

1) Pengumpulan Data

2) Menelaah Data

```
import pandas as pd
import numpy as np
import re
import itertools
```

Load Data masukkan dataset yang dibutuhkan

```
#dir merupakan variabel yang digunakan untuk menyimpan data yang akan diproses
dir = 'hungarian.data'

#membuka file dengan path atau nama file yang disimpan dalam variabel dir.
with open(dir, encoding='Latin1') as file:
    #membaca setiap baris, menghapus whitespace di awal dan akhir setiap baris, dan menyimpannya dalam list lines.
    lines = [line.strip() for line in file]
#Kemudian, 10 baris pertama dari list tersebut dicetak.
lines[0:10]

['1254 0 40 1 1 0 0',
'-9 2 140 0 289 -9 -9 -9',
'0 -9 -9 0 12 16 84 0',
'0 0 0 0 150 18 -9 7',
'172 86 200 110 140 86 0 0',
'0 -9 26 20 -9 -9 -9 -9',
'-9 -9 -9 -9 -9 -9 -9 12',
'20 84 0 -9 -9 -9 -9 -9',
'-9 -9 -9 -9 -9 1 1 1',
'1 1 -9. -9. name']

import itertools

#mengambil setiap kelompok 10 baris dari list lines, menggabungkannya menjadi satu string, membaginya menjadi list hingga panjang 76
data = itertools.takewhile(
    lambda x: len(x) == 76,
    (' '.join(lines[i:(i+10)]).split() for i in range(0,
len(lines), 10))
)
#Hasilnya dimasukkan ke dalam DataFrame.
df = pd.DataFrame.from_records(data)
```

#lima baris terakhir dari DataFrame dicetak.

```
df.tail()
```

	0	1	2	3	4	5	6	7	8	9	...	66	67	68	69	70	71	72
73 \																		
289	1053	0	48	0	0	0	0	-9	2	-9	...	-9	-9	1	1	1	1	1
-9.																		
290	1054	0	36	1	1	0	0	-9	2	120	...	-9	-9	1	1	1	1	1
-9.																		
291	5001	0	48	1	0	0	0	-9	3	110	...	-9	-9	1	1	1	1	1
-9.																		
292	5000	0	47	0	0	0	0	-9	2	140	...	-9	-9	1	1	1	1	1
-9.																		
293	5002	0	53	1	1	1	1	-9	4	130	...	1	1	1	1	1	1	1
-9.																		

	74	75
289	-9.	name
290	-9.	name
291	-9.	name
292	-9.	name
293	-9.	name

[5 rows x 76 columns]

```
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	64	294	non-null	object
65	65	294	non-null	object
66	66	294	non-null	object

```

67 67      294 non-null    object
68 68      294 non-null    object
69 69      294 non-null    object
70 70      294 non-null    object
71 71      294 non-null    object
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 column pertama dan terakhir
df = df.iloc[:, :-1]
df = df.drop(df.columns[0], axis=1)

```

mengubah tipe data file daaset menjadi tipe data float sesuai dengan nilai null yaitu -9.0

```

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    float64
21  22      294 non-null    float64
22  23      294 non-null    float64

```

23	24	294	non-null	float64
24	25	294	non-null	float64
25	26	294	non-null	float64
26	27	294	non-null	float64
27	28	294	non-null	float64
28	29	294	non-null	float64
29	30	294	non-null	float64
30	31	294	non-null	float64
31	32	294	non-null	float64
32	33	294	non-null	float64
33	34	294	non-null	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	non-null	float64
63	64	294	non-null	float64
64	65	294	non-null	float64
65	66	294	non-null	float64
66	67	294	non-null	float64
67	68	294	non-null	float64
68	69	294	non-null	float64
69	70	294	non-null	float64
70	71	294	non-null	float64
71	72	294	non-null	float64

```
72 73      294 non-null    float64
73 74      294 non-null    float64
dtypes: float64(74)
memory usage: 170.1 KB
```

```
##menganti nilai -9.0 menjadi NaN
```

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

