

# PROJECT REPORT

# INT 247 MACHINE LEARNING FOUNDATION

Submitted By:

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## GitHub link:

github.com/Nikhilkataru07/ML\_ClassificationTechniques

#### I. Problem:

Analyze the difficulty level of course using Classification techniques

# II. Software requirement analysis:

#### **Software and Libraries**

This project uses the following software and Python libraries:

**Anaconda**: Anaconda is a free and open-source distribution of the Python and R programming languages for scientific computing, that aims to simplify package management and deployment. We need to have this software installed to run and execute a **Jupyter Notebook**.

**Jupyter Notebook** is a web application that allows you to create and share documents that contain:

- live code (e.g. Python code)
- visualizations
- explanatory text (written in markdown syntax)

Jupyter Notebook is great for the following use cases:

- learn and try out Python
- data processing / transformation
- numeric simulation
- statistical modeling

**Python:** Python is a general-purpose interpreted, interactive, object-oriented, and high-level programming language.

**NumPy:** NumPy, which stands for Numerical Python, is a library consisting of multidimensional array objects and a collection of routines for processing those arrays. Using NumPy, mathematical and logical operations on arrays can be performed.

**Pandas**: Pandas is a software library written for the Python programming language for data manipulation and analysis. In particular, it offers data structures and operations for manipulating numerical tables and time series.

**Scikit-learn:** Scikit-learn is a free software machine learning library for the Python programming language. It features various classification, regression and clustering algorithms including support vector machines, random forests, gradient boosting, k-means and DBSCAN, and is designed to interoperate with the Python numerical and scientific libraries NumPy and SciPy.

**Matplotlib**: Matplotlib is one of the most popular Python packages used for data visualization. It is a cross-platform library for making 2D plots from data in arrays. It provides an object-oriented API that helps in embedding plots in applications using Python GUI toolkits such as PyQt, WxPythonotTkinter. It can be used in Python and IPython shells, Jupyter notebook and web application servers also.

I have used the Anaconda distribution of Python, which already has the above packages and more included.

# III. Design

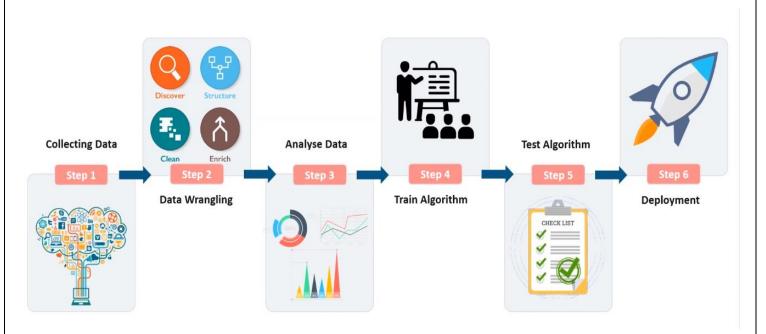


FIG 1: Life Cycle

Step1: Collecting Data – Gathering data, Bachelor of Technology (Cyber Security) Dataset

Step2: Data Wrangling – Cleaning data to have homogeneity

Step 3: Analyze Data – Data Visualization, Transforming the data into visual graphs

Step 4,5: Train & Test -Model Building & selecting the right ML algorithm

Step 6: Deployment – Gaining insights from the model's results, transforming results into visual graphs

IV.

