## e-scaling-and-feature-selection-1

## October 4, 2024

```
[3]: import pandas as pd
     import numpy as np
     import seaborn as sns
     import matplotlib.pyplot as plt
     from sklearn.model_selection import train_test_split
     from sklearn.neighbors import KNeighborsClassifier
     from sklearn.metrics import accuracy_score,confusion_matrix
     df=pd.read_csv("/content/income(1) (1).csv",na_values=[" ?"])
     df
[3]:
                       JobType
                                        EdType
                                                       maritalstatus
            age
     0
             45
                       Private
                                       HS-grad
                                                            Divorced
                                       HS-grad
     1
             24
                   Federal-gov
                                                       Never-married
     2
             44
                       Private
                                  Some-college
                                                  Married-civ-spouse
     3
             27
                       Private
                                           9th
                                                       Never-married
     4
             20
                       Private
                                  Some-college
                                                       Never-married
     31973
                                       HS-grad
             34
                     Local-gov
                                                       Never-married
     31974
                     Local-gov
                                  Some-college
                                                       Never-married
     31975
                       Private
                                  Some-college
                                                 Married-civ-spouse
             23
     31976
                     Local-gov
                                  Some-college
                                                 Married-civ-spouse
     31977
                       Private
                                     Bachelors
                                                       Never-married
                  occupation
                                  relationship
                                                   race
                                                           gender
                                                                   capitalgain
     0
                Adm-clerical
                                 Not-in-family
                                                   White
                                                           Female
                                                                              0
     1
                 Armed-Forces
                                      Own-child
                                                                              0
                                                   White
                                                             Male
     2
              Prof-specialty
                                        Husband
                                                   White
                                                             Male
                                                                              0
     3
                 Craft-repair
                                                                              0
                                 Other-relative
                                                   White
                                                             Male
     4
                        Sales
                                 Not-in-family
                                                   White
                                                             Male
                                                                              0
     31973
             Farming-fishing
                                                                            594
                                 Not-in-family
                                                   Black
                                                             Male
     31974
             Protective-serv
                                 Not-in-family
                                                   White
                                                           Female
                                                                              0
     31975
                Adm-clerical
                                                                              0
                                        Husband
                                                   White
                                                             Male
                Adm-clerical
                                                                              0
     31976
                                           Wife
                                                  White
                                                           Female
     31977
              Prof-specialty
                                                   White
                                                             Male
                                                                              0
                                 Not-in-family
```

nativecountry

capitalloss hoursperweek

```
0
                      0
                                    28
                                         United-States
     1
                      0
                                    40
                                         United-States
     2
                       0
                                    40
                                         United-States
     3
                                    40
                                                 Mexico
     4
                                    35
                                         United-States
     31973
                      0
                                    60
                                         United-States
     31974
                                    40
                                         United-States
                      0
     31975
                      0
                                    40
                                         United-States
     31976
                       0
                                    40
                                         United-States
                                         United-States
     31977
                       0
                                    40
                                   SalStat
     0
             less than or equal to 50,000
     1
             less than or equal to 50,000
     2
                      greater than 50,000
     3
             less than or equal to 50,000
     4
             less than or equal to 50,000
     31973
             less than or equal to 50,000
     31974
             less than or equal to 50,000
     31975
             less than or equal to 50,000
     31976
             less than or equal to 50,000
             less than or equal to 50,000
     31977
     [31978 rows x 13 columns]
[4]: df.isnull().sum()
[4]: age
                          0
                      1809
     JobType
     EdType
                          0
     maritalstatus
                          0
     occupation
                       1816
     relationship
                          0
     race
                          0
     gender
                          0
     capitalgain
                          0
                          0
     capitalloss
     hoursperweek
                          0
     nativecountry
                          0
     SalStat
                          0
     dtype: int64
[5]: missing=df[df.isnull().any(axis=1)]
```

