

ML Assignment 3 Scikit Learn

October 24, 2018

1 FA15-BCS-100

2 Omer Javed

2.1 Gender Prediction

2.1.1 Step 1: Import Libraries

```
In [38]: import re
         import string

In [80]: import scipy
         import pickle
         import pandas as pd
         import numpy

In [40]: import matplotlib as plt
         import seaborn as sns

In [41]: from sklearn.feature_extraction.text import *
         from sklearn.preprocessing import LabelEncoder

In [42]: from sklearn.linear_model import LogisticRegression
         from sklearn.naive_bayes import BernoulliNB
         from sklearn.ensemble import RandomForestClassifier
         from sklearn.svm import LinearSVC
         from sklearn.metrics import accuracy_score

In [43]: from prettytable import PrettyTable
         from astropy.table import Table, Column

In [44]: %matplotlib inline
```

2.1.2 Step 2: Read, Understand and Pre-process Train/Test Data

Step 2.1: Read Data Reading Train data set from a csv file

```
In [45]: train_data = pd.read_csv('train.csv')
```

Reading Test data set from a csv file

```
In [46]: test_data = pd.read_csv('test.csv')
```

Step 2.2 : Understand Data

In []:

```
In [47]: print('Train Dataset:')
        train_data
```

Train Dataset:

```
Out[47]:
```

	height	weight	hair	beard	scarf	gender
0	180.3000	196	Bald	Yes	No	Male
1	170.0000	120	Long	No	No	Female
2	178.5000	200	Short	No	No	Male
3	163.4000	110	Medium	No	Yes	Female
4	175.2222	220	Short	Yes	No	Male
5	165.0000	150	Medium	No	Yes	Female

```
In [48]: print('Train Dataset Columns:')
        train_data.columns
```

Train Dataset Columns:

```
Out[48]: Index(['height', 'weight', 'hair', 'beard', 'scarf', 'gender'], dtype='object')
```

```
In [49]: train_data.shape
```

```
Out[49]: (6, 6)
```

```
In [50]: print('Number of instaces in Train Dataset:')
        print("Train Instances: ",len(train_data))
```

Number of instaces in Train Dataset:

Train Instances: 6

```
In [51]: print('Test Dataset:')
        test_data
```

Test Dataset:

```
Out[51]:
```

	height	weight	hair	beard	scarf	gender
0	179.1	185	Long	Yes	No	Male
1	160.5	130	Short	No	No	Female
2	177.8	160	Bald	No	No	Male
3	161.1	100	Medium	No	No	Female

```
In [52]: print('Number of instaces in Test Dataset:')
        print("Test Instances: ",len(test_data))
```

Number of instances in Test Dataset:
Test Instances: 4

```
In [53]: train_data.gender.value_counts()
```

```
Out[53]: Male      3  
        Female    3  
        Name: gender, dtype: int64
```

```
In [54]: print("""  
        Training data set contain 6 instances:  
  
        \t3 train instances having label 'Male'  
        \t3 train instances having label 'Female'  
        """)
```

Training data set contain 6 instances:

```
3 train instances having label 'Male'  
3 train instances having label 'Female'
```

```
In [55]: train_data[train_data.gender == 'Male']
```

```
Out[55]:   height  weight  hair beard scarf gender  
0  180.3000    196   Bald   Yes    No   Male  
2  178.5000    200  Short   No    No   Male  
4  175.2222    220  Short   Yes    No   Male
```

```
In [56]: train_data[train_data.gender == 'Female']
```

```
Out[56]:   height  weight  hair beard scarf gender  
1   170.0    120   Long   No    No  Female  
3   163.4    110  Medium   No   Yes  Female  
5   165.0    150  Medium   No   Yes  Female
```

```
In [57]: test_data.gender.value_counts()
```

```
Out[57]: Male      2  
        Female    2  
        Name: gender, dtype: int64
```

```
In [58]: test_data[train_data.gender == 'Male']
```

```
/home/omer/anaconda3/lib/python3.7/site-packages/ipykernel_launcher.py:1: UserWarning: Boolean  
    ""Entry point for launching an IPython kernel.
```

```
Out[58]:   height  weight  hair beard scarf gender
         0   179.1    185  Long   Yes    No   Male
         2   177.8    160  Bald   No    No   Male
```

```
In [59]: test_data[train_data.gender == 'Female']
```

```
/home/omer/anaconda3/lib/python3.7/site-packages/ipykernel_launcher.py:1: UserWarning: Boolean
    ""Entry point for launching an IPython kernel.
```

```
Out[59]:   height  weight   hair beard scarf gender
         1   160.5    130  Short   No    No  Female
         3   161.1    100  Medium   No    No  Female
```

```
In [60]: print("""
    Testing data set contain 6 instances:

    \t3 test Dataset instances having label 'Male'
    \t3 test Datasets instances having label 'Female'
    """)
```

```
Testing data set contain 6 instances:
```

```
3 test Dataset instances having label 'Male'
3 test Datasets instances having label 'Female'
```

```
In [61]: train_data.describe()
```

```
Out[61]:
```

	height	weight
count	6.000000	6.000000
mean	172.070367	166.000000
std	7.049154	45.782093
min	163.400000	110.000000
25%	166.250000	127.500000
50%	172.611100	173.000000
75%	177.680550	199.000000
max	180.300000	220.000000

```
In [62]: train_data.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 6 entries, 0 to 5
Data columns (total 6 columns):
height    6 non-null float64
weight    6 non-null int64
hair      6 non-null object
```

```
beard      6 non-null object
scarf      6 non-null object
gender     6 non-null object
dtypes: float64(1), int64(1), object(4)
memory usage: 368.0+ bytes
```

```
In [63]: train_data.dtypes
```

```
Out[63]: height    float64
         weight    int64
         hair      object
         beard     object
         scarf     object
         gender    object
         dtype: object
```

