```
B - Good
                     81
                     59
A - Very Good
dtype: int64
=========KNN Results===========
-----Math Class Dataset-----
Confusion Matrix:
[[44300]
[67400]
[ 1 5 34 1 5]
[00665]
[ 0 0 11 4 5]]
Classification Report:
                  precision
                             recall f1-score
                                             support
     A - Very Good
                      0.36
                               0.36
                                        0.36
                                                   11
         B - Good
                      0.44
                               0.41
                                        0.42
                                                   17
    C - Sufficient
                      0.59
                               0.74
                                        0.65
                                                   46
    F - Poor (Mau)
                      0.55
                               0.35
                                        0.43
                                                  17
F - Poor (Mediocre)
                     0.33
                               0.25
                                        0.29
                                                  20
         accuracy
                                        0.50
                                                 111
        macro avg
                     0.45
                               0.42
                                        0.43
                                                 111
      weighted avg
                      0.49
                               0.50
                                        0.49
                                                  111
-----Portuguese Class Dataset-----
Confusion Matrix:
[[16 6 0 0 1]
[ 8 11 12 0 0]
[ 6 20 69 1 4]
[00501]
[ 0 0 17 0 5]]
Classification Report:
                  precision recall f1-score
                                             support
     A - Very Good
                      0.53
                               0.70
                                        0.60
                                                   23
         B - Good
                      0.30
                               0.35
                                        0.32
                                                  31
    C - Sufficient
                     0.67
                               0.69
                                        0.68
                                                  100
                     0.00
    F - Poor (Mau)
                               0.00
                                        0.00
                                                  6
F - Poor (Mediocre)
                     0.45
                               0.23
                                        0.30
                                                  22
                                                 182
         accuracy
                                        0.55
        macro avg
                     0.39
                               0.39
                                        0.38
                                                  182
      weighted avg
                     0.54
                               0.55
                                        0.54
                                                  182
============Decision Tree Results=============
-----Math Class Dataset-----
Confusion Matrix:
[[7 3 1 0 0]
[47600]
[0 3 34 3 6]
[0 0 3 11 3]
[00677]]
Classification Report:
                  precision
                             recall f1-score
                                              support
     A - Very Good
                      0.64
                                        0.64
                               0.64
                                                   11
                      0.54
         B - Good
                               0.41
                                        0.47
                                                   17
    C - Sufficient
                     0.68
                               0.74
                                        0.71
                                                   46
```

```
F - Poor (Mau)
                  0.52 0.65
                                       0.58
                                                 17
F - Poor (Mediocre)
                     0.44
                              0.35
                                       0.39
                                                 20
         accuracy
                                       0.59
                                                111
        macro avg
                    0.56
                              0.56
                                       0.56
                                                111
     weighted avg
                    0.59
                              0.59
                                       0.59
                                                111
-----Portuguese Class Dataset-----
Confusion Matrix:
[[14 7 2 0 0]
[720400]
[ 2 24 66 0 8]
[00222]
[10966]]
Classification Report:
                 precision recall f1-score support
    A - Very Good
                     0.58
                              0.61
                                       0.60
                                                 23
                                       0.49
         B - Good
                     0.39
                              0.65
                                                31
    C - Sufficient
                     0.80
                             0.66
                                       0.72
                                                100
    F - Poor (Mau)
                    0.25
                             0.33
                                       0.29
                                                6
F - Poor (Mediocre)
                    0.38
                              0.27
                                       0.32
                                                22
         accuracy
                                       0.59
                                                182
                   0.48
        macro avg
                              0.50 0.48
                                                182
     weighted avg
                    0.63
                              0.59
                                       0.60
                                               182
======Logistic Regression===========
-----Math Class Dataset-----
Score for logistic regression
0.5495495495495496
Confusion matrix:
[[7 4 0 0 0]
[5 8 4 0 0]
[2 3 33 4 4]
[00575]
[00866]]
Classification Report:
                 precision recall f1-score
                                            support
    A - Very Good
                     0.50
                             0.64
                                       0.56
                                                 11
                     0.53
                             0.47
                                       0.50
        B - Good
                                                 17
    C - Sufficient
                     0.66
                             0.72
                                       0.69
                                                 46
    F - Poor (Mau)
                     0.41
                             0.41
                                       0.41
                                                 17
F - Poor (Mediocre)
                     0.40
                              0.30
                                       0.34
                                                 20
         accuracy
                                       0.55
                                                111
        macro avg
                    0.50
                              0.51
                                       0.50
                                                111
     weighted avg
                     0.54
                              0.55
                                       0.54
                                                111
-----Portuguese Class Dataset-----
Score for logistic regression
0.6428571428571429
Confusion matrix:
[[16 7 0 0 0]
[ 9 8 14 0 0]
[ 2 13 81 0 4]
```

