

```
!pip3 install autokeras
```

```
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Requirement already satisfied: keras-nightly~=2.5.0.dev in /usr/local/lib/python3.
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```

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Requirement already satisfied: joblib>=0.11 in /usr/local/lib/python3.7/dist-packa
```

```
from google.colab import drive
drive.mount('/content/drive')
```

Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.m

```
from numpy import mean
from numpy import std
import numpy as np
from matplotlib import pyplot
from sklearn.model_selection import KFold
from tensorflow.keras.datasets import mnist
from tensorflow.keras.utils import to_categorical
from tensorflow.keras.models import Sequential
from tensorflow.keras.layers import Conv2D
from tensorflow.keras.layers import MaxPooling2D
```

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```
from tensorflow.keras.optimizers import SGD
from tensorflow.keras.layers import Dropout
from tensorflow.keras.layers import BatchNormalization
import tensorflow as tf
from tensorflow.keras.models import Model
from tensorflow.keras import backend as K
import matplotlib.pyplot as plt
import sklearn
from sklearn.metrics import confusion_matrix
from scipy.io import loadmat
import numpy as np
import PIL
import cv2
import os
from sklearn.model_selection import train_test_split
import autokeras as ak
```

```
...
```

```
x = list()
data = list()
y = list()
z = 0
# ##Class-1 images##
folder_path_class1 = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/STFT_Github
# #folder_path_class2 = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physionet
# #folder_path_class3 = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physionet
# #folder_path_class4 = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physionet
# #folder_path_class5 = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physionet

# #folder_path_class1b = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physione
# #folder_path_class2b = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physione
# #folder_path_class3b = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physione
# #folder_path_class4b = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physione
```

```
# #folder_path_class5b = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physione

paths = [folder_path_class1]

class_types = {'MVP':0, 'MR':1, 'MS':2, 'normal':3, 'AS':4}

for p in paths:
    #print(p)
    for image in os.walk(p):
        data.append(image[2])
        #print(image[2])

    for i in range(len(data[0])):
        name = data[0][i].split('_')[0]
        #print(name)
        y.append(class_types[str(name)])
        str_complete = p + data[0][i]
        #print(str_complete)
        img = cv2.imread(str_complete)
```

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```
data = []

data_x = np.asarray(x)
y = np.asarray(y)
np.save('/content/drive/MyDrive/PCG_signal_time_frequency_image/STFT_Github/x', data_x)
np.save('/content/drive/MyDrive/PCG_signal_time_frequency_image/STFT_Github/y', y)
'''

'\nx = list()\ndata = list()\nny = list()\nz = 0\n# ##Class-1 images##\n folder_path_
class1 = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/STFT_Github')\n# #
folder_path_class2 = ('/content/drive/MyDrive/PCG_signal_time_frequency_image/Physio
net_complete/scheme1/normal_TDPCT_SetB/')\n# #folder_path_class3 = ('/content/drive/
MyDrive/PCG_signal_time_frequency_image/Physionet_complete/scheme1/normal_TDPCT_Set
C/')\n# #folder_path_class4 = ('/content/drive/MyDrive/PCG_signal_time_frequency_ima
ge/Physionet_complete/scheme1/normal_TDPCT_SetD/')\n# #folder_path_class5 = ('/conte
nt/drive/MyDrive/PCG_signal_time_frequency_image/Physionet_complete/scheme1/normal_T
DPCT_SetF/')\n\n# #folder path class1b = ('/content/drive/MvDrive/PCG signal time fr

x = np.load("/content/drive/MyDrive/PCG_signal_time_frequency_image/STFT_Github/x.npy")
y = np.load("/content/drive/MyDrive/PCG_signal_time_frequency_image/STFT_Github/y.npy")

x_train, x_test, y_train, y_test = train_test_split(x, y, test_size=0.1, random_state=1)
x_train, x_val, y_train, y_val = train_test_split(x_train, y_train, test_size=1/8, random_

y_tr_one_hot = np.zeros((np.array(y_train).shape[0],5))
for i in range(np.array(y_train).shape[0]):
    label = y_train[i]
    y_tr_one_hot[i][int(label)] = 1

y_te_one_hot = np.zeros((np.array(y_test).shape[0],5))
for i in range(np.array(y_test).shape[0]):
    label = y_test[i]
    y_te_one_hot[i][int(label)] = 1
```

```

y_val_one_hot = np.zeros((np.array(y_val).shape[0],5))
for i in range(np.array(y_val).shape[0]):
    label = y_val[i]
    y_val_one_hot[i][int(label)] = 1