missing

```
[5]:
            age JobType
                                  EdType
                                                 maritalstatus occupation
             17
     8
                     NaN
                                    11th
                                                 Never-married
                                                                       NaN
     17
             32
                     NaN
                                           Married-civ-spouse
                                                                       NaN
                           Some-college
     29
             22
                     NaN
                           Some-college
                                                 Never-married
                                                                       NaN
             52
     42
                     NaN
                                    12th
                                                 Never-married
                                                                       NaN
             63
                     NaN
                                 1st-4th
                                            Married-civ-spouse
     44
                                                                       NaN
                                                   •••
     31892
             59
                     NaN
                              Bachelors
                                           Married-civ-spouse
                                                                       NaN
     31934
             20
                     NaN
                                HS-grad
                                                 Never-married
                                                                       NaN
     31945
             28
                     NaN
                           Some-college
                                            Married-civ-spouse
                                                                       NaN
     31967
             80
                     NaN
                                 HS-grad
                                                       Widowed
                                                                       NaN
     31968
             17
                     NaN
                                    11th
                                                 Never-married
                                                                       NaN
               relationship
                                                 capitalgain
                                                              capitalloss
                                race
                                        gender
     8
                                        Female
                   Own-child
                                White
                                White
                                                            0
     17
                     Husband
                                          Male
                                                                          0
     29
                   Own-child
                                White
                                          Male
                                                            0
                                                                          0
     42
             Other-relative
                                Black
                                          Male
                                                          594
                                                                          0
     44
                     Husband
                                White
                                          Male
                                                            0
                                                                          0
     31892
                     Husband
                               White
                                          Male
                                                            0
                                                                          0
     31934
             Other-relative
                                White
                                        Female
                                                            0
                                                                          0
     31945
                        Wife
                                White
                                        Female
                                                            0
                                                                       1887
                                White
                                          Male
     31967
              Not-in-family
                                                            0
                                                                          0
     31968
                   Own-child
                                White
                                          Male
                                                            0
                                                                          0
            hoursperweek
                                                                    SalStat
                            nativecountry
     8
                        5
                                              less than or equal to 50,000
                            United-States
     17
                       40
                            United-States
                                              less than or equal to 50,000
     29
                       40
                            United-States
                                              less than or equal to 50,000
     42
                       40
                            United-States
                                              less than or equal to 50,000
     44
                       35
                            United-States
                                              less than or equal to 50,000
     31892
                       40
                            United-States
                                                       greater than 50,000
                       35
                            United-States
                                              less than or equal to 50,000
     31934
                                                       greater than 50,000
     31945
                       40
                            United-States
                       24
                            United-States
                                              less than or equal to 50,000
     31967
     31968
                       40
                            United-States
                                              less than or equal to 50,000
```

