Cube Statistica DS Course Data Project Qasim Basra

October 26, 2022

1 Importing Python Packages

```
[]: import pandas as pd
  import numpy as np
  import datetime as dt
  import matplotlib.pyplot as plt
  from numpy import int64
  import datetime as dt
  import scipy.stats
  import seaborn as sns
  import statsmodels
  import sklearn
  from tabulate import tabulate
```

2 Importing Data set

```
[]: df_raw= pd.read_csv("dataCleaned.csv")
```

2.1 Simplifying columns labels

```
"Prior Work Experience in Data Science or Machine Learning":

"Prior ML or DS Experience",

"Personal Education or Knowledge (learning R on your own

and/or doing personal projects, etc.) in R?": "R own Learning",

"What programming language(s) are you most comfortable in

(R, Python, Java, JS, etc.)? If none please type "None".': "Preffered

Programming language",

"Have you taken any foundational course in data science /

econometrics / statistics / computer science?": "Any Prior Course in DS/

Econometrics/Statistics/ComputerScience",

"Do you understand that this is a paid course ?...21": "Dou

you understand this course is paid", "Latest Degree Completed or in Progress?

"" : "Degree Level"
```

2.2 Inspecting Null Values

```
[]: from numpy import NaN from pandas import isnull df.isna().sum()
```

[]:	Id	0	
	Date	0	
	University	0	
	Degree	0	
	Country	1	
	City	1	
	Course Fee Email	8	
	Payment	7	
	Payment Receipt Sent	221	
	Referral medium	0	
	Gender	0	
	Age	0	
	Currently studying	0	
	Any Prior Course in DS/Econometrics/Statistics/ComputerScience	0	
	Preffered Programming language	0	
	Prior ML or DS Experience	0	
	Primary Reason for taking this course?	0	
	Do you understand this course is paid	0	
	Prior R Learing	0	
	Prior Python Learing	0	
	R experience	0	
	Python experience	0	
	R own Learning	0	
	Do you have a LinkedIn Account?	1	

Any Feedback 119
Degree Level 0
dtype: int64

2.3 Further Manipulation

2.4 Inspecting Null Values again after Data manipulation

```
[]: print(df.isna().sum())
     df[df.duplicated()] # Check whether there is any duplicate row
    Ιd
                                                                          0
                                                                          0
    Date
    University
                                                                          0
    Degree
                                                                          0
    Country
    City
                                                                          0
    Course Fee Email
                                                                          8
    Payment
                                                                          0
    Payment Receipt Sent
                                                                        221
    Referral medium
                                                                          0
    Gender
                                                                          0
    Age
    Currently studying
    Any Prior Course in DS/Econometrics/Statistics/ComputerScience
                                                                          0
    Preffered Programming language
                                                                          0
    Prior ML or DS Experience
                                                                          0
    Primary Reason for taking this course?
                                                                          0
```

```
Do you understand this course is paid
                                                                       0
Prior R Learing
                                                                        0
Prior Python Learing
                                                                        0
R experience
                                                                        0
Python experience
                                                                        0
R own Learning
                                                                        0
Do you have a LinkedIn Account?
                                                                        1
Any Feedback
                                                                      119
Degree Level
                                                                        0
Enrolled
                                                                        0
```

dtype: int64

[]: Empty DataFrame

Columns: [Id, Date, University, Degree, Country, City, Course Fee Email,
Payment, Payment Receipt Sent, Referral medium, Gender, Age, Currently studying,
Any Prior Course in DS/Econometrics/Statistics/ComputerScience, Preffered
Programming language, Prior ML or DS Experience, Primary Reason for taking this
course?, Do you understand this course is paid, Prior R Learing, Prior Python
Learing, R experience, Python experience, R own Learning, Do you have a LinkedIn
Account?, Any Feedback, Degree Level, Enrolled]

Index: []

[0 rows x 27 columns]

