## heartdisease

December 26, 2023

# 1 1) Pengumpulan Data

Data didapat dari https://archive.ics.uci.edu/dataset/45/heart+disease File yang digunakan adalah hungarian.data

# 2 2) Menelaah Data

```
[]: import pandas as pd import numpy as np import re import itertools
```

Load Data

```
[]: direct = '/content/sample_data/hungarian.data'
```

Membuat iterasi untuk membaca dataset

```
[]: with open(direct, encoding='Latin1') as file:
    lines= [line.strip() for line in file]
    lines[0:10]
```

Membuat keterangan kolom dan baris dari deskripsi dataset sebelumnya

```
[]: data = itertools.takewhile(
    lambda x: len(x) == 76,
```

```
(' '.join(lines[i:(i+10)]).split() for i in range(0, len(lines), 10))
     )
     df = pd.DataFrame.from_records(data)
     df.head()
[]:
          0
                  2
                     3
                        4
                            5
                               6
                                   7
                                      8
                                            9
                                                        67 68 69 70 71 72
                                                                             73
                                                                                   74
                                                   66
        1254
                  40
                                0
                                   -9
                                       2
                                                                            -9.
                      1
                         1
                             0
                                           140
                                                    -9
                                                        -9
                                                                                  -9.
     1
       1255
                  49
                                0
                                   -9
                                       3
                                           160
                                                   -9
                                                        -9
                                                                            -9.
                                                                                  -9.
                                       2
        1256
              0
                  37
                            0
                                0
                                   -9
                                           130
                                                    -9
                                                       -9
                                                                      1
                                                                            -9.
                                                                                  -9.
                                                            1
     3 1257
               0
                  48
                      0
                         1
                             1
                                1
                                   -9
                                       4
                                           138
                                                    2
                                                        -9
                                                            1
                                                               1
                                                                   1
                                                                      1
                                                                         1
                                                                            -9.
                                                                                  -9.
                                1
     4 1258
              0
                  54
                      1
                            0
                                   -9
                                       3
                                           150
                                                    1
                                                        -9
                                                           1
                                                                            -9.
                                                                                 -9.
          75
       name
     0
     1 name
     2 name
     3 name
     4 name
```

[5 rows x 76 columns]

Menampilkan informasi dataset

### []: df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 294 entries, 0 to 293
Data columns (total 76 columns):

#	Column	Non-Null Count	Dtype
0	0	294 non-null	object
1	1	294 non-null	object
2	2	294 non-null	object
3	3	294 non-null	object
4	4	294 non-null	object
5	5	294 non-null	object
6	6	294 non-null	object
7	7	294 non-null	object
8	8	294 non-null	object
9	9	294 non-null	object
10	10	294 non-null	object
11	11	294 non-null	object
12	12	294 non-null	object
13	13	294 non-null	object
14	14	294 non-null	object
15	15	294 non-null	object

16	16	294 non-	null	object
17	17	294 non-	null	object
18	18	294 non-	null	object
19	19	294 non-	null	object
20	20	294 non-	null	object
21	21	294 non-	null	object
22	22	294 non-	null	object
23	23	294 non-	null	object
24	24	294 non-	null	object
25	25	294 non-	null	object
26	26	294 non-	null	object
27	27	294 non-	null	object
28	28	294 non-	null	object
29	29	294 non-	null	object
30	30	294 non-	null	object
31	31	294 non-	null	object
32	32	294 non-	null	object
33	33	294 non-	null	object
34	34	294 non-	null	object
35	35	294 non-	null	object
36	36	294 non-	null	object
37	37	294 non-	null	object
38	38	294 non-	null	object
39	39	294 non-	null	object
40	40	294 non-	null	object
41	41	294 non-	null	object
42	42	294 non-	null	object
43	43	294 non-	null	object
44	44	294 non-	null	object
45	45	294 non-	null	object
46	46	294 non-	null	object
47	47	294 non-	null	object
48	48	294 non-	null	object
49	49	294 non-	null	object
50	50	294 non-	null	object
51	51	294 non-	null	object
52	52	294 non-	null	object
53	53	294 non-	null	object
54	54	294 non-	null	object
55	55	294 non-	null	object
56	56	294 non-	null	object
57	57	294 non-	null	object
58	58	294 non-	null	object
59	59	294 non-	null	object
60	60	294 non-	null	object
61	61	294 non-	null	object
62	62	294 non-	null	object
63	63	294 non-	null	object

```
64
            294 non-null
                             object
64
65
    65
            294 non-null
                             object
    66
            294 non-null
                             object
66
67
    67
            294 non-null
                             object
            294 non-null
                             object
    68
68
69
    69
            294 non-null
                             object
            294 non-null
70
    70
                             object
    71
            294 non-null
                             object
71
72
    72
            294 non-null
                             object
73
    73
            294 non-null
                             object
74
    74
            294 non-null
                             object
75 75
            294 non-null
                             object
```

dtypes: object(76)
memory usage: 174.7+ KB

Menghapus kolom ke-0 atau pertama

```
[]: df = df.iloc[:,:-1]
df = df.drop(df.columns[0], axis =1)
```

