```
In [1]:
              import pandas as pd
              import numpy as np
              import warnings
              warnings.filterwarnings("ignore")
              import seaborn as sns
In [ ]:
              df=pd.read_csv('student.csv')
In [2]:
    Out[2]:
                    Unnamed:
                                  Id Student_Age
                                                      Sex High_School_Type Scholarship Additional_Wo
                               5001
                 0
                            0
                                               21
                                                     Male
                                                                       Other
                                                                                    50%
                                                                                                      Υ
                 1
                            1
                               5002
                                               20
                                                     Male
                                                                       Other
                                                                                    50%
                                                                                                      ١
                 2
                               5003
                                               21
                                                                       State
                                                                                    50%
                                                     Male
                 3
                            3
                               5004
                                               18 Female
                                                                      Private
                                                                                    50%
                                                                                                      ١
                 4
                            4
                               5005
                                               22
                                                     Male
                                                                      Private
                                                                                    50%
                 ...
                                               ...
                                                                          ...
                                                                                      ...
               140
                          140
                               5141
                                               22
                                                  Female
                                                                       State
                                                                                    50%
                                                                                                      ١
                                                  Female
               141
                          141
                               5142
                                                                       State
                                                                                    75%
                                               18
               142
                          142 5143
                                                  Female
                                                                      Private
                                                                                    75%
                                               18
               143
                                                                       State
                                                                                    75%
                                                                                                      ١
                          143 5144
                                               22
                                                  Female
                                               18 Female
                                                                      Private
                                                                                   100%
               144
                          144 5145
              145 rows × 16 columns
In [3]:
              df.head(5)
    Out[3]:
                  Unnamed:
                                   Student_Age
                                                   Sex High_School_Type Scholarship Additional_Work
                          0
                             5001
               0
                                             21
                                                   Male
                                                                     Other
                                                                                  50%
                                                                                                    Yes
               1
                             5002
                                             20
                                                   Male
                                                                     Other
                                                                                  50%
                                                                                                    Yes
               2
                          2
                             5003
                                             21
                                                                                  50%
                                                   Male
                                                                     State
                                                                                                    No
               3
                             5004
                                             18
                                                Female
                                                                    Private
                                                                                  50%
                                                                                                    Yes
                             5005
                                             22
                                                                   Private
                                                                                  50%
                                                   Male
                                                                                                    No
```

In [4]: ► df.tail(5)

Out[4]:

	Unnamed: 0	ld	Student_Age	Sex	High_School_Type	Scholarship	Additional_Wo
140	140	5141	22	Female	State	50%	Υ
141	141	5142	18	Female	State	75%	
142	142	5143	18	Female	Private	75%	
143	143	5144	22	Female	State	75%	Υ
144	144	5145	18	Female	Private	100%	
4							•

In [5]: ► df.describe()

Out[5]:

