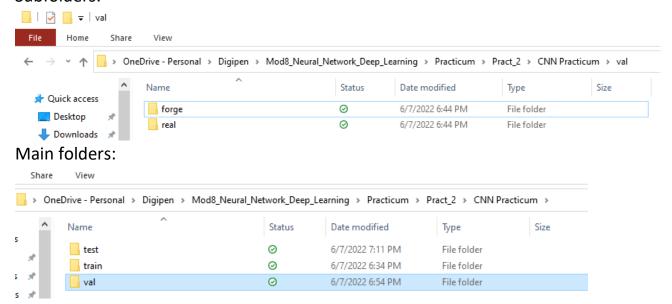
# Artificial Neural Network & Deep Learning – Practicum 2-Convolution Neural Network

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## (Qns 1)

Arrange the all the images into 3 folders, namely "train", "val" and test folders with 2 subfolders namely "forge" and "real".

#### Subfolders:



Save the files' directories into the variables as shown below:

```
In [3]: 1 train_folder= './CNN Practicum/train/'
2 val_folder = './CNN Practicum/val/'
3 test_folder = './CNN Practicum/test/'
```

Extract the images using keras "flow\_from\_directory" and convert all the images into greyscale format so as to reduce the "noise". Standardise all images as per screenshot shown below before fit into the CNN model:

```
In [5]:
            # The function ImageDataGenerator augments your image by iterating through image as your CNN is getting ready to process tha
            train datagen = ImageDataGenerator(rescale = 1./255
                                                shear range = 0.2,
                                                zoom range = 0.2,
                                                horizontal_flip = True)
            test_datagen = ImageDataGenerator(rescale = 1./255) #Image normalization.
            training_set