2.5 Split the Data with the ratio of 50%, 25%, 25%

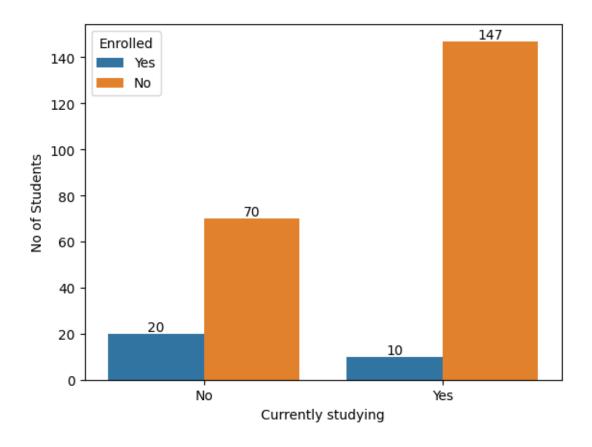
```
[]: np.random.seed(1000)
    df_fractiontraining_50 = df.sample(frac=0.5)
    dfn = df.drop(df_fractiontraining_50.index)
    df_validation_25 = dfn.sample(frac=0.5)
    df_fractiontest_25 = dfn.drop (df_validation_25.index)
```

3 EDA

3.1 Number of student Enrolled with respect to Currently Studying

```
[]: g=sns.countplot(x="Currently studying", hue="Enrolled",data=df)
for container_i in g.containers:
    g.bar_label(container_i)
plt.ylabel("No of Students")
```

[]: Text(0, 0.5, 'No of Students')



3.1.1 Percentage of Students who have enrolled with respect to Studying in Universities/Colleges

3.1.2 Visulize percentage of students (no of people who enrolled in the course/people who are currently students), (no of people who enrolled in course/people who are not students)

```
[]: x = ["Percentage of Students who have enrolled and not Studying", "Percentage
of Students who have enrolled and Studying"]

y = [percent_student_enrolled_not_study, percent_student_enrolled_study]

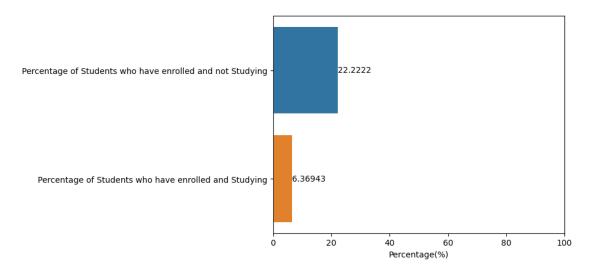
g=sns.barplot(x=y,y=x)

for container_i in g.containers:
    g.bar_label(container_i)

plt.xlim(0,100)

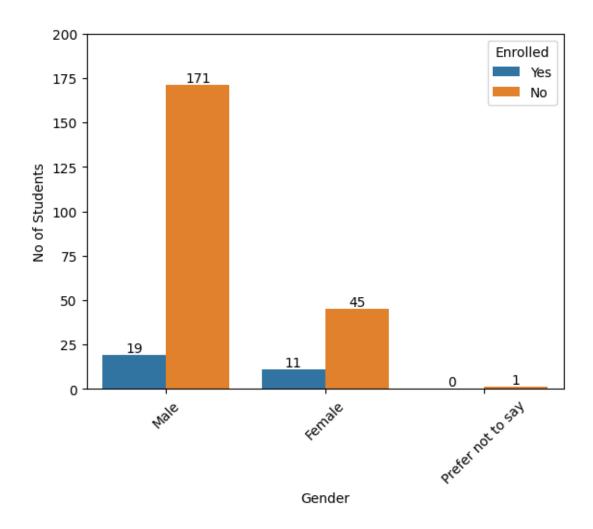
plt.xlabel("Percentage(%)")
```

[]: Text(0.5, 0, 'Percentage(%)')



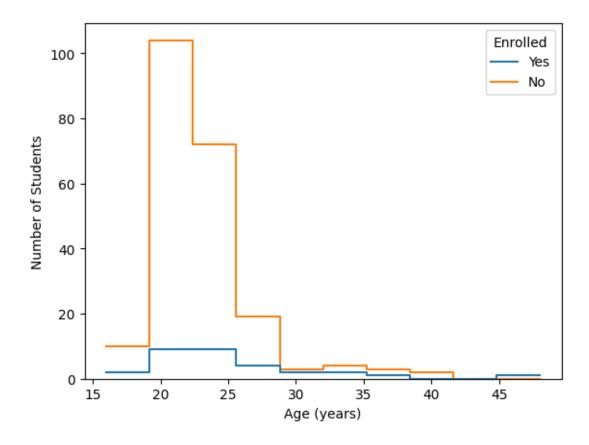
3.2 Enrollment with respect to Gender

```
[]: g=sns.countplot(x="Gender",hue="Enrolled", data=df)
   plt.ylim(0,200)
   plt.xticks(rotation=45)
   plt.ylabel("No of Students")
   for container_i in g.containers:
        g.bar_label(container_i)
```