	Unnamed: 0	ld	Student_Age	Weekly_Study_Hours
count	145.000000	145.000000	145.000000	145.000000
mean	72.000000	5073.000000	19.682759	2.331034
std	42.001984	42.001984	1.992010	4.249273
min	0.000000	5001.000000	18.000000	0.000000
25%	36.000000	5037.000000	18.000000	0.000000
50%	72.000000	5073.000000	19.000000	0.000000
75%	108.000000	5109.000000	21.000000	2.000000
max	144.000000	5145.000000	26.000000	12.000000

```
M df.info()
In [6]:
            <class 'pandas.core.frame.DataFrame'>
            RangeIndex: 145 entries, 0 to 144
            Data columns (total 16 columns):
             #
                 Column
                                     Non-Null Count Dtype
                 -----
                                     -----
            - - -
                                                     ----
             0
                 Unnamed: 0
                                     145 non-null
                                                     int64
             1
                 Ιd
                                     145 non-null
                                                     int64
             2
                 Student_Age
                                     145 non-null
                                                     int64
             3
                 Sex
                                     145 non-null
                                                     object
             4
                 High_School_Type
                                     145 non-null
                                                     object
             5
                 Scholarship
                                     144 non-null
                                                     object
             6
                 Additional Work
                                     145 non-null
                                                     object
             7
                 Sports_activity
                                                     object
                                     145 non-null
             8
                 Transportation
                                     145 non-null
                                                     object
                 Weekly_Study_Hours 145 non-null
                                                     int64
             10 Attendance
                                     145 non-null
                                                     object
             11 Reading
                                     145 non-null
                                                     object
             12
                 Notes
                                     145 non-null
                                                     object
             13 Listening_in_Class 145 non-null
                                                     object
             14 Project_work
                                     145 non-null
                                                     object
             15 Grade
                                     145 non-null
                                                     object
            dtypes: int64(4), object(12)
            memory usage: 18.3+ KB
In [7]:
         Out[7]: (145, 16)

    df.isnull().sum()

In [8]:
   Out[8]: Unnamed: 0
                                  0
            Ιd
                                  0
            Student_Age
                                  0
            Sex
                                  0
            High_School_Type
                                  0
            Scholarship
                                  1
            Additional_Work
                                  0
            Sports_activity
                                  0
            Transportation
                                  0
            Weekly_Study_Hours
                                  0
            Attendance
                                  0
            Reading
                                  0
            Notes
                                  0
            Listening_in_Class
                                  0
            Project_work
                                  0
            Grade
                                  0
            dtype: int64
```

```
    df.groupby('Additional_Work').sum()

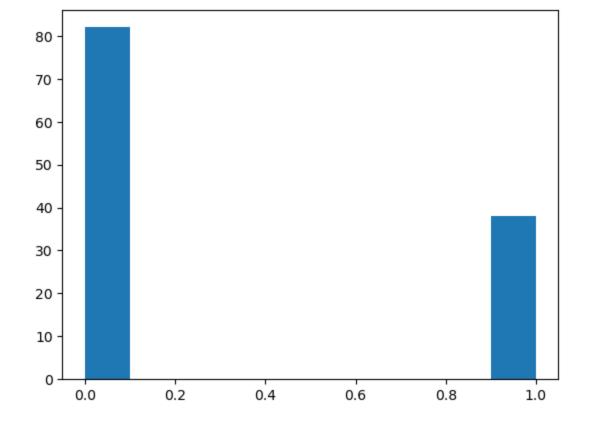
In [9]:
     Out[9]:
                              Unnamed:
                                           Id Student_Age
               Additional Work
                                  6714
                                       486810
                                                     1868
                                                           MaleMaleMaleFemaleFemaleFemaleFen
                          No
                         Yes
                                  3726
                                       248775
                                                      986
                                                           In [10]:
              df.groupby('Attendance').sum()
    Out[10]:
                         Unnamed:
                                       Id Student_Age
               Attendance
                       3
                               112
                                     5113
                                                   20
                  Always
                              6602
                                   496700
                                                 1934
                                                       MaleMaleFemaleMaleMaleFemaleFemaleFem
                   Never
                              1485
                                   106506
                                                  424
                                                       Sometimes
                              2241
                                   127266
                                                       FemaleFemaleMaleMaleMaleFemaleMaleF
                                                                                           df=df.drop(['Unnamed: 0','Id','Student_Age','Scholarship','Transportation
In [11]:
              df
In [12]:
    Out[12]:
                   High_School_Type Additional_Work Weekly_Study_Hours
                                                                    Attendance Reading Lister
                              Other
                                                                   0
                                                                         Always
                0
                                              Yes
                                                                                    Yes
                 1
                                                                   0
                              Other
                                              Yes
                                                                         Always
                                                                                    Yes
                2
                              State
                                               No
                                                                   2
                                                                          Never
                                                                                     No
                3
                             Private
                                                                   2
                                              Yes
                                                                         Always
                                                                                     No
                                                                  12
                 4
                             Private
                                               No
                                                                         Always
                                                                                    Yes
               140
                              State
                                              Yes
                                                                   0
                                                                         Always
                                                                                     No
               141
                              State
                                               No
                                                                   0
                                                                          Never
                                                                                     No
               142
                             Private
                                               No
                                                                   0
                                                                         Always
                                                                                    Yes
                                                                  12
                                                                      Sometimes
               143
                              State
                                              Yes
                                                                                     No
                             Private
                                                                  12
               144
                                               No
                                                                         Always
                                                                                    Yes
              145 rows × 8 columns
```

```
▶ Q1 = df['Weekly_Study_Hours'].quantile(0.25)
In [13]:
                                                           Q3 = df['Weekly Study Hours'].quantile(0.75)
                                                           IQR = Q3 - Q1
                                                           df = df[(df['Weekly_Study_Hours'] >= Q1 - 1.5 * IQR) & (df['Weekly_Study_Foundation of the study of the 
In [14]:
                                              M df.info()
                                                           <class 'pandas.core.frame.DataFrame'>
                                                           Index: 120 entries, 0 to 142
                                                           Data columns (total 8 columns):
                                                               #
                                                                                 Column
                                                                                                                                                                           Non-Null Count Dtype
                                                                                 _____
                                                               0
                                                                                 High_School_Type
                                                                                                                                                                           120 non-null
                                                                                                                                                                                                                                                   object
                                                                1
                                                                                 Additional Work
                                                                                                                                                                           120 non-null
                                                                                                                                                                                                                                                   object
                                                                2
                                                                                 Weekly_Study_Hours 120 non-null
                                                                                                                                                                                                                                                   int64
                                                                3
                                                                                 Attendance
                                                                                                                                                                           120 non-null
                                                                                                                                                                                                                                                   object
                                                               4
                                                                                 Reading
                                                                                                                                                                           120 non-null
                                                                                                                                                                                                                                                   object
                                                                5
                                                                                 Listening_in_Class 120 non-null
                                                                                                                                                                                                                                                  object
                                                                6
                                                                                 Project_work
                                                                                                                                                                           120 non-null
                                                                                                                                                                                                                                                   object
                                                                7
                                                                                 Grade
                                                                                                                                                                           120 non-null
                                                                                                                                                                                                                                                   object
                                                           dtypes: int64(1), object(7)
                                                           memory usage: 8.4+ KB
In [15]:

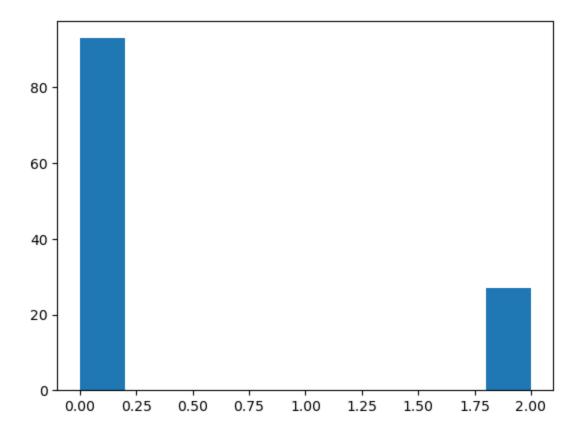
    | df['Grade'] = df['Grade'].map({'AA': 1, 'BA': 0.875, 'BB': 0.750, 'CB': 0.750, 'CB'
                                                           df['Attendance']=df['Attendance'].map({'Always': 1.5, 'Sometimes': 1.0, 'N
                                                           df['Project_work']=df['Project_work'].map({'Yes':1, 'No':0})
                                                           df['Reading']=df['Reading'].map({'Yes':1,'No':0})
                                                           df['Listening_in_Class']=df['Listening_in_Class'].map({'Yes':1,'No':0})
                                                           df['Additional_Work']=df['Additional_Work'].map({'Yes':1,'No':0})
In [16]:
                                              df=pd.get_dummies(df,dtype=int)
```