[00321]

[0 0 12 0 10]]					
Classification Repor	F :				
Classificación Repor		recall	f1-score	support	
	p. cc1510		. 1 500. 0	зарро. с	
A - Very Good	0.59	0.70	0.64	23	
B - Good	0.29	0.26	0.27	31	
C - Sufficient	0.74	0.81	0.77	100	
F - Poor (Mau)	1.00	0.33	0.50	6	
F - Poor (Mediocre)	0.67	0.45	0.54	22	
(1661 (16616)	0.07	0.15	0.5.		
accuracy			0.64	182	
macro avg	0.66	0.51	0.54	182	
weighted avg	0.64	0.64	0.63	182	
8	•••		0.00		
=======================================	===Support	Vector Mac	hines====	=======	======
Math Class Data		vecesi nae			
Confusion matrix:	4500				
[[1 6 4 0 0]					
[1 1 15 0 0]					
[0 0 42 3 1]					
[0 0 7 9 1] [0 0 12 4 4]]					
Classification Repor	L.				
Classification Repor-		11	£1		
	precision	recall	f1-score	support	
A Vany Good	0 50	0 00	0 15	11	
A - Very Good B - Good	0.50	0.09	0.15		
	0.14	0.06	0.08	17	
C - Sufficient		0.91	0.67	46	
F - Poor (Mau)	0.56	0.53	0.55	17	
F - Poor (Mediocre)	0.67	0.20	0.31	20	
			0 51	111	
accuracy	0.40	0.36	0.51	111	
macro avg	0.48	0.36	0.35	111	
weighted avg	0.50	0.51	0.44	111	
Dantusus as Cla	D-++				
Portuguese Cla	ss Dataset-				
Confusion_matrix:	0.7				
	0]				
_	3]				
_	9]				
-	9]				
	1]]				
Classification Repor					
	precision	recall	f1-score	support	
A - Very Good	0.79	0.65	0.71	23	
B - Good	0.20	0.03	0.06	31	
C - Sufficient	0.64	1.00	0.78	100	
F - Poor (Mau)	0.00	0.00	0.00	6	
F - Poor (Mediocre)	1.00	0.05	0.09	22	
accuracy			0.64	182	
macno ava	0 53	0 35	0 33	192	

0.53

0.60

macro avg

weighted avg

0.35

0.64

0.330.54

182

182

⁻⁻⁻⁻⁻Math Class Dataset-----

D:\SERNi\anaconda3\Lib\site-packages\sklearn\metrics_classification.py:1469:

```
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))
D:\SERNi\anaconda3\Lib\site-packages\sklearn\metrics\ classification.py:1469:
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))
D:\SERNi\anaconda3\Lib\site-packages\sklearn\metrics\_classification.py:1469:
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))
0.4774774774774775
Confusion matrix:
[[6 3 2 0 0]
[47600]
[ 2 4 31 3 6]
[003311]
 [0 0 11 3 6]]
Classification Report:
                    precision
                                 recall f1-score
                                                    support
     A - Very Good
                         0.50
                                   0.55
                                             0.52
                                                         11
          B - Good
                         0.50
                                   0.41
                                             0.45
                                                         17
    C - Sufficient
                         0.58
                                   0.67
                                             0.63
                                                         46
     F - Poor (Mau)
                         0.33
                                   0.18
                                             0.23
                                                         17
F - Poor (Mediocre)
                         0.26
                                   0.30
                                             0.28
                                                         20
          accuracy
                                             0.48
                                                        111
         macro avg
                         0.44
                                   0.42
                                             0.42
                                                        111
      weighted avg
                         0.47
                                   0.48
                                             0.47
                                                        111
-----Portuguese Class Dataset-----
0.532967032967033
Confusion matrix:
[[14 5 3 0 1]
[7121200]
[ 3 24 60 3 10]
[0 1 2 2 1]
[0 0 12 1 9]]
Classification Report:
                    precision
                                 recall f1-score
                                                    support
     A - Very Good
                         0.58
                                   0.61
                                             0.60
                                                         23
          B - Good
                         0.29
                                   0.39
                                             0.33
                                                         31
    C - Sufficient
                         0.67
                                   0.60
                                             0.63
                                                        100
     F - Poor (Mau)
                         0.33
                                   0.33
                                             0.33
                                                          6
F - Poor (Mediocre)
                         0.43
                                   0.41
                                             0.42
                                                         22
```