3.3 Age Density with respect to Enrollment status

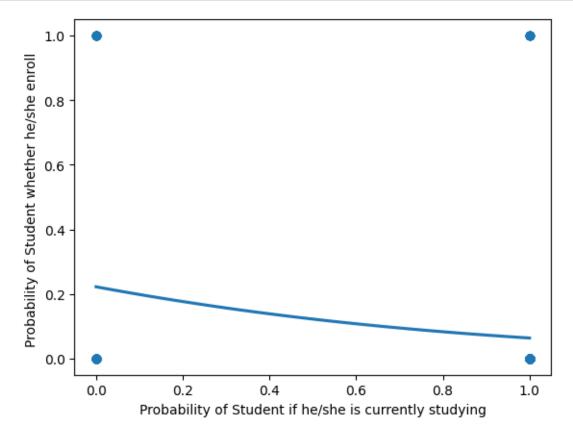
```
[]: sns.histplot(data=df,x="Age",hue="Enrolled",fill=False,bins=10,element="step")
plt.xlabel("Age (years)")
plt.ylabel("Number of Students")
plt.show()
```



4 Machine Learning Algorithms

4.1 Pre Processing

4.2 Logistic curve between "Enrolled" and "Currently Studying"



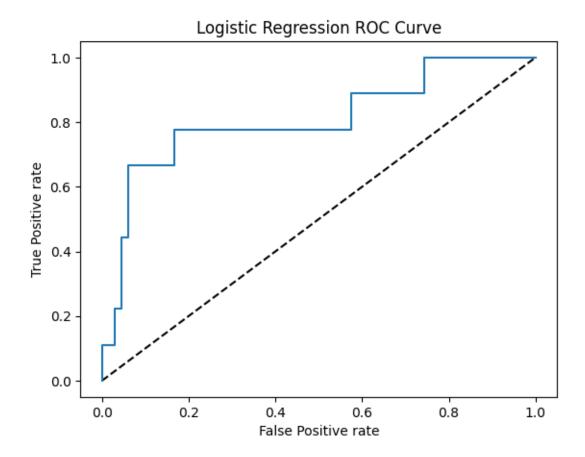
4.3 Logistic Regression

```
[]: from sklearn.linear_model import LogisticRegression
    from statsmodels.graphics.mosaicplot import mosaic
    from sklearn.model_selection import train_test_split
    logreg = LogisticRegression()
    from sklearn.metrics import accuracy_score
    from sklearn.metrics import classification_report, confusion_matrix
    seed=123
    from sklearn.metrics import roc_curve ,roc_auc_score
    X=dfn.drop("Enrolled",axis=1)
    y=dfn["Enrolled"]
```

```
X_train, X_test , y_train , y_test =train_test_split(X,y,test_size=0.
 →3, random_state=seed, stratify=y)
logreg.fit(X_train,y_train)
y_pred=logreg.predict(X_test)
y_pred_prob=logreg.predict_proba(X_test)[:,1]
fpr,tpr,thresholds =roc_curve(y_test,y_pred_prob)
plt.plot([0,1],[0,1],'k--')
plt.plot(fpr,tpr)
plt.xlabel("False Positive rate")
plt.ylabel("True Positive rate")
plt.title("Logistic Regression ROC Curve")
plt.show()
print("ROC AUC Score of the Logistic model =__

¬",roc_auc_score(y_test,y_pred_prob)*100)
cf_logr=confusion_matrix(y_test,y_pred)
mosaic(cf_logr)
class_report_logr=classification_report(y_test,y_pred)
accuracy_logr=accuracy_score(y_test,y_pred)
print("Classification Report of Logistic Regression Model⊔

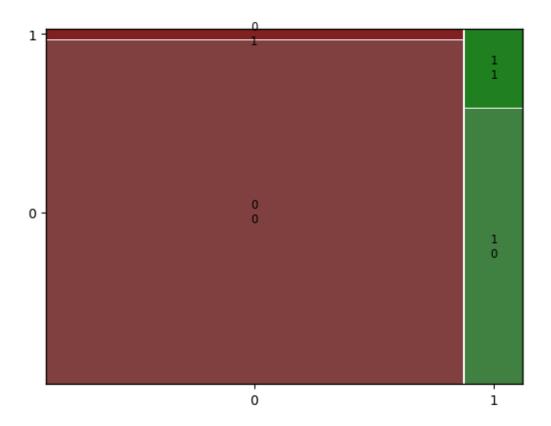
¬\n",class_report_logr)
print("Accuracy of Logistic Regression = ",accuracy_logr*100," %")
print("Confusion Matrix of Logistic Regression model \n\n",cf_logr)
c:\Users\qasim\AppData\Local\Programs\Python\Python310\lib\site-
packages\sklearn\linear_model\_logistic.py:444: ConvergenceWarning: lbfgs failed
to converge (status=1):
STOP: TOTAL NO. of ITERATIONS REACHED LIMIT.
Increase the number of iterations (max_iter) or scale the data as shown in:
   https://scikit-learn.org/stable/modules/preprocessing.html
Please also refer to the documentation for alternative solver options:
   https://scikit-learn.org/stable/modules/linear_model.html#logistic-
regression
 n_iter_i = _check_optimize_result(
```



