



TUGAS SESI 11_ENSAMBLE LEARNING

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Tabel:

<https://docs.google.com/spreadsheets/d/15zUrhsxscHYxJllyC7C89Gs17ox7unRnuqWyhFDG7Fg/edit?usp=sharing>

Kuis	Tugas	UTS	UAS	Target	RATA_RATA
83	95	89	38	0	76
74	34	49	87	0	61
90	90	59	39	0	70
52	98	43	31	1	56
55	47	59	58	1	55
85	64	56	75	0	70
94	16	29	24	1	41
35	81	95	77	0	72
97	40	91	81	0	77
31	70	65	85	0	63
31	66	56	13	1	42
68	70	16	84	0	60
25	24	16	46	1	28
65	87	33	77	0	66
90	25	13	75	1	51
15	22	90	47	1	44
30	27	86	74	1	54
55	39	31	89	1	54
94	30	74	87	0	71
48	90	17	81	1	59
11	88	82	40	1	55
69	96	79	27	0	68
69	27	83	21	1	50
67	43	93	83	0	72
40	67	10	63	1	45
80	59	64	81	0	71
62	14	95	99	0	68
37	63	16	42	1	40
60	32	26	12	1	33
76	53	12	55	1	49
50	13	68	22	1	38



50	28	65	30	1	43
47	90	90	53	0	70
11	43	60	87	1	50
26	45	77	92	0	60
26	86	30	55	1	49
33	76	61	63	1	58
38	89	64	43	1	59
68	27	53	99	0	62
58	88	13	84	0	61

Kode: <https://colab.research.google.com/drive/1gLGI2IJjv6T0HewTtwQWeyYpqhTiWh?usp=sharing>

```
#Import
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.preprocessing import StandardScaler
from sklearn.model_selection import train_test_split
from sklearn.ensemble import RandomForestClassifier
from sklearn.ensemble import GradientBoostingClassifier
from sklearn.metrics import accuracy_score
from sklearn.model_selection import cross_val_score
from sklearn.ensemble import VotingClassifier
from sklearn.metrics import classification_report
from sklearn.metrics import roc_curve, roc_auc_score

[ ] #Load Data
df = pd.read_csv('tugasses111_ml.csv')
df.head()
```

	Kuis	Tugas	UTS	UAS	Target	RATA_RATA
0	83	95	89	38	0	76
1	74	34	49	87	0	61
2	90	90	59	39	0	70
3	52	98	43	31	1	56
4	55	47	59	58	1	55



```
#Identifikasi data
df.info() #Memeriksa Tipe Data
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 40 entries, 0 to 39
Data columns (total 6 columns):
#   Column      Non-Null Count  Dtype
---  -
0    Kuis        40 non-null    int64
1    Tugas       40 non-null    int64
2    UTS         40 non-null    int64
3    UAS         40 non-null    int64
4    Target      40 non-null    int64
5    RATA_RATA   40 non-null    int64
dtypes: int64(6)
memory usage: 2.0 KB
```

```
[ ] # Menghitung persentase duplikasi
percentage_duplicates = (df.duplicated().sum() / df.shape[0]) * 100

print("Jumlah duplikasi : ", df.duplicated().sum()) #Melihat Jumlah Duplikasi Data
print(f"Persentase duplikasi: {percentage_duplicates:.2f}%")
```

```
Jumlah duplikasi : 0
Persentase duplikasi: 0.00%
```

```
df.describe() #Memeriksa Parameter Statistik
```

```

      Kuis      Tugas      UTS      UAS      Target  RATA_RATA
count  40.000000  40.000000  40.000000  40.000000  40.000000  40.000000
mean   54.875000  56.050000  55.200000  60.475000   0.550000  56.775000
std    24.362842  27.550373  28.129918  25.802989   0.503831  12.296523
min    11.000000  13.000000  10.000000  12.000000   0.000000  28.000000
25%    34.500000  29.500000  29.750000  39.750000   0.000000  49.000000
50%    55.000000  56.000000  59.500000  63.000000   1.000000  58.500000
75%    70.250000  86.250000  79.750000  83.250000   1.000000  68.000000
max    97.000000  98.000000  95.000000  99.000000   1.000000  77.000000
```

```
[ ] #cleaning data
df.drop_duplicates(inplace=True) #Menghapus Data Duplikat
```

```
[ ] print("Jumlah Duplikasi : ", df.duplicated().sum()) #Melihat Jumlah Duplikasi Data
```

