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Environment:

- Python 3.10.8
- Ubuntu 22.04.2 LTS x86 64
- Without GPU

```
In []: import tensorflow as tf
    from tensorflow import keras
    import pandas as pd
    import matplotlib.pyplot as plt
    from sklearn.model_selection import train_test_split
    import numpy as np
    from keras import regularizers
```

```
2023-05-10 21:39:36.314814: I tensorflow/tsl/cuda/cudart_stub.cc:28] Could not find cuda drivers on your machine, GP U will not be used. 2023-05-10 21:39:36.337970: I tensorflow/tsl/cuda/cudart_stub.cc:28] Could not find cuda drivers on your machine, GP U will not be used. 2023-05-10 21:39:36.338476: I tensorflow/core/platform/cpu_feature_guard.cc:182] This TensorFlow binary is optimized to use available CPU instructions in performance-critical operations. To enable the following instructions: AVX2 FMA, in other operations, rebuild TensorFlow with the appropriate compile r flags. 2023-05-10 21:39:36.810297: W tensorflow/compiler/tf2tensorrt/utils/py_utils.cc:38] TF-TRT Warning: Could not find T ensorRT
```

```
In [ ]: tf.__version__
```

In []: df.head()

Load & preprocessing the dataset

```
In [ ]: columns = ['fLength', 'fWidth', 'fSize', 'fConc', 'fConc1',
                    'fAsym', 'fM3Long', 'fM3Trans', 'fAlpha', 'fDist', 'class']
        df = pd.read csv('./data/magic04.data', names=columns)
In [ ]: df.head()
                      fWidth
                               fSize fConc fConc1
                                                     fAsym fM3Long fM3Trans
Out[]:
            fLength
                                                                                fAlpha
                                                                                           fDist class
           28.7967
                     16.0021 2.6449 0.3918
                                            0.1982
                                                    27,7004
                                                              22.0110
                                                                       -8.2027
                                                                               40.0920
                                                                                        81.8828
                                                                                                    g
                     11.7235 2.5185 0.5303
                                            0.3773
            31.6036
                                                    26.2722
                                                             23.8238
                                                                                6.3609 205.2610
                                                                       -9.9574
                                                                                                    g
         2 162.0520 136.0310 4.0612 0.0374
                                            0.0187 116.7410
                                                             -64.8580
                                                                       -45.2160 76.9600 256.7880
                                                              -6.4633
            23.8172
                      9.5728 2.3385 0.6147
                                            0.3922
                                                    27.2107
                                                                       -7.1513 10.4490 116.7370
                                                                                                    g
           75.1362
                     30.9205 3.1611 0.3168
                                            0.1832
                                                     -5.5277
                                                             28.5525
                                                                       21.8393 4.6480 356.4620
                                                                                                    g
        Label encoding the class column so that it can be fitted in ANN
In [ ]: from sklearn import preprocessing
        le = preprocessing.LabelEncoder()
        df['class'] = le.fit transform(df['class'])
In [ ]: from sklearn.preprocessing import StandardScaler
        scaler = StandardScaler()
        for col in df.columns:
             if(col == 'class'): continue
             scalerData = scaler.fit transform(df[col].values.reshape(-1, 1))
             df[col] = scalerData
```

```
Out[ ]:
             fLength
                        fWidth
                                   fSize
                                            fConc
                                                     fConc1
                                                                fAsym fM3Long fM3Trans
                                                                                             fAlpha
                                                                                                         fDist class
         0 -0.577226 -0.336804 -0.381130
                                          0.062759
                                                   -0.148923
                                                              0.541042
                                                                        0.224818 -0.405842
                                                                                           0.476816 -1.497866
                                                                                                                  0
         1 -0.510969 -0.570027 -0.648595
                                          0.820383
                                                   1.471776
                                                              0.516919
                                                                       0.260364 -0.490094 -0.815418
                                                                                                     0.153125
                                                                                                                  0
                                2.615783 -1.875883 -1.773241
                                                              2.044992 -1.478536 -2.183030
            2.568278
                      6.205858
                                                                                           1.889224
                                                                                                     0.842635
                                                                                                                  0
         3 -0.694768 -0.687259 -1.029478
                                        1.282069
                                                   1.606608
                                                              0.532771 -0.333515 -0.355359
                                                                                           -0.658804 -1.031463
                                                                                                                  0
         4 0.516622 0.476384
                                0.711157 -0.347506 -0.284660 -0.020200 0.353086 1.036620 -0.881039 2.176427
                                                                                                                  0
```

