)     0.23819743082652528
(0, 0)       0.23819743082652528
(0, 1717)    0.22445333746210416
(0, 3411)    0.23819743082652528
(0, 3470)    0.23819743082652528
(0, 1447)    0.22445333746210416
(0, 2063)    0.23819743082652528
(0, 335)     0.23819743082652528
(0, 2582)    0.19573239287831176
(0, 1715)    0.22445333746210416
(0, 409)     0.1774619718703711
```

```

(0, 3554)    0.1804114056568988
(0, 1294)    0.14874102728657873
(0, 2140)    0.284319400937232
(0, 3777)    0.16565538326448254
(0, 59)      0.16771038243892572
(0, 3049)    0.15258254163782356
(0, 1313)    0.14997378514152887
(0, 3605)    0.15849261671802412
(0, 2834)    0.16771038243892572
(0, 3609)    0.15258254163782356
(0, 3171)    0.19573239287831176
(0, 3629)    0.19120606523479225
(1, 307)     0.23042284485480724
:
(577, 742)   0.14968891974696927
(577, 1947)  0.16302270346202263
(577, 3767)  0.18158863086173657
(577, 2317)  0.18717313645751385
(577, 1165)  0.18717313645751385
(577, 3396)  0.16302270346202263
(577, 953)   0.20281971497818488
(577, 1205)  0.15790584022871224
(577, 1595)  0.24851073610897026
(577, 2459)  0.2625744571143809
(577, 752)   0.14043006275740014
(577, 2401)  0.12126470370721307
(577, 771)   0.16302270346202263
(577, 1502)  0.08667889229898602
(577, 3808)  0.2782529252576799
(578, 2968)  0.2618429705732027
(578, 3138)  0.37189303347534525
(578, 1757)  0.37189303347534525
(578, 1639)  0.2618429705732027
(578, 3576)  0.37189303347534525
(578, 2264)  0.37189303347534525
(578, 1994)  0.28167283203049437
(578, 2613)  0.23614849222634068
(578, 2738)  0.2985263248739169
(578, 1256)  0.2922929058414592

```

```

# model creation
from sklearn.metrics import confusion_matrix, classification_report
from sklearn.svm import SVC
from sklearn.naive_bayes import MultinomialNB
from sklearn.neighbors import KNeighborsClassifier
from sklearn.ensemble import RandomForestClassifier
from sklearn.tree import DecisionTreeClassifier
s_model=SVC()
n_model=MultinomialNB()
k_model=KNeighborsClassifier()
r_model=RandomForestClassifier()
d_model=DecisionTreeClassifier()
lst_model=[s_model,n_model,k_model,r_model,d_model]

for i in lst_model:
    i.fit(x_train,y_train)
    y_pred=i.predict(x_test)
    print(i)
    print(''*100)
    print(confusion_matrix(y_test,y_pred))
    print(classification_report(y_test,y_pred))

```

```
[45 17 29]]
precision    recall  f1-score   support

   -1       0.41       0.81       0.55        79
    0       0.47       0.30       0.37        79
    1       0.67       0.32       0.43        91

 accuracy          0.47        249
macro avg          0.52       0.48       0.45        249
weighted avg          0.53       0.47       0.45        249
```

RandomForestClassifier()

\*\*\*\*\*

```
[[56 16 7]
 [28 41 10]
 [25 26 40]]
precision    recall  f1-score   support

   -1       0.51       0.71       0.60        79
    0       0.49       0.52       0.51        79
    1       0.70       0.44       0.54        91

 accuracy          0.55        249
macro avg          0.57       0.56       0.55        249
weighted avg          0.58       0.55       0.55        249
```

DecisionTreeClassifier()

\*\*\*\*\*

```
[[49 22 8]
 [22 37 20]
 [31 28 32]]
precision    recall  f1-score   support

   -1       0.48       0.62       0.54        79
    0       0.43       0.47       0.45        79
    1       0.53       0.35       0.42        91

 accuracy          0.47        249
macro avg          0.48       0.48       0.47        249
weighted avg          0.48       0.47       0.47        249
```