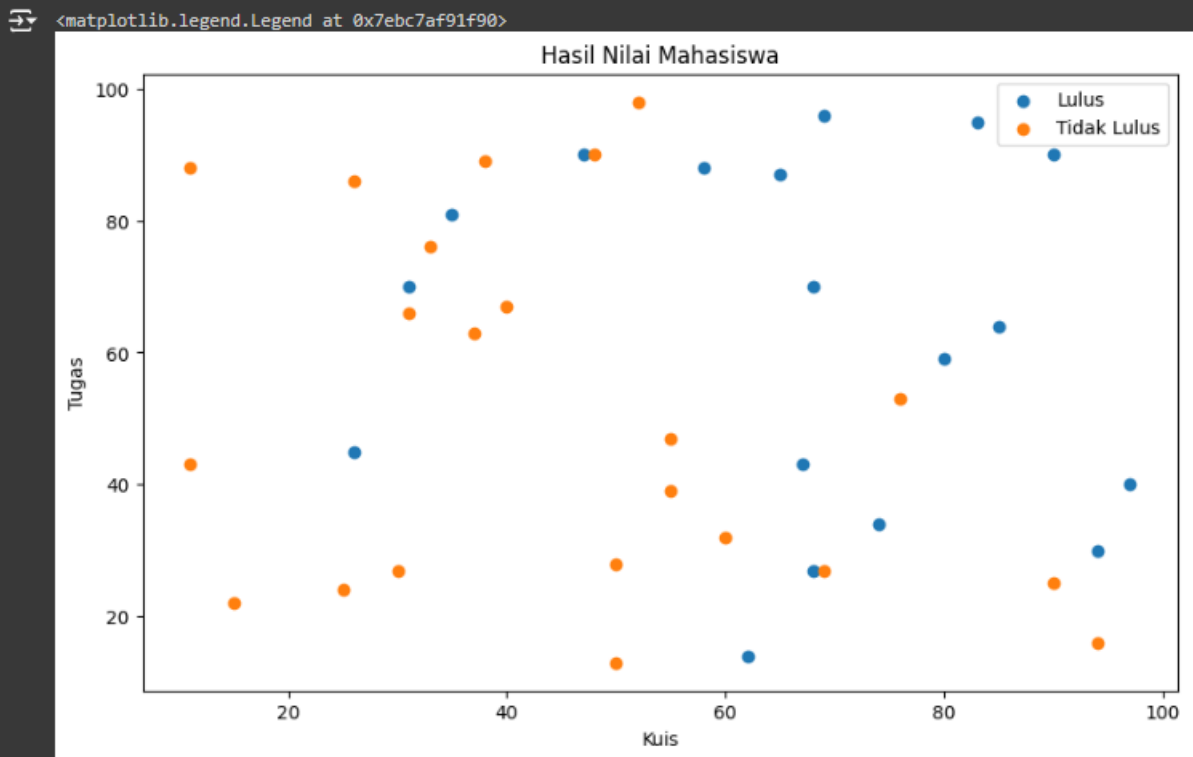
```
Jumlah Duplikasi : 0
```



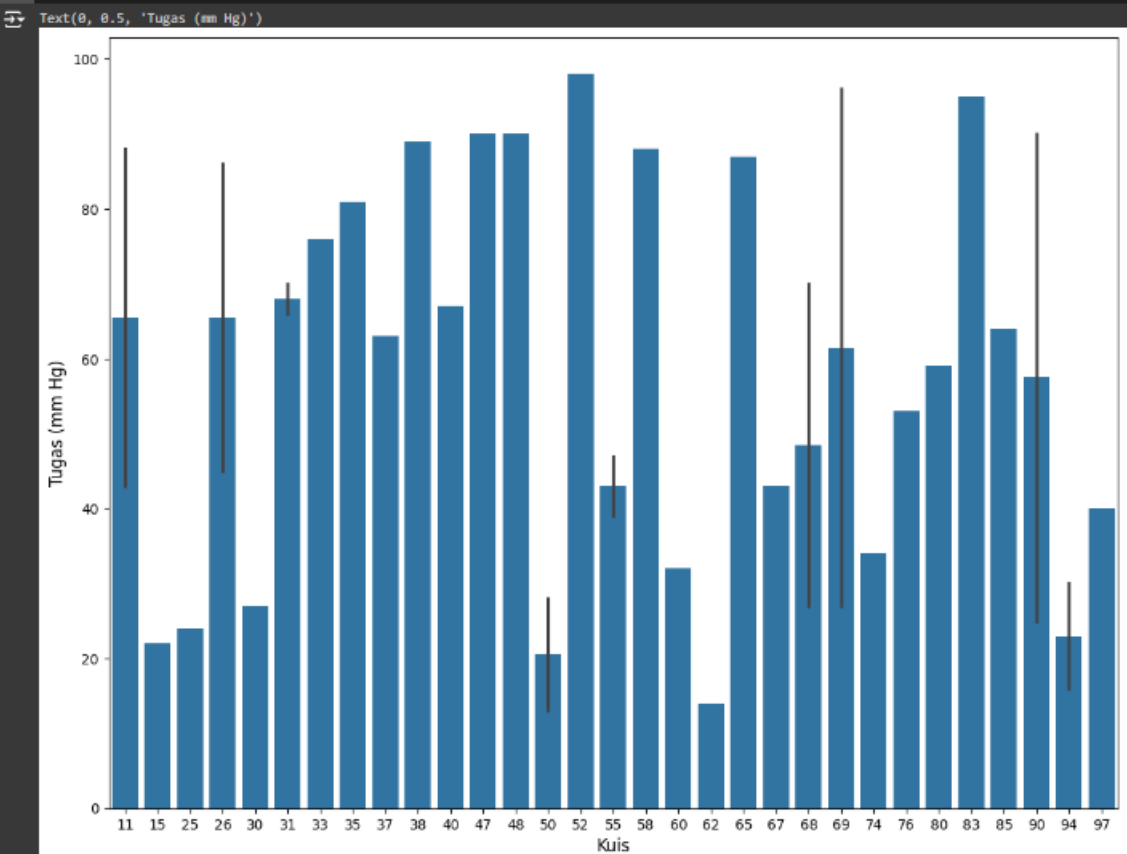
```
plt.figure(figsize=(10,6))

#Target = 0 (Lulus)
plt.scatter(x = df[df['Target']==0]['Kuis'], y = df.Tugas[df.Target==0])
#Target = 1 (Tidak Lulus)
plt.scatter(x = df[df['Target']==1]['Kuis'], y = df.Tugas[df.Target==1,]);

plt.title("Hasil Nilai Mahasiswa")
plt.xlabel("Kuis")
plt.ylabel("Tugas")
plt.legend(["Lulus", "Tidak Lulus"])
```



```
plt.figure(figsize=(13,10))
sns.barplot(x=df["Kuis"],y=df["Tugas"])
plt.xlabel('Kuis',fontsize=12)
plt.ylabel('Tugas (mm Hg)',fontsize=12)
```





```
# #Feature Engineering
# #Mengganti Kolom Sex
# df["sex"].replace({"Male" : 1,
#                   "Female" : 0}, inplace=True)
# #Mengganti Kolom Chest Pain
# df["chest_pain_type"].replace({"Typical angina" : 1,
#                               "Atypical angina" : 2,
#                               "Non-anginal pain" : 3,
#                               "Asymptomatic" : 4}, inplace=True)
# #Mengganti Kolom Fasting Blood Sugar
# df["fasting_blood_sugar"].replace({"Greater than 120 mg/ml" : 1,
#                                   "Lower than 120 mg/ml" : 0}, inplace=True)
# #Mengganti Kolom Resting Electrocardiographic
# df["rest_ecg"].replace({"Normal" : 0,
#                         "ST-T wave abnormality" : 1,
#                         "Left ventricular hypertrophy" : 2}, inplace=True)
# #Mengganti Kolom Exercise Induced Angina
# df["exercise_induced_angina"].replace({"Yes" : 1,
#                                         "No" : 0}, inplace=True)
# #Mengganti Kolom Slope
# df["slope"].replace({"Upsloping" : 1,
#                     "Flat" : 2,
#                     "Downsloping" : 3}, inplace=True)
# #Mengganti Vessels Colored By Flourosopy
# df["vessels_colored_by_flourosopy"].replace({"Zero" : 0,
#                                              "One" : 1,
#                                              "Two" : 2,
#                                              "Three" : 3,
#                                              "Four" : 4}, inplace=True)
# #Mengganti Kolom
# df["thalassemia"].replace({"Normal" : 3,
#                           "Fixed Defect" : 6,
#                           "Reversable Defect" : 7,
#                           "No" : 0}, inplace=True)

df['Target'].replace({
    "Lulus":0,
    "Tidak Lulus":1,
}, inplace=True)
df.head()
```