0.47

0.53

0.53

0.46

0.54

182

182

182

indices to drop

accuracy

0.46

0.56

macro avg

weighted avg

```
[]
final data:
indices to drop
final data:
=========Count how many are in math grade range=============
C - Sufficient
F - Poor (Mediocre)
                  69
F - Poor (Mau)
                  61
B - Good
                  60
A - Very Good
                  40
Name: bins, dtype: int64
========Count how many are in Portugueses grade
range==========
C - Sufficient
                 355
B - Good
                 112
A - Very Good
                  82
F - Poor (Mediocre)
                  80
F - Poor (Mau)
Name: bins, dtype: int64
school sex age address ... G1 G2 G3
0
      0 0 18
                    1 ... 5
                             6 6 F - Poor (Mau)
                    1 ...
1
      0
         0 17
                           5
                              5
                                6 F - Poor (Mau)
                             8 10 C - Sufficient
2
      0
         0 15
                    1 ...
                           7
3
      0
             15
                    1 ... 15
                             14
                                15
                                        B - Good
                             10 10 C - Sufficient
            16
                    1 ... 6
[5 rows x 34 columns]
school sex age address ... G1 G2 G3
                    1 ...
                           0 11 11 C - Sufficient
0
      0
        0 18
                           1
      0
         0
            17
                    1 ...
2
      0
         0
            15
                    1 ... 12
                             13
                                12 C - Sufficient
3
      0
         0 15
                    1 ... 14 14 14
                                         B - Good
      0
          0 16
                    1 ... 11 13 13 C - Sufficient
[5 rows x 34 columns]
=======Count how many are in port y test grade
range===========
F - Poor (Mau)
                   6
F - Poor (Mediocre)
                  22
C - Sufficient
                 100
B - Good
                  31
A - Very Good
                  23
dtype: int64
=======Count how many are in port y train grade
range==========
F - Poor (Mau)
F - Poor (Mediocre)
                  58
C - Sufficient
                 255
B - Good
                  81
A - Very Good
                  59
```

```
dtype: int64
=========KNN Results===========
-----Math Class Dataset-----
Confusion Matrix:
[[4 4 3 0 0]
[67400]
[ 1 5 34 1 5]
[00665]
[ 0 0 11 4 5]]
Classification Report:
                  precision recall f1-score
                                             support
     A - Very Good
                      0.36
                               0.36
                                        0.36
                                                  11
         B - Good
                      0.44
                               0.41
                                        0.42
                                                  17
    C - Sufficient
                      0.59
                               0.74
                                        0.65
                                                  46
    F - Poor (Mau)
                      0.55
                               0.35
                                        0.43
                                                  17
F - Poor (Mediocre)
                      0.33
                               0.25
                                        0.29
                                                  20
         accuracy
                                        0.50
                                                 111
        macro avg
                     0.45
                               0.42
                                        0.43
                                                 111
                     0.49
      weighted avg
                               0.50
                                        0.49
                                                 111
-----Portuguese Class Dataset-----
Confusion Matrix:
[[16 6 0 0 1]
[ 8 11 12 0 0]
[6 20 69 1 4]
[0 0 5 0 1]
[ 0 0 17 0 5]]
Classification Report:
                  precision
                             recall f1-score
                                             support
     A - Very Good
                      0.53
                               0.70
                                        0.60
                                                  23
                      0.30
                                        0.32
         B - Good
                               0.35
                                                  31
    C - Sufficient
                      0.67
                               0.69
                                        0.68
                                                  100
    F - Poor (Mau)
                     0.00
                              0.00
                                        0.00
                                                  6
F - Poor (Mediocre)
                     0.45
                               0.23
                                        0.30
                                                 22
         accuracy
                                        0.55
                                                 182
                     0.39
                               0.39
        macro avg
                                        0.38
                                                 182
      weighted avg
                     0.54
                               0.55