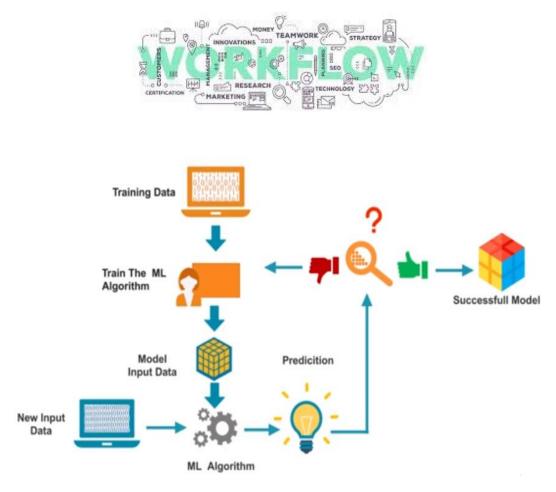


FIG 2: Workflow

# V. Implementation

#### **Data Collection**

```
1 [86]: #Importing Required Libraries
         %matplotlib inline
         import numpy as np
         import pandas as pd
         import matplotlib.pvplot as plt
         import seaborn as sea
1 [87]: #dataset
         df=pd.read_csv('dataset.csv')
        df
it[87]:
                 Termid Regd No
                                  Course Grade CA_100 MTT_50 ETT_100 ETP_100 Course_Att MHRDName ... CA_3 CA_4 Height Weight ScholarTyp
                                                                                                Bachelor of
                                                                                                 Science
(Honours)
             0 318192 1101776
                                                                                                                1.0
                                                                                                (Agriculture)
                                                                                                Bachelor of
                                                                                                   Science
                                                            47.0
             1 318192 1101776 KVY147
                                             A+
                                                    87.0
                                                                     65.0
                                                                               85.0
                                                                                                                0.0
                                                                                                                      1.0
                                                                                                                             181
                                                                                                                                      65
                                                                                                                                              Hostle
                                                                                                 (Honours)
                                                                                                (Agriculture)
                                                                                                Bachelor of
```

```
[88]: #rows and colums of the datase
            print('Rows :'+str(df.shape[0]))
print('Columns :'+str(df.shape[1]))
            print(df['MHRDName'].value_counts())
            Columns: 222
Bachelor of Science (Honours) (Agriculture)
Bachelor of Technology in Computer Science and Engineering (Big Data)
Bachelor of Technology (Computer Science and Engineering)
Bachelor of Technology in Computer Science and Engineering (Android Application Development)
Bachelor of Technology in Electronics and Communication Engineering (Internet of Things)
                                                                                                                                                                                                                                        7707
                                                                                                                                                                                                                                       5493
                                                                                                                                                                                                                                        4900
                                                                                                                                                                                                                                       4324
                                                                                                                                                                                                                                        3917
            Bachelor of Technology in Computer Science and Engineering (Internet Bachelor of Technology in Computer Science and Engineering (Data Science)
Bachelor of Technology (Mechanical Engineering)
Bachelor of Technology (Electronics and Communication Engineering)
Bachelor of Technology (Civil Engineering)
Bachelor of Technology in Mechanical Engineering (Robotics and Mechatronics)
                                                                                                                                                                                                                                        3705
                                                                                                                                                                                                                                        3238
                                                                                                                                                                                                                                        3209
                                                                                                                                                                                                                                        3077
                                                                                                                                                                                                                                        2692
            Bachelor of Computer Applications
                                                                                                                                                                                                                                       1719
            Bachelor of Technology in Computer Science and Engineering (Machine Learning)
                                                                                                                                                                                                                                        1716
            Bachelor of Architecture
Bachelor of Technology in Computer Science and Engineering (Full Stack Web Developer)
                                                                                                                                                                                                                                       1577
                                                                                                                                                                                                                                       1388
            Bachelor of Technology in Computer Science and Engineering (Cyber Security) Diploma in Computer Science Engineering
                                                                                                                                                                                                                                       1365
                                                                                                                                                                                                                                       1110
            Bachelor of Technology (Electrical and Electronics Engineering)
Bachelor of Technology in Computer Science and Engineering (Cloud Computing)
Bachelor of Technology (Biotechnology)
Bachelor of Science (Honours) (Agriculture)
                                                                                                                                                                                                                                         981
                                                                                                                                                                                                                                         882
                                                                                                                                                                                                                                         822
                                                                                                                                                                                                                                         818
            Diploma in Mechanical Engineering
            Bachelor of Technology (Electrical Engineering)
                                                                                                                                                                                                                                         622
          Integrated Bachelor of Science - Master of Science (Chemistry)
                                                                                                                                                                                                                                         4
          Master of Planning (Urban)
Bachelor of Technology in Automobile Engineering
          Master of Science in Agriculture Horticulture (Fruit Science)
Bachelor of Technology in Information Technology
         Master of Science Ag. (Plant Pathology)
Master of Technology (Automobile Engineering)
Master of Science in Agriculture (Soil Science and Agriculture Chemistry)
Bachelor of Science (Honours) (Chemistry)
          Dual Degree Bachelor of Technology (Civil Engineering) - Master of Business Administration
Integrated Bachelor of Science - Master of Science (Botany)
         Integrated Backelor of Science - Master of Science (Botany)
Master of Science (Honours) (Biochemistry)
Master of Technology (VLSI Design)
Master of Science in Agriculture (Genetics and Plant Breeding)
Master of Technology (Power Systems)
Master of Technology (Civil Engineering)
Master of Technology (Civil Engineering)
          Name: MHRDName, Length: 135, dtype: int64
39]: #filtering the required data B.Tech (Cyber Security)
df=df[df['MHRDName']=="Bachelor of Technology in Computer Science and Engineering (Cyber Security)"]
30]: #shape of the newly formed dataset
print("Rows :"+str(df.shape[0]))
          print("Columns :"+str(df.shape[1]))
          Rows :1365
          Columns :22
```