Split the dataset by 70% training and 30% testing

```
In []: y = df['class']
X = df.drop(columns=['class'])

In []: X_train, X_test, y_train, y_test = train_test_split(X, y, train_size=70, random_state=42, shuffle=True)

In []: X_train.shape

Out[]: (70, 10)

In []: num_classes = len(set(y))

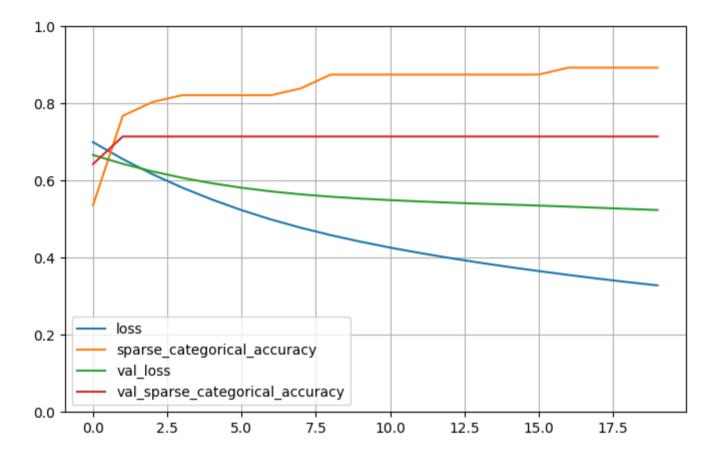
In []: from keras.models import Sequential from keras.layers import Flatten, Dense

In []: model = Sequential([
    Flatten(input_shape=(10,)),
        Dense(100, activation="relu", kernel_regularizer=regularizers.L1L2(1e-5, 1e-4)),
        Dense(100, activation="relu", kernel_regularizer=regularizers.L1L2(1e-5, 1e-4)),
        Dense(num_classes, activation="softmax")
])
```

```
Epoch 1/20
s: 0.6665 - val sparse categorical accuracy: 0.6429
Epoch 2/20
0.6436 - val sparse categorical accuracy: 0.7143
Epoch 3/20
0.6239 - val sparse categorical accuracy: 0.7143
Epoch 4/20
0.6072 - val sparse categorical accuracy: 0.7143
Epoch 5/20
0.5932 - val sparse categorical accuracy: 0.7143
Epoch 6/20
0.5815 - val sparse categorical accuracy: 0.7143
Epoch 7/20
0.5719 - val sparse categorical accuracy: 0.7143
Epoch 8/20
0.5643 - val sparse categorical accuracy: 0.7143
Epoch 9/20
0.5583 - val sparse categorical accuracy: 0.7143
Epoch 10/20
0.5534 - val sparse categorical accuracy: 0.7143
Epoch 11/20
0.5494 - val sparse categorical accuracy: 0.7143
Epoch 12/20
0.5459 - val sparse categorical accuracy: 0.7143
Epoch 13/20
0.5429 - val sparse categorical accuracy: 0.7143
Epoch 14/20
```

```
0.5402 - val sparse categorical accuracy: 0.7143
  Epoch 15/20
  0.5378 - val sparse categorical accuracy: 0.7143
  Epoch 16/20
  0.5352 - val sparse categorical accuracy: 0.7143
  Epoch 17/20
  0.5325 - val sparse categorical accuracy: 0.7143
  Epoch 18/20
  0.5296 - val sparse categorical accuracy: 0.7143
  Epoch 19/20
  0.5266 - val sparse categorical accuracy: 0.7143
  Epoch 20/20
  0.5237 - val sparse categorical accuracy: 0.7143
In [ ]: pd.DataFrame(history.history).plot(figsize=(8, 5))
   plt.grid(True)
   plt.gca().set ylim(0, 1)
```

