

NeuroFinalProject

December 9, 2023

0.1 Import packages and dataset

```
[4]:
```

	ID	M/F	Hand	Age	Educ	SES	MMSE	CDR	eTIV	nWBV	ASF	\
0	OAS1_0001_MR1	F	R	74	2.0	3.0	29.0	0.0	1344	0.743	1.306	
1	OAS1_0002_MR1	F	R	55	4.0	1.0	29.0	0.0	1147	0.810	1.531	
2	OAS1_0003_MR1	F	R	73	4.0	3.0	27.0	0.5	1454	0.708	1.207	
3	OAS1_0004_MR1	M	R	28	NaN	NaN	NaN	NaN	1588	0.803	1.105	
4	OAS1_0005_MR1	M	R	18	NaN	NaN	NaN	NaN	1737	0.848	1.010	
..	
431	OAS1_0285_MR2	M	R	20	NaN	NaN	NaN	NaN	1469	0.847	1.195	
432	OAS1_0353_MR2	M	R	22	NaN	NaN	NaN	NaN	1684	0.790	1.042	
433	OAS1_0368_MR2	M	R	22	NaN	NaN	NaN	NaN	1580	0.856	1.111	
434	OAS1_0379_MR2	F	R	20	NaN	NaN	NaN	NaN	1262	0.861	1.390	
435	OAS1_0395_MR2	F	R	26	NaN	NaN	NaN	NaN	1283	0.834	1.368	


```
Delay
```

0	NaN
1	NaN
2	NaN
3	NaN
4	NaN
..	...
431	2.0
432	40.0
433	89.0
434	2.0
435	39.0


```
[436 rows x 12 columns]
```

1 Data preprocessing

1.0.1 Data cleaning

```
[5]: ID      object
      M/F     object
      Hand    object
```

```

Age          int64
Educ         float64
SES          float64
MMSE         float64
CDR          float64
eTIV         int64
nWBV         float64
ASF          float64
Delay        float64
dtype: object

```

```

[6]:      M/F Hand Age Educ SES MMSE CDR eTIV nWBV ASF Delay
0      F   R   74   2.0 3.0 29.0 0.0 1344 0.743 1.306   NaN
1      F   R   55   4.0 1.0 29.0 0.0 1147 0.810 1.531   NaN
2      F   R   73   4.0 3.0 27.0 0.5 1454 0.708 1.207   NaN
3      M   R   28   NaN NaN   NaN NaN 1588 0.803 1.105   NaN
4      M   R   18   NaN NaN   NaN NaN 1737 0.848 1.010   NaN
..    ..  ...  ...  ...  ...  ...  ...  ...  ...  ...
431    M   R   20   NaN NaN   NaN NaN 1469 0.847 1.195    2.0
432    M   R   22   NaN NaN   NaN NaN 1684 0.790 1.042   40.0
433    M   R   22   NaN NaN   NaN NaN 1580 0.856 1.111   89.0
434    F   R   20   NaN NaN   NaN NaN 1262 0.861 1.390    2.0
435    F   R   26   NaN NaN   NaN NaN 1283 0.834 1.368   39.0

```

[436 rows x 11 columns]

```

[7]: M/F      0
     Hand     0
     Age      0
     Educ    201
     SES     220
     MMSE    201
     CDR     201
     eTIV     0
     nWBV     0
     ASF      0
     Delay   416
     dtype: int64

```

```

[8]:      M/F Hand Age Educ SES MMSE CDR eTIV nWBV ASF
0      F   R   74   2.0 3.0 29.0 0.0 1344 0.743 1.306
1      F   R   55   4.0 1.0 29.0 0.0 1147 0.810 1.531
2      F   R   73   4.0 3.0 27.0 0.5 1454 0.708 1.207
3      M   R   28   NaN NaN   NaN NaN 1588 0.803 1.105
4      M   R   18   NaN NaN   NaN NaN 1737 0.848 1.010
..    ..  ...  ...  ...  ...  ...  ...  ...
431    M   R   20   NaN NaN   NaN NaN 1469 0.847 1.195

```

432	M	R	22	NaN	NaN	NaN	NaN	1684	0.790	1.042
433	M	R	22	NaN	NaN	NaN	NaN	1580	0.856	1.111
434	F	R	20	NaN	NaN	NaN	NaN	1262	0.861	1.390
435	F	R	26	NaN	NaN	NaN	NaN	1283	0.834	1.368

[436 rows x 10 columns]

```
[10]: M/F      0
      Hand    0
      Age     0
      Educ    0
      SES     0
      MMSE    0
      CDR     0
      eTIV    0
      nWBV    0
      ASF     0
      dtype: int64
```

```
[11]:   M/F  Age  Educ  SES  MMSE  CDR  eTIV  nWBV  ASF
0    F   74   2.0  3.0  29.0  0.0  1344  0.743  1.306
1    F   55   4.0  1.0  29.0  0.0  1147  0.810  1.531
2    F   73   4.0  3.0  27.0  0.5  1454  0.708  1.207
8    M   74   5.0  2.0  30.0  0.0  1636  0.689  1.073
9    F   52   3.0  2.0  30.0  0.0  1321  0.827  1.329
..   ..  ...  ...  ...  ...  ...  ...  ...
411  F   70   1.0  4.0  29.0  0.5  1295  0.748  1.355
412  F   73   3.0  2.0  23.0  0.5  1536  0.730  1.142
413  F   61   2.0  4.0  28.0  0.0  1354  0.825  1.297
414  M   61   5.0  2.0  30.0  0.0  1637  0.780  1.072
415  F   62   3.0  3.0  26.0  0.0  1372  0.766  1.279
```

[216 rows x 9 columns]

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 216 entries, 0 to 415
Data columns (total 9 columns):
#   Column  Non-Null Count  Dtype
---  -
0   M/F      216 non-null      object
1   Age      216 non-null      int64
2   Educ     216 non-null      float64
3   SES      216 non-null      float64
4   MMSE     216 non-null      float64
5   CDR      216 non-null      float64
6   eTIV     216 non-null      int64
7   nWBV     216 non-null      float64
```

```

      8   ASF      216 non-null   float64
dtypes: float64(6), int64(2), object(1)
memory usage: 16.9+ KB

```

1.0.2 Feature Engineering

```

[13]: 0      0.0
      1      0.0
      2      0.5
      8      0.0
      9      0.0
      ...
     411     0.5
     412     0.5
     413     0.0
     414     0.0
     415     0.0
Name: CDR, Length: 216, dtype: float64

```