	Kuis	Tugas	UTS	UAS	Target	RATA_RATA
0	83	95	89	38	0	76
1	74	34	49	87	0	61
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```
#Persiapan data menjadi model
sc=StandardScaler()
X=df.drop('Target',axis=1)
Y=df['Target']
df=sc.fit(X).transform(X)

[ ] #Pisahkan data train dan test
X_train,X_test,y_train,y_test=train_test_split(X,Y,test_size=0.25,random_state=3)

[ ] #Menyusun model, evaluasi dan klasifikasi
def model(X_train,y_train):
    models=[]
    #Random Forest Classifier
    rfc=RandomForestClassifier()
    rfc.fit(X_train,y_train)
    models.append(rfc)
    #XGBoost
    xgb=GradientBoostingClassifier(n_estimators=100,learning_rate=1.0,max_depth=1)
    xgb.fit(X_train,y_train)
    models.append(xgb)
```

```
models=model(X_train,y_train) #Penampung Nilai X Train dan y Train
```

[+ Code](#)

```
[ ] Model=['RandomForestClassifier','XgBoost']

[ ] # Inisialisasi model-modelnya
rf = RandomForestClassifier()
gb = GradientBoostingClassifier()

# Fit model ke data latih
rf.fit(X_train, y_train)
gb.fit(X_train, y_train)

# Simpan model dalam sebuah list
models = [rf, gb]

# Menghitung Akurasi
train_accuracy=[]
test_accuracy=[]
for i in range(len(models)):
    yhat = models[i].predict(X_test)
    yhat_t = models[i].predict(X_train)
    train_accuracy.append(accuracy_score(yhat_t, y_train))
    test_accuracy.append(accuracy_score(yhat, y_test))
```

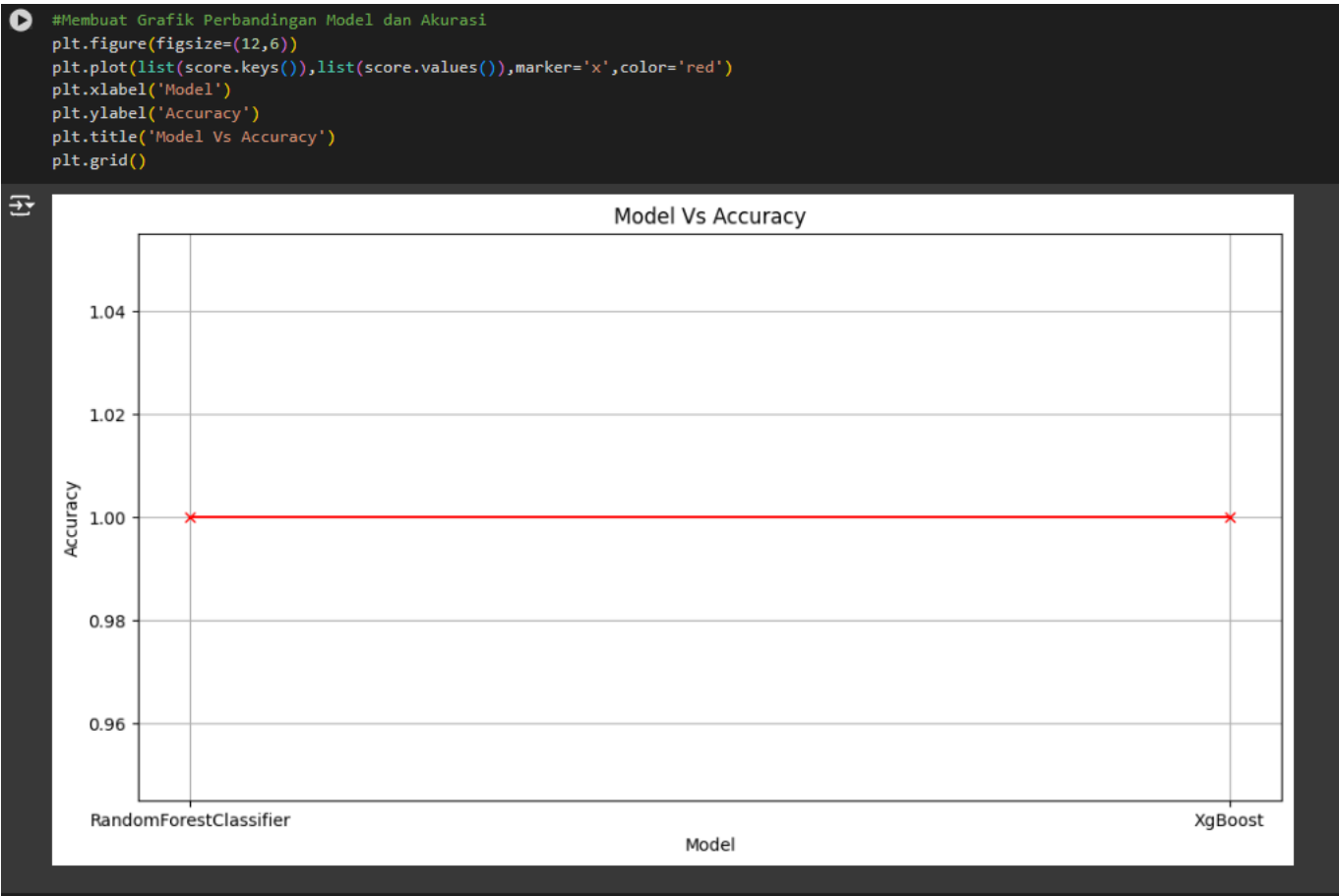