Out[]: (0.0, 1.0)



Hyperparameter fine-tunning

Here I created a function to build an ANN model with 4 hyperparameters:

- n hidden : number of hidden layers
- n neurons : number of neurons for each layer
- optimizer : optimization algorithm (e.g Adam, SGD)
- 11, 12: regulization parameters for L1 and L2, respectively

```
metrics=["accuracy"])
    return model

In []: keras_clf = keras.wrappers.scikit_learn.KerasClassifier(build_model)

/tmp/ipykernel_1080623/1341954221.py:1: DeprecationWarning: KerasClassifier is deprecated, use Sci-Keras (https://gi
thub.com/adriangb/scikeras) instead. See https://www.adriangb.com/scikeras/stable/migration.html for help migrating.
    keras_clf = keras.wrappers.scikit_learn.KerasClassifier(build_model)

In []: from sklearn.model_selection import GridSearchCV
    param_distribs = {
        "n_hidden": [2, 4, 6, 8, 10],
        "n_neurons": [100, 200, 300],
        "optimizer": ['SGD', 'adam'],
        "11": [le-5, le-4, le-2],
        "l2": [le-5, le-4, le-2],
    }
    rnd_search_cv = GridSearchCV(keras_clf, param_distribs, cv=5, n_jobs=-1)
    history = rnd_search_cv.fit(X_train, y_train, epochs=20, batch_size=100, verbose=0, validation_split=0.2)
```

```
2023-05-10 21:39:41.751580: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38| TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.836358: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.837974: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.881565: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.886144: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.891486: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.902959: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.907618: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.910774: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.914397: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.965393: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:41.978056: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:39:42.702314: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
w the quide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your
platform.
Skipping registering GPU devices...
2023-05-10 21:39:42.754429: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
w the quide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your
platform.
Skipping registering GPU devices...
2023-05-10 21:39:42.772462: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your
platform.
```

2023-05-10 21:39:42.803107: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie

Skipping registering GPU devices...

s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follow the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:39:42.823407: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:39:42.828150: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:39:42.838723: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:39:42.857206: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:39:42.857424: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:39:42.857987: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:39:42.952326: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:39:42.973489: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie

s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

/home/huukhang1512/.local/share/virtualenvs/lab8-n1-oXRNz/lib/python3.11/site-packages/joblib/externals/loky/process _executor.py:700: UserWarning: A worker stopped while some jobs were given to the executor. This can be caused by a too short worker timeout or by a memory leak.

warnings.warn(

```
2023-05-10 21:42:12.190810: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:42:13.201207: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
```

2023-05-10 21:42:13.201207: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

```
2023-05-10 21:42:36.657362: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:42:37.316896: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:42:37.589813: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
w the quide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your
platform.
Skipping registering GPU devices...
2023-05-10 21:42:37.984107: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:42:38.292528: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your
platform.
Skipping registering GPU devices...
2023-05-10 21:42:38.399374: W tensorflow/core/data/root dataset.cc:273] Optimization loop failed: CANCELLED: Operati
on was cancelled
```

2023-05-10 21:42:38.697475: W tensorflow/compiler/tf2tensorrt/utils/py_utils.cc:38] TF-TRT Warning: Could not find T ensorRT

2023-05-10 21:42:38.978155: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:42:39.646494: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

```
2023-05-10 21:42:43.138213: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:42:44.121526: W tensorflow/core/common runtime/qpu/qpu device.cc:1956] Cannot dlopen some GPU librarie
s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
```

w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

2023-05-10 21:42:57.415785: W tensorflow/compiler/tf2tensorrt/utils/py_utils.cc:38] TF-TRT Warning: Could not find T ensorRT

```
2023-05-10 21:42:58.373894: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your
platform.
Skipping registering GPU devices...
2023-05-10 21:43:01.815033: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
```

2023-05-10 21:43:02.750597: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1956] Cannot dlopen some GPU librarie s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.