[1816 rows x 13 columns]

```
[6]: df2=df.dropna(axis=0) df2
```

```
[6]: age JobType EdType maritalstatus \
0 45 Private HS-grad Divorced
1 24 Federal-gov HS-grad Never-married
```

```
2
        44
                  Private
                             Some-college
                                             Married-civ-spouse
3
        27
                  Private
                                      9th
                                                  Never-married
4
        20
                  Private
                             Some-college
                                                  Never-married
                  •••
31973
                Local-gov
                                  HS-grad
                                                  Never-married
        34
31974
        34
                Local-gov
                             Some-college
                                                  Never-married
31975
        23
                  Private
                             Some-college
                                             Married-civ-spouse
31976
        42
                Local-gov
                             Some-college
                                             Married-civ-spouse
31977
        29
                  Private
                                Bachelors
                                                  Never-married
              occupation
                                                      gender capitalgain
                             relationship
                                              race
0
           Adm-clerical
                            Not-in-family
                                              White
                                                      Female
1
           Armed-Forces
                                 Own-child
                                              White
                                                        Male
                                                                          0
2
         Prof-specialty
                                   Husband
                                              White
                                                        Male
                                                                          0
3
           Craft-repair
                            Other-relative
                                              White
                                                        Male
                                                                          0
4
                   Sales
                            Not-in-family
                                              White
                                                        Male
                                                                          0
                                                 •••
31973
        Farming-fishing
                            Not-in-family
                                                                        594
                                              Black
                                                        Male
        Protective-serv
31974
                             Not-in-family
                                              White
                                                      Female
                                                                          0
31975
           Adm-clerical
                                   Husband
                                              White
                                                         Male
                                                                          0
31976
           Adm-clerical
                                              White
                                                      Female
                                                                          0
                                      Wife
         Prof-specialty
                            Not-in-family
                                                        Male
                                                                          0
31977
                                              White
                     hoursperweek
                                     nativecountry
       capitalloss
0
                  0
                                28
                                     United-States
1
                  0
                                40
                                     United-States
                                     United-States
                  0
                                40
3
                  0
                                40
                                             Mexico
4
                  0
                                35
                                     United-States
31973
                  0
                                60
                                     United-States
                                40
31974
                  0
                                     United-States
                                40
                                     United-States
31975
                                     United-States
31976
                  0
                                40
31977
                                40
                                     United-States
                               SalStat
0
        less than or equal to 50,000
1
        less than or equal to 50,000
2
                  greater than 50,000
3
        less than or equal to 50,000
        less than or equal to 50,000
31973
        less than or equal to 50,000
31974
        less than or equal to 50,000
31975
        less than or equal to 50,000
        less than or equal to 50,000
31976
```

```
[30162 rows x 13 columns]
[7]: sal=df['SalStat']
[8]: df2['SalStat']=df2['SalStat'].map({' less than or equal to 50,000':0,' greater_
      ⇔than 50,000':1})
     print(df2['SalStat'])
    0
             0
    1
             0
    2
             1
    3
             0
    4
             0
    31973
             0
    31974
             0
    31975
             0
    31976
    31977
    Name: SalStat, Length: 30162, dtype: int64
    <ipython-input-8-4b0b6c30c323>:1: SettingWithCopyWarning:
    A value is trying to be set on a copy of a slice from a DataFrame.
    Try using .loc[row_indexer,col_indexer] = value instead
    See the caveats in the documentation: https://pandas.pydata.org/pandas-
    docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
      df2['SalStat']=df2['SalStat'].map({' less than or equal to 50,000':0,' greater
    than 50,000':1})
[9]: sal2=df2['SalStat']
     sal2
[9]: 0
              0
              0
     2
              1
     3
              0
     4
              0
     31973
              0
     31974
     31975
              0
     31976
              0
     31977
     Name: SalStat, Length: 30162, dtype: int64
```

less than or equal to 50,000

```
[10]: sal3=pd.concat([sal,sal2],axis=1)
      sal3
[10]:
                                     SalStat
                                              SalStat
              less than or equal to 50,000
      0
                                                   0.0
      1
              less than or equal to 50,000
                                                   0.0
      2
                        greater than 50,000
                                                   1.0
      3
              less than or equal to 50,000
                                                   0.0
              less than or equal to 50,000
                                                   0.0
      31973
              less than or equal to 50,000
                                                   0.0
              less than or equal to 50,000
      31974
                                                   0.0
              less than or equal to 50,000
      31975
                                                   0.0
              less than or equal to 50,000
      31976
                                                   0.0
      31977
              less than or equal to 50,000
                                                   0.0
      [31978 rows x 2 columns]
[11]: df2
                                         EdType
[11]:
              age
                        JobType
                                                        maritalstatus \
      0
              45
                                        HS-grad
                        Private
                                                             Divorced
      1
              24
                    Federal-gov
                                        HS-grad
                                                        Never-married
      2
                        Private
                                   Some-college
                                                   Married-civ-spouse
              44
      3
              27
                        Private
                                            9th
                                                        Never-married
      4
              20
                        Private
                                   Some-college
                                                        Never-married
      31973
              34
                      Local-gov
                                        HS-grad
                                                        Never-married
      31974
                      Local-gov
                                   Some-college
                                                        Never-married
              34
      31975
              23
                        Private
                                   Some-college
                                                   Married-civ-spouse
      31976
              42
                      Local-gov
                                   Some-college
                                                   Married-civ-spouse
      31977
              29
                        Private
                                      Bachelors
                                                        Never-married
                                                                     capitalgain
                    occupation
                                    relationship
                                                            gender
                                                     race
      0
                  Adm-clerical
                                   Not-in-family
                                                            Female
                                                    White
                                                                                0
      1
                  Armed-Forces
                                       Own-child
                                                    White
                                                              Male
                                                                                0
      2
               Prof-specialty
                                                    White
                                                              Male
                                         Husband
                                                                                0
      3
                  Craft-repair
                                  Other-relative
                                                    White
                                                              Male
                                                                                0
      4
                         Sales
                                   Not-in-family
                                                    White
                                                              Male
                                                                                0
      31973
              Farming-fishing
                                   Not-in-family
                                                    Black
                                                              Male
                                                                              594
              Protective-serv
                                   Not-in-family
                                                                                0
      31974
                                                    White
                                                            Female
      31975
                  Adm-clerical
                                         Husband
                                                    White
                                                               Male
                                                                                0
                                                    White
      31976
                  Adm-clerical
                                            Wife
                                                            Female
                                                                                0
               Prof-specialty
      31977
                                   Not-in-family
                                                    White
                                                               Male
                                                                                0
```