```
##informasi jumlah NaN dalam setiap DataFrame
```

```
df.isnull().sum()
```

```
1      0
2      0
3      0
4      0
5      0
```

```
...
70     0
71     0
72     0
73    266
74    294
```

```
Length: 74, dtype: int64
```

```
df.head()
```

```
      1      2      3      4      5      6      7      8      9     10     ...     65     66
67  68  \
0  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
2  0.0  37.0  1.0  1.0  0.0  0.0 NaN  2.0  130.0  0.0  ...  NaN  NaN
NaN  1.0
3  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
4  0.0  54.0  1.0  1.0  0.0  1.0 NaN  3.0  150.0  0.0  ...  NaN  1.0
NaN  1.0
```

```
      69     70     71     72     73     74
0  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  1.0  1.0 NaN NaN
3  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):
```

#	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
36	37	293 non-null	float64
37	38	292 non-null	float64
38	39	294 non-null	float64
39	40	104 non-null	float64
40	41	293 non-null	float64
41	42	294 non-null	float64
42	43	4 non-null	float64
43	44	0 non-null	float64
44	45	0 non-null	float64

45	46	0 non-null	float64
46	47	3 non-null	float64
47	48	0 non-null	float64
48	49	2 non-null	float64
49	50	28 non-null	float64
50	51	27 non-null	float64
51	52	17 non-null	float64
52	53	0 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	19 non-null	float64
58	59	58 non-null	float64
59	60	48 non-null	float64
60	61	18 non-null	float64
61	62	59 non-null	float64
62	63	9 non-null	float64
63	64	23 non-null	float64
64	65	5 non-null	float64
65	66	50 non-null	float64
66	67	25 non-null	float64
67	68	294 non-null	float64
68	69	294 non-null	float64
69	70	294 non-null	float64
70	71	294 non-null	float64
71	72	294 non-null	float64
72	73	28 non-null	float64
73	74	0 non-null	float64

4) Menentukan Object Data

```
#mementukan object data yang sudah diketahui pada dataset
df_selected = df.iloc[0:, [1, 2, 7, 8, 10, 14, 17, 30, 36, 38, 39, 42, 49, 56]]
```

[illegible]


```

2  37.0  1.0  2.0  130.0  283.0  0.0  1.0  98.0  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
4  54.0  1.0  3.0  150.0  NaN  0.0  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  \
289  48.0  0.0  2.0      NaN  308.0  0.0  1.0      NaN  NaN  2.0  1.0 NaN
NaN
290  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  0.0  0.0  138.0  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
NaN
293  53.0  1.0  4.0  130.0  182.0  0.0  0.0  148.0  0.0  0.0  NaN NaN
NaN

```

```

      57
289  0.0
290  0.0
291  0.0
292  0.0
293  0.0

```

```
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    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

```

```
dtypes: float64(14)
memory usage: 32.3 KB
```

mengganti nama kolom sesuai dengan 14 nama kolom yang ada pada deskripsi dataset

```
import re

columns_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 = columns_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   cp          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
```

```
#melihat nilai mana yang paling sering muncul dan paling jarang
```

```
df_selected.value_counts()
```

```
age    sex    cp    trestbps    chol    fbs    restecg    thalach    exang    oldpeak
slope  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) Membersihkan data

```
#melihat banyak nilai null pada setiap object
```

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

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

```
#menghapus object yang memiliki nilai null yang sangat banyak
```

```
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
```

```

#menghapus nilai NaN sehingga nanti bisa diisi nilai baru
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()
#konversi tipe data object menjadi float
meanTBPS = meanTBPS.astype(float)
meanChol = meanChol.astype(float)
meanFbs = meanFbs.astype(float)
meanRestCG = meanRestCG.astype(float)
meanThalach = meanThalach.astype(float)
meanExang = meanExang.astype(float)
#membuat nilai baru dari perhitungan rata2 dari nilai yang kemudian
dibulatkan
meanTBPS = round(meanTBPS.mean())
meanChol = round(meanChol.mean())
meanFbs = round(meanFbs.mean())
meanRestCG = round(meanRestCG.mean())
meanThalach = round(meanThalach.mean())
meanExang = round(meanExang.mean())

#mengisi nilai NaN tadi dengan nilai rata2 yang sebelumnya sudah
dihitung
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):
 #   Column      Non-Null Count  Dtype
---  -
 0   age         294 non-null   float64
 1   sex         294 non-null   float64
 2   cp          294 non-null   float64
 3   trestbps    294 non-null   float64
 4   chol        294 non-null   float64
 5   fbs         294 non-null   float64
 6   restecg     294 non-null   float64
 7   thalach     294 non-null   float64
 8   exang       294 non-null   float64
 9   oldpeak     294 non-null   float64
10   target      294 non-null   float64
dtypes: float64(11)
memory usage: 25.4 KB