Mengubah type data menjadi float

```
[]: df = df.astype(float)
```

```
[ ]: df.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 294 entries, 0 to 293
Data columns (total 74 columns):

#	Column	Non-Null Count	Dtype
0	1	294 non-null	float64
1	2	294 non-null	float64
2	3	294 non-null	float64
3	4	294 non-null	float64
4	5	294 non-null	float64
5	6	294 non-null	float64
6	7	294 non-null	float64
7	8	294 non-null	float64
8	9	294 non-null	float64
9	10	294 non-null	float64
10	11	294 non-null	float64
11	12	294 non-null	float64
12	13	294 non-null	float64
13	14	294 non-null	float64
14	15	294 non-null	float64
15	16	294 non-null	float64
16	17	294 non-null	float64
17	18	294 non-null	float64

18	19	294	non-null	float64
19	20	294	non-null	float64
20	21	294	non-null	${\tt float64}$
21	22	294	non-null	float64
22	23	294	non-null	float64
23	24	294	non-null	${\tt float64}$
24	25	294	non-null	${\tt float64}$
25	26	294	non-null	${\tt float64}$
26	27	294	non-null	${\tt float64}$
27	28	294	non-null	${\tt float64}$
28	29	294	non-null	${\tt float64}$
29	30	294	non-null	${\tt float64}$
30	31	294	non-null	${\tt float64}$
31	32	294	non-null	${\tt float64}$
32	33	294	non-null	${\tt float64}$
33	34	294	non-null	${\tt float64}$
34	35	294	non-null	float64
35	36	294	non-null	float64
36	37	294	non-null	float64
37	38	294	non-null	float64
38	39	294	non-null	float64
39	40	294	non-null	float64
40	41	294	non-null	float64
41	42	294	non-null	float64
42	43	294	non-null	float64
43	44	294	non-null	float64
44	45	294	non-null	float64
45	46	294	non-null	float64
46	47	294	non-null	float64
47	48	294	non-null	float64
48	49	294	non-null	float64
49	50	294	non-null	float64
50	51	294	non-null	float64
51	52	294	non-null	float64
52	53	294	non-null	float64
53	54	294	non-null	float64
54	55	294	non-null	float64
55	56	294	non-null	float64
56	57	294	non-null	float64
57	58	294	non-null	float64
58	59	294	non-null	float64
59	60	294	non-null	float64
60	61	294	non-null	float64
61	62	294	non-null	float64
62	63	294		float64
63	64	294		float64
64	65	294		float64
65	66	294		float64

```
66
    67
             294 non-null
                               float64
    68
             294 non-null
                               float64
67
    69
             294 non-null
                               float64
68
    70
             294 non-null
                               float64
69
    71
             294 non-null
                               float64
70
71
    72
             294 non-null
                               float64
72
    73
             294 non-null
                               float64
    74
73
             294 non-null
                               float64
```

dtypes: float64(74) memory usage: 170.1 KB

### 3) Validasi Data 3

Mengubah value -9.0 pada setiap baris, menjadi null atau NaN

```
[]: df.replace(-9.0, np.nan, inplace=True)
```

Menghitung jumlah nilai null value

```
[]: df.isnull().sum()
[]:1
              0
     2
              0
     3
              0
              0
     4
     5
              0
     70
              0
     71
              0
     72
              0
     73
            266
            294
     74
     Length: 74, dtype: int64
     df.head()
[]:
```

```
1
                   2
                         3
                               4
                                      5
                                                 7
                                                        8
                                                                 9
[]:
                                            6
                                                                       10
                                                                                65
                                                                                      66
                                                                                           67
                                                                                                  68
```