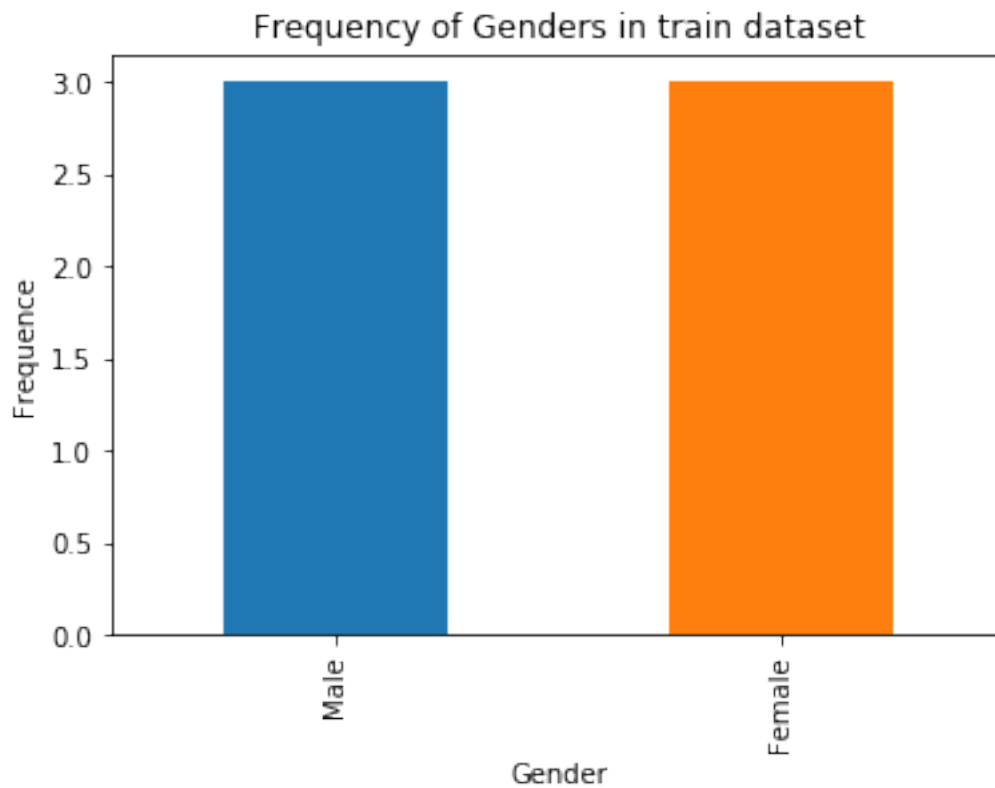
Understanding Data via Graphs

```
In [64]: print('Total number of \'Males\' and \'Females\' in Train Dataset ')
```

```
x=train_data.gender.value_counts().plot.bar(title='Frequency of Genders in train data')
x.set_xlabel('Gender')
x.set_ylabel('Frequency')
```

Total number of 'Males' and 'Females' in Train Dataset

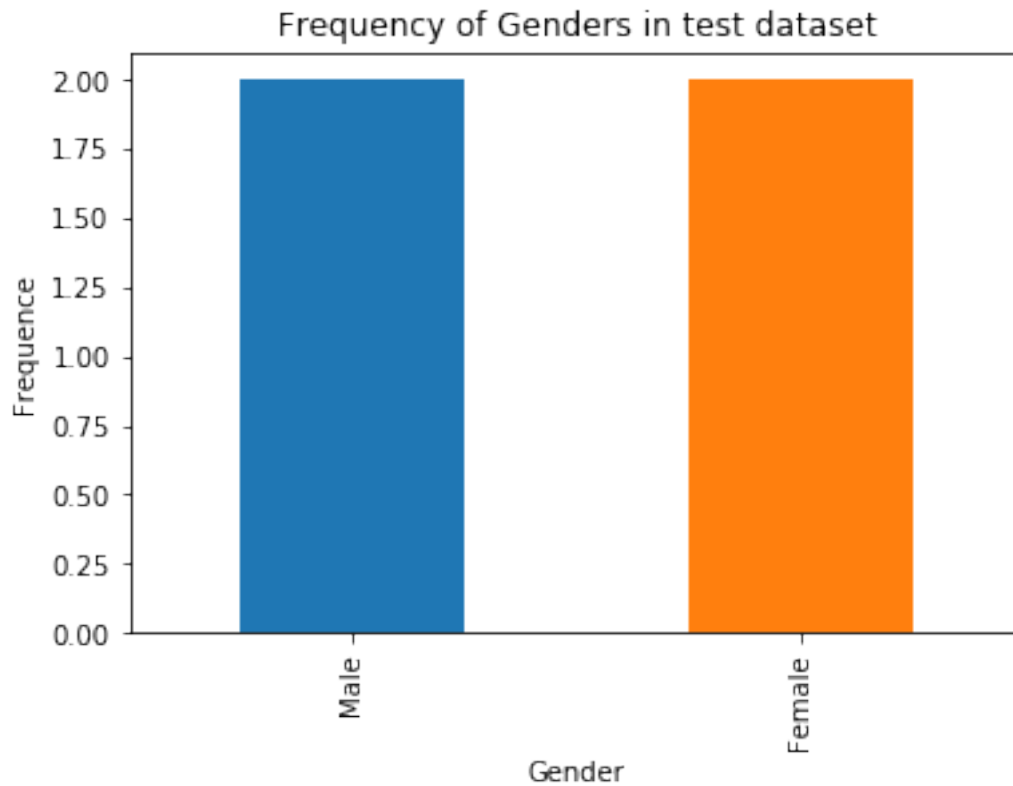
```
Out[64]: Text(0,0.5,'Frequency')
```



```
In [65]: print('Total number of \'Males\' and \'Females\' in Test Dataset ')\n         x=test_data.gender.value_counts().plot.bar(title='Frequency of Genders in test dataset')\n         x.set_xlabel('Gender')\n         x.set_ylabel('Frequency')
```