```

[15]: 0      0.0
      1      0.0
      2      1.0
      8      0.0
      9      0.0
      ...
     411     1.0
     412     1.0
     413     0.0
     414     0.0
     415     0.0
Name: CDR, Length: 216, dtype: float64

```

```

[69]:
      M/F  Age  Educ  SES  MMSE  CDR  eTIV  nWBV  ASF
0      0   74   2.0  3.0  29.0  0.0  1344  0.743  1.306
1      0   55   4.0  1.0  29.0  0.0  1147  0.810  1.531
2      0   73   4.0  3.0  27.0  1.0  1454  0.708  1.207
8      1   74   5.0  2.0  30.0  0.0  1636  0.689  1.073
9      0   52   3.0  2.0  30.0  0.0  1321  0.827  1.329
..  ...  ...  ...  ...  ...  ...  ...  ...
411   0   70   1.0  4.0  29.0  1.0  1295  0.748  1.355
412   0   73   3.0  2.0  23.0  1.0  1536  0.730  1.142
413   0   61   2.0  4.0  28.0  0.0  1354  0.825  1.297
414   1   61   5.0  2.0  30.0  0.0  1637  0.780  1.072
415   0   62   3.0  3.0  26.0  0.0  1372  0.766  1.279

```

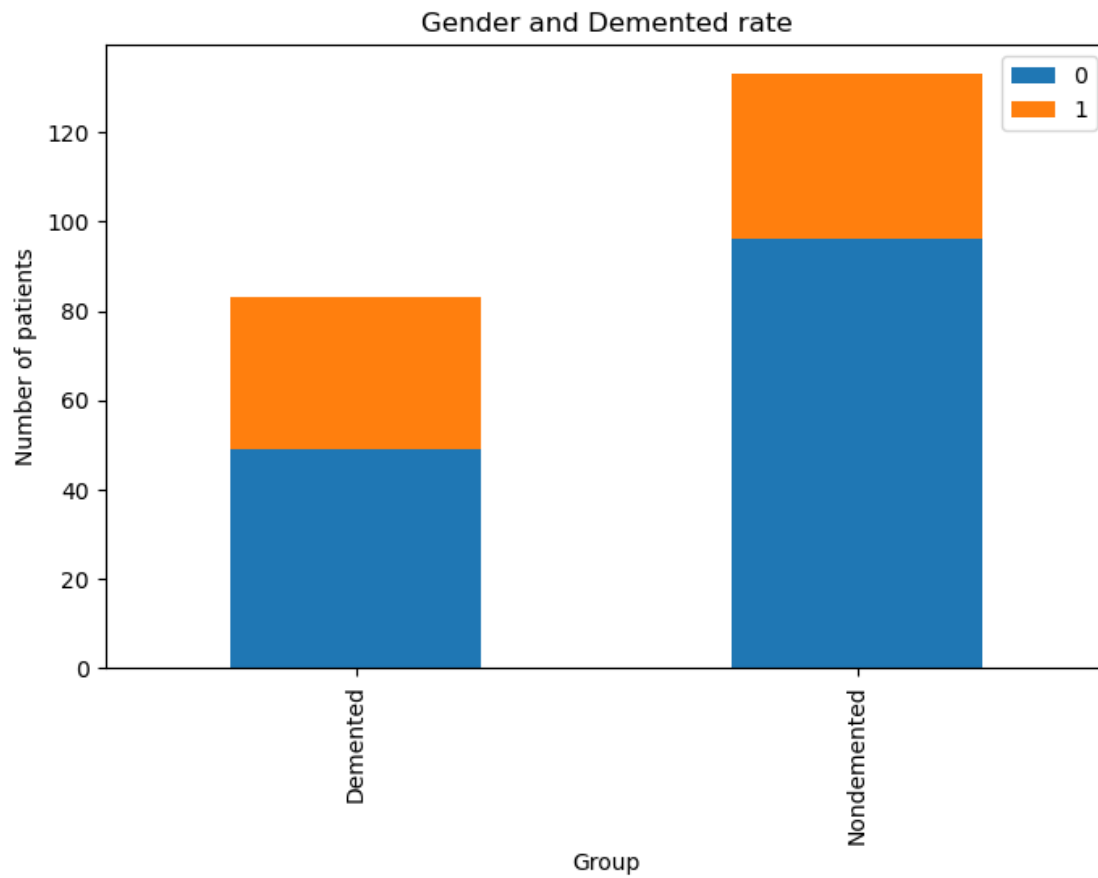
[216 rows x 9 columns]

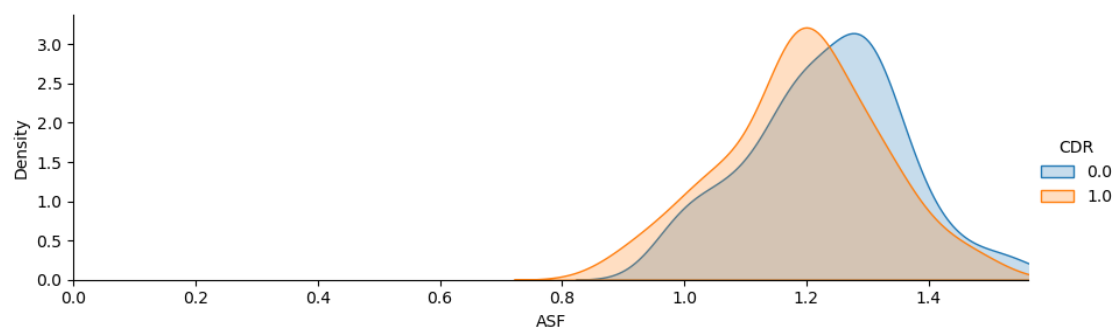