<class 'pandas.core.frame.DataFrame'>
Index: 120 entries, 0 to 142
Data columns (total 10 columns):

#	Column	Non-Null Count	Dtype
0	Additional_Work	120 non-null	int64
1	Weekly_Study_Hours	120 non-null	int64
2	Attendance	120 non-null	float64
3	Reading	120 non-null	int64
4	Listening_in_Class	120 non-null	int64
5	Project_work	120 non-null	int64
6	Grade	120 non-null	float64
7	High_School_Type_Other	120 non-null	int32
8	<pre>High_School_Type_Private</pre>	120 non-null	int32
9	<pre>High_School_Type_State</pre>	120 non-null	int32
dtyp	es: float64(2), int32(3),	int64(5)	
memo	ry usage: 8.9 KB		



```
In [19]: | import matplotlib.pyplot as plt
plt.hist(df['Weekly_Study_Hours'])
Out[19]: (array([93., 0., 0., 0., 0., 0., 0., 0., 27.]),
```



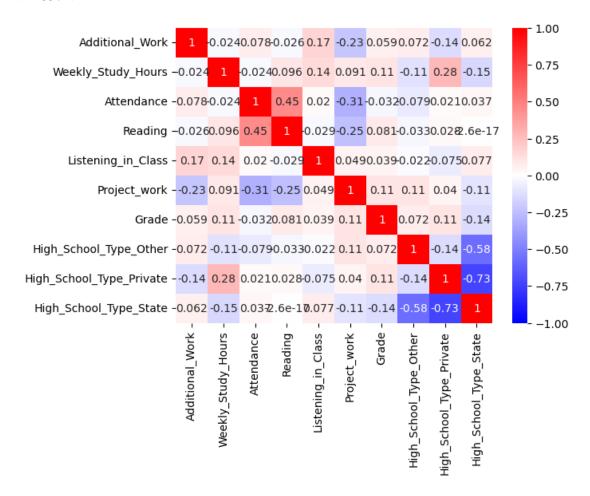
In [21]: ► cor\_mat

Out[21]:

	Additional_Work	Weekly_Study_Hours	Attendance	Reading
Additional_Work	1.000000	-0.023595	0.077880	-2.633298e- 02
Weekly_Study_Hours	-0.023595	1.000000	-0.024481	9.600307e-02
Attendance	0.077880	-0.024481	1.000000	4.543984e-01
Reading	-0.026333	0.096003	0.454398	1.000000e+00
Listening_in_Class	0.169967	0.144005	0.020132	-2.901786e- 02
Project_work	-0.226350	0.090813	-0.312465	-2.494785e- 01
Grade	0.059440	0.105675	-0.031898	8.130353e-02
High_School_Type_Other	0.071657	-0.113085	-0.078912	-3.340766e- 02
High_School_Type_Private	-0.135460	0.276648	0.021095	2.806804e-02
High_School_Type_State	0.062057	-0.149782	0.037276	-2.569667e- 17
4				•

```
In [22]: | import seaborn as sns
sns.heatmap(cor_mat,vmax=1,vmin=-1,annot=True,linewidth=0,cmap='bwr')
```

Out[22]: <Axes: >



## In [23]: ► df.info()

<class 'pandas.core.frame.DataFrame'>

Index: 120 entries, 0 to 142
Data columns (total 10 columns):

Data	COTUMNIS (COCAT TO COTUMNIS	<i>)</i> •						
#	Column	Non-Null Count	Dtype					
0	Additional_Work	120 non-null	int64					
1	Weekly_Study_Hours	120 non-null	int64					
2	Attendance	120 non-null	float64					
3	Reading	120 non-null	int64					
4	Listening_in_Class	120 non-null	int64					
5	Project_work	120 non-null	int64					
6	Grade	120 non-null	float64					
7	High_School_Type_Other	120 non-null	int32					
8	<pre>High_School_Type_Private</pre>	120 non-null	int32					
9	<pre>High_School_Type_State</pre>	120 non-null	int32					
dtype	dtypes: float64(2), int32(3), int64(5)							
memoi	memory usage: 8.9 KB							

```
In [24]:

    df.isnull().sum()

   Out[24]: Additional_Work
                                           0
             Weekly_Study_Hours
                                           0
             Attendance
                                           0
             Reading
                                           0
             Listening_in_Class
                                           0
             Project_work
                                           0
             Grade
                                           0
             High_School_Type_Other
                                           0
             High_School_Type_Private
                                           0
             High_School_Type_State
                                           0
             dtype: int64
```

## **Linear Regression**

```
In [25]:

y=df['Grade']

   Out[25]: 0
                     1.000
                     1.000
             1
             2
                     1.000
             3
                     1.000
             5
                     0.875
                     . . .
                     0.875
             137
             139
                     0.000
             140
                     0.500
             141
                     0.500
             142
                     1.000
             Name: Grade, Length: 120, dtype: float64
```