Total number of 'Males' and 'Females' in Test Dataset

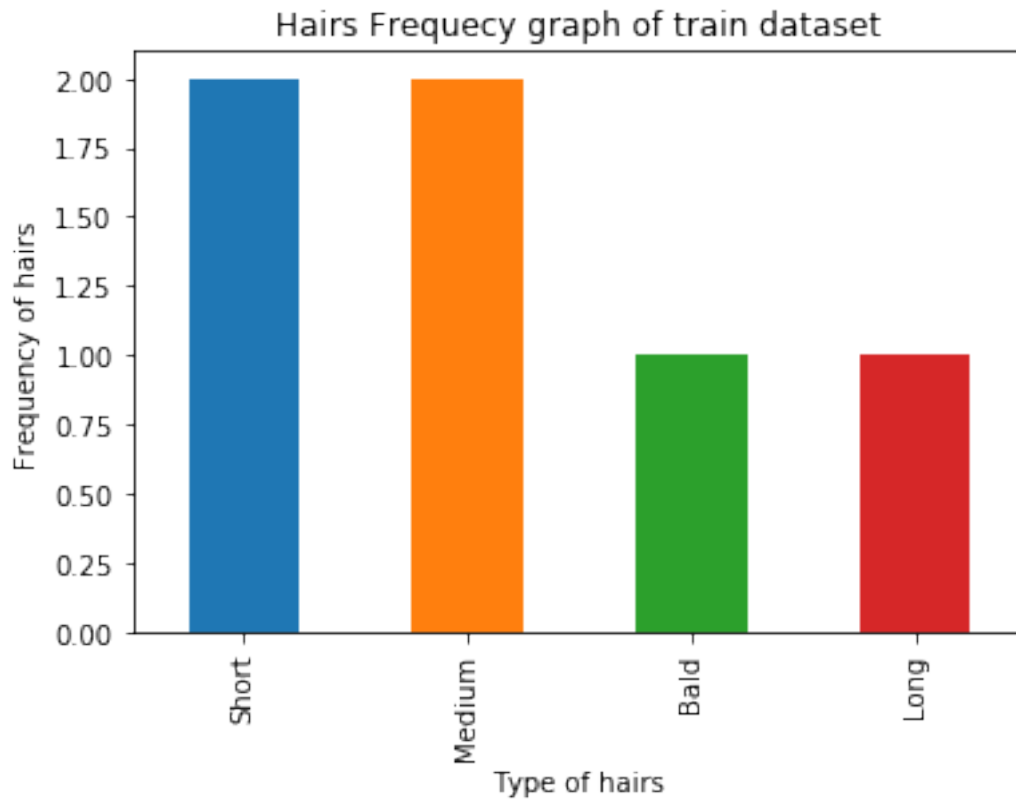
```
Out[65]: Text(0,0.5,'Frequency')
```



```
In [66]: print('Number of people having various hair length in Train dataset:')
ax = train_data.hair.value_counts().plot.bar()
ax.set_xlabel('Type of hairs')
ax.set_ylabel('Frequency of hairs')
ax.set_title('Hairs Frequency graph of train dataset')
```

Number of people having various hair length in Train dataset:

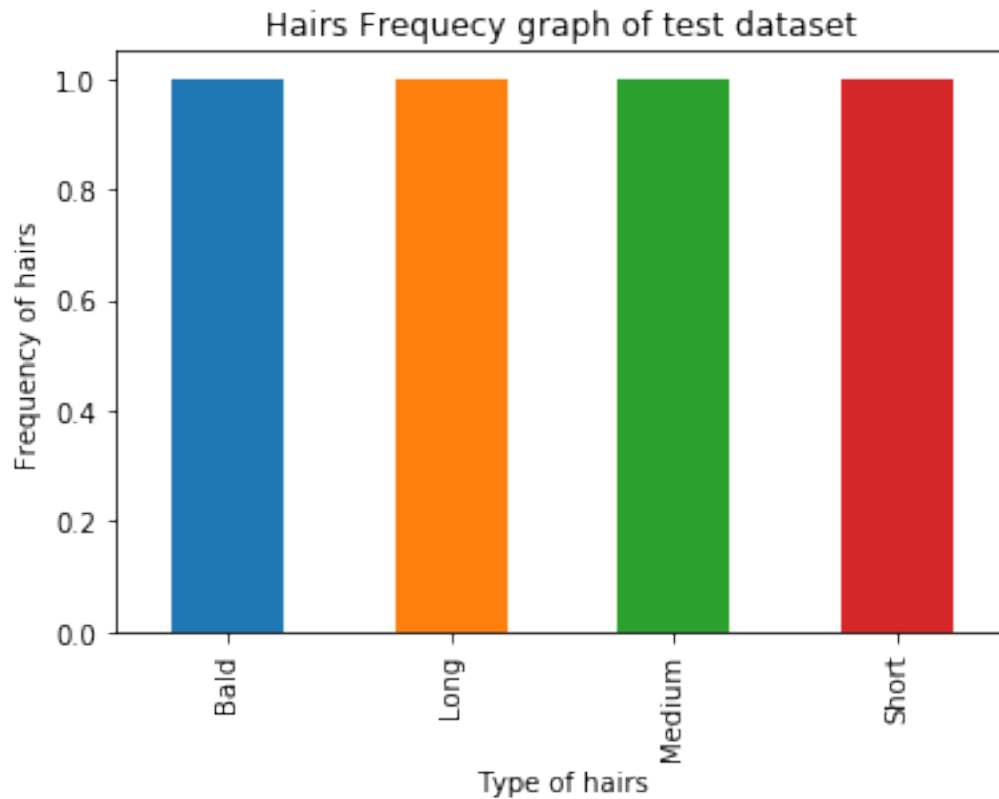
```
Out[66]: Text(0.5,1,'Hairs Frequency graph of train dataset')
```



```
In [67]: print('Number of people having various hair length in Test dataset:')
ax = test_data.hair.value_counts().plot.bar()
ax.set_xlabel('Type of hairs')
ax.set_ylabel('Frequency of hairs')
ax.set_title('Hairs Frequecy graph of test dataset')
```

Number of people having various hair length in Test dataset:

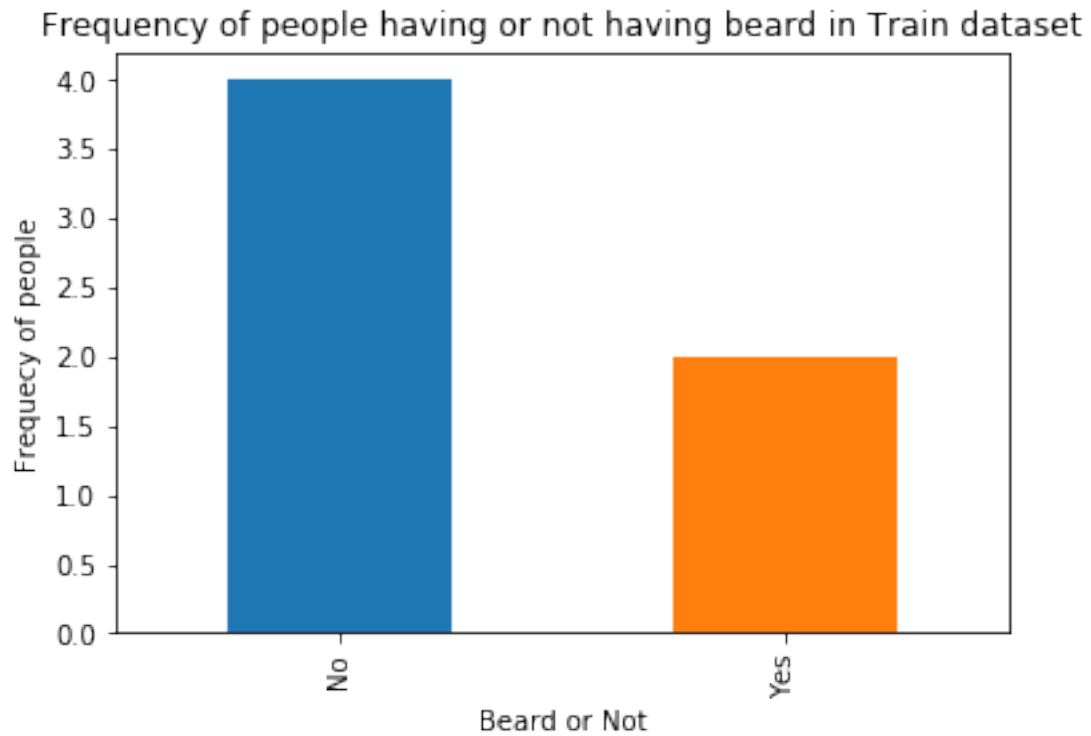
```
Out[67]: Text(0.5,1,'Hairs Frequecy graph of test dataset')
```

```
In [68]: print('Number of people have/haven\'t beard in Train dataset')
ax = train_data.beard.value_counts().plot.bar()
ax.set_xlabel('Beard or Not')
ax.set_ylabel('Frequency of people')
ax.set_title('Frequency of people having or not having beard in Train dataset')
```