## **Data Preprocessing**

91]: #displaying the features and its values df.head(10)

91]:

	Termid	Regd No	Course	Grade	CA_100	MTT_50	ETT_100	ETP_100	Course_Att	MHRDName	 CA_3	CA_4	Height	Weight	ScholarType	Directio
47	218192	1113776	KHZ28	B+	57.0	17.0	56.0	NaN	93.0	Bachelor of Technology in Computer Science and	 12.0	1.0	167	90	Day Scholar	Eas
48	218192	1113776	KHZ51	С	21.0	25.0	59.0	NaN	83.0	Bachelor of Technology in Computer Science and	 0.0	1.0	167	90	Day Scholar	Eas
49	218192	1113776	KHZ52	А	96.0	NaN	NaN	56.0	89.0	Bachelor of Technology in Computer Science and	 5.0	58.0	167	90	Day Scholar	Eas
50	218192	1113776	KHZ53	B+	54.0	30.0	69.0	NaN	67.0	Bachelor of Technology in Computer Science and	 4.0	8.0	167	90	Day Scholar	Eas
										Bachelor of						

```
[95]: #Mapping the feature 'grade' with numeric values so as to calculate the difficulty level of the course
grade_map={'O':10, 'A+':9, 'A':8, 'B+':7, 'B':6, 'C':5, 'D':4, 'E':3, 'F':2}
df['Grade']=df['Grade'].map(grade_map)
df['Grade']
           C:\Users\DELL\Anaconda3\lib\site-packages\ipykernel_launcher.py:3: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFrame. Try using .loc[row_indexer,col_indexer] = value instead
           See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy
This is separate from the ipykernel package so we can avoid doing imports until
95]: 47
           48
           49
50
51
52
53
54
55
                               8
7
                               8
                               6
           604
                               9
           605
           606
607
                               8
           608
609
           610
```

```
[96]: #Label Encoder
#coverting the string type values
from sklearn.preprocessing import LabelEncoder
le=LabelEncoder()
#converting the Course & Gender features values into numeric type
df['Course']=le.fit_transform(df['Course'])
df['Gender']=le.fit_transform(df['Gender'])
#display data
df.head(5)
```

```
[92]: #dropping the features that are not required as per the problem statement df.drop(['Termid','Regd No','MHRDName', 'CA_1', 'CA_2','CA_3','CA_4','Height','ScholarType','Direction','CourseType',
                   4
                  \verb|C:\USers\DELL\Anaconda3| lib\site-packages\pandas\core\frame.py: 3940: Setting With Copy Warning: Property of the packages of the packages
                  A value is trying to be set on a copy of a slice from a DataFrame
                   See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy
                  errors=errors)
 [93]: #dataset after dropping features
                   df.head(5)
 :[93]:
                            Course Grade CA_100 MTT_50 ETT_100 ETP_100 Course_Att Gender
                   47 KHZ28
                                                     B+
                                                                     57.0 17.0
                                                                                                              56.0
                                                                                                                                  NaN
                                                                                                                                                              93.0
                                                                                                                                                                                Male
                                                                     21.0
                                                                                         25.0
                                                                                                               59.0
                                                                                                                                                               83.0
                                                                                      NaN
                    49 KHZ52
                                                    Α
                                                                    96.0
                                                                                                              NaN
                                                                                                                                  56.0
                                                                                                                                                              89.0
                                                                                                                                                                                Male
                     50 KHZ53
                                                   B+
                                                                     54.0
                                                                                        30.0
                                                                                                               69.0
                                                                                                                                   NaN
                                                                                                                                                               67.0
                                                                                                                                                                                Male
                    51 KHZ54 D 64.0 8.0 42.0 NaN
                                                                                                                                                              68.0
                                                                                                                                                                                Male
 [94]: #detailed Data
                   df.describe()
 :[94]:
 print(df.isnull().sum())
                     Course
                                                               0
                     Grade
CA_100
MTT_50
                    ETT_100
ETP_100
Course_Att
Gender
dtype: int64
                                                            344
                                                        1021
1 [98]: #Eliminating the null values
                    #Eliminating the null values from sklearn.preprocessing import Imputer
#strategy used here is mean which is the average of all the values belonging to that particular feature
#we can use other strategies 'most_frequent' , 'median' as well
#im=Imputer(missing_values=np.nan,strategy='most-frequent',axis=0)
#im=Imputer(missing_values=np.nan,strategy='median',axis=0)
                    im-Imputer(missing_values=np.nan,strategy='mean',axis=0)
df['MTT_50']=\m.fit_transform(df[['MTT_50']].values)
df['ETT_100']=\m.fit_transform(df[['ETT_100']].values)
df['ETP_100']=\m.fit_transform(df[['ETP_100']].values)
                                          64544 False False
                                                                                False False
                                                                                                                            False
                                                                                                                                               False
                                                                                                                                                                              False
                                                                                                                                                                                                  False
                        64545
                                        False False
                                                                                 False
                                                                                                    False
                                                                                                                            False
                                                                                                                                                   False
                                                                                                                                                                              False
                                                                                                                                                                                                  False
                        64546 False False False
                                                                                                                            False
                                                                                                                                                  False
                                                                                                                                                                              False
                                                                                                                                                                                                  False
                      1365 rows x 8 columns
  [100]: #data after inserting new values
                      print(df.isnull().sum())
                      Course
                      Grade
                                                            0
                      CA 100
                                                            0
                      MTT_50
                                                            0
                      ETT 100
                                                            0
                      Course_Att
                                                            0
                      Gender
                      dtype: int64
 [101]: #display data
                      df.head(5)
 :[101]:
```