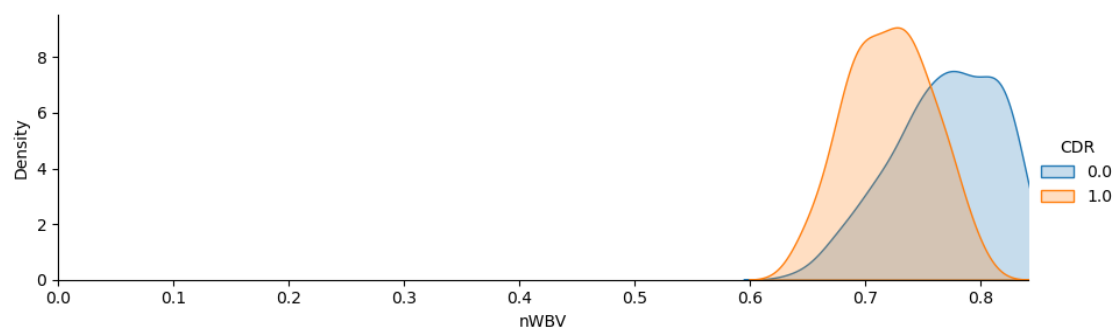
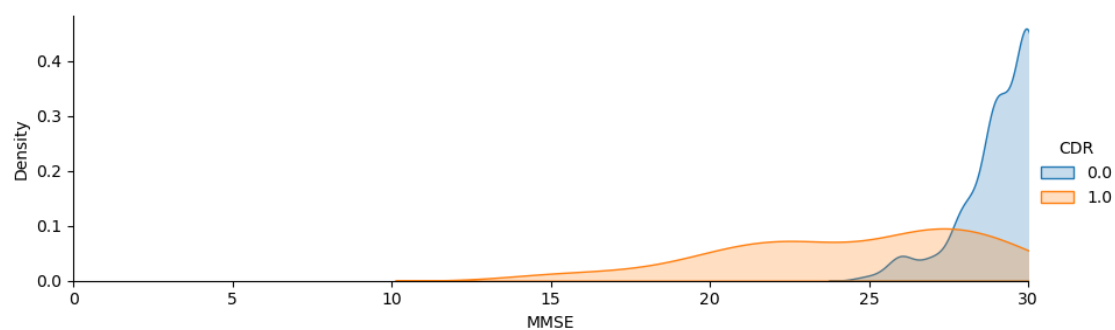
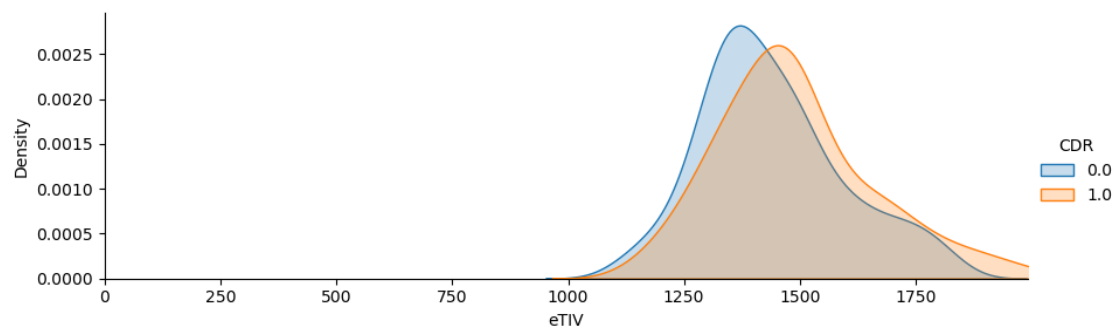
2 Exploratory Data Analysis

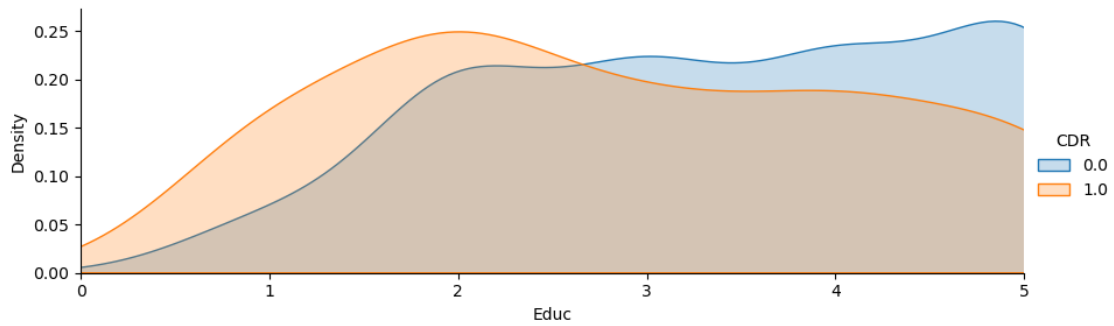
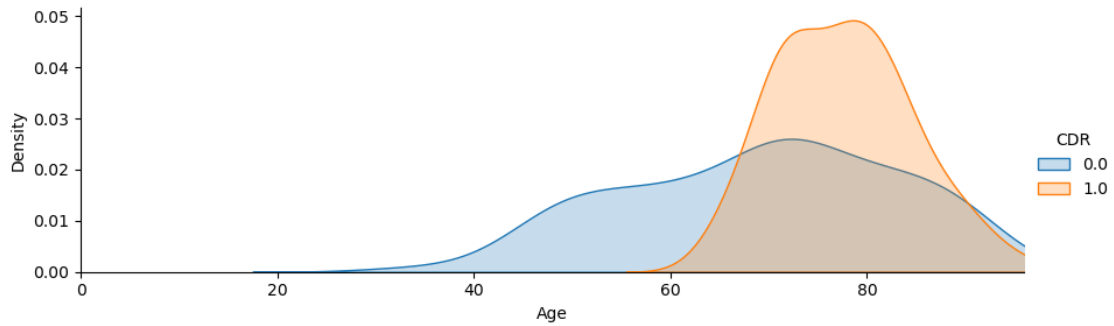
- Distribution of variables
- Exploratory PCAs
- Model implementations
 - Linear regression model with automatic feature selection
 - Automatic ML model selection (RandomforestClassifier)
 - Model testing & Results visualization

2.1 Distributions

[18]: Text(0.5, 1.0, 'Gender and Demented rate')







2.2 Exploratory Data analysis – PCAs

- General PCA
- PCA without age
- PCA with social factors only (no results because the dataset is only 2-D)
- PCA with brain measurement factors

Training set shape: (172, 8) (172,)

Test set shape: (44, 8) (44,)

[25]:

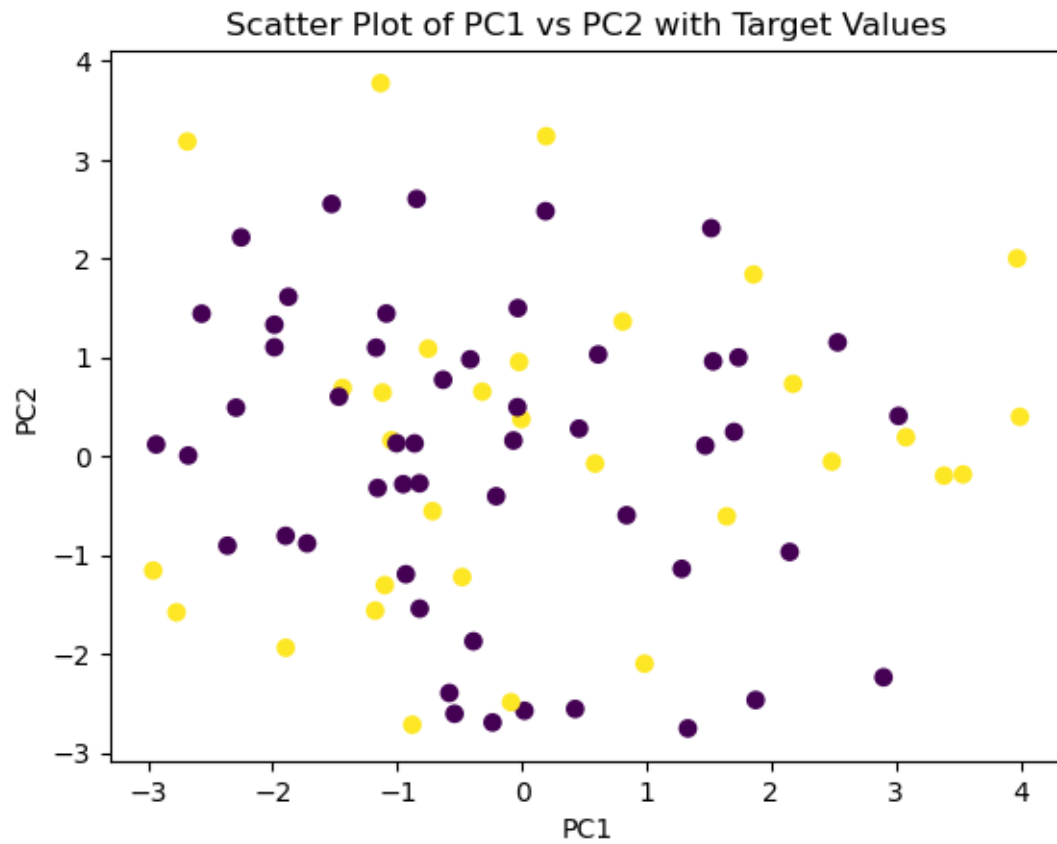
	PC1	PC2	CDR
0	-1.874614	1.613698	0.0
1	1.736401	1.000079	0.0
2	-0.479995	-1.221007	1.0
3	-1.865039	2.591256	NaN
4	2.742506	-1.813851	NaN
..
411	NaN	NaN	1.0
412	NaN	NaN	1.0