Number of people have/haven't beard in Train dataset

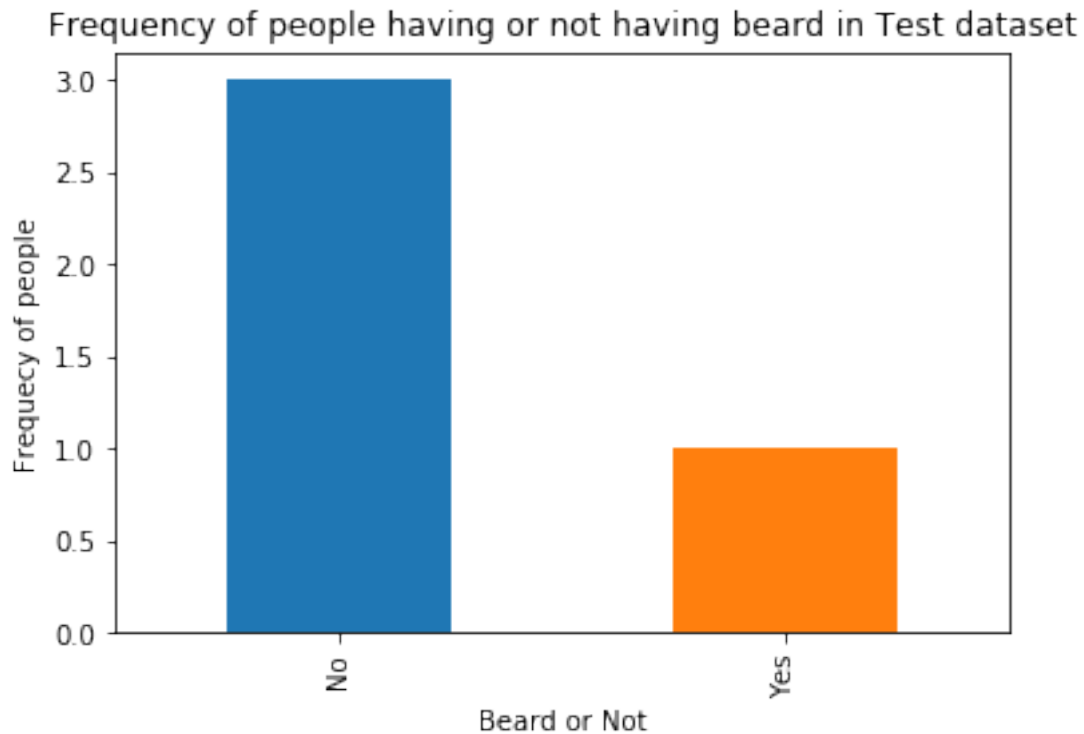
```
Out[68]: Text(0.5,1,'Frequency of people having or not having beard in Train dataset')
```



```
In [69]: print('Number of people have/haven\'t beard in Test dataset')
         ax = test_data.beard.value_counts().plot.bar()
         ax.set_xlabel('Beard or Not')
         ax.set_ylabel('Frequency of people')
         ax.set_title('Frequency of people having or not having beard in Test dataset')
```

Number of people have/haven't beard in Test dataset

```
Out[69]: Text(0.5,1,'Frequency of people having or not having beard in Test dataset')
```



2.1.3 2.3: Pre-Process Data

```
In [70]: print('Train dataset before pre-processing:')
         train_data.head()
```

Train dataset before pre-processing:

```
Out[70]:
```

	height	weight	hair	beard	scarf	gender
0	180.3000	196	Bald	Yes	No	Male
1	170.0000	120	Long	No	No	Female
2	178.5000	200	Short	No	No	Male
3	163.4000	110	Medium	No	Yes	Female
4	175.2222	220	Short	Yes	No	Male

```
In [71]: train_data.height=train_data.height.round(1)
```

```
In [72]: print('Train dataset after pre-processing')
         train_data
```

Train dataset after pre-processing

```
Out [72]:
```

	height	weight	hair	beard	scarf	gender
0	180.3	196	Bald	Yes	No	Male
1	170.0	120	Long	No	No	Female
2	178.5	200	Short	No	No	Male
3	163.4	110	Medium	No	Yes	Female
4	175.2	220	Short	Yes	No	Male
5	165.0	150	Medium	No	Yes	Female

2.1.4 Step 3 : Label Encoding for Train/Test Data

```
In [73]: encoder = LabelEncoder()
```

```
In [82]: encoder_class = dict()
for col in train_data.columns[2:]:
    encoder_class[col] = LabelEncoder()
    encoder_class[col].fit(train_data.loc[:,col])
numpy.save('Encoder_class.npy',encoder_class)
```

```
In [83]: print('Gender Attribute Encoding in Train Dataset:')
x = pd.DataFrame(train_data.gender)
x['Encoded Gender ']=encoder_class['gender'].transform(train_data.gender)
x
```

Gender Attribute Encoding in Train Dataset:

```
Out [83]:
```

	gender	Encoded Gender
0	Male	1
1	Female	0
2	Male	1
3	Female	0
4	Male	1
5	Female	0

```
In [84]: print('Beard Attribute Encoding in Train Dataset:')
x = pd.DataFrame(train_data.beard)
x['Encoded Beard ']= encoder_class['beard'].transform(train_data.beard)
x
```

Beard Attribute Encoding in Train Dataset:

```
Out [84]:
```

	beard	Encoded Beard
0	Yes	1
1	No	0
2	No	0
3	No	0
4	Yes	1
5	No	0

In []:

```
In [85]: print('Scarf Attribute Encoding in Train Dataset:')
x = pd.DataFrame(train_data.scarf)
x['Encoded Scraf ']= encoder_class['scarf'].transform(train_data.scarf)
x
```

Scarf Attribute Encoding in Train Dataset:

```
Out[85]:   scarf  Encoded Scraf
0     No           0
1     No           0
2     No           0
3    Yes           1
4     No           0
5    Yes           1
```

```
In [86]: print('Hair Attribute Encoding in Train Dataset:')
x = pd.DataFrame(train_data.hair)
x['Encoded Hair ']= encoder_class['hair'].transform(train_data.hair)
x
```