capitalloss hoursperweek nativecountry SalStat

0	0		28	United-States	0
1	0		40	United-States	0
2	0		40	United-States	1
3	0		40	Mexico	0
4	0		35	United-States	0
•••	•••	•••			
 31973		•••	60	 United-States	0
	_		60 40		0
31973	0	•••		United-States	0 0 0
31973 31974	0	•••	40	United-States United-States	0

[30162 rows x 13 columns]

```
[12]: new_data=pd.get_dummies(df2,drop_first=True)
new_data
```

[12]:		age	capitalgain	capitalloss	hoursperweek	SalStat \
	0	45	0	0	28	0
	1	24	0	0	40	0
	2	44	0	0	40	1
	3	27	0	0	40	0
	4	20	0	0	35	0
			•••	•••		
	31973	34	594	0	60	0
	31974	34	0	0	40	0
	31975	23	0	0	40	0
	31976	42	0	0	40	0
	31977	29	0	0	40	0

JobType_ Local-gov	JobType_ Private	JobType_ Self-emp-inc	/
False	True	False	
False	False	False	
False	True	False	
False	True	False	
False	True	False	
•••	•••	<b></b>	
True	False	False	
True	False	False	
False	True	False	
True	False	False	
False	True	False	
	False False False False False True True False True	False True False False False True False True False True False True True False True False False True False False True False False True True False	False False False False True False False True False False True False True False False True False True False False True False False False False True False False

```
JobType_ Self-emp-not-inc JobType_ State-gov ... \
0 False False ...
1 False False ...
2 False False ...
```

```
3
                            False
                                                  False ...
4
                            False
                                                  False
31973
                            False
                                                  False ...
31974
                            False
                                                  False ...
31975
                            False
                                                  False ...
31976
                            False
                                                  False ...
31977
                            False
                                                  False ...
       nativecountry_ Portugal nativecountry_ Puerto-Rico \
0
                          False
                                                        False
1
                          False
                                                        False
2
                          False
                                                        False
3
                          False
                                                        False
4
                          False
                                                        False
31973
                          False
                                                        False
31974
                          False
                                                        False
                                                        False
31975
                          False
31976
                          False
                                                        False
31977
                          False
                                                        False
       nativecountry_ Scotland nativecountry_ South nativecountry_ Taiwan \
                                                  False
                                                                          False
0
                          False
1
                          False
                                                  False
                                                                          False
2
                          False
                                                  False
                                                                          False
3
                          False
                                                  False
                                                                          False
4
                          False
                                                  False
                                                                          False
31973
                          False
                                                  False
                                                                          False
31974
                          False
                                                  False
                                                                          False
                                                                          False
31975
                          False
                                                  False
31976
                          False
                                                  False
                                                                          False
31977
                          False
                                                  False
                                                                          False
       nativecountry_ Thailand nativecountry_ Trinadad&Tobago \
0
                          False
                                                            False
1
                          False
                                                            False
2
                          False
                                                            False
3
                          False
                                                            False
4
                          False
                                                            False
31973
                          False
                                                            False
31974
                          False
                                                            False
31975
                          False
                                                            False
31976
                          False
                                                            False
31977
                          False
                                                            False
```

```
0
                                      True
                                                               False
      1
                                      True
                                                               False
      2
                                      True
                                                               False
      3
                                     False
                                                               False
      4
                                      True
                                                               False
      31973
                                      True
                                                               False
      31974
                                      True
                                                               False
                                      True
                                                               False
      31975
      31976
                                      True
                                                               False
                                                               False
      31977
                                      True
             nativecountry_ Yugoslavia
      0
                                  False
      1
                                  False
      2
                                  False
      3
                                  False
      4
                                  False
      31973
                                  False
      31974
                                  False
                                  False
      31975
      31976
                                  False
      31977
                                  False
      [30162 rows x 95 columns]
[13]: columns_list=list(new_data.columns)
      columns_list
[13]: ['age',
       'capitalgain',
       'capitalloss',
       'hoursperweek',
       'SalStat',
       'JobType_ Local-gov',
       'JobType_ Private',
       'JobType_ Self-emp-inc',
       'JobType_ Self-emp-not-inc',
       'JobType_ State-gov',
       'JobType_ Without-pay',
       'EdType_ 11th',
       'EdType_ 12th',
       'EdType_ 1st-4th',
       'EdType_ 5th-6th',
```