```

413      NaN      NaN  0.0
414      NaN      NaN  0.0
415      NaN      NaN  0.0

```

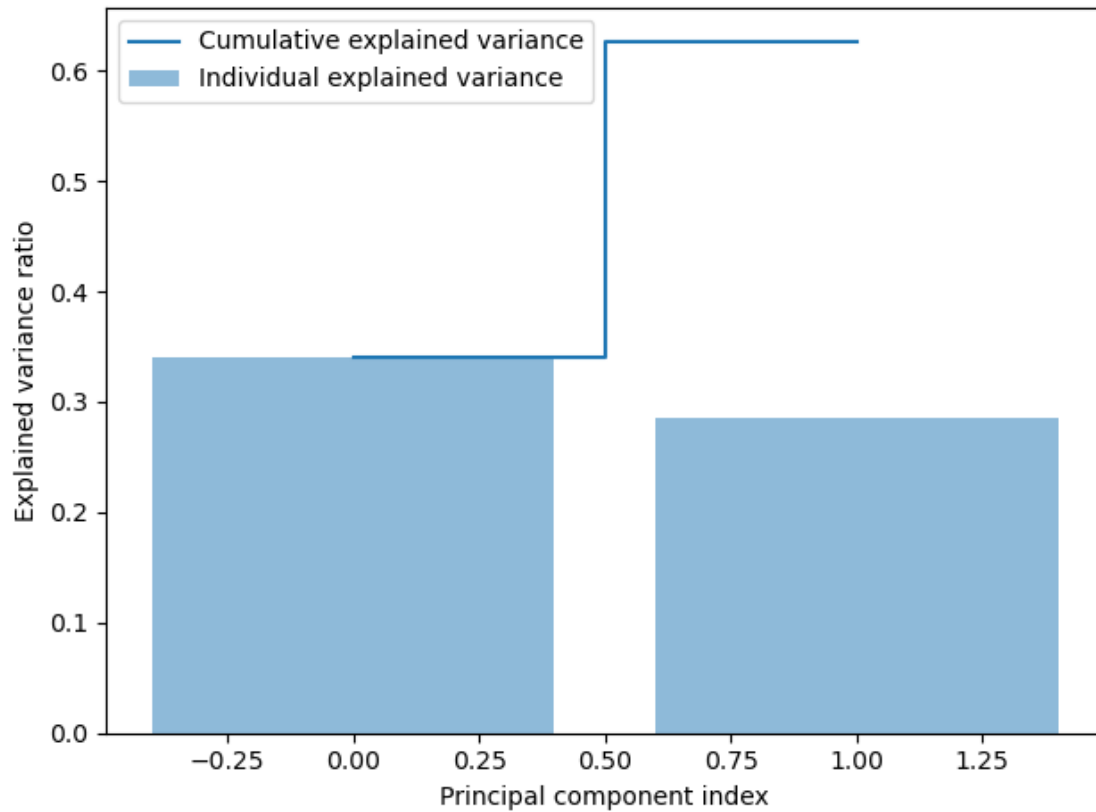
```
[306 rows x 3 columns]
```



```

The explained variances by PC1 and PC2 is [0.34073802 0.28484481]
The total explained variance by PCA is 0.6255828327408242

```

2.2.1 Inferring the PCA results

```
[28]: array([[ 0.43829675, -0.03454681,  0.29904305, -0.30799529,  0.0638827 ,
               0.55369213, -0.10709964, -0.5479857 ],
             [ 0.09280395,  0.482203 , -0.34705162,  0.28885494, -0.47398471,
               0.12421983, -0.54564549, -0.1310138 ]])
```

```
[29]: array(['M/F', 'Age', 'Educ', 'SES', 'MMSE', 'eTIV', 'nWBV', 'ASF'],
            dtype='<U4')
```