Course Grade CA\_100 MTT\_50 ETT\_100 ETP\_100 Course\_Att Gender

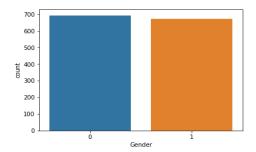
47 3 7 57.0 17.000000 56.000000 69.270349 93.0

# **Data Visualization**

## **Analysing Data**

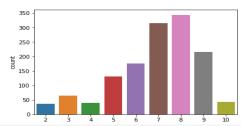
```
02]: #number of male and female
sea.countplot(x="Gender", data=df)
df['Gender'].value_counts()
```

02]: 0 693 1 672 Name: Gender, dtype: int64



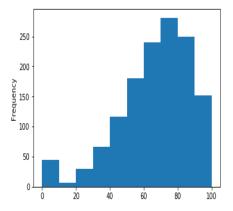
```
[103]: #grades comparison
sea.countplot(x="Grade", data=df)
df['Grade'].value_counts()
```

103]: 8 344 7 315 9 215 6 176 5 131 3 64 10 43 4 40 2 37 Name: Grade, dtype: int64



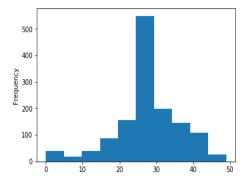
```
[108]: df["CA_100"].plot.hist()
```

[108]: <matplotlib.axes.\_subplots.AxesSubplot at 0x2673e90a4e0>

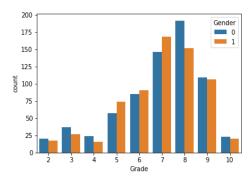


```
05]: df["MTT_50"].plot.hist()
```

05]: <matplotlib.axes.\_subplots.AxesSubplot at 0x2673e7eb9e8>



- 4]: #Grades and gender comparison sea.countplot(x="Grade",hue='Gender',data=df)
- 4]: <matplotlib.axes.\_subplots.AxesSubplot at 0x2673e753f60>