                                        0.54
                                                 182
============Decision Tree Results=============
-----Math Class Dataset-----
Confusion Matrix:
[[7 2 2 0 0]
[47600]
[ 0 4 30 4 8]
[00395]
[00668]]
Classification Report:
                  precision
                             recall f1-score
                                              support
     A - Very Good
                      0.64
                               0.64
                                        0.64
                                                   11
         B - Good
                      0.54
                               0.41
                                        0.47
                                                  17
    C - Sufficient
                     0.64
                               0.65
                                        0.65
                                                  46
                                        0.50
    F - Poor (Mau)
                     0.47
                              0.53
                                                  17
F - Poor (Mediocre)
                     0.38
                              0.40
                                        0.39
                                                   20
```

```
accuracy
                                            0.55
                                                      111
                                            0.53
                                                      111
         macro avg
                        0.53
                                  0.53
      weighted avg
                        0.55
                                  0.55
                                            0.55
                                                      111
-----Portuguese Class Dataset-----
Confusion Matrix:
[[14 6 3 0 0]
[11 16 4 0 0]
[ 2 24 66 0 8]
[00312]
[0 0 11 7 4]]
Classification Report:
                    precision
                                recall f1-score
                                                  support
     A - Very Good
                        0.52
                                  0.61
                                            0.56
                                                       23
          B - Good
                        0.35
                                  0.52
                                            0.42
                                                       31
    C - Sufficient
                        0.76
                                  0.66
                                            0.71
                                                      100
    F - Poor (Mau)
                        0.12
                                  0.17
                                            0.14
                                                        6
F - Poor (Mediocre)
                        0.29
                                  0.18
                                            0.22
                                                       22
                                            0.55
          accuracy
                                                      182
         macro avg
                        0.41
                                  0.43
                                            0.41
                                                      182
      weighted avg
                        0.58
                                  0.55
                                            0.56
                                                      182
======Logistic Regression===========
-----Math Class Dataset-----
Score for logistic regression
0.5495495495495496
Confusion_matrix:

\begin{bmatrix}
[ 7 & 4 & 0 & 0 & 0 \\
5 & 8 & 4 & 0 & 0
\end{bmatrix}

[ 2 3 33 4 4]
[00575]
[00866]]
Classification Report:
                                recall f1-score
                    precision
                                                  support
     A - Very Good
                        0.50
                                  0.64
                                            0.56
                                                       11
          B - Good
                        0.53
                                  0.47
                                            0.50
                                                       17
    C - Sufficient
                        0.66
                                  0.72
                                            0.69
                                                       46
    F - Poor (Mau)
                        0.41
                                  0.41
                                            0.41
                                                       17
F - Poor (Mediocre)
                       0.40
                                  0.30
                                            0.34
                                                       20
                                            0.55
          accuracy
                                                      111
         macro avg
                        0.50
                                  0.51
                                            0.50
                                                      111
      weighted avg
                        0.54
                                  0.55
                                            0.54
                                                      111
-----Portuguese Class Dataset-----
Score for logistic regression
0.6428571428571429
Confusion_matrix:
[[16 7 0 0 0]
[ 2 13 81 0 4]
[00321]
[ 0 0 12 0 10]]
```