nativecountry\_ United-States nativecountry\_ Vietnam \

```
'EdType_ 7th-8th',
'EdType_ 9th',
'EdType_ Assoc-acdm',
'EdType_ Assoc-voc',
'EdType_ Bachelors',
'EdType_ Doctorate',
'EdType_ HS-grad',
'EdType_ Masters',
'EdType Preschool',
'EdType_ Prof-school',
'EdType Some-college',
'maritalstatus_ Married-AF-spouse',
'maritalstatus_ Married-civ-spouse',
'maritalstatus_ Married-spouse-absent',
'maritalstatus_ Never-married',
'maritalstatus_ Separated',
'maritalstatus_ Widowed',
'occupation_ Armed-Forces',
'occupation_ Craft-repair',
'occupation_ Exec-managerial',
'occupation_ Farming-fishing',
'occupation Handlers-cleaners',
'occupation_ Machine-op-inspct',
'occupation Other-service',
'occupation_ Priv-house-serv',
'occupation_ Prof-specialty',
'occupation_ Protective-serv',
'occupation_ Sales',
'occupation_ Tech-support',
'occupation_ Transport-moving',
'relationship_ Not-in-family',
'relationship_ Other-relative',
'relationship_ Own-child',
'relationship_ Unmarried',
'relationship_ Wife',
'race_ Asian-Pac-Islander',
'race_ Black',
'race_ Other',
'race White',
'gender Male',
'nativecountry_ Canada',
'nativecountry_ China',
'nativecountry_ Columbia',
'nativecountry_ Cuba',
'nativecountry_ Dominican-Republic',
'nativecountry_ Ecuador',
'nativecountry_ El-Salvador',
```

```
'nativecountry_ England',
       'nativecountry_ France',
       'nativecountry_ Germany',
       'nativecountry_ Greece',
       'nativecountry_ Guatemala',
       'nativecountry_ Haiti',
       'nativecountry_ Holand-Netherlands',
       'nativecountry_ Honduras',
       'nativecountry_ Hong',
       'nativecountry_ Hungary',
       'nativecountry_ India',
       'nativecountry_ Iran',
       'nativecountry_ Ireland',
       'nativecountry_ Italy',
       'nativecountry_ Jamaica',
       'nativecountry_ Japan',
       'nativecountry_ Laos',
       'nativecountry_ Mexico',
       'nativecountry_ Nicaragua',
       'nativecountry_ Outlying-US(Guam-USVI-etc)',
       'nativecountry_ Peru',
       'nativecountry_ Philippines',
       'nativecountry_ Poland',
       'nativecountry Portugal',
       'nativecountry_ Puerto-Rico',
       'nativecountry_ Scotland',
       'nativecountry_ South',
       'nativecountry_ Taiwan',
       'nativecountry_ Thailand',
       'nativecountry_ Trinadad&Tobago',
       'nativecountry_ United-States',
       'nativecountry_ Vietnam',
       'nativecountry_ Yugoslavia']
[14]: features=list(set(columns_list)-set(['SalStat']))
      features
[14]: ['nativecountry_ Hungary',
       'JobType_ Local-gov',
       'nativecountry_ Japan',
       'EdType_ 1st-4th',
       'maritalstatus_ Widowed',
       'nativecountry_ Ecuador',
       'EdType_ 11th',
       'EdType_ Assoc-voc',
       'EdType_ Bachelors',
       'nativecountry_ China',
```

```
'race_ Asian-Pac-Islander',
'EdType_ Prof-school',
'nativecountry_ Hong',
'nativecountry_ Peru',
'relationship_ Wife',
'occupation_ Exec-managerial',
'nativecountry_ Nicaragua',
'nativecountry_ Outlying-US(Guam-USVI-etc)',
'nativecountry Iran',
'maritalstatus_ Separated',
'nativecountry_ Taiwan',
'gender_ Male',