```
[30]:   vars    to_PC1    to_PC2
0  M/F  0.438297  0.092804
1  Age -0.034547  0.482203
2  Educ  0.299043 -0.347052
3  SES -0.307995  0.288855
4  MMSE  0.063883 -0.473985
5  eTIV  0.553692  0.124220
6  nWBV -0.107100 -0.545645
7  ASF -0.547986 -0.131014
```

2.2.2 Data2 without Age

Since Age is a huge predictor of Alzheimer's, it is possible that the PCA results were skewed by the Age feature.

So this section tries the entire process without Age

```
[31]:      M/F  Educ  SES  MMSE  CDR  eTIV  nWBV  ASF
0      0   2.0   3.0  29.0   0.0  1344  0.743  1.306
1      0   4.0   1.0  29.0   0.0  1147  0.810  1.531
2      0   4.0   3.0  27.0   1.0  1454  0.708  1.207
8      1   5.0   2.0  30.0   0.0  1636  0.689  1.073
9      0   3.0   2.0  30.0   0.0  1321  0.827  1.329
..     ...   ...   ...   ...   ...   ...   ...
411    0   1.0   4.0  29.0   1.0  1295  0.748  1.355
412    0   3.0   2.0  23.0   1.0  1536  0.730  1.142
413    0   2.0   4.0  28.0   0.0  1354  0.825  1.297
414    1   5.0   2.0  30.0   0.0  1637  0.780  1.072
415    0   3.0   3.0  26.0   0.0  1372  0.766  1.279
```

[216 rows x 8 columns]

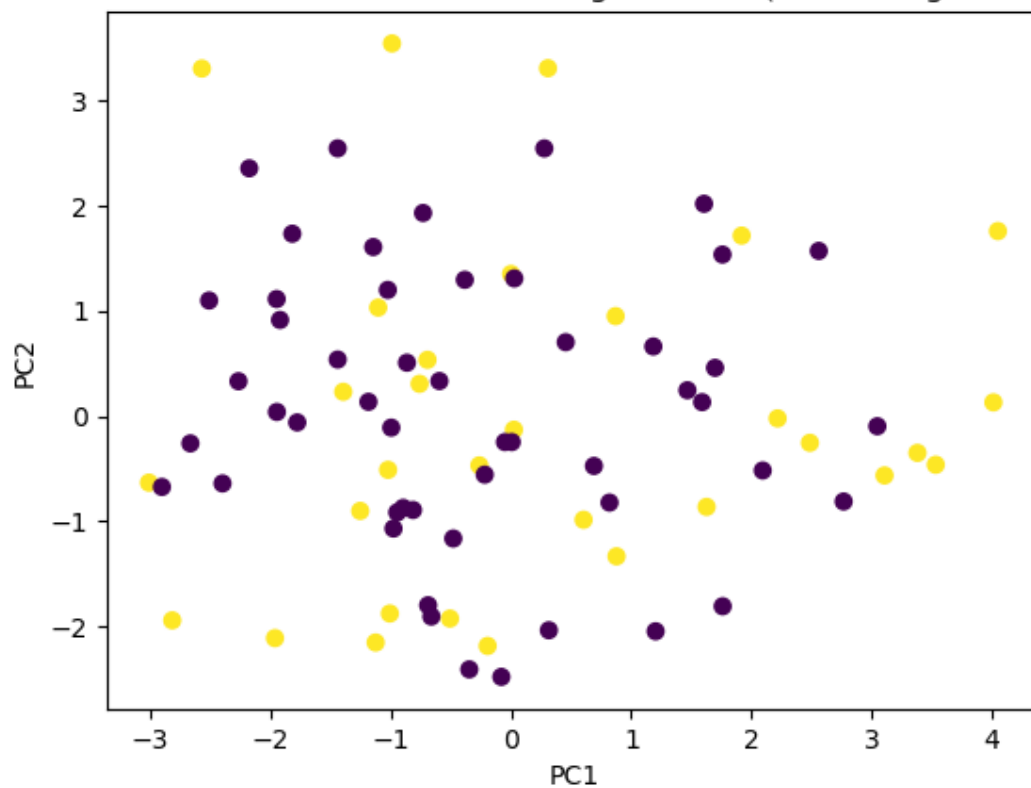
Training set shape: (172, 7) (172,)

Test set shape: (44, 7) (44,)

```
[34]:      PC1      PC2  CDR
0  -1.816204  1.733007  0.0
1   1.759053  1.535174  0.0
2  -0.505545 -1.925298  1.0
3  -1.774946  2.793992 NaN
4   2.646523 -0.964920 NaN
..     ...     ...   ...
411      NaN      NaN  1.0
412      NaN      NaN  1.0
413      NaN      NaN  0.0
414      NaN      NaN  0.0
415      NaN      NaN  0.0
```

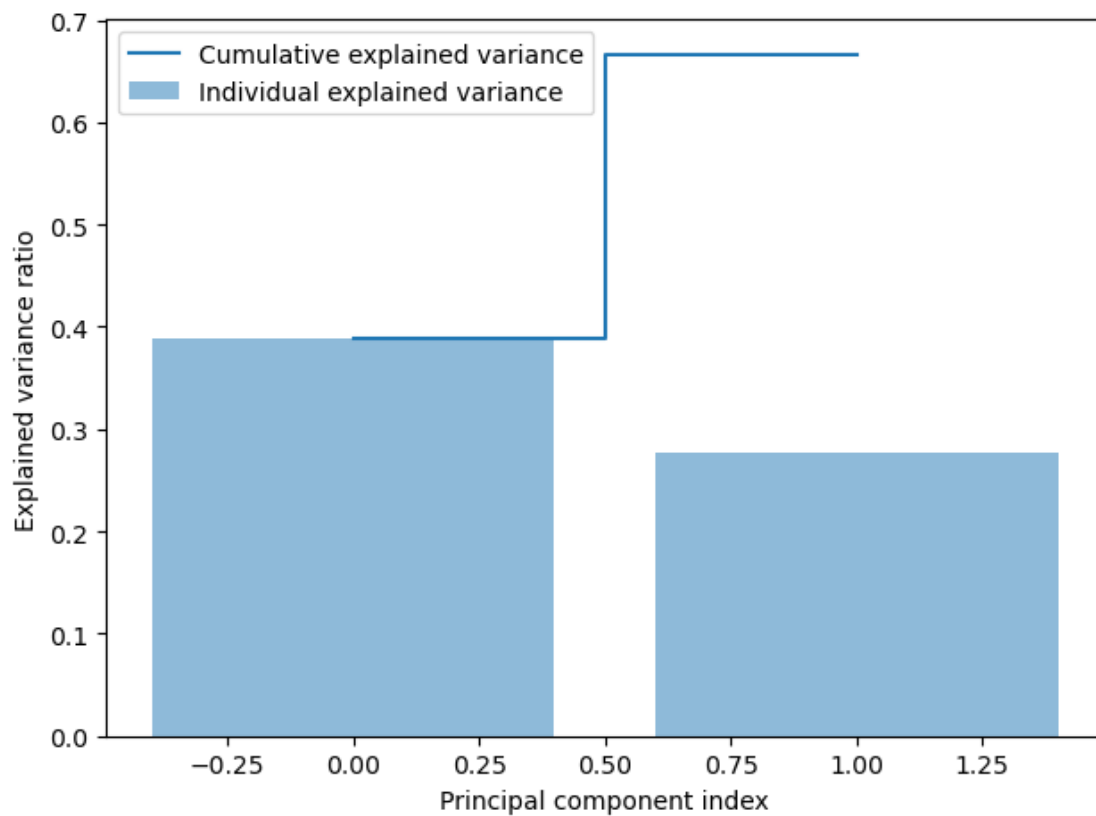
[306 rows x 3 columns]

Scatter Plot of PC1 vs PC2 with Target Values (without Age feature)



The explained variances by PC1 and PC2 is [0.38922668 0.27753814]

The total explained variance by PCA is 0.666764812569268