In [26]: ▶	x=df.d x	rop('Grade',	axis=1)				
Out[26]:	Α	dditional_Work	Weekly_Study_Hours	Attendance	Reading	Listening_in_Class	Proje
	0	1	0	1.5	1	0	
	1	1	0	1.5	1	1	
	2	0	2	0.5	0	0	
	3	1	2	1.5	0	0	
	5	0	2	1.5	1	1	
	137	0	0	1.5	1	0	
	139	1	2	1.0	0	1	
	140	1	0	1.5	0	0	
	141	0	0	0.5	0	1	
	142	0	0	1.5	1	0	
	120 row	vs × 9 columns					
	4						•
In [27]: ▶	x_trai		_selection import rain,y_test = tra			test_size=0.33,r	andor
							andoi
Out[27]:	Ad	ditional_Work	Weekly_Study_Hours	Attendance	Reading	Listening_in_Class	
Out[27]:	Ad 56	ditional_Work	Weekly_Study_Hours	Attendance	Reading 1	Listening_in_Class	
Out[27]:							
Out[27]:	56 61 5	0 0 0	0 2 2	1.5 1.5 1.5	1 0 1	1	
Out[27]:	56 61 5 71	0 0 0 0	0 2 2 0	1.5 1.5 1.5 1.5	1 0 1 0	1 1 1 1	
Out[27]:	56 61 5	0 0 0	0 2 2	1.5 1.5 1.5	1 0 1	1 1 1	
Out[27]:	56 61 5 71	0 0 0 0	0 2 2 0	1.5 1.5 1.5 1.5	1 0 1 0	1 1 1 1	
Out[27]: In [28]: ▶	56 61 5 71 33	0 0 0 0	0 2 2 0	1.5 1.5 1.5 1.5	1 0 1 0	1 1 1 1	Projec
	56 61 5 71 33  x_trai	0 0 0 1	0 2 2 0	1.5 1.5 1.5 1.5	1 0 1 0	1 1 1 1	Projec
In [28]: ► MOUT[28]:	56 61 5 71 33  x_trai	0 0 0 1	0 2 2 0	1.5 1.5 1.5 1.5	1 0 1 0	1 1 1 1	Projec

```
In [30]:
            reg=LinearRegression() #creating object of LinearRegression
            reg.fit(x_train,y_train)
            LinearRegression()
            #training and fitting
   Out[30]: LinearRegression()
            In a Jupyter environment, please rerun this cell to show the HTML representation or
            trust the notebook.
            On GitHub, the HTML representation is unable to render, please try loading this
            page with nbviewer.org.
In [31]:
         ypred = reg.predict(x_test)
            ypred
   Out[31]: array([0.59790319, 0.72551973, 0.67346423, 0.69561043, 0.57117139,
                   0.75487754, 0.59503864, 0.4938383 , 0.72472669, 0.65796333,
                   0.44818655, 0.65796333, 0.51111124, 0.51111124, 0.76226702,
                   0.62627252, 0.75622498, 0.73180332, 0.59503864, 0.59503864,
                   0.5082467 , 0.57117139, 0.79779651, 0.55676299, 0.68787264,
                   0.55676299, 0.55071147, 0.6463011 , 0.51111124, 0.61817057,
                   0.5082467 , 0.49944901, 0.84378709, 0.59790319, 0.58063024,
                   0.57251882, 0.58063024, 0.55676299, 0.63750342, 0.55676299])
In [ ]:

X_pred=reg.predict()

    ★ from sklearn.metrics import r2 score

In [32]:
            r2_score(y_test,ypred)
   Out[32]: -0.1998852439459411
In [33]:
         mean_squared_error(ypred,y_test)
```

Out[33]: 0.08341780323878081

```
In [34]: N Results=pd.DataFrame(columns=['Grade','Predicated'])
Results['Grade']=y_test
Results['Predicated']=ypred
Results=Results.reset_index()
Results['Id']=Results.index
Results.head(15)
```

		· ·				
Out[34]:		index	Grade	Predicated	ld	
	0	56	0.500	0.597903	0	
	1	61	0.500	0.725520	1	
	2	5	0.875	0.673464	2	
	3	71	0.375	0.695610	3	
	4	33	0.875	0.571171	4	
	5	80	0.625	0.754878	5	
	6	91	0.375	0.595039	6	
	7	15	0.875	0.493838	7	
	8	50	1.000	0.724727	8	
	9	129	0.750	0.657963	9	
	10	25	0.750	0.448187	10	
	11	78	0.625	0.657963	11	
	12	16	1.000	0.511111	12	
	13	46	0.500	0.511111	13	

108 0.375

14

0.762267 14

```
In [35]: N import seaborn as sns
import matplotlib.pyplot as plt
sns.lineplot(x='Id',y='Grade',data=Results.head(50))
sns.lineplot(x='Id',y='Predicated',data=Results.head(50))
plt.plot()

Out[35]: []

1.0

0.8

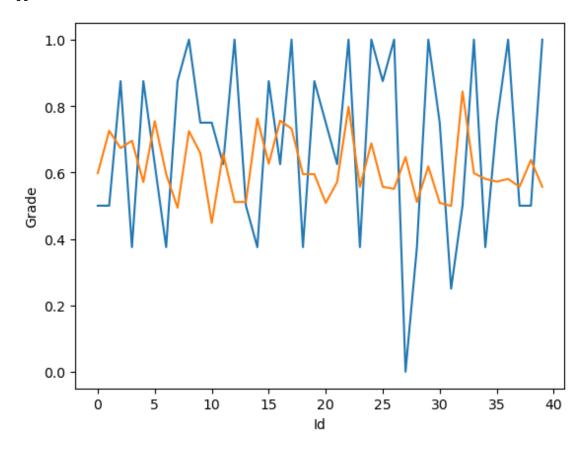
0.4

0.4
```

0.2

```
In [36]: import seaborn as sns
import matplotlib.pyplot as plt
sns.lineplot(x='Id',y='Grade',data=Results.tail(50))
sns.lineplot(x='Id',y='Predicated',data=Results.tail(50))
plt.plot()
```

Out[36]: []



Type *Markdown* and LaTeX:  $\alpha^2$