```

```
dfClean.isnull().sum()
```

```
age      0
sex      0
cp       0
trestbps 0
chol     0
fbs      0
restecg  0
thalach  0
exang    0
oldpeak  0
target   0
dtype: int64
```

```
#mengidentifikasi baris-baris yang merupakan duplikat
```

```
duplicate_rows = dfClean.duplicated()
dfClean[duplicate_rows]
```

```
      age  sex  cp  trestbps  chol  fbs  restecg  thalach  exang
oldpeak \
163  49.0  0.0  2.0    110.0  251.0  0.0      0.0    160.0    0.0
0.0

      target
163      0.0
```

```
#melihat baris duplikat
```

```
print("All Duplicate_rows")
dfClean[dfClean.duplicated(keep=False)]
```

```
All Duplicate_rows
```

```
      age  sex  cp  trestbps  chol  fbs  restecg  thalach  exang
oldpeak \
90   49.0  0.0  2.0    110.0  251.0  0.0      0.0    160.0    0.0
0.0
163  49.0  0.0  2.0    110.0  251.0  0.0      0.0    160.0    0.0
0.0

      target
90      0.0
163      0.0
```

```
#menghapus semua baris duplikat
```

```
dfClean = dfClean.drop_duplicates()
```

```
#mengecek kembali apakah ada baris yang masih duplikat
```

```
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()
```

	age	sex	cp	trestbps	chol	fbs	restecg	thalach	exang	oldpeak \
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	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	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	1.0
2	0.0
3	3.0
4	0.0

```
#melihat jumlah kemunculan setiap nilai unik dalam kolom target
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
```

```
#menghitung matriks korelasi
dfClean.corr()
```

	age	sex	cp	trestbps	chol	fbs
age	1.000000	0.014516	0.146616	0.246571	0.087101	0.181130
sex	0.014516	1.000000	0.245769	0.082064	0.027695	0.044372
cp	0.146616	0.245769	1.000000	0.081293	0.134697	0.031930

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
restecg	0.050672	-0.108656	-0.016372	0.011256	0.048081	0.047988
thalach	-0.460514	-0.106959	-0.367819	-0.181824	-0.122038	-0.069722
exang	0.239223	0.154925	0.494674	0.211507	0.161055	0.115503
oldpeak	0.178172	0.115959	0.351735	0.204000	0.106743	0.063179
target	0.210429	0.220732	0.427536	0.214898	0.256027	0.154319

	restecg	thalach	exang	oldpeak	target
age	0.050672	-0.460514	0.239223	0.178172	0.210429
sex	-0.108656	-0.106959	0.154925	0.115959	0.220732
cp	-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
restecg	1.000000	0.006084	0.041290	0.042193	0.042643
thalach	0.006084	1.000000	-0.400508	-0.300458	-0.367525
exang	0.041290	-0.400508	1.000000	0.624965	0.571710
oldpeak	0.042193	-0.300458	0.624965	1.000000	0.580732
target	0.042643	-0.367525	0.571710	0.580732	1.000000

#visualiasi matriks korelasi

```
cor_mat = dfClean.corr()
```

Membuat objek gambar (fig) dan sumbu (ax) menggunakan subplots dari matplotlib

```
fig,ax = plt.subplots(figsize=(15,10))
```

#membuat heatmap dari matriks korelasi. Parameter annot=True

menambahkan label nilai korelasi pada sel heatmap. linewidth=0.5

menentukan lebar garis pembatas antar sel. fmt=".3f" menentukan format nilai desimal untuk label (tiga desimal).

```
sns.heatmap(cor_mat, annot=True, linewidth=0.5, fmt=" .3f")
```

```
<Axes: >
```