Classification Report:

	precision	recall	f1-score	support			
A - Very Good	0.59	0.70	0.64	23			
B - Good	0.29	0.26	0.27	31			
C - Sufficient	0.74	0.81		100			
F - Poor (Mau)	1.00	0.33	0.50	6			
F - Poor (Mediocre)	0.67	0.45	0.54	22			
accuracy			0.64	182			
macro avg	0.66	0.51	0.54	182			
weighted avg	0.64	0.64	0.63	182			
=======================================	===Support	Vector Mac	hines=====		======		
Math Class Dat	aset						
Confusion_matrix:							
$[[1 6 \overline{4} 0 0]$							
[1 1 15 0 0]							
[0 0 42 3 1]							
[00791]							
[0 0 12 4 4]]							
Classification Repor	t:						
		recall	f1-score	support			
	F						
A - Very Good	0.50	0.09	0.15	11			
B - Good			0.08	17			
C - Sufficient		0.91		46			
F - Poor (Mau)	0.56	0.53	0.55	17			
F - Poor (Mediocre)	0.67	0.20	0.31	20			
	• • • • • • • • • • • • • • • • • • • •	0.10	0.02				
accuracy			0.51	111			
macro avg	0.48	0.36	0.35	111			
weighted avg	0.50	0.51	0.44	111			
mergineed avg	0.50	0.51	0.				
Portuguese Class Dataset							
Confusion_matrix:							
	0]						
[4 1 26 0							
	0]						
-	0]						
	1]]						
Classification Repor							
crassificación Repor	precision	recall	f1-score	support			
	precision	rccair	11 30010	заррог с			
A - Very Good	0.79	0.65	0.71	23			
B - Good	0.20	0.03	0.06	31			
C - Sufficient	0.64	1.00	0.78	100			
F - Poor (Mau)	0.00	0.00	0.00	6			
F - Poor (Mediocre)	1.00	0.05	0.09	22			
. 1001 (HCG10C1C)	1.00	0.03	0.05	22			
accuracy			0.64	182			
macro avg	0.53	0.35	0.33	182			
woighted ava	0.55	0.55	0.55	102			

========Multi-layer Preceptron===========

0.64

0.60

weighted avg

0.54

182

⁻⁻⁻⁻⁻Math Class Dataset-----

D:\SERNi\anaconda3\Lib\site-packages\sklearn\metrics_classification.py:1469: 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))
D:\SERNi\anaconda3\Lib\site-packages\sklearn\metrics\_classification.py:1469:
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))
D:\SERNi\anaconda3\Lib\site-packages\sklearn\metrics\_classification.py:1469:
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))
0.4774774774774775
Confusion_matrix:
[[6 3 2 0 0]
[47600]
[ 2 4 31 3 6]
[003311]
[ 0 0 11 3 6]]
Classification Report:
                    precision
                                 recall f1-score
                                                    support
     A - Very Good
                         0.50
                                   0.55
                                              0.52
                                                         11
          B - Good
                         0.50
                                   0.41
                                             0.45
                                                         17
                         0.58
    C - Sufficient
                                   0.67
                                             0.63
                                                         46
    F - Poor (Mau)
                         0.33
                                   0.18
                                             0.23
                                                         17
F - Poor (Mediocre)
                         0.26
                                   0.30
                                             0.28
                                                         20
           accuracy
                                             0.48
                                                        111
         macro avg
                         0.44
                                   0.42
                                             0.42
                                                        111
      weighted avg
                         0.47
                                   0.48
                                             0.47
                                                        111
-----Portuguese Class Dataset-----
0.532967032967033
Confusion matrix:
[[14 5 3 0 1]
[7121200]
[ 3 24 60 3 10]
[0 1 2 2 1]
[0 0 12 1 9]]
Classification Report:
                     precision
                                 recall f1-score
                                                    support
     A - Very Good
                         0.58
                                   0.61
                                             0.60
                                                         23
          B - Good
                         0.29
                                   0.39
                                             0.33
                                                         31
    C - Sufficient
                         0.67
                                   0.60
                                             0.63
                                                        100
    F - Poor (Mau)
                         0.33
                                   0.33
                                             0.33
                                                          6
F - Poor (Mediocre)
                         0.43
                                   0.41
                                             0.42
                                                         22
           accuracy
                                             0.53
                                                        182
         macro avg
                         0.46
                                   0.47
                                             0.46
                                                        182
                         0.56
                                   0.53
                                             0.54
                                                        182
```

In [64]:

weighted avg