```
0.0
         40.0
                1.0
                      1.0
                           0.0
                                 0.0 NaN
                                           2.0
                                                  140.0
                                                         0.0
                                                               ... NaN
                                                                       NaN NaN
                                                                                  1.0
1
   0.0
         49.0
                0.0
                      1.0
                           0.0
                                 0.0 NaN
                                            3.0
                                                  160.0
                                                          1.0
                                                               ... NaN
                                                                       NaN NaN
                                                                                  1.0
         37.0
                1.0
                                            2.0
                                                               ... NaN
   0.0
                      1.0
                           0.0
                                 0.0 NaN
                                                  130.0
                                                         0.0
                                                                       NaN NaN
                                                                                  1.0
   0.0
         48.0
                0.0
                     1.0
                           1.0
                                 1.0 NaN
                                            4.0
                                                  138.0
                                                         0.0
                                                               ... NaN
                                                                        2.0 NaN
                                                                                  1.0
   0.0
         54.0
                           0.0
                                           3.0
                1.0
                      1.0
                                 1.0 NaN
                                                 150.0
                                                         0.0
                                                               ... NaN
                                                                       1.0 NaN
```

```
69
         70
               71
                     72
                         73
                            74
   1.0
        1.0
              1.0
                    1.0 NaN NaN
1
   1.0
        1.0
              1.0
                    1.0 NaN NaN
2
   1.0
                    1.0 NaN NaN
        1.0
              1.0
   1.0
        1.0
              1.0
                   1.0 NaN NaN
```

### 4 1.0 1.0 1.0 1.0 NaN NaN

[5 rows x 74 columns]

# []: df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 294 entries, 0 to 293
Data columns (total 74 columns):

Data	COLUMNS	s (total /4 columns):		
#	Column	Non-Null Count	Dtype	
0	1	294 non-null	float64	
1	2	294 non-null	float64	
2	3	294 non-null	float64	
3	4	294 non-null	float64	
4	5	294 non-null	float64	
5	6	294 non-null	float64	
6	7	0 non-null	float64	
7	8	294 non-null	float64	
8	9	293 non-null	float64	
9	10	293 non-null	float64	
10	11	271 non-null	float64	
11	12	12 non-null	float64	
12	13	1 non-null	float64	
13	14	0 non-null	float64	
14	15	286 non-null	float64	
15	16	21 non-null	float64	
16	17	1 non-null	float64	
17	18	293 non-null	float64	
18	19	294 non-null	float64	
19	20	294 non-null	float64	
20	21	294 non-null	float64	
21	22	293 non-null	float64	
22	23	292 non-null	float64	
23	24	293 non-null	float64	
24	25	293 non-null	float64	
25	26	293 non-null	float64	
26	27	285 non-null	float64	
27	28	292 non-null	float64	
28	29	104 non-null	float64	
29	30	292 non-null	float64	
30	31	293 non-null	float64	
31	32	293 non-null	float64	
32	33	293 non-null	float64	
33	34	293 non-null	float64	
34	35	293 non-null	float64	
35	36	293 non-null	float64	

```
37
             293 non-null
                               float64
36
37
    38
             292 non-null
                               float64
    39
             294 non-null
38
                               float64
    40
             104 non-null
                               float64
39
40
    41
             293 non-null
                               float64
    42
             294 non-null
                               float64
41
42
    43
             4 non-null
                               float64
43
    44
             0 non-null
                               float64
             0 non-null
    45
                               float64
44
                               float64
45
    46
             0 non-null
    47
             3 non-null
46
                               float64
47
    48
             0 non-null
                               float64
             2 non-null
48
    49
                               float64
49
    50
             28 non-null
                               float64
50
    51
             27 non-null
                               float64
    52
51
             17 non-null
                               float64
52
    53
             0 non-null
                               float64
53
    54
             294 non-null
                               float64
             294 non-null
54
    55
                               float64
             294 non-null
                               float64
55
    56
56
    57
             294 non-null
                               float64
57
    58
             19 non-null
                               float64
58
    59
             58 non-null
                               float64
59
    60
             48 non-null
                               float64
             18 non-null
                               float64
60
    61
             59 non-null
    62
61
                               float64
    63
             9 non-null
                               float64
62
63
    64
             23 non-null
                               float64
64
    65
             5 non-null
                               float64
    66
             50 non-null
                               float64
65
66
    67
             25 non-null
                               float64
    68
             294 non-null
                               float64
67
    69
             294 non-null
                               float64
68
             294 non-null
    70
                               float64
69
70
    71
             294 non-null
                               float64
71
    72
             294 non-null
                               float64
72
    73
             28 non-null
                               float64
73
    74
             0 non-null
                               float64
```

dtypes: float64(74) memory usage: 170.1 KB

# 4 4) Menentukan Object Data

Mengambil 14 fitur, sesuai instruksi dari file heart-disease.names