	precision	recall	f1-score	support
0	0.90	0.97	0.93	66
1	0.50	0.22	0.31	9
accuracy			0.88	75
macro avg	0.70	0.60	0.62	75
weighted avg	0.85	0.88	0.86	75

Accuracy of Logistic Regression = 88.0 % Confusion Matrix of Logistic Regression model

[[64 2] [7 2]]



4.3.1 Exporting Predicted data to 'csv' file

Dataframe of Logistic Regression predicting University

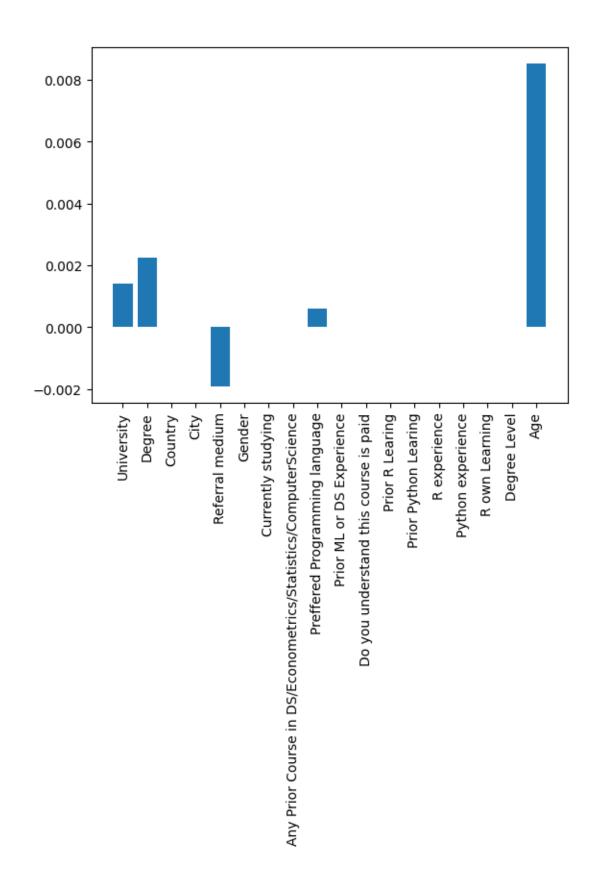
					
	1	Enrolled_test	I		Ţ
	0			No	
	1	Yes	I	No	
	2	Yes	1	No	
	3	No		No	
	4	No		Yes	
	5	No	I	No	1

	6	No I	No I
	7	No I	No I
	8	No I	No I
	9	No I	No I
	10	No I	No I
	11	No I	No I
	12	No I	No I
	13	No I	No I
	14	No I	No I
	15	No I	No I
	16	No I	No I
	17	No I	No I
	18	No I	No I
	19	No I	No I
	20	No I	No I
	21	No I	No I
	22	No I	No I
	23	No I	No I
	24	No I	No I
	25	No I	No I
	26	Yes	No I
	27	No I	No I
	28	No I	No I
	29	No I	No I
	30	No I	No I
	31	Yes	No I
	32	No I	No I
	33	No I	No I
	34	No I	No I
	35	No I	No I
	36	No I	No I
	37	No I	No I
	38	No I	No I
	39	Yes	No I
	40	No I	No I
	41	No I	No I
	42	No I	No I
	43	No I	No I
	44	No I	No I
	45	No I	No I
	46	No I	No I
	47	No I	No I
	48	No I	No I
	49	No I	No I
	50	No I	No I
	51	No I	No I
	52	No I	No I
	53	No I	No I

```
| 54 | No
                         | No
| 55 | No
                         | No
| 56 | Yes
                         | Yes
| 57 | No
                         | No
| 58 | No
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| 59 | Yes
