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[ ] from google.colab import drive
drive.mount('/content/drive')
{x} Mounted at /content/drive
[ ] import os
os.chdir('/content/drive/MyDrive/Data_Ikan_Baru/train')

[ ] #Bawal Putih
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Bawal_Putih')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Belato
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Belato')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Cakalang
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Cakalang')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Gembolo
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Gembolo')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Gole-gole
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Gole_Gole')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Kakap Merah
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Kakap_Merah')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Kembung
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Kembung')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Kerapu
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Kerapu')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Tenggiri
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Tenggiri')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #Tuna
import os
folder_path = ('/content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Tuna')
test = os.listdir(folder_path)
for fichier in test:
    if not(fichier.endswith(".jpg")):
        os.remove(os.path.join(folder_path, fichier))

[ ] #cek label
from pathlib import Path
image_dir = Path('/content/drive/MyDrive/Data_Ikan_Baru/train')

# Get filepaths and labels
filepaths = list(image_dir.glob(r'**/*.jpg'))
labels = list(map(lambda x: os.path.split(os.path.split(x)[0])[1], filepaths))

[ ] import pandas as pd
filepaths = pd.Series(filepaths, name='Filepath').astype(str)
labels = pd.Series(labels, name='Label')

# Concatenate filepaths and labels
image_df = pd.concat([filepaths, labels], axis=1)

# Shuffle the DataFrame and reset index
image_df = image_df.sample(frac=1).reset_index(drop = True)

# Show the result
image_df.head(3)

Filepath           Label
0   /content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Gembolo   Ikan Gembolo
1   /content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Kembung   Ikan Kembung
2   /content/drive/MyDrive/Data_Ikan_Baru/train/Ikan_Gole_Gole   Ikan Gole Gole

[ ] # Display some pictures of the dataset with their labels
import matplotlib.pyplot as plt
fig, axes = plt.subplots(nrows=3, ncols=4, figsize=(10, 7),
                       subplot_kw={'xticks': [], 'yticks': []})

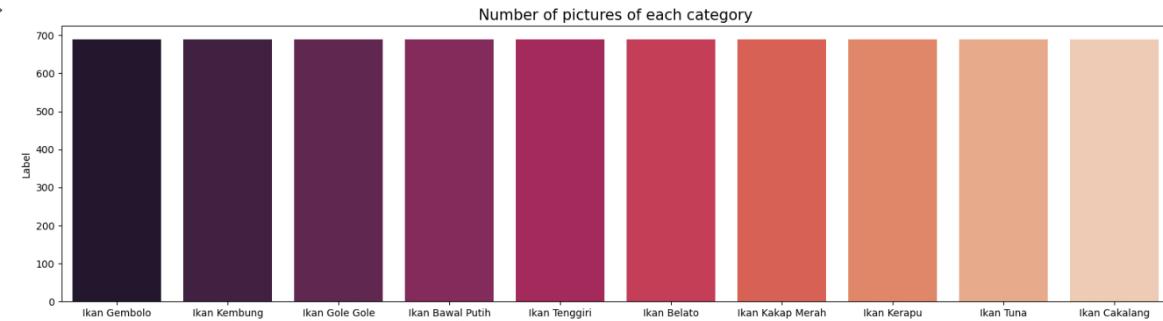
for i, ax in enumerate(axes.flat):
    ax.imshow(plt.imread(image_df.Filepath[i]))
    ax.set_title(image_df.Label[i])
    plt.tight_layout()
plt.show()

Ikan Gembolo          Ikan Kembung          Ikan Gole Gole          Ikan Bawal Putih
   

```



```
[ ] # Display the number of pictures of each category
import seaborn as sns
vc = image_df['Label'].value_counts()
plt.figure(figsize=(20,5))
sns.barplot(x = vc.index, y = vc, palette = "rocket")
plt.title("Number of pictures of each category", fontsize = 15)
plt.show()
```