```
[]: df_selected = df.iloc[:, [1, 2, 7, 8, 10, 14, 17, 30, 36, 38, 39, 42, 49, 56]]
```

### []: df\_selected.head() []: 2 3 8 9 15 18 31 37 40 43 50 57 11 39 40.0 1.0 2.0 140.0 289.0 0.0 0.0 172.0 0.0 0.0 0.0 NaN NaN NaN 49.0 3.0 160.0 0.0 180.0 0.0 0.0 156.0 0.0 1.0 2.0 NaN NaN 1.0 37.0 1.0 2.0 130.0 283.0 98.0 0.0 1.0 0.0 0.0 NaN NaN NaN 0.0 3 48.0 0.0 4.0 138.0 214.0 0.0 0.0 108.0 1.0 1.5 2.0 NaN NaN 3.0 54.0 1.0 3.0 150.0 NaN0.0 0.0 122.0 0.0 0.0 NaN NaN NaN 0.0 []: df\_selected.tail() []: 2 3 8 9 11 15 18 31 37 39 40 43 50 2.0 289 48.0 0.0 NaN 308.0 0.0 1.0 NaN 2.0 1.0 NaN NaN NaN290 36.0 1.0 2.0 120.0 166.0 0.0 0.0 180.0 0.0 0.0 NaN NaN NaN 291 48.0 1.0 3.0 110.0 211.0 138.0 0.0 0.0 0.0 0.0 NaN NaN 6.0 292 47.0 0.0 2.0 140.0 257.0 0.0 0.0 135.0 0.0 1.0 1.0 NaN NaN293 53.0 1.0 4.0 130.0 182.0 0.0 0.0 148.0 0.0 0.0 NaN NaN NaN57 289 0.0 290 0.0 291 0.0 292 0.0 293 0.0

### []: df\_selected.info()

dtypes: float64(14)

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 294 entries, 0 to 293
Data columns (total 14 columns):

#	Column	Non-Null Count	Dtype
0	2	294 non-null	float64
1	3	294 non-null	float64
2	8	294 non-null	float64
3	9	293 non-null	float64
4	11	271 non-null	float64
5	15	286 non-null	float64
6	18	293 non-null	float64
7	31	293 non-null	float64
8	37	293 non-null	float64
9	39	294 non-null	float64
10	40	104 non-null	float64
11	43	4 non-null	float64
12	50	28 non-null	float64
13	57	294 non-null	float64

memory usage: 32.3 KB

Mengganti 14 nama kolom sesuai instruksi

```
[]: column_mapping = {
         2: 'age',
         3: 'sex',
         8: 'cp',
         9: 'trestbps',
         11: 'chol',
         15: 'fbs',
         18: 'restecg',
         31: 'thalach',
         37: 'exang',
         39: 'oldpeak',
         40: 'slope',
         43: 'ca',
         50: 'thal',
         57: 'target'
     df_selected.rename(columns=column_mapping, inplace=True)
```

<ipython-input-103-b484e5bfe3ce>:17: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus-a-copy df\_selected.rename(columns=column\_mapping, inplace=True)

### [ ]: df\_selected.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 294 entries, 0 to 293
Data columns (total 14 columns):

#	Column	Non-Null Count	Dtype
0	age	294 non-null	float64
1	sex	294 non-null	float64
2	ср	294 non-null	float64
3	trestbps	293 non-null	float64
4	chol	271 non-null	float64
5	fbs	286 non-null	float64
6	restecg	293 non-null	float64
7	thalach	293 non-null	float64
8	exang	293 non-null	float64
9	oldpeak	294 non-null	float64
10	slope	104 non-null	float64
11	ca	4 non-null	float64
12	thal	28 non-null	float64

```
13 target 294 non-null float64 dtypes: float64(14)
```

memory usage: 32.3 KB

Menghitung jumlah fitur pada dataset

```
[]: df_selected.value_counts()
```

```
[]: age
                     trestbps chol
                                                    thalach
                                                             exang oldpeak slope
           sex
               ср
                                      fbs
                                           restecg
     ca
          thal
               target
     47.0 1.0
               4.0
                    150.0
                               226.0
                                     0.0 0.0
                                                    98.0
                                                             1.0
                                                                    1.5
                                                                             2.0
     0.0 7.0
                1.0
                          1
     dtype: int64
```

# 5 5) Membersihkan Data

Menghitung nilai null pada setiap kolom