```

AutoKeras Code

```

input_node = ak.ImageInput()
output_node = ak.Normalization()(input_node)
output_node1 = ak.ConvBlock()(output_node)
output_node2 = ak.ConvBlock(max_pooling=True)(output_node1)
output_node = ak.ClassificationHead()(output_node)

auto_model = ak.AutoModel(
    inputs=input_node, outputs=output_node, overwrite=True, max_trials=1
)

```

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```
print(y_val_one_hot.shape)
```

```

# Feed the AutoModel with training data.
auto_model.fit(x_train, y_train, epochs=10)
# Predict with the best model.
predicted_y = auto_model.predict(x_test)
# Evaluate the best model with testing data.
print(auto_model.evaluate(x_test, y_test))

```

```

Trial 1 Complete [00h 00m 12s]
val_loss: 0.5416480898857117

```

```
Best val_loss So Far: 0.5416480898857117
```

```
Total elapsed time: 00h 00m 12s
```

```
INFO:tensorflow:Oracle triggered exit
```

```
Epoch 1/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 3.4218 - accuracy: 0.28
```

```
Epoch 2/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 0.7467 - accuracy: 0.75
```

```
Epoch 3/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 0.3103 - accuracy: 0.91
```

```
Epoch 4/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 0.1464 - accuracy: 0.95
```

```
Epoch 5/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 0.1024 - accuracy: 0.95
```

```
Epoch 6/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 0.0786 - accuracy: 1.00
```

```
Epoch 7/10
```

```
25/25 [=====] - 1s 25ms/step - loss: 0.0641 - accuracy: 1.00
```

```
Epoch 8/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 0.0543 - accuracy: 1.00
```

```
Epoch 9/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 0.0472 - accuracy: 1.00
```

```
Epoch 10/10
```

```
25/25 [=====] - 1s 26ms/step - loss: 0.0417 - accuracy: 1.00
```

```
INFO:tensorflow:Assets written to: ./auto_model/best_model/assets
```

```
4/4 [=====] - 0s 14ms/step
4/4 [=====] - 0s 15ms/step - loss: 0.3715 - accuracy: 0.9006
[0.3714759945869446, 0.8999999761581421]
```



```
predicted_y = auto_model.predict(x_test)
```

```
4/4 [=====] - 0s 14ms/step
```

```
p_list = predicted_y.reshape(100).tolist()
p_list_int = []
for i in p_list:
    p_list_int.append(int(i))
```

```
from sklearn.metrics import confusion_matrix
cm1 = confusion_matrix(y_test,p_list_int)
print("confusion matrix \n",cm1)
```

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```
[[ 0  0  0  0  0]
 [ 2 23  1  0  0]
 [ 1  0 14  0  0]
 [ 1  0  0 19  0]
 [ 0  0  2  0 16]]
```

```
precision = sklearn.metrics.precision_score(y_test,p_list_int,average='micro')
print(precision)
```

```
0.9
```

```
accuracy=np.diag(cm1).sum()/cm1.sum().sum()
print(accuracy)
```

```
0.9
```

```
recall = sklearn.metrics.recall_score(y_test,p_list_int,average='micro')
print(recall)
```

```
0.9
```

```
F1 = sklearn.metrics.f1_score(y_test,p_list_int,average='micro')
print(F1)
```

```
0.9
```

```
K_cappa = sklearn.metrics.cohen_kappa_score(y_test,p_list_int)
print(K_cappa)
```

```
0.8741346758967904
```

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