## **Random Forest Classifier**

```
121]: from sklearn.ensemble import RandomForestClassifier
```

```
122]: from sklearn.ensemble import RandomForestClassifier
ran=RandomForestClassifier(n_estimators=100,criterion='gini',max_features=5)
ran.fit(X_train,y_train)
ran_pred=ran.predict(X_test)
# comparing actual response values (y_test) with predicted response values (y_pred)
print("RandomForestClassifier")
print("Accuracy_score :")
print(accuracy_score(y_test,ran_pred))
print("r2_score(y_test,ran_pred))

BandomForestClassifier
```

RandomForestClassifier Accuracy Score : 0.7585365853658537 r2\_score : 0.9260916590672916

126]: print("Comparing the accuracy values attained from the above models, SVC is best model for the given dataset with an accuracy\_t

Comparing the  $\,$  accuracy values attained from the  $\,$  above models, SVC is best model for the given dataset with an accuracy\_score of about 0.83

#### **Decision Tree Classifier**

```
119]: from sklearn.tree import DecisionTreeClassifier

120]: deci=DecisionTreeClassifier(criterion='gini') deci.fit(X_train,y_train) deci_pred=deci_predict(X_test) print("DecisionTreeClassifier") print("Accuracy Score :") print(accuracy Score :") print(accuracy Score(y_test,deci_pred)) print("r2_score:") print(r2_score(y_test,deci_pred)) # comparing actual response values (y_test) with predicted response values (y_pred)

DecisionTreeClassifier Accuracy Score:
0.6439024390243903 r2_score:
0.8855145307120791
```

## Naive Bayes Classifier

```
117]: from sklearn.naive_bayes import GaussianNB

118]: gnb=GaussianNB()
 gnb.fit(X_train,y_train)
 gnb_pred=gnb.predict(X_test)
 print("GaussianNB")
 print("Accuracy Score:")
  # comparing actual response values (y_test) with predicted response values (y_pred)
 print(accuracy_score(y_test,gnb_pred))
 print("r2_score:")
 print(r2_score(y_test,gnb_pred))

GaussianNB
 Accuracy Score:
  0.4317073170731707
 r2_score:
  0.4551071335157183
```

#### **SVC**

```
115]: from sklearn.svm import SVC

116]: model=SVC(C=10,kernel='rbf',gamma='auto')
model.fit(X_train,y_train)
svm_pred=model.predict(X_test)
from sklearn.metrics import accuracy_score
print("SVC")
print('Accuracy Score:')
# comparing actual response values (y_test) with predicted response values (y_pred)
print(accuracy_score(y_test,svm_pred))
print("r2_score:")
print(r2_score(y_test,svm_pred))

SVC
Accuracy Score:
0.8268292682926829
r2_score:
0.9384097158894097
```

#### **KNN Classifier**

```
13]: from sklearn.neighbors import KNeighborsClassifier
from sklearn.metrics import accuracy_score
from sklearn.metrics import r2_score

14]: knn=KNeighborsClassifier(n_neighbors=2)
knn.fit(X_train,y_train)
knn_pred-knn.predict(X_test)
print("KNeighborsClassifier")
print("KNeighborsClassifier")
print("Accuracy score:")
# comparing actual response values (y_test) with predicted response values (y_pred)
print(accuracy_score(y_test,knn_pred))
print("r2_score:")
print(r2_score(y_test,knn_pred))

KNeighborsClassifier
Accuracy score:
0.7097560975609756
r2_score:
0.8985571791119689
```

## Difficulty level of the course

Difficulty level of this course is MEDIUM (50% -75%)

SVC best suits the dataset with an accuracy score of about 0.83 when compared to other Classification Techniques

# VI. Technical and Managerial lessons learnt:

I have learnt to

- Use NumPy to investigate the latent features of a dataset.
- Use scikit-learn, matplotlib and sklearn libraries.
- Determine the best-guess model for predictions from unseen data.
- Evaluate a model's performance on unseen data using previous data.

### VII. References

www.edureka.com

www.towardsdatascience.com

www.edx.org

www.geeksforgeeks.com

www.scikit-learn.org