```
[37]: vars    to_PC1    to_PC2
0  M/F  0.439875  0.149675
1  Educ  0.289599 -0.498214
2  SES  -0.300694  0.450204
3  MMSE  0.049019 -0.526259
4  eTIV  0.556647  0.159572
5  nWBV -0.127619 -0.441487
6  ASF  -0.551072 -0.171388
```

```
[39]:      M/F  Age  MMSE  CDR  eTIV  nWBV  ASF
0      0   74  29.0  0.0  1344  0.743  1.306
1      0   55  29.0  0.0  1147  0.810  1.531
2      0   73  27.0  1.0  1454  0.708  1.207
8      1   74  30.0  0.0  1636  0.689  1.073
9      0   52  30.0  0.0  1321  0.827  1.329
..    ...  ...  ...  ...  ...  ...
411    0   70  29.0  1.0  1295  0.748  1.355
412    0   73  23.0  1.0  1536  0.730  1.142
413    0   61  28.0  0.0  1354  0.825  1.297
414    1   61  30.0  0.0  1637  0.780  1.072
415    0   62  26.0  0.0  1372  0.766  1.279
```

```
[216 rows x 7 columns]
```

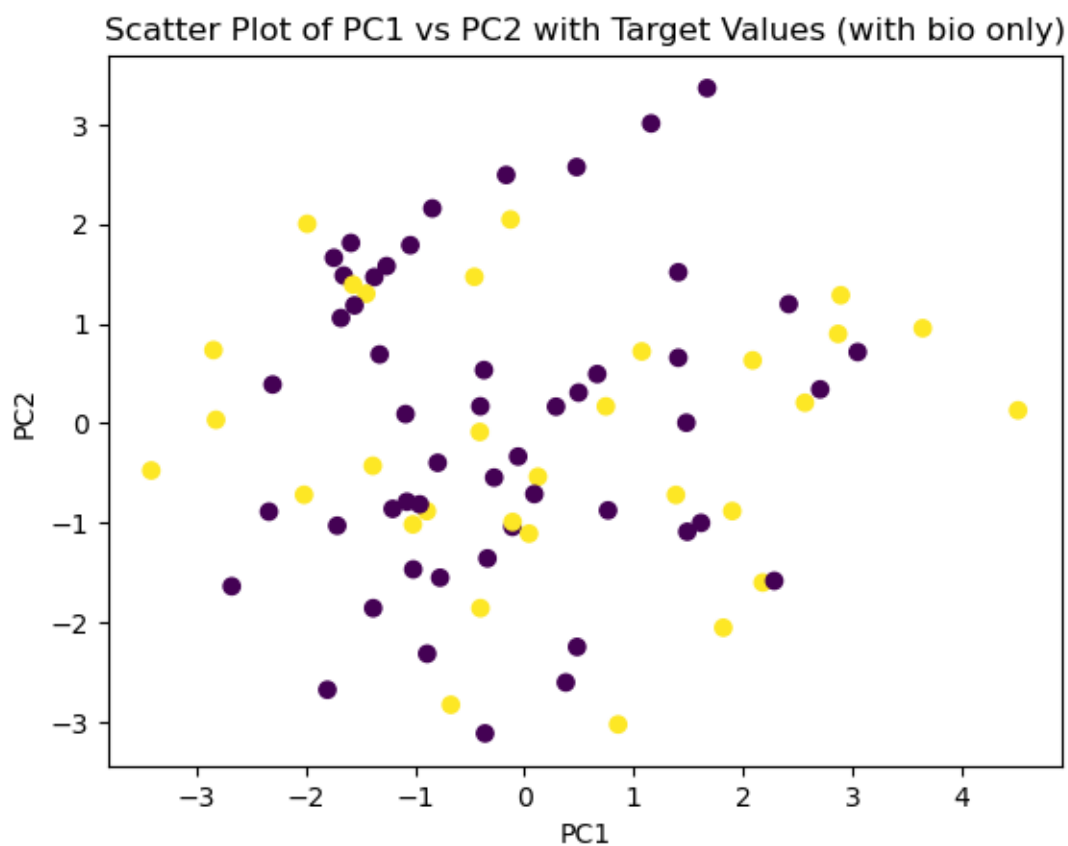
```
Training set shape: (172, 6) (172, 6)
```

```
Test set shape: (44,) (44,)
```

```
[42]:
```

	PC1	PC2	CDR
0	-0.770960	-1.550299	0.0
1	2.419336	1.196371	0.0
2	-1.386507	-0.426424	1.0
3	-0.276261	-2.160778	NaN
4	1.719195	2.819163	NaN
..
411	NaN	NaN	1.0
412	NaN	NaN	1.0
413	NaN	NaN	0.0
414	NaN	NaN	0.0
415	NaN	NaN	0.0