Hair Attribute Encoding in Train Dataset:

```
Out[86]:   hair  Encoded Hair
0    Bald           0
1    Long           1
2   Short           3
3  Medium           2
4   Short           3
5  Medium           2
```

```
In [87]: print('Orignal Train Data:')
train_data
```

Original Train Data:

```
Out[87]:   height  weight   hair beard scarf  gender
0   180.3    196   Bald   Yes   No   Male
1   170.0    120   Long   No   No  Female
2   178.5    200  Short   No   No   Male
3   163.4    110  Medium   No  Yes  Female
4   175.2    220  Short   Yes   No   Male
5   165.0    150  Medium   No  Yes  Female
```

```
In [88]: Encoded_train_data = train_data.copy()
        for c in Encoded_train_data.iloc[:,2:].columns:
            Encoded_train_data[c] = encoder_class[c].transform(Encoded_train_data[c])
        print('Train Data after Label Encoding:')
        Encoded_train_data
```

Train Data after Label Encoding:

```
Out [88]:
```

	height	weight	hair	beard	scarf	gender
0	180.3	196	0	1	0	1
1	170.0	120	1	0	0	0
2	178.5	200	3	0	0	1
3	163.4	110	2	0	1	0
4	175.2	220	3	1	0	1
5	165.0	150	2	0	1	0

```
In [89]: print('Original Test Data:')
        test_data
```

Original Test Data:

```
Out [89]:
```

	height	weight	hair	beard	scarf	gender
0	179.1	185	Long	Yes	No	Male
1	160.5	130	Short	No	No	Female
2	177.8	160	Bald	No	No	Male
3	161.1	100	Medium	No	No	Female

```
In [90]: Encoded_test_data = test_data.copy()
        for c in Encoded_test_data.iloc[:,2:].columns:
            Encoded_test_data[c] = encoder_class[c].transform(Encoded_test_data[c])
        print('Test Data after Label Encoding:')
        Encoded_test_data
```

Test Data after Label Encoding:

```
Out [90]:
```

	height	weight	hair	beard	scarf	gender
0	179.1	185	1	1	0	1
1	160.5	130	3	0	0	0
2	177.8	160	0	0	0	1
3	161.1	100	2	0	0	0

2.2 Step 5: Train ML Algorithm using Train Data

```
In [91]: train_X = Encoded_train_data.drop('gender',axis = 1)
        train_y = Encoded_train_data['gender']
```

```
In [92]: train_X
```

```
Out [92]:
```

	height	weight	hair	beard	scarf
0	180.3	196	0	1	0
1	170.0	120	1	0	0
2	178.5	200	3	0	0
3	163.4	110	2	0	1
4	175.2	220	3	1	0
5	165.0	150	2	0	1

```
In [93]: train_y
```

```
Out [93]:
```

0	1
1	0
2	1
3	0
4	1
5	0

Name: gender, dtype: int64

```
In [94]: test_X = Encoded_test_data.drop('gender',axis = 1)
test_y = Encoded_test_data['gender']
```

```
In [95]: test_X
```

```
Out [95]:
```

	height	weight	hair	beard	scarf
0	179.1	185	1	1	0
1	160.5	130	3	0	0
2	177.8	160	0	0	0
3	161.1	100	2	0	0

```
In [96]: test_y
```

```
Out [96]:
```

0	1
1	0
2	1
3	0

Name: gender, dtype: int64

Logistic Regression Parameters Parameters and their values:

LogisticRegression(penalty='l2', dual=False, tol=0.0001, C=1.0, fit_intercept=True, intercept_scaling=1, class_weight=None, random_state=None, solver='liblinear', max_iter=100, multi_class='ovr', verbose=0, warm_start=False, n_jobs=1)

```
In [117]: from sklearn.linear_model import LogisticRegression
LogisticRegression = LogisticRegression()
LogisticRegression.fit(train_X,train_y)
LogisticRegression_prediction = LogisticRegression.predict(test_X)
accuracy_LogisticRegression = accuracy_score(test_y,LogisticRegression_prediction)
```

Random forest Parameters Parameters and their values:

RandomForestClassifier(n_estimators=10, criterion='gini', max_depth=None, min_samples_split=2, min_samples_leaf=1, min_weight_fraction_leaf=0.0, max_features='auto', max_leaf_nodes=None, min_impurity_decrease=0.0, min_impurity_split=None, bootstrap=True, oob_score=False, n_jobs=1, random_state=None, verbose=0, warm_start=False, class_weight=None) Docstring:

A random forest classifier.

A random forest is a meta estimator that fits a number of decision tree classifiers on various sub-samples of the dataset and use averaging to improve the predictive accuracy and control overfitting. The sub-sample size is always the same as the original input sample size but the samples are drawn with replacement if bootstrap=True (default).

```
In [118]: from sklearn.ensemble import RandomForestClassifier
RandomForestClassifier = RandomForestClassifier()
RandomForestClassifier.fit(train_X,train_y)
RandomForestClassifier_prediction = RandomForestClassifier.predict(test_X)
accuracy_RandomForestClassifier = accuracy_score(test_y,RandomForestClassifier_predi
```

Linear SVC Parameters Parameters and their values:

LinearSVC(penalty='l2', loss='squared_hinge', dual=True, tol=0.0001, C=1.0, multi_class='ovr', fit_intercept=True, intercept_scaling=1, class_weight=None, verbose=0, random_state=None, max_iter=1000) Docstring:

Linear Support Vector Classification.