Skipping registering GPU devices...

```
2023-05-10 21:43:19.701307: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
2023-05-10 21:43:20.438432: W tensorflow/compiler/tf2tensorrt/utils/py utils.cc:38] TF-TRT Warning: Could not find T
ensorRT
2023-05-10 21:43:20.647517: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your
platform.
Skipping registering GPU devices...
```

```
2023-05-10 21:43:21.447037: W tensorflow/core/common runtime/gpu/gpu device.cc:1956] Cannot dlopen some GPU librarie
 s. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follo
 w the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your
 platform.
 Skipping registering GPU devices...
 In [ ]: best params = rnd search cv.best params
 best params
Out[]: {'l1': 1e-05,
 'l2': 1e-05.
 'n hidden': 4.
 'n neurons': 200,
```

'optimizer': 'adam'}

```
In [ ]: rnd_search_cv.best_score_
Out[ ]: 0.8571428537368775
In [ ]: tuned_ann = rnd_search_cv.best_estimator_.model
tuned_ann.summary()
```

Model: "sequential_1"

Layer (type)	Output Shape	Param #
flatten_1 (Flatten)	(None, 10)	0
dense_3 (Dense)	(None, 200)	2200
dense_4 (Dense)	(None, 200)	40200
dense_5 (Dense)	(None, 200)	40200
dense_6 (Dense)	(None, 200)	40200
dense_7 (Dense)	(None, 2)	402

Total params: 123,202 Trainable params: 123,202 Non-trainable params: 0

Layer (type) Output Shape Param # flatten_1 (Flatten) (None, 10) 0 dense 3 (Dense) (None, 200) 2200 dense_4 (Dense) (None, 200) 40200 dense 5 (Dense) (None, 200) 40200 dense 6 (Dense) (None, 200) 40200 dense 7 (Dense) 402 (None, 2)

Total params: 123,202 Trainable params: 123,202

```
Non-trainable params: 0
```

```
Epoch 1/20
racy: 0.7143
Epoch 2/20
acy: 0.7143
Epoch 3/20
acy: 0.7143
Epoch 4/20
acy: 0.7143
Epoch 5/20
acy: 0.7143
Epoch 6/20
acy: 0.7143
Epoch 7/20
acv: 0.7143
Epoch 8/20
acv: 0.7143
Epoch 9/20
acv: 0.7143
Epoch 10/20
acy: 0.7143
Epoch 11/20
acy: 0.6429
Epoch 12/20
acy: 0.7143
Epoch 13/20
acv: 0.7143
Epoch 14/20
```

```
acy: 0.7857
 Epoch 15/20
 acy: 0.8571
 Epoch 16/20
 acy: 0.8571
 Epoch 17/20
 acy: 0.7857
 Epoch 18/20
 acy: 0.7143
 Epoch 19/20
 acv: 0.7143
 Epoch 20/20
 acv: 0.7143
In [ ]: probs = best ann.predict(X test)
 In [ ]: predictions = np.argmax(probs, axis=-1)
In [ ]: best ann.evaluate(X test, y test)
 Out[]: [0.735068142414093, 0.7770448327064514]
  => Accuarcy improves from 70% to 77.7%
```

Learning curve and test accuracy

```
In [ ]: pd.DataFrame(best_history.history).plot(figsize=(8, 5))
    plt.grid(True)
```

Out[]: (0.0, 1.0)