```
[306 rows x 3 columns]
```



```
[44]:      vars      to_PC1      to_PC2
0   M/F  0.461271  0.184471
1   Age  0.134123 -0.587461
2  MMSE -0.131233  0.468814
3  eTIV  0.577746  0.194324
4  nWBV -0.292716  0.571614
5   ASF -0.576667 -0.191230
```

2.3 Model implementation – (1) Linear regression Model

With Automatic Feature Selection

```

                                model      RSS
0  <statsmodels.regression.linear_model.Regressio...  21.324458
1  <statsmodels.regression.linear_model.Regressio...  20.374411
2  <statsmodels.regression.linear_model.Regressio...  22.886511
3  <statsmodels.regression.linear_model.Regressio...  26.465201
4  <statsmodels.regression.linear_model.Regressio...  19.488219
5  <statsmodels.regression.linear_model.Regressio...  19.336666
6  <statsmodels.regression.linear_model.Regressio...  19.296314
7  <statsmodels.regression.linear_model.Regressio...  19.393491

                                OLS Regression Results
=====
=====
Dep. Variable:                  CDR      R-squared (uncentered):
0.708
Model:                          OLS      Adj. R-squared (uncentered):
0.695
Method:                        Least Squares      F-statistic:
57.05
Date:                          Sat, 09 Dec 2023      Prob (F-statistic):
7.27e-41
Time:                          15:48:43      Log-Likelihood:
-55.926
No. Observations:              172      AIC:
125.9
Df Residuals:                  165      BIC:
147.9
Df Model:                      7
Covariance Type:               nonrobust
=====
=====
                                coef      std err          t      P>|t|      [0.025      0.975]
-----
M/F                0.0651      0.068      0.952      0.342      -0.070      0.200
Educ               0.0195      0.031      0.621      0.535      -0.042      0.081
SES                0.0454      0.035      1.286      0.200      -0.024      0.115
MMSE              -0.0705      0.009     -7.944      0.000      -0.088     -0.053
eTIV               0.0015      0.000      8.978      0.000      0.001      0.002

```

nWBV	-2.7252	0.646	-4.222	0.000	-4.000	-1.451
ASF	1.5881	0.240	6.610	0.000	1.114	2.063
=====						
Omnibus:		10.640	Durbin-Watson:			1.803
Prob(Omnibus):		0.005	Jarque-Bera (JB):			11.549
Skew:		0.629	Prob(JB):			0.00311
Kurtosis:		2.836	Cond. No.			3.78e+04
=====						

Notes:

[1] R^2 is computed without centering (uncentered) since the model does not contain a constant.

[2] Standard Errors assume that the covariance matrix of the errors is correctly specified.

[3] The condition number is large, 3.78e+04. This might indicate that there are strong multicollinearity or other numerical problems.

```
[48]: <class 'statsmodels.iolib.table.SimpleTable'>
```

```
Empty DataFrame
Columns: []
Index: []
```

2.4 Model implementation – (2) Automatic ML Model Selection

```
[73]: M/F      int64
      Age      int64
      Educ    float64
      SES      float64
      MMSE     float64
      CDR      float64
      eTIV     int64
      nWBV     float64
      ASF      float64
      dtype: object
```

```
[78]: M/F      object
      Age      float64
      Educ     float64
      SES      float64
      MMSE     float64
      CDR      object
      eTIV     float64
      nWBV     float64
      ASF      float64
      dtype: object
```

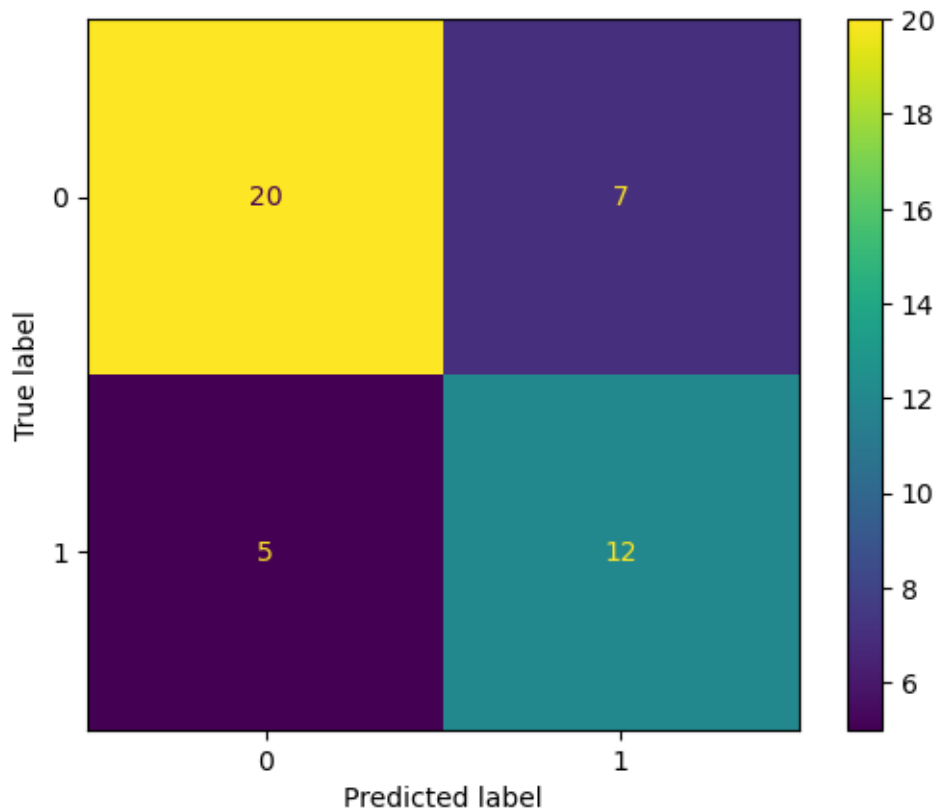
```
Best Model: Pipeline(steps=[('preprocessor',
```

```

ColumnTransformer(transformers=[('num',
                                Pipeline(steps=[('scaler',
StandardScaler()))]),
                                Index(['M/F', 'Age', 'Educ',
'SES', 'MMSE', 'eTIV', 'nWBV', 'ASF'], dtype='object')),
                                ('cat',
                                Pipeline(steps=[('onehot',
OneHotEncoder(handle_unknown='ignore'))])),
                                Index([], dtype='object'))]),
                                ('classifier', RandomForestClassifier()))
Cross-Validation Accuracy: 0.8601680672268905
Test Accuracy: 0.7727272727272727
Accuracy: 0.7272727272727273

```

[126]: <sklearn.metrics._plot.confusion_matrix.ConfusionMatrixDisplay at 0x7fc2439d2610>



2.5 Codes not working

Requirement already satisfied: graphviz in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (0.20.1)