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| 60 | No
                         | No
| 61 | No
                         | No
| 62 | No
                         | No
| 63 | Yes
                         | No
| 64 | No
                         | No
| 65 | Yes
                         | Yes
| 66 | No
                         | No
| 67 | No
                         No
| 68 | No
                         | No
| 69 | No
                         | Yes
| 70 | No
                         | No
| 71 | No
                         | No
| 72 | No
                         | No
| 73 | No
                         | No
| 74 | No
                         | No
```

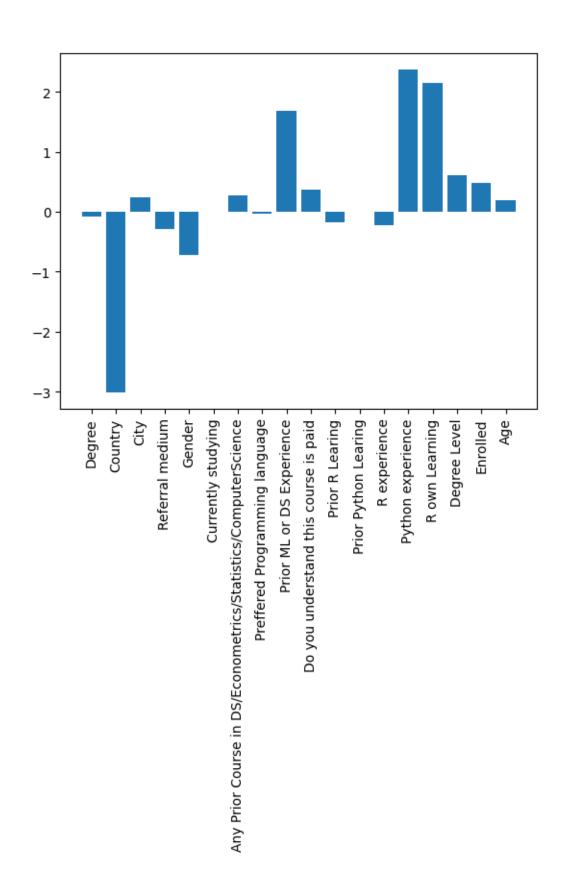
4.4 Checking linearity of Features with "Enrolled" as target variable

```
[]: from sklearn.linear_model import Lasso
X=dfn.drop("Enrolled",axis=1).values
y=dfn["Enrolled"].values
names= dfn.drop("Enrolled",axis=1).columns
lasso =Lasso(alpha=0.1)
lasso_coef=lasso.fit(X,y).coef_
plt.bar(names,lasso_coef)
plt.xticks(rotation=90)
plt.show()
```



4.5 Checking linearity of Features with "University" as target variable

```
from sklearn.linear_model import Lasso
X=dfn.drop("University",axis=1).values
y=dfn["University"].values
names= dfn.drop("University",axis=1).columns
lasso =Lasso(alpha=0.1)
lasso_coef=lasso.fit(X,y).coef_
plt.bar(names,lasso_coef)
plt.xticks(rotation=90)
plt.show()
```