```
[]: df_selected.isnull().sum()
```

```
0
[]: age
                     0
     sex
                     0
     ср
     trestbps
                     1
     chol
                    23
     fbs
                     8
     restecg
                     1
     thalach
                     1
                     1
     exang
     oldpeak
                     0
     slope
                   190
     ca
                   290
                   266
     thal
     target
                     0
     dtype: int64
```

Dikarenakan kolom slope, ca, dan thal memiliki banyak nilai null, maka akan didrop atau dihapus

```
[]: columns_to_drop = ['ca', 'slope', 'thal']
    df_selected = df_selected.drop(columns_to_drop, axis=1)

    df_selected.isnull().sum()
```

```
[]: age 0 sex 0 cp 0 trestbps 1 chol 23
```

```
fbs 8
restecg 1
thalach 1
exang 1
oldpeak 0
target 0
dtype: int64
```

Pengisian nilai null pada beberapa fitur, dengan mencari nilai mean di setiap kolomnya

```
[]: meanTBPS = df_selected['trestbps'].dropna()
     meanChol = df_selected['chol'].dropna()
     meanfbs = df selected['fbs'].dropna()
     meanRestCG = df_selected['restecg'].dropna()
     meanthalach = df selected['thalach'].dropna()
     meanexang = df_selected['exang'].dropna()
[ ]: meanTBPS = meanTBPS.astype(float)
     meanChol = meanChol.astype(float)
     meanfbs = meanfbs.astype(float)
     meanthalach = meanthalach.astype(float)
     meanexang = meanexang.astype(float)
     meanRestCG = meanRestCG.astype(float)
[ ]: meanTBPS = round(meanTBPS.mean())
     meanChol = round(meanChol.mean())
     meanfbs = round(meanfbs.mean())
     meanthalach = round(meanthalach.mean())
     meanexang = round(meanexang.mean())
     meanRestCG = round(meanRestCG.mean())
```

Mengubah nilai null menjadi nilai mean

```
[]: fill_values = {'trestbps': meanTBPS, 'chol': meanChol, 'fbs': meanfbs,
    'thalach':meanthalach, 'exang':meanexang, 'restecg':meanRestCG}
dfClean = df_selected.fillna(value=fill_values)
dfClean.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 294 entries, 0 to 293
Data columns (total 11 columns):
             Non-Null Count Dtype
    Column
              _____
              294 non-null
                             float64
0
    age
1
              294 non-null
                             float64
    sex
2
             294 non-null
                             float64
    ср
    trestbps 294 non-null
                             float64
```

294 non-null

chol

float64

```
6
         restecg
                   294 non-null
                                    float64
     7
         thalach
                   294 non-null
                                    float64
     8
         exang
                   294 non-null
                                    float64
                   294 non-null
     9
         oldpeak
                                    float64
     10 target
                   294 non-null
                                    float64
    dtypes: float64(11)
    memory usage: 25.4 KB
[]: dfClean.isnull().sum()
[]: age
                 0
                 0
     sex
                 0
     ср
     trestbps
                 0
                 0
     chol
     fbs
                 0
                 0
     restecg
     thalach
                 0
     exang
     oldpeak
                 0
     target
                 0
     dtype: int64
    Pengecekan duplikasi data
[]: duplicate_rows = dfClean.duplicated()
     dfClean[duplicate_rows]
[]:
                                     chol fbs
                                                                   exang oldpeak \
                          trestbps
                                                restecg
                                                          thalach
           age sex
                      ср
     163 49.0 0.0
                     2.0
                             110.0
                                    251.0
                                                     0.0
                                                            160.0
                                                                     0.0
                                                                              0.0
                                           0.0
          target
     163
             0.0
[]: print("All duplicate rows:")
     dfClean[dfClean.duplicated(keep=False)]
    All duplicate rows:
[]:
                          trestbps
                                     chol
                                           fbs
                                                restecg
                                                         thalach
                                                                   exang
                                                                          oldpeak \
           age
               sex
                      ср
                                                                              0.0
          49.0 0.0
                     2.0
                             110.0
                                    251.0
                                           0.0
                                                     0.0
                                                            160.0
                                                                     0.0
     90
                                                            160.0
     163
         49.0 0.0
                     2.0
                             110.0 251.0 0.0
                                                     0.0
                                                                     0.0
                                                                              0.0
          target
     90
             0.0
     163
             0.0
```

294 non-null

float64

5

fbs