```
-----  
FileNotFoundError                                Traceback (most recent call last)  
Input In [116], in <cell line: 15>()  
    12 graph = graphviz.Source(dot_data)  
    13 #display(graph)  
--> 15 with open("tree") as f:  
    16     dot_graph = f.read()  
    17     display(graphviz.Source(dot_graph))  
  
FileNotFoundError: [Errno 2] No such file or directory: 'tree'
```

/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-
packages/sklearn/linear_model/_logistic.py:458: 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](https://scikit-learn.org/stable/modules/linear_model.html#logistic-regression)
n_iter_i = _check_optimize_result(

[89]: LogisticRegression()

2.5.1 Alternative model selection method: MDR

(Trying to implement)

Collecting scikit-mdr

Downloading scikit_MDR-0.4.5-py3-none-any.whl (15 kB)

Requirement already satisfied: scikit-learn in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from scikit-mdr)
(1.2.2)

Requirement already satisfied: scipy in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from scikit-mdr)
(1.10.1)

Requirement already satisfied: numpy in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from scikit-mdr)
(1.21.5)

Requirement already satisfied: matplotlib in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from scikit-mdr)

```

(3.7.1)
Requirement already satisfied: fonttools>=4.22.0 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (4.25.0)
Requirement already satisfied: python-dateutil>=2.7 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (2.8.2)
Requirement already satisfied: cycler>=0.10 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (0.11.0)
Requirement already satisfied: pyparsing>=2.3.1 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (3.0.9)
Requirement already satisfied: kiwisolver>=1.0.1 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (1.4.4)
Requirement already satisfied: packaging>=20.0 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (23.0)
Requirement already satisfied: importlib-resources>=3.2.0 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (5.2.0)
Requirement already satisfied: contourpy>=1.0.1 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (1.0.5)
Requirement already satisfied: pillow>=6.2.0 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from
matplotlib->scikit-mdr) (9.4.0)
Requirement already satisfied: zipp>=3.1.0 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from importlib-
resources>=3.2.0->matplotlib->scikit-mdr) (3.11.0)
Requirement already satisfied: six>=1.5 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from python-
dateutil>=2.7->matplotlib->scikit-mdr) (1.16.0)
Requirement already satisfied: joblib>=1.1.1 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from scikit-
learn->scikit-mdr) (1.1.1)
Requirement already satisfied: threadpoolctl>=2.0.0 in
/Users/yufeimeng/opt/anaconda3/lib/python3.9/site-packages (from scikit-
learn->scikit-mdr) (2.2.0)
Installing collected packages: scikit-mdr
Successfully installed scikit-mdr-0.4.5
Note: you may need to restart the kernel to use updated packages.

```

```

[60]:      M/F  Age  Educ  SES  MMSE  eTIV   nWBV   ASF
      352    0   77    2.0  4.0   22.0  1350  0.736  1.300
      300    1   72    1.0  3.0   29.0  1734  0.762  1.012

```

```

200    0    75    5.0    1.0    30.0    1317    0.742    1.332
212    0    77    1.0    4.0    20.0    1376    0.701    1.275
189    1    51    5.0    2.0    29.0    1714    0.819    1.024
..    ..    ..    ..    ..    ..    ..    ..    ..
153    0    74    2.0    3.0    29.0    1395    0.787    1.258
17     0    89    5.0    1.0    30.0    1536    0.715    1.142
152    0    81    2.0    3.0    28.0    1495    0.687    1.174
262    1    83    3.0    2.0    26.0    1992    0.706    0.881
263    0    73    2.0    2.0    19.0    1274    0.745    1.377

```

[172 rows x 8 columns]

```

-----
KeyError                                Traceback (most recent call last)
File ~/opt/anaconda3/lib/python3.9/site-packages/pandas/core/indexes/base.py:
  3802, in Index.get_loc(self, key, method, tolerance)
    3801 try:
-> 3802     return self._engine.get_loc(casted_key)
    3803 except KeyError as err:

File ~/opt/anaconda3/lib/python3.9/site-packages/pandas/_libs/index.pyx:138, in
  pandas._libs.index.IndexEngine.get_loc()

File ~/opt/anaconda3/lib/python3.9/site-packages/pandas/_libs/index.pyx:165, in
  pandas._libs.index.IndexEngine.get_loc()

File pandas/_libs/hashtable_class_helper.pxi:5745, in pandas._libs.hashtable.
  PyObjectHashTable.get_item()

File pandas/_libs/hashtable_class_helper.pxi:5753, in pandas._libs.hashtable.
  PyObjectHashTable.get_item()

KeyError: 0

```

The above exception was the direct cause of the following exception:

```

KeyError                                Traceback (most recent call last)
Input In [61], in <cell line: 1>()
----> 1 my_mdr.fit(features, labels)
      2 my_mdr.transform(features)

File ~/opt/anaconda3/lib/python3.9/site-packages/mdr/mdr.py:81, in MDRBase.
  fit(self, features, class_labels)
    79 self.class_count_matrix = defaultdict(lambda: defaultdict(int))
    80 for row_i in range(features.shape[0]):
--> 81     feature_instance = tuple(features[row_i])
    82     self.class_count_matrix[feature_instance][class_labels[row_i]] += 1

```

```
83 self.class_count_matrix = dict(self.class_count_matrix)
```

File ~/opt/anaconda3/lib/python3.9/site-packages/pandas/core/frame.py:3807, in

```
↳ DataFrame.__getitem__(self, key)
    3805 if self.columns.nlevels > 1:
    3806     return self._getitem_multilevel(key)
-> 3807 indexer = self.columns.get_loc(key)
    3808 if is_integer(indexer):
    3809     indexer = [indexer]
```

File ~/opt/anaconda3/lib/python3.9/site-packages/pandas/core/indexes/base.py:

```
↳ 3804, in Index.get_loc(self, key, method, tolerance)
    3802     return self._engine.get_loc(casted_key)
    3803 except KeyError as err:
-> 3804     raise KeyError(key) from err
    3805 except TypeError:
    3806     # If we have a listlike key, _check_indexing_error will raise
    3807     # InvalidIndexError. Otherwise we fall through and re-raise
    3808     # the TypeError.
    3809     self._check_indexing_error(key)
```

KeyError: 0