4.6 K-Nearst Neighbours

4.6.1 Model Training

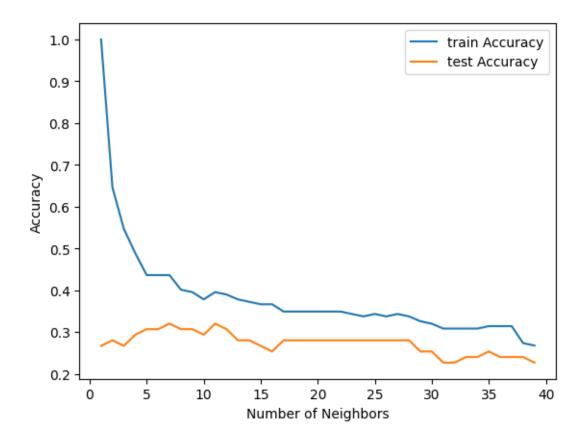
Accuracy of the model= 32.0

4.6.2 Quantifying number of neighbours

```
[]: import matplotlib.pyplot as plt
    train_accuracies= {}
    test_accuracies={}
    neighbors = np.arange(1,40)

for neighbor in neighbors:
        knn=KNeighborsClassifier(n_neighbors=neighbor)
        knn.fit(X_train,y_train)
        train_accuracies[neighbor]=knn.score(X_train,y_train)
        test_accuracies[neighbor]=knn.score(X_test,y_test)

plt.plot(neighbors,train_accuracies.values(),label="train Accuracy")
    plt.plot(neighbors,test_accuracies.values(),label="test Accuracy")
    plt.legend()
    plt.xlabel("Number of Neighbors")
    plt.ylabel("Accuracy")
    plt.show()
```



4.6.3 Confusion Matrix

```
[]: import sys
    import numpy
    from tabulate import tabulate # To prettify dataframe output
    numpy.set_printoptions(threshold=sys.maxsize)
    from sklearn.metrics import classification_report , confusion_matrix
    from statsmodels.graphics.mosaicplot import mosaic
    cf_matrix=confusion_matrix(y_test,y_pred)
    class_report=classification_report(y_test,y_pred)
    print("Confusion Matrix ","(Shape =",cf_matrix.shape,")\n\n",cf_matrix)
    print('Classification_report \n\n',class_report)
    Confusion Matrix
                        (Shape = (29, 29))
                               0 0 0 0 0 0
                   0]
     ΓΟ
                0
                   0
                     0
                        0
                           0
                              1
                                 0
                                    0
                                       0
                                          0
                                             0
                                                0
                                                   0
                                                      0
                                                         0
                                                            0
                                                               0
                   0]
                   0
                     0
                        0 0 0 0 0 0 0 0 0
          0
                0
                   0]
```

[0	0	0	0	0	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
0	0	0	0	0]																			
[0	0	0	0	0	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
0	0	0	0	0]]																		
Classification_report																							

	precision	recall	f1-score	support
3	0.00	0.00	0.00	1
5	0.00	0.00	0.00	1
7	1.00	1.00	1.00	1
9	0.00	0.00	0.00	1
13	0.00	0.00	0.00	1
14	0.00	0.00	0.00	1
16	0.00	0.00	0.00	1
18	0.00	0.00	0.00	1
19	0.31	0.90	0.46	21
20	0.00	0.00	0.00	1
21	0.33	0.14	0.20	7
22	0.00	0.00	0.00	1
24	0.00	0.00	0.00	4
27	0.00	0.00	0.00	2
28	0.00	0.00	0.00	1
30	0.00	0.00	0.00	4
33	0.00	0.00	0.00	1
34	0.00	0.00	0.00	1
36	0.00	0.00	0.00	3
37	0.00	0.00	0.00	1
38	0.33	0.50	0.40	4
39	0.00	0.00	0.00	1
41	0.33	0.11	0.17	9
42	0.00	0.00	0.00	1
43	0.00	0.00	0.00	1
44	0.00	0.00	0.00	1
45	0.00	0.00	0.00	1
48	0.00	0.00	0.00	1
54	0.00	0.00	0.00	1
accuracy			0.32	75
macro avg	0.08	0.09	0.08	75
weighted avg	0.19	0.32	0.20	75