'nativecountry_ England',
'nativecountry_ Thailand',
'occupation_ Sales',
'age',
'nativecountry_ India',
'occupation_ Armed-Forces',
'EdType_ Some-college',
'occupation_ Other-service',
'nativecountry_ Poland',
'nativecountry_ Holand-Netherlands',
'occupation_ Craft-repair',
'nativecountry Canada',
'nativecountry_ Germany',
'race White',
'occupation_ Machine-op-inspct',
'occupation_ Farming-fishing',
'EdType_ 5th-6th',
'maritalstatus_ Married-AF-spouse',
'relationship_ Not-in-family',
'nativecountry_ Dominican-Republic',
'JobType_ Private',
'nativecountry_ Trinadad&Tobago',
'occupation_ Protective-serv',
'EdType_ Preschool',
'capitalloss',
'nativecountry_ Haiti',
'nativecountry_ Columbia',
'nativecountry_ Italy',
'nativecountry_ Vietnam',
'maritalstatus_ Married-spouse-absent',
'nativecountry_ Yugoslavia',
'nativecountry_ Ireland',
'maritalstatus_ Married-civ-spouse',
'nativecountry_ Greece',
'occupation_ Transport-moving',
```

```
'nativecountry_ Guatemala',
       'nativecountry_ Jamaica',
       'EdType_ Doctorate',
       'JobType_ State-gov',
       'EdType_ HS-grad',
       'occupation_ Handlers-cleaners',
       'nativecountry_ El-Salvador',
       'race_ Other',
       'EdType_ 7th-8th',
       'nativecountry_ Mexico',
       'EdType_ 9th',
       'nativecountry_ South',
       'relationship_ Unmarried',
       'occupation_ Tech-support',
       'JobType_ Self-emp-not-inc',
       'hoursperweek',
       'occupation_ Prof-specialty',
       'JobType_ Without-pay',
       'JobType_ Self-emp-inc',
       'relationship_ Other-relative',
       'capitalgain',
       'maritalstatus_ Never-married',
       'nativecountry United-States',
       'nativecountry_ Scotland',
       'relationship_ Own-child',
       'nativecountry_ Philippines',
       'EdType_ 12th',
       'nativecountry_ France',
       'race_ Black',
       'EdType_ Masters',
       'nativecountry_ Puerto-Rico',
       'nativecountry_ Portugal',
       'occupation_ Priv-house-serv',
       'EdType_ Assoc-acdm',
       'nativecountry_ Laos',
       'nativecountry_ Honduras']
[15]: y=new_data['SalStat'].values
      print(y)
      x=new_data[features].values
      print(x)
     [0 0 1 ... 0 0 0]
     [[False False False ... False False False]
      [False False False False False]
      [False False False False False]
```

'nativecountry\_ Cuba',

```
[False False False False False]
      [False True False ... False False False]
      [False False False False False False]]
[16]: train_x,test_x,train_y,test_y=train_test_split(x,y,test_size=0.3,random_state=0)
[18]: KNN_classifier=KNeighborsClassifier(n_neighbors=5)
[19]: KNN_classifier.fit(train_x,train_y)
[19]: KNeighborsClassifier()
[20]: prediction=KNN_classifier.predict(test_x)
[21]: confusionmatrix=confusion_matrix(test_y,prediction)
      confusionmatrix
[21]: array([[6176, 647],
             [ 808, 1418]])
[22]: accuracy=accuracy_score(test_y,prediction)
      accuracy
[22]: 0.8392087523483258
[24]: print("missclassified data:",(test_y!=prediction).sum())
     missclassified data: 1455
[26]: new_data.shape
[26]: (30162, 95)
```