```
Hapus data yang sama
```

```
[]: dfClean = dfClean.drop_duplicates()
     print("All duplicate rows:")
     dfClean[dfClean.duplicated(keep=False)]
    All duplicate rows:
[]: Empty DataFrame
     Columns: [age, sex, cp, trestbps, chol, fbs, restecg, thalach, exang, oldpeak,
     target]
     Index: []
[]: dfClean.head()
[]:
                       trestbps
                                   chol
                                         fbs
                                              restecg
                                                       thalach
                                                                exang oldpeak \
         age
             sex
                    ср
     0 40.0
              1.0
                  2.0
                           140.0
                                  289.0
                                         0.0
                                                  0.0
                                                         172.0
                                                                  0.0
                                                                           0.0
     1 49.0 0.0 3.0
                                                  0.0
                                                         156.0
                                                                  0.0
                                                                            1.0
                           160.0
                                  180.0
                                         0.0
     2 37.0 1.0 2.0
                           130.0
                                  283.0 0.0
                                                  1.0
                                                          98.0
                                                                  0.0
                                                                           0.0
     3 48.0 0.0 4.0
                           138.0 214.0
                                        0.0
                                                  0.0
                                                         108.0
                                                                  1.0
                                                                           1.5
     4 54.0 1.0 3.0
                           150.0 251.0 0.0
                                                  0.0
                                                         122.0
                                                                  0.0
                                                                           0.0
       target
     0
           0.0
           1.0
     1
     2
           0.0
     3
           3.0
           0.0
[]: dfClean['target'].value_counts()
[]: 0.0
            187
     1.0
             37
     3.0
             28
     2.0
             26
     4.0
             15
     Name: target, dtype: int64
[]: import seaborn as sns
     import matplotlib.pyplot as plt
    Mencari korelasi antar fitur
[]: dfClean.corr()
[]:
                                            trestbps
                                                           chol
                    age
                              sex
                                         ср
               1.000000 0.014516
                                   0.146616
                                             0.246571
                                                       0.087101 0.181130
     age
               0.014516
                         1.000000 0.245769 0.082064 0.027695
     sex
```

```
0.134697
              0.146616 0.245769
                                  1.000000
                                            0.081293
                                                                0.031930
    ср
    trestbps
              0.246571 0.082064
                                  0.081293
                                            1.000000
                                                      0.080818
                                                               0.096222
    chol
              0.087101
                        0.027695
                                  0.134697
                                            0.080818
                                                      1.000000
                                                                0.107686
    fbs
              0.181130
                        0.044372
                                  0.031930
                                            0.096222
                                                      0.107686
                                                                1.000000
              0.050672 -0.108656 -0.016372
                                            0.011256
                                                      0.048081
    restecg
                                                                0.047988
    thalach
             -0.460514 -0.106959 -0.367819 -0.181824 -0.122038 -0.069722
                                  0.494674
                                            0.211507
                                                      0.161055
    exang
              0.239223 0.154925
                                                               0.115503
    oldpeak
              0.178172
                        0.115959
                                  0.351735
                                            0.204000
                                                      0.106743
                                                                0.063179
    target
                                                      0.256027
              0.210429 0.220732 0.427536
                                            0.214898
                                                                0.154319
                                             oldpeak
               restecg
                         thalach
                                     exang
                                                        target
              0.050672 -0.460514
                                  0.239223 0.178172
                                                      0.210429
    age
             -0.108656 -0.106959
    sex
                                  0.154925
                                            0.115959
                                                      0.220732
    ср
             -0.016372 -0.367819
                                  0.494674
                                            0.351735
                                                      0.427536
    trestbps 0.011256 -0.181824
                                  0.211507
                                            0.204000
                                                      0.214898
    chol
              0.048081 -0.122038
                                  0.161055
                                            0.106743
                                                      0.256027
    fbs
              0.047988 -0.069722
                                  0.115503
                                            0.063179
                                                      0.154319
              1.000000 0.006084
                                  0.041290
                                            0.042193
    restecg
                                                      0.042643
    thalach
              0.006084 1.000000 -0.400508 -0.300458 -0.367525
                                            0.624965
              0.041290 -0.400508
                                  1.000000
                                                      0.571710
    exang
    oldpeak
              0.042193 -0.300458
                                  0.624965
                                            1.000000
                                                      0.580732
    target
              0.042643 -0.367525
                                  0.571710
                                                      1.000000
                                            0.580732
[]: cor_mat = dfClean.corr()
    fig,ax = plt.subplots(figsize=(15,10))
    sns.heatmap(cor mat, annot=True, linewidths=0.5, fmt=".3f")
```

### []: <Axes: >



# 6 6) Konstruksi Data

## []: dfClean.info()

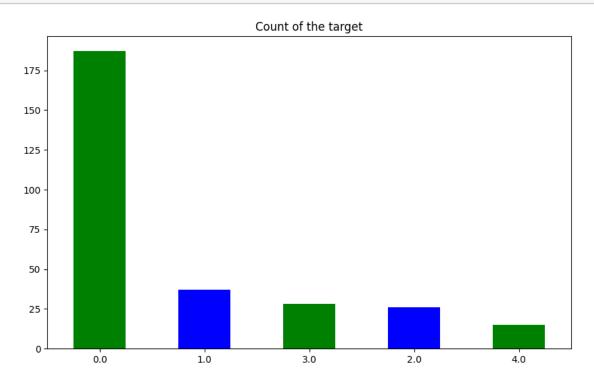
<class 'pandas.core.frame.DataFrame'>
Int64Index: 293 entries, 0 to 293
Data columns (total 11 columns):

#	Column	Non-Null Count	Dtype
0	age	293 non-null	float64
1	sex	293 non-null	float64
2	ср	293 non-null	float64
3	trestbps	293 non-null	float64
4	chol	293 non-null	float64
5	fbs	293 non-null	float64
6	restecg	293 non-null	float64
7	thalach	293 non-null	float64
8	exang	293 non-null	float64
9	oldpeak	293 non-null	float64
10	target	293 non-null	float64

dtypes: float64(11) memory usage: 27.5 KB