c:\Users\qasim\AppData\Local\Programs\Python\Python310\lib\sitepackages\sklearn\metrics_classification.py:1334: UndefinedMetricWarning:
Precision and F-score are ill-defined and being set to 0.0 in labels with no
predicted samples. Use `zero_division` parameter to control this behavior.
 _warn_prf(average, modifier, msg_start, len(result))

```
c:\Users\qasim\AppData\Local\Programs\Python\Python310\lib\site-
packages\sklearn\metrics\_classification.py:1334: UndefinedMetricWarning:
Precision and F-score are ill-defined and being set to 0.0 in labels with no
predicted samples. Use `zero_division` parameter to control this behavior.
    _warn_prf(average, modifier, msg_start, len(result))
c:\Users\qasim\AppData\Local\Programs\Python\Python310\lib\site-
packages\sklearn\metrics\_classification.py:1334: UndefinedMetricWarning:
Precision and F-score are ill-defined and being set to 0.0 in labels with no
predicted samples. Use `zero_division` parameter to control this behavior.
    _warn_prf(average, modifier, msg_start, len(result))
```

4.6.4 Exporting Predicted data to 'csv' file

Dataframe of K-Neighbors Model predicting University

++	+
University_test	University_pred
O IBA	IBA
1 IQRA	IBA
2 QU	IBA
3 IBA	IBA
4 IBA	IBA
5 SirSyed	SirSyed
6 IBA	IQRA
7 SirSyed	IBA
8 SSUET	SMIU
9 IQRA	IQRA
10 IBA	IBA
11 NED	IBA
12 IBA	SMIU
13 International Islamic university	IQRA
14 Mehran University of Engineering	IBA
15 SirSyed	IBA
16 KU	IBA
17 IBA	IBA
18 The Islamia University of Bahawalpur	IBA
19	IBA

		077	
!	20	·	IBA
!	21	3	SirSyed
- 1	22	IBA	IBA
-	23		IBA
-	24		IOBM
١	25 l	IQRA	IBA
١	26 I	IBA	IBA
١	27	NED	IBA
-	28 I	SMIU	IBA
	29 l	Colorado State University Global Campus	IBA
-	30 l	SirSyed	IBA
-	31	PUCIT	IBA
-	32 l	IBA	IBA
-	33	IBA	IBA
-	34 l	Ryerson	IBA
-	35 l	Paf Kiet	IBA
-	36 I	IBA	IBA
-	37 l	Superior University	IBA
١	38 I	IQRA	IBA
1	39 l		IBA
ĺ		IBA	IBA
Ì	41	Hamdard University	IBA
i	42 l		IBA
i	43 I		IBA
i	44		IBA
i	45 l	IBA	IBA
i	46 I		COMSATS
i	47 I		IBA
i	48	University Of Technology Nowshera	IBA
i	49 I	KU	IBA
i	50 I	SirSyed	IBA
i	51	IBA	IBA
i	52	SirSyed	IBA
i	53 I	KU	IBA
i	54	SMIU	SMIU
i	55 I	SirSyed	SMIU
i	56 I	LUMS	IBA
i	57	SMIU	IBA
i	58	SMIU	SMIU
i	59 I	GCUF	SMIU
i	60 I	IOBM	IBA
	61	IBA	IBA
ı	62	SirSyed	IBA
ı	63	IQRA	IBA
ı	64	University of Malakand	IBA
ı	65	UET	IBA
I I	66	IBA	IBA
l I			IBA
ı	67	QU	TD#