```
[ ] Accuracy_score=pd.DataFrame([
    'Model':Model,
    'Train_Accuracy':train_accuracy,
    'Test_Accuracy':test_accuracy
])

[ ] Accuracy_score #Melihat Skor Akurasi

Model Train_Accuracy Test_Accuracy
0 RandomForestClassifier 1.0 1.0
1 XgBoost 1.0 1.0

[ ] score=dict(zip(Model, Accuracy_score['Test_Accuracy'].values)) #Membuat Dictionary Dari Hasil Akurasi
score={k: v for k, v in sorted(score.items(), key=lambda item: item[1])} #Mengurutkan Dictionary Berdasarkan Nilai Akurasi
```



```
#Model Terbaik
best_model = Accuracy_score.loc[Accuracy_score['Test_Accuracy'].idxmax()]
print("Model terbaik berdasarkan akurasi pada data uji:")
print(best_model)

Model terbaik berdasarkan akurasi pada data uji:
Model          RandomForestClassifier
Train_Accuracy          1.0
Test_Accuracy           1.0
Name: 0, dtype: object

[ ] # Ambil model dengan akurasi tertinggi dari Accuracy_score
best_model_name = Accuracy_score.loc[Accuracy_score['Test_Accuracy'].idxmax()][['Model']]
best_model_index = Model.index(best_model_name)
best_model = models[best_model_index]

# lakukan prediksi pada data uji
y_pred = best_model.predict(X_test)

#Model Evaluation
print(accuracy_score(y_test,y_pred))

1.0

[ ] # Prediksi pada data baru (contoh: data test)
# Misalnya, Kita akan menggunakan satu baris dari data uji sebagai contoh
sample_data = X_test.iloc[0].values.reshape(1, -1)
prediction = gb.predict(sample_data)
print("Prediction:", prediction)

Prediction: [1]
/usr/local/lib/python2.7/dist-packages/sklearn/base.py:429: UserWarning: X does not have valid feature names, but GradientBoostingClassifier was fitted with feature names
  warnings.warn(
```



```
[ ] # Evaluasi model dengan mencetak laporan klasifikasi
print("Laporan Klasifikasi untuk Model Terbaik:")
print(classification_report(y_test, y_pred))
```

Laporan Klasifikasi untuk Model Terbaik:

	precision	recall	f1-score	support
0	1.00	1.00	1.00	4
1	1.00	1.00	1.00	6
accuracy			1.00	10
macro avg	1.00	1.00	1.00	10
weighted avg	1.00	1.00	1.00	10

```
[ ] # Mendapatkan nilai keputusan dari model terbaik
y_scores = best_model.predict_proba(X_test)[:, 1]

# Menghitung false positive rate, true positive rate, dan threshold
fpr, tpr, thresholds = roc_curve(y_test, y_scores)

# Plotting ROC curve
plt.figure(figsize=(8, 6))
plt.plot(fpr, tpr, color='blue', lw=2, label='ROC curve')
plt.plot([0, 1], [0, 1], color='red', linestyle='--')
plt.xlabel('False Positive Rate')
plt.ylabel('True Positive Rate')
plt.title('ROC Curve')
plt.legend()
plt.show()

# Hitung Area di Bawah Kurva ROC (AUC)
auc = roc_auc_score(y_test, y_scores)
print(f"Area under the ROC curve (AUC): {auc:.2f}")
```