```
[ ] #shuffle
from sklearn.utils import shuffle
from sklearn.model_selection import train_test_split
# Separate in train and test data
train_df, validasi_df = train_test_split(image_df, train_size=0.8, shuffle=True, random_state=1)
```

```
[ ] #data generator
from keras.preprocessing.image import ImageDataGenerator
train_datagen = ImageDataGenerator(
    rescale=1./255,
    rotation_range=20,
    width_shift_range=0.2,
    height_shift_range=0.2,
    shear_range=0.2,
    zoom_range=0.2,
    fill_mode='nearest',
    brightness_range=[0.8, 1.2],
    horizontal_flip=True)
```

```
val_datagen = ImageDataGenerator(rescale=1./255)
```

```
train_data = train_datagen.flow_from_dataframe(dataframe=train_df,
                                                x_col='Filepath',
                                                y_col='Label',
                                                seed=0,
                                                target_size=(416,416),
                                                batch_size=16,
                                                shuffle=True,
                                                class_mode = 'categorical',
                                                subset='training',
                                                )
```

```
validasi_data = val_datagen.flow_from_dataframe(dataframe=validasi_df,
                                                 x_col='Filepath',
                                                 y_col='Label',
                                                 seed=0,
                                                 target_size=(416,416),
                                                 batch_size=16,
                                                 shuffle=False,
                                                 class_mode = 'categorical',
                                                 )
```

Found 5520 validated image filenames belonging to 10 classes.  
Found 1388 validated image filenames belonging to 10 classes.

```
[ ] from keras import Model, Input
input_shape = (416,416,3)
model_input = Input(shape=input_shape)
```

```
[ ]
from keras.applications.densenet import DenseNet201
from keras import layers
from keras import Model, Input
from tensorflow.keras.optimizers import RMSprop

from keras.callbacks import ReduceLROnPlateau, EarlyStopping

import torchvision.models as models
%matplotlib inline
import matplotlib.pyplot as plt
```

```
[ ] denseNet = DenseNet201(input_shape=input_shape, input_tensor=model_input, include_top=False, weights="imagenet")
```

```
Downloading data from https://storage.googleapis.com/tensorflow/keras-applications/densenet/densenet201_weights_tf_dim_ordering_tf_kernels_notop.h5
74836368/74836368 [=====] - 0s 0us/step
```

```
(*) for layer in denseNet.layers:
    layer.trainable = False
```

```
[ ] denseNet_last_layer = denseNet.get_layer('relu')
print('last layer output shape:', denseNet_last_layer.output_shape)
denseNet_last_output = denseNet_last_layer.output
```

```
last layer output shape: (None, 13, 13, 1920)
```

```
[ ] # Flatten the output layer to 1 dimension
x_denseNet = layers.GlobalMaxPooling2D()(denseNet_last_output)
# Add a fully connected layer with 512 hidden units and ReLU activation
x_denseNet = layers.Dense(512, activation='relu')(x_denseNet)
# Add a dropout rate of 0.7
x_denseNet = layers.Dropout(0.15)(x_denseNet)
# Add a final sigmoid layer for classification
x_denseNet = layers.Dense(10, activation='softmax')(x_denseNet)

# Configure and compile the model

denseNet_model = Model(model_input, x_denseNet)
optimizer = RMSprop(learning_rate=0.0001)
denseNet_model.compile(loss='categorical_crossentropy',
                      optimizer=optimizer,
                      metrics=['accuracy'])

[ ]

[ ] # denseNet_model.load_weights("DenseNetFull.h5")
# denseNet_model.DenseNet201(pretrained=True)
denseNet_model.summary()