```
[]: dfClean.head(5)
[]:
                       trestbps
                                  chol
                                        fbs
                                             restecg
                                                      thalach
                                                              exang oldpeak \
        age
             sex
                   ср
                           140.0
                                                                           0.0
    0
       40.0
             1.0
                  2.0
                                 289.0
                                        0.0
                                                 0.0
                                                         172.0
                                                                 0.0
    1
       49.0 0.0 3.0
                           160.0
                                 180.0
                                        0.0
                                                 0.0
                                                         156.0
                                                                 0.0
                                                                           1.0
    2 37.0 1.0 2.0
                           130.0
                                 283.0
                                        0.0
                                                 1.0
                                                         98.0
                                                                 0.0
                                                                           0.0
    3 48.0 0.0 4.0
                           138.0 214.0
                                                 0.0
                                                                  1.0
                                                                           1.5
                                        0.0
                                                         108.0
    4 54.0 1.0 3.0
                                                         122.0
                           150.0 251.0
                                        0.0
                                                 0.0
                                                                 0.0
                                                                           0.0
       target
    0
          0.0
    1
          1.0
    2
          0.0
    3
          3.0
    4
          0.0
[]: X = dfClean.drop("target", axis=1).values
    y = dfClean.iloc[:, -1]
```



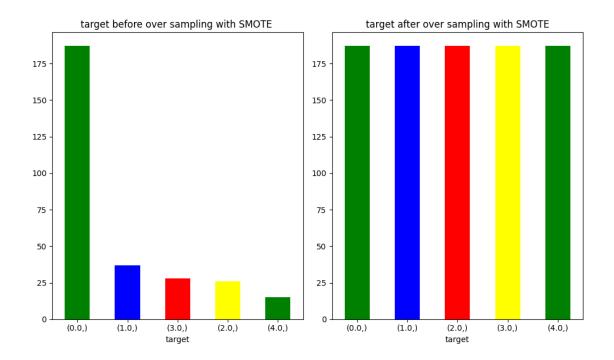


```
[]: from imblearn.over_sampling import SMOTE
                    # oversampling
                    smote = SMOTE(random_state=42)
                    X_smote_resampled, y_smote_resampled = smote.fit_resample(X, y)
[]: plt.subplot(1, 2, 1)
                    new_df1 = pd.DataFrame(data=y)
                    plt.subplot(1, 2, 1)
                    new_df1.value_counts().plot(kind='bar',figsize=(10,6),color=['green', 'blue',__

¬'red', 'yellow'])
                    plt.title("target before over sampling with SMOTE ")
                    plt.xticks(rotation=0);
                    plt.subplot(1, 2, 2)
                    new_df2 = pd.DataFrame(data=y_smote_resampled)
                    new_df2.value_counts().
                         General content of the second content o
                    plt.title("target after over sampling with SMOTE")
                    plt.xticks(rotation=0);
```

plt.tight\_layout()

plt.show()



```
[ ]: new_df1 = pd.DataFrame(data=y)
     new_df1.value_counts()
[]: target
     0.0
               187
     1.0
                37
     3.0
                28
     2.0
                26
     4.0
                15
     dtype: int64
[]: # oversampling
     new_df2 = pd.DataFrame(data=y_smote_resampled)
     new_df2.value_counts()
[]: target
     0.0
               187
     1.0
               187
     2.0
               187
     3.0
               187
     4.0
               187
     dtype: int64
[]: dfClean.describe()
```