Similar to SVC with parameter kernel='linear', but implemented in terms of liblinear rather than libsvm, so it has more flexibility in the choice of penalties and loss functions and should scale better to large numbers of samples.

```
In [119]: from sklearn.svm import LinearSVC
LinearSVC = LinearSVC()
LinearSVC.fit(train_X,train_y)
prediction = LinearSVC.predict(test_X)
accuracy_LinearSVC = accuracy_score(test_y,prediction)
```

BernoulliNB Parameters and their values:

BernoulliNB(alpha=1.0, binarize=0.0, fit_prior=True, class_prior=None)

```
In [120]: from sklearn.naive_bayes import BernoulliNB
BernoulliNB = BernoulliNB()
BernoulliNB.fit(train_X,train_y)
prediction = BernoulliNB.predict(test_X)
accuracy_BernoulliNB = accuracy_score(test_y,prediction)
```

2.2.1 Step 6: Evaluate ML Algorithms using Test Data

Logistic Regression Classifier

```
In [121]: x=test_data.copy()
x['predicted_gender']=encoder_class['gender'].inverse_transform(LogisticRegression_p
```



```
/home/omer/anaconda3/lib/python3.7/site-packages/sklearn/preprocessing/label.py:151: Deprecati
if diff:
```

```
In [122]: print('Prediction using Logistic Regression\n')
          print(x)
          print('\nAccuracy Score = ',accuracy_LogisticRegression)
```

Prediction using Logistic Regression

	height	weight	hair	beard	scarf	gender	predicted_gender
0	179.1	185	Long	Yes	No	Male	Male
1	160.5	130	Short	No	No	Female	Female
2	177.8	160	Bald	No	No	Male	Female
3	161.1	100	Medium	No	No	Female	Female

Accuracy Score = 0.75

Random Forest Classifier

```
In [123]: x=test_data.copy()
          x['predicted_gender']=encoder_class['gender'].inverse_transform(RandomForestClassifi
```

```
/home/omer/anaconda3/lib/python3.7/site-packages/sklearn/preprocessing/label.py:151: Deprecati
if diff:
```

```
In [124]: print('Prediction using RandomForestClassifier\n')
          print(x)
          print('\nAccuracy Score = ',accuracy_RandomForestClassifier)
```

Prediction using RandomForestClassifier

	height	weight	hair	beard	scarf	gender	predicted_gender
0	179.1	185	Long	Yes	No	Male	Male
1	160.5	130	Short	No	No	Female	Female
2	177.8	160	Bald	No	No	Male	Male
3	161.1	100	Medium	No	No	Female	Female

Accuracy Score = 1.0

BernoulliNB

```
In [125]: x=test_data.copy()
          x['predicted_gender']=encoder_class['gender'].inverse_transform(prediction)
```

```
/home/omer/anaconda3/lib/python3.7/site-packages/sklearn/preprocessing/label.py:151: Deprecati
if diff:
```

```
In [126]: print('Prediction using BernoulliNB\n')
          print(x)
          print('\nAccuracy Score = ',accuracy_BernoulliNB)
```

Prediction using BernoulliNB

	height	weight	hair	beard	scarf	gender	predicted_gender
0	179.1	185	Long	Yes	No	Male	Male
1	160.5	130	Short	No	No	Female	Female
2	177.8	160	Bald	No	No	Male	Male
3	161.1	100	Medium	No	No	Female	Female

Accuracy Score = 1.0

LinearSVC

```
In [127]: x=test_data.copy()
          x['predicted_gender']=encoder_class['gender'].inverse_transform(prediction)
```

/home/omer/anaconda3/lib/python3.7/site-packages/sklearn/preprocessing/label.py:151: DeprecationWarning: `LabelEncoder.inverse_transform` is deprecated in favor of `LabelEncoder.inverse_transform_`. If diff:

```
In [128]: print('Prediction using LinearSVC\n')
          print(x)
          print('\nAccuracy Score = ',accuracy_LinearSVC)
```

Prediction using LinearSVC

	height	weight	hair	beard	scarf	gender	predicted_gender
0	179.1	185	Long	Yes	No	Male	Male
1	160.5	130	Short	No	No	Female	Female
2	177.8	160	Bald	No	No	Male	Male
3	161.1	100	Medium	No	No	Female	Female

Accuracy Score = 0.75

2.2.2 Step 7: Selection of Best Model

```
In [130]: models = pd.DataFrame({'Models':
                                ['LogisticRegression',
                                 'RandomForestClassifier',
                                 'LinearSVC',
                                 'BernoulliNB'],
                                'Accuracy':[accuracy_LogisticRegression,
                                              accuracy_RandomForestClassifier,
                                              accuracy_LinearSVC,
```

```

        accuracy_BernoulliNB]
    })

```

```

In [131]: print('Detail Performance of all the models')
          models

```

Detail Performance of all the models

```

Out[131]:
          Models  Accuracy
0      LogisticRegression    0.75
1  RandomForestClassifier    1.00
2          LinearSVC        0.75
3          BernoulliN        1.00

```

```

In [132]: print("Best Model")
          models.max()

```

Best Model

```

Out[132]: Models      RandomForestClassifier
          Accuracy      1
          dtype: object

```

2.2.3 Step 8: Application Phase

2.2.4 Step 8.1: Combine Data (Train+Test)

```

In [133]: print('Train Features in form of Datafram:\n')
          print(Encoded_train_data)