Model: "model"
-----
```

Layer (type)	Output Shape	Param #	Connected to
input_1 (InputLayer)	[None, 416, 416, 3 0 ]		[]
zero_padding2d (ZeroPadding2D)	(None, 422, 422, 3) 0		['input_1[0][0]']
conv1/conv (Conv2D)	(None, 208, 208, 64 9408 )		['zero_padding2d[0][0]']
conv1/bn (BatchNormalization)	(None, 208, 208, 64 256 )		['conv1/conv[0][0]']
conv1/relu (Activation)	(None, 208, 208, 64 0 )		['conv1/bn[0][0]']
zero_padding2d_1 (ZeroPadding2D)	(None, 210, 210, 64 0 )		['conv1/relu[0][0]']
pool1 (MaxPooling2D)	(None, 104, 104, 64 0 )		['zero_padding2d_1[0][0]']
conv2_block1_0_bn (BatchNormalization)	(None, 104, 104, 64 256 )		['pool1[0][0]']
conv2_block1_0_relu (Activation)	(None, 104, 104, 64 0 )		['conv2_block1_0_bn[0][0]']
conv2_block1_1_conv (Conv2D)	(None, 104, 104, 12 8192 8)		['conv2_block1_0_relu[0][0]']
conv2_block1_1_bn (BatchNormalization)	(None, 104, 104, 12 512 8)		['conv2_block1_1_conv[0][0]']
conv2_block1_1_relu (Activation)	(None, 104, 104, 12 0 )		['conv2_block1_1_bn[0][0]']
conv2_block1_2_conv (Conv2D)	(None, 104, 104, 32 36864 )		['conv2_block1_1_relu[0][0]']
conv2_block1_concat (Concatenate)	(None, 104, 104, 96 0 )		['conv2_block1_2_conv[0][0]']
conv2_block2_0_bn (BatchNormalization)	(None, 104, 104, 96 384 8)		['conv2_block1_concat[0][0]']
conv2_block2_0_relu (Activation)	(None, 104, 104, 96 0 )		['conv2_block2_0_bn[0][0]']
conv2_block2_1_conv (Conv2D)	(None, 104, 104, 12 12288 8)		['conv2_block2_0_relu[0][0]']
conv2_block2_1_bn (BatchNormalization)	(None, 104, 104, 12 512 8)		['conv2_block2_1_conv[0][0]']
conv2_block2_1_relu (Activation)	(None, 104, 104, 12 0 )		['conv2_block2_1_bn[0][0]']

```
[ ] import tensorflow as tf
class myCallback(tf.keras.callbacks.Callback):
    def on_epoch_end(self, epoch, logs={}):
        if(logs.get('loss') < 0.1 and logs.get('val_loss') < 0.1):
            print("\nStoped, Akurasi mencapai 98%")
            self.model.stop_training = True

[ ] from tensorflow.keras.callbacks import ModelCheckpoint

# Tentukan path penyimpanan model
checkpoint_path = '/content/drive/MyDrive/Percobaan-Desnet201-1/Desnet201-512-015.h5'

# Buat callback ModelCheckpoint
checkpoint_callback = ModelCheckpoint(filepath=checkpoint_path,
                                      monitor='val_loss', # Metrik yang akan dipantau
                                      save_best_only=True, # Hanya menyimpan model terbaik
                                      save_weights_only=False, # Menyimpan seluruh model
                                      mode='min', # Mode pemantauan (misalnya, 'min', 'max', atau 'auto')
                                      verbose=1) # Menampilkan pesan saat menyimpan