```
[]:
                                                     trestbps
                                                                      chol
                                                                                    fbs
                    age
                                 sex
                                               ср
            293.000000
     count
                         293.000000
                                      293.000000
                                                   293.000000
                                                                293.000000
                                                                             293.000000
     mean
             47.822526
                           0.726962
                                        2.986348
                                                   132.662116
                                                                250.860068
                                                                               0.068259
                           0.446282
                                                    17.576793
                                                                 65.059069
                                                                               0.252622
     std
              7.824875
                                        0.965049
     min
             28.000000
                           0.000000
                                        1.000000
                                                    92.000000
                                                                 85.000000
                                                                               0.000000
     25%
             42.000000
                           0.000000
                                        2.000000
                                                   120.000000
                                                                211.000000
                                                                               0.000000
     50%
             49.000000
                           1.000000
                                        3.000000
                                                   130.000000
                                                                248.000000
                                                                               0.000000
     75%
             54.000000
                           1.000000
                                        4.000000
                                                   140.000000
                                                                277.000000
                                                                               0.000000
                                        4.000000
                                                   200.000000
             66.000000
                           1.000000
                                                                603.000000
                                                                               1.000000
     max
                                                      oldpeak
                            thalach
                                                                    target
                restecg
                                           exang
                         293.000000
                                      293.000000
                                                   293.000000
                                                                293.000000
     count
            293.000000
                                                                  0.795222
              0.218430
                         139.058020
                                        0.303754
                                                     0.588055
     mean
                                                                  1.238251
     std
              0.460868
                          23.558003
                                        0.460665
                                                     0.909554
     min
              0.000000
                          82.000000
                                        0.00000
                                                     0.000000
                                                                  0.000000
     25%
              0.000000
                         122.000000
                                        0.00000
                                                     0.000000
                                                                  0.000000
     50%
              0.000000
                         140.000000
                                        0.00000
                                                     0.000000
                                                                  0.00000
     75%
              0.000000
                         155.000000
                                        1.000000
                                                     1.000000
                                                                  1.000000
              2.000000
                         190.000000
                                        1.000000
                                                                  4.000000
     max
                                                     5.000000
[]: from sklearn.preprocessing import MinMaxScaler
     scaler = MinMaxScaler()
     X_smote_resampled_normal = scaler.fit_transform(X_smote_resampled)
    len(X_smote_resampled_normal)
[]: 935
     dfcek1 = pd.DataFrame(X_smote_resampled_normal)
     dfcek1.describe()
[]:
                      0
                                   1
                                                2
                                                             3
                                                                          4
                                                                                      5
     count
            935.000000
                         935.000000
                                      935.000000
                                                   935.000000
                                                                935.000000
                                                                             935.000000
     mean
                           0.842507
                                        0.818224
                                                     0.403413
                                                                  0.341027
                                                                               0.094277
              0.563739
     std
                           0.332492
                                        0.274211
                                                     0.147493
                                                                  0.110990
                                                                               0.252030
              0.174873
     min
              0.000000
                           0.000000
                                        0.00000
                                                     0.000000
                                                                  0.000000
                                                                               0.000000
     25%
              0.473283
                           1.000000
                                        0.666667
                                                     0.305556
                                                                  0.267954
                                                                               0.00000
     50%
              0.578947
                           1.000000
                                        1.000000
                                                     0.387952
                                                                  0.330240
                                                                               0.00000
     75%
                           1.000000
                                        1.000000
              0.683363
                                                     0.487481
                                                                  0.393811
                                                                               0.00000
              1.000000
                           1.000000
                                        1.000000
                                                     1.000000
                                                                  1.000000
                                                                               1.000000
     max
                                   7
                                                             9
                      6
                                                8
            935.000000
                         935.000000
                                      935.000000
                                                   935.000000
     count
     mean
              0.117938
                           0.453354
                                        0.598398
                                                     0.227015
     std
              0.199527
                           0.197232
                                        0.450288
                                                     0.201293
```

	0 000000	0 000000	0 000000	0 000000
$\mathtt{min}$	0.000000	0.000000	0.000000	0.000000
25%	0.000000	0.312720	0.000000	0.000000
50%	0.000000	0.440606	0.962447	0.200000
75%	0.201473	0.593629	1.000000	0.386166
max	1.000000	1.000000	1.000000	1.000000