

# Tubes-Experimental-Scheme

March 20, 2020

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In [22]: import matplotlib.pyplot as plt
         from sklearn import datasets
         from sklearn import tree
         from sklearn import neural_network
         from sklearn.metrics import confusion_matrix
         from sklearn.tree import export_text
         from id3 import Id3Estimator
         from id3 import export_text as id3export_text
         import numpy as np
         import joblib

         from sklearn.model_selection import train_test_split

In [23]: # Iris
         # iris Features: [Sepal Length, Sepal Width, Petal Length, Petal Width]
         # iris target: {Setosa, Versicolour, Virginica}
         iris = datasets.load_iris()
         iris_X = iris.data
         iris_y = iris.target
         print(iris.target_names)

['setosa' 'versicolor' 'virginica']

In [24]: # DTL Skema Split Train
         # TODO: Confusion matrix
         dtl_model = tree.DecisionTreeClassifier()
         dtl_train_X, dtl_test_X, dtl_train_y, dtl_test_y = train_test_split(iris_X, iris_y, t
         dtl_model = dtl_model.fit(dtl_train_X, dtl_train_y)

         y_pred = dtl_model.predict(dtl_test_X)

         matrix = confusion_matrix(dtl_test_y, y_pred)

         pred_column = []
         truth_row = []

         for i in range(0, len(matrix)):
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    pred_column.append(1)
    truth_row.append(1)
    tempSumPred = 0
    tempSumTruth = 0
    for j in range(0, len(matrix[i])):
        tempSumPred += matrix[j][i]
        tempSumTruth += matrix[i][j]
    pred_column[i] = max(pred_column[i], tempSumPred)
    truth_row[i] = max(truth_row[i], tempSumTruth)

tempSumPred = 0
tempSumTruth = 0
for i in range(0, len(matrix)):
    tempSumPred += matrix[i][i]/pred_column[i] # precision
    tempSumTruth += matrix[i][i]/truth_row[i] # recall
tempSumPred /= len(matrix)
tempSumTruth /= len(matrix)

print("Precision: ", tempSumPred*100)
print("Recall   : ", tempSumTruth*100)

print(matrix)

# Kinerja
print("Kinerja DTL dengan skema Split Train =", dtl_model.score(dtl_test_X, dtl_test_y))

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Precision:  96.74603174603175
Recall   :  96.74603174603175
[[19  0  0]
 [ 0 20  1]
 [ 0  1 19]]
Kinerja DTL dengan skema Split Train = 96.66666666666667 %

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In [25]: # DTL Skema 10-fold cross validation
from sklearn.model_selection import cross_val_score

ten_fold_score = cross_val_score(dtl_model, iris_X, iris_y, cv=10)
print("Kinerja DTL dengan skema 10-fold cross validation =\n", list(ten_fold_score))
print("Rata-rata akurasi = %0.2f (+/- %0.2f)" % (ten_fold_score.mean(), ten_fold_score.std()))

Kinerja DTL dengan skema 10-fold cross validation =
[1.0, 0.9333333333333333, 1.0, 0.9333333333333333, 0.9333333333333333, 0.8666666666666667, 0.9333333333333333, 0.9333333333333333, 0.9333333333333333, 0.9333333333333333]
Rata-rata akurasi = 0.95 (+/- 0.09)

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In [26]: # ANN Skema Split Train
# TODO: Confusion Matrix
ANN_model = neural_network.MLPClassifier(hidden_layer_sizes=(3, 2), max_iter=10000, random_state=1)

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ANN_train_X, ANN_test_X, ANN_train_y, ANN_test_y = train_test_split(iris_X, iris_y, t
ANN_model = ANN_model.fit(ANN_train_X, ANN_train_y)

y_pred = ANN_model.predict(ANN_test_X)

matrix = confusion_matrix(ANN_test_y, y_pred)

pred_column = []
truth_row = []

for i in range(0, len(matrix)):
    pred_column.append(1)
    truth_row.append(1)
    tempSumPred = 0
    tempSumTruth = 0
    for j in range(0, len(matrix[i])):
        tempSumPred += matrix[j][i]
        tempSumTruth += matrix[i][j]
    pred_column[i] = max(pred_column[i], tempSumPred)
    truth_row[i] = max(truth_row[i], tempSumTruth)

tempSumPred = 0
tempSumTruth = 0
for i in range(0, len(matrix)):
    tempSumPred += matrix[i][i]/pred_column[i] # precision
    tempSumTruth += matrix[i][i]/truth_row[i] # recall
tempSumPred /= len(matrix)
tempSumTruth /= len(matrix)

print("Precision: ", tempSumPred*100)
print("Recall    : ", tempSumTruth*100)

print(matrix)
print("Kinerja ANN dengan skema Split Train =", ANN_model.score(ANN_test_X, ANN_test_y))

Precision:  96.96969696969697
Recall    :  96.82539682539682
[[19  0  0]
 [ 0 19  2]
 [ 0  0 20]]
Kinerja ANN dengan skema Split Train = 96.66666666666667 %

In [27]: # ANN Skema 10-fold cross validation
from sklearn.model_selection import cross_val_score

ten_fold_score = cross_val_score(ANN_model, iris_X, iris_y, cv=10)
print("Kinerja ANN dengan skema 10-fold cross validation =\n", list(ten_fold_score))
print("Rata-rata akurasi = %0.2f (+/- %0.2f)" % (ten_fold_score.mean(), ten_fold_score

```

Kinerja ANN dengan skema 10-fold cross validation =

[1.0, 1.0, 1.0, 0.9333333333333333, 0.8666666666666667, 0.8666666666666667, 0.9333333333333333]  
Rata-rata akurasi = 0.96 (+/- 0.11)

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In [28]: # Export DTL Model
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print(dtl_model)
filename = 'finalized_model.sav'
joblib.dump(dtl_model, filename)

loaded_model = joblib.load(filename)
result = loaded_model.score(dtl_test_X, dtl_test_y)
print(result)
```

```
DecisionTreeClassifier(ccp_alpha=0.0, class_weight=None, criterion='gini',
                      max_depth=None, max_features=None, max_leaf_nodes=None,
                      min_impurity_decrease=0.0, min_impurity_split=None,
                      min_samples_leaf=1, min_samples_split=2,
                      min_weight_fraction_leaf=0.0, presort='deprecated',
                      random_state=None, splitter='best')
0.9666666666666667
```

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In [29]: # Export ANN Model
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```
print(ANN_model)
filename = 'finalized_mlp_model.sav'
joblib.dump(ANN_model, filename)

loaded_model = joblib.load(filename)
result = loaded_model.score(ANN_test_X, ANN_test_y)
print(result)
```

```
MLPClassifier(activation='relu', alpha=0.0001, batch_size='auto', beta_1=0.9,
             beta_2=0.999, early_stopping=False, epsilon=1e-08,
             hidden_layer_sizes=(3, 2), learning_rate='constant',
             learning_rate_init=0.001, max_fun=15000, max_iter=10000,
             momentum=0.9, n_iter_no_change=10, nesterovs_momentum=True,
             power_t=0.5, random_state=3, shuffle=True, solver='adam',
             tol=0.0001, validation_fraction=0.1, verbose=False,
             warm_start=False)
0.9666666666666667
```