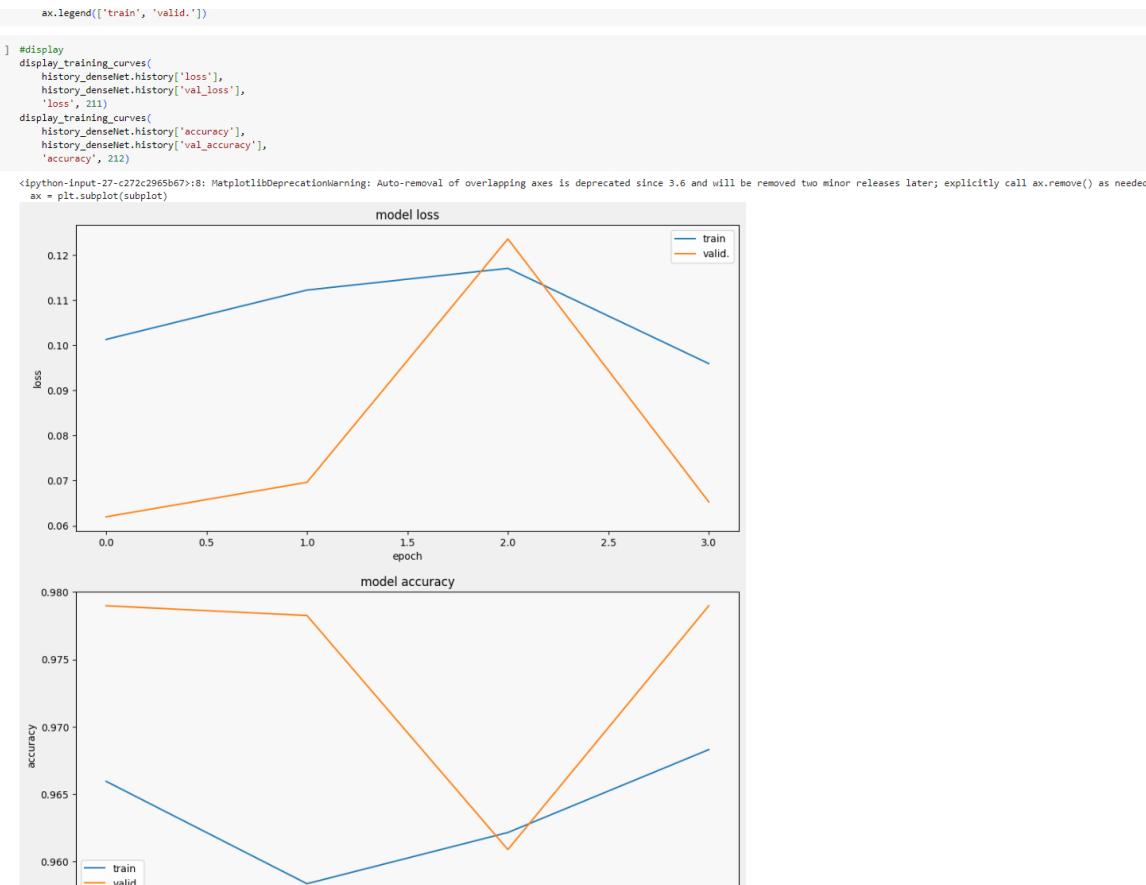
[ ] # desnet
callbacks= myCallback()
history_denseNet = denseNet_model.fit(
    train_data,
    validation_data=validasi_data,
    steps_per_epoch=train_data.n/16,
    validation_steps=validasi_data.n/16,
    epochs=20,
    callbacks=[callbacks,checkpoint_callback])

Epoch 1/20
345/345 [=====] - ETA: 0s - loss: 0.1013 - accuracy: 0.9659
Epoch 1: loss improved from inf to 0.10132, saving model to /content/drive/MyDrive/Percobaan-Desnet201-1/Desnet201-512-015.h5
345/345 [=====] - 4451s 13s/step - loss: 0.1013 - accuracy: 0.9659 - val_loss: 0.0620 - val_accuracy: 0.9790
Epoch 2/20
345/345 [=====] - ETA: 0s - loss: 0.1123 - accuracy: 0.9583
Epoch 2: loss did not improve from 0.10132
345/345 [=====] - 373s 1s/step - loss: 0.1123 - accuracy: 0.9583 - val_loss: 0.0696 - val_accuracy: 0.9783
Epoch 3/20
345/345 [=====] - ETA: 0s - loss: 0.1171 - accuracy: 0.9621
Epoch 3: loss did not improve from 0.10132
345/345 [=====] - 357s 1s/step - loss: 0.1171 - accuracy: 0.9621 - val_loss: 0.1236 - val_accuracy: 0.9609
Epoch 4/20
345/345 [=====] - ETA: 0s - loss: 0.0960 - accuracy: 0.9683
Epoch 4: loss improved from 0.10132 to 0.09596, saving model to /content/drive/MyDrive/Percobaan-Desnet201-1/Desnet201-512-015.h5
345/345 [=====] - 360s 1s/step - loss: 0.0960 - accuracy: 0.9683 - val_loss: 0.0653 - val_accuracy: 0.9790