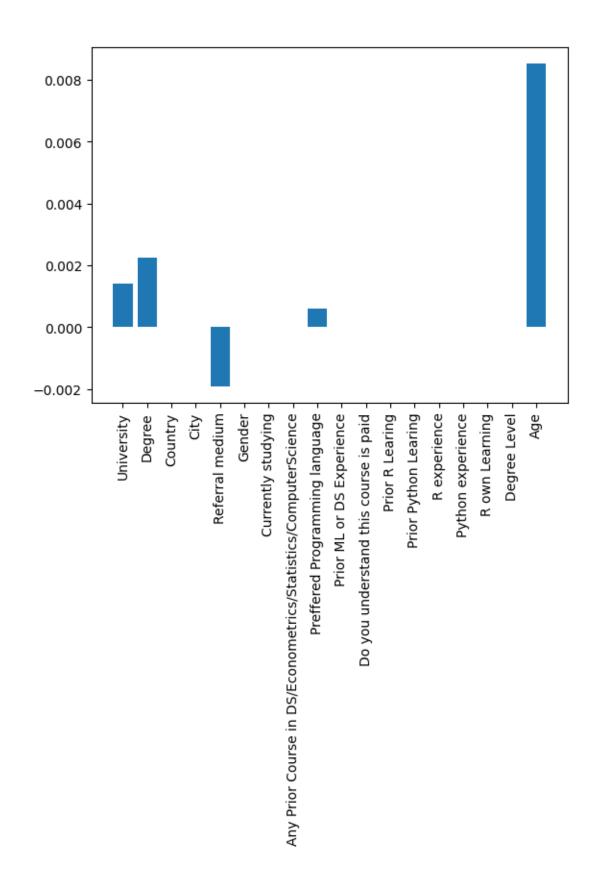
```
| 68 | SirSyed
                                             | IBA
   | 69 | KU
                                             | IBA
   | 70 | IBA
                                             | IBA
   | 71 | GIFT University
                                             | IBA
   | 72 | Government degree science college malir | IBA
   | 73 | LUMS
                                             | IBA
   | 74 | UAAR
                                             | SirSyed
   +---+----
[]: from sklearn.linear_model import Lasso
    X=dfn.drop("Enrolled",axis=1).values
    y=dfn["Enrolled"].values
    names= dfn.drop("Enrolled",axis=1).columns
```

lasso =Lasso(alpha=0.1)

plt.bar(names,lasso_coef)
plt.xticks(rotation=90)

plt.show()

lasso_coef=lasso.fit(X,y).coef_



4.7 Decision-Tree Regression

4.150293691432968

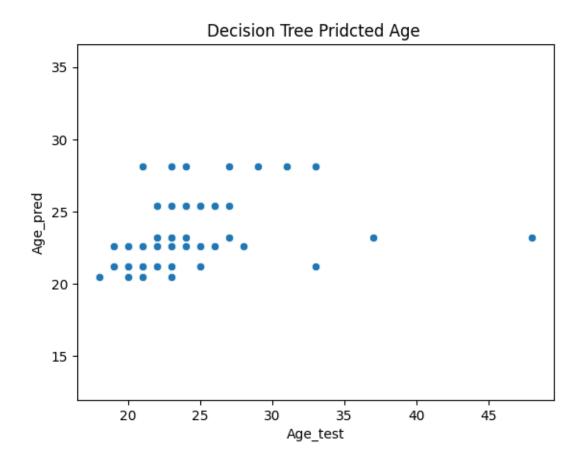
4.7.1 Exporting Predicted data to 'csv' file

```
[]: df_dtree_reg=pd.DataFrame({"Age_test":list(y_test), "Age_pred":list(y_pred)})
    df_dtree_reg.to_csv("Decision_tree_reg_prediction.csv")
```

4.7.2 PLotting Predicted data of Decision Tree Regression

```
[]: sns.scatterplot(data=df_dtree_reg,x="Age_test",y="Age_pred")
  plt.title("Decision Tree Pridcted Age ")
  plt.axis("equal")
  plt.show
```

[]: <function matplotlib.pyplot.show(close=None, block=None)>



4.8 Random Forrest

[]: 4.097640575145502

4.8.1 Exporting Predicted data to 'csv' file

```
[]: df_rf=pd.DataFrame({"Age_test":list(y_test),"Age_pred":list(y_pred)})
    df_rf.to_csv("Random_Forrest_prediction.csv")
```

4.8.2 PLotting Predicted data of Random Forrest

```
[]: sns.scatterplot(data=df_rf,x="Age_test",y="Age_pred")
  plt.title("Random Forret Pridcted Age ")
  plt.axis("equal")
  plt.show
```

[]: <function matplotlib.pyplot.show(close=None, block=None)>