```

Train Features in form of Datafram:

	height	weight	hair	beard	scarf	gender
0	180.3	196	0	1	0	1
1	170.0	120	1	0	0	0
2	178.5	200	3	0	0	1
3	163.4	110	2	0	1	0
4	175.2	220	3	1	0	1
5	165.0	150	2	0	1	0

```

In [134]: print('Test Features in form of Datafram:\n')
          print(Encoded_test_data)

```

Test Features in form of Datafram:

	height	weight	hair	beard	scarf	gender
0	179.1	185	1	1	0	1

1	160.5	130	3	0	0	0
2	177.8	160	0	0	0	1
3	161.1	100	2	0	0	0

```
In [135]: train_test_data = pd.concat([Encoded_train_data,Encoded_test_data],axis=0)
```

```
In [136]: print('All Features in form of Dataframe:')
          train_test_data
```

All Features in form of Dataframe:

```
Out[136]:
```

	height	weight	hair	beard	scarf	gender
0	180.3	196	0	1	0	1
1	170.0	120	1	0	0	0
2	178.5	200	3	0	0	1
3	163.4	110	2	0	1	0
4	175.2	220	3	1	0	1
5	165.0	150	2	0	1	0
0	179.1	185	1	1	0	1
1	160.5	130	3	0	0	0
2	177.8	160	0	0	0	1
3	161.1	100	2	0	0	0

2.2.5 Step 8.2: Train Best Model on All Data

Which is Random forest in our case

```
In [137]: RandomForestClassifier
```

```
Out[137]: RandomForestClassifier(bootstrap=True, class_weight=None, criterion='gini',
                                max_depth=None, max_features='auto', max_leaf_nodes=None,
                                min_impurity_decrease=0.0, min_impurity_split=None,
                                min_samples_leaf=1, min_samples_split=2,
                                min_weight_fraction_leaf=0.0, n_estimators=10, n_jobs=1,
                                oob_score=False, random_state=None, verbose=0,
                                warm_start=False)
```

```
In [138]: from sklearn.ensemble import RandomForestClassifier
          RandomForestClassifier = RandomForestClassifier()
          X = train_test_data.drop('gender',axis=1)
          y = train_test_data['gender']

          trainedModel = RandomForestClassifier.fit(scipy.sparse.csr_matrix(X),y)
```

2.2.6 Step 8.3: Save the trained Model

```
In [139]: f = open('trainedModelfile','wb')
          pickle.dump(trainedModel,f)
          f.close()
```

2.3 Step 9.1 Load the Traind Model

```
In [140]: f = open('trainedModelfile','rb')

         trained_model = pickle.load(f)
         f.close()
```

2.3.1 Step 9.2: Take inputs from User

```
In [142]: height = input('Please enter your Height here (centimeter): ')
```

Please enter your Height here (centimeter): 170

```
In [143]: round(float(height),3)
```

```
Out[143]: 170.0
```

```
In [144]: weight = input('Please enter your Weight here (Kg): ')
```

Please enter your Weight here (Kg): 120

```
In [145]: hair = input('Please enter your Hair Length here (Bald/Long/Short/Medium): ')
```

Please enter your Hair Length here (Bald/Long/Short/Medium): Long

```
In [146]: beard = input('Do you have beard? (Yes/No)')
```

Do you have beard? (Yes/No)Yes

```
In [147]: scraf = input('Do you wear Scarf? (Yes/No)')
```

Do you wear Scarf? (Yes/No)Yes

2.3.2 Step 9.3: Convert User input into Feature Vector

```
In [148]: input_feature_vector = pd.DataFrame({'height':[round(float(height),1)],
                                              'weight':[weight],
                                              'hair':[hair],
                                              'beard':[beard],
                                              'scarf':[scraf]
                                              })
```

```
In [149]: Encoded_input_feature_vector = input_feature_vector.copy()
```

```
In [150]: print('User input in Actual DataFrame form:')
         input_feature_vector
```

User input in Actual DataFrame form:

```
Out[150]:    height weight  hair beard scarf
          0   170.0   120  Long   Yes   Yes
```

```
In [151]: encoder_class =numpy.load('Encoder_class.npy').all()
```

```
In [152]: Encoded_input_feature_vector = input_feature_vector.copy()
          for c in Encoded_input_feature_vector.iloc[:,2:].columns:
              Encoded_input_feature_vector[c] = encoder_class[c].transform(Encoded_input_featu
          print('User input in Encoded DataFrame form:')
          Encoded_input_feature_vector
```

User input in Encoded DataFrame form:

```
Out[152]:    height weight  hair  beard  scarf
          0   170.0   120     1     1     1
```

```
In [153]: print('User input in Actual DataFrame form:\n\n',input_feature_vector)
          print('\nUser input in Encoded DataFrame form:\n\n',Encoded_input_feature_vector)
```

User input in Actual DataFrame form:

```
    height weight  hair beard scarf
0   170.0   120  Long   Yes   Yes
```

User input in Encoded DataFrame form:

```
    height weight  hair  beard  scarf
0   170.0   120     1     1     1
```

2.3.3 Step 9.4 Apply Trained Model on Feature Vector of Unseen Data and Output Prediction to User

```
In [154]: prediction_of_user_input = trained_model.predict(Encoded_input_feature_vector)
          prediction_of_user_input
```

```
Out[154]: array([0])
```

```
In [155]: decoded_prediction_of_user_input = encoder_class['gender'].inverse_transform(predicti
/home/omer/anaconda3/lib/python3.7/site-packages/sklearn/preprocessing/label.py:151: Deprecati
if diff:
```

```
In [156]: print("Prediction : ",decoded_prediction_of_user_input)
```

Prediction : Female