[ ]

[ ] #plotting
import matplotlib.pyplot as plt
def display_training_curves(training, validation, title, subplot):

    if subplot!=0: # set up the subplots on the first call
        plt.subplots(figsize=(10,10), facecolor="#F0F0F0")
        plt.tight_layout()
    ax = plt.subplot(subplot)
    ax.set_facecolor('#F8F8F8')
    ax.plot(training)
    ax.plot(validation)
    ax.set_title('model '+ title)
    ax.set_ylabel(title)
    ax.set_xlabel('epoch')
    ax.set_xlim(0,20)
    ax.set_ylim(0.28,1.05)
```



## Evaluation dan Prediction

```

[ ] # Predict the label of the test_images
import numpy as np
pred = densenet_model.predict(validasi_data)
pred = np.argmax(pred, axis=1)

# Map the label
labels = {train_data.class_indices}
labels = dict((v,k) for k,v in labels.items())
pred = [labels[k] for k in pred]

# Display the result
print(f'The first 10 predictions: {pred[:10]}')

87/87 [=====] - 26s 263ms/step
The first 10 predictions: ['Ikan Cakalang', 'Ikan Tuna', 'Ikan Tenggiri', 'Ikan Gembolo', 'Ikan Gembolo', 'Ikan Cakalang', 'Ikan Tuna', 'Ikan Gembolo', 'Ikan Tuna', 'Ikan Bawal Putih']

[ ] #classification Report
from sklearn.metrics import classification_report
from sklearn.metrics import confusion_matrix

y_test = list(validasi_df.Label)
print(classification_report(y_test, pred))

precision    recall   f1-score   support

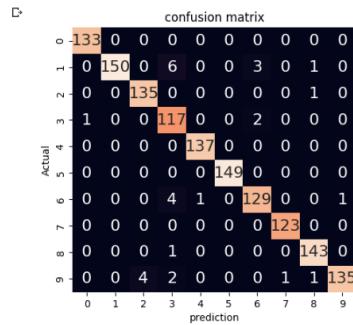
```

	precision	recall	f1-score	support
Ikan Bawal Putih	1.00	0.99	1.00	134
Ikan Cakalang	0.94	1.00	0.97	134
Ikan Cakalang	0.89	0.97	0.98	139
Ikan Gembolo	0.97	0.90	0.94	130
Ikan Gole Gole	1.00	0.99	1.00	138
Ikan Kakap Merah	1.00	1.00	1.00	149
Ikan Kembung	0.96	0.96	0.96	134
Ikan Kerapu	1.00	0.99	1.00	124
Ikan Tenggiri	0.99	0.98	0.99	144
Ikan Tuna	0.94	0.99	0.97	136
accuracy			0.98	1380
macro avg	0.98	0.98	0.98	1380
weighted avg	0.98	0.98	0.98	1380

```

import seaborn as sns
import pandas as pd
cm = confusion_matrix(pred,y_test)
df_cm = pd.DataFrame(cm, index = [i for i in range(10)],
                      columns = [i for i in range(10)])
sns.heatmap(df_cm, annot=True, annot_kws={"size": 16}, fmt='d')
plt.title('confusion matrix')
plt.xlabel('prediction')
plt.ylabel('Actual');

```



```
[ ] # Display some pictures of the dataset with their labels and the predictions
```

```

fig, axes = plt.subplots(nrows=7, ncols=5, figsize=(20, 15),
                        subplot_kw={'xticks': [], 'yticks': []})

for i, ax in enumerate(axes.flat):
    ax.imshow(plt.imread(validasi_df.Filepath.iloc[i]))
    ax.set_title(f'True: {validasi_df.Label.iloc[i]}\nPredicted: {pred[i]}')
    plt.tight_layout()
    plt.show()

```

True: Ikan Cakalang  
Predicted: Ikan Cakalang



True: Ikan Cakalang  
Predicted: Ikan Cakalang



True: Ikan Belato  
Predicted: Ikan Belato



True: Ikan Kakap Merah  
Predicted: Ikan Kakap Merah



True: Ikan Tenggiri  
Predicted: Ikan Tenggiri



True: Ikan Tuna  
Predicted: Ikan Tuna



True: Ikan Tuna  
Predicted: Ikan Tuna



True: Ikan Belato  
Predicted: Ikan Belato



True: Ikan Kembung  
Predicted: Ikan Kembung



True: Ikan Tuna  
Predicted: Ikan Tuna



True: Ikan Tenggiri  
Predicted: Ikan Tenggiri



True: Ikan Gembolo  
Predicted: Ikan Gembolo



True: Ikan Belato  
Predicted: Ikan Belato



True: Ikan Tuna  
Predicted: Ikan Tuna



True: Ikan Gembolo  
Predicted: Ikan Gembolo



True: Ikan Tuna  
Predicted: Ikan Tuna



True: Ikan Cakalang  
Predicted: Ikan Cakalang



True: Ikan Gembolo  
Predicted: Ikan Gembolo



True: Ikan Kakap Merah  
Predicted: Ikan Kakap Merah



True: Ikan Gembolo  
Predicted: Ikan Gembolo



True: Ikan Bawal Putih  
Predicted: Ikan Bawal Putih



True: Ikan Gole Gole  
Predicted: Ikan Gole Gole



True: Ikan Gole Gole  
Predicted: Ikan Gole Gole



## Load Model

```

[ ] import tensorflow as tf
class myCallback(keras.callbacks.Callback):
    def on_epoch_end(self, epoch, logs={}):
        if(logs.get('loss') < 0.1 and logs.get('val_loss') < 0.1):
            print("\nStoped, Akurasi mencapai 98%")
            self.model.stop_training = True

[ ] from tensorflow.keras.callbacks import ModelCheckpoint
# Tentukan path penyimpanan model
checkpoint_path = '/content/drive/MyDrive/Percobaan-Desnet201-1/Desnet201-512-015.h5'

# Buat callback ModelCheckpoint
checkpoint_callback = ModelCheckpoint(filepath=checkpoint_path,
                                       monitor='loss', # Metrik yang akan dipantau
                                       save_best_only=True, # Hanya menyimpan model terbaik
                                       save_weights_only=False, # Menyimpan seluruh model
                                       mode='min', # Mode pemantauan (misalnya, 'min', 'max', atau 'auto')
                                       verbose=1) # Menampilkan pesan saat menyimpan

[ ] from tensorflow.keras.models import load_model
densenet_model = load_model(checkpoint_path)

[ ] from tensorflow.keras.optimizers import RMSprop
optimizer = RMSprop(learning_rate=0.0001)
densenet_model.compile(loss='categorical_crossentropy',
                       optimizer=optimizer,
                       metrics=['accuracy'])

[ ]

```

```

MODEL_BASE_PATH = "/content/drive/MyDrive/"
PROJECT_NAME = "Percobaan-Desnet201-1"
SAVE_MODEL_NAME = "Final(26-5-23 : 02 AM)-Desnet201-512-015.h5"
save_model_path = os.path.join(MODEL_BASE_PATH, PROJECT_NAME, SAVE_MODEL_NAME)
if os.path.exists(os.path.join(MODEL_BASE_PATH, PROJECT_NAME)) == False:
    os.makedirs(os.path.join(MODEL_BASE_PATH, PROJECT_NAME))

print('Saving Model At {}'.format(save_model_path))
densenet_model.save(save_model_path, include_optimizer=False)

Saving Model At /content/drive/MyDrive/Percobaan-Desnet201-1/Final(26-5-23 : 02 AM)-Desnet201-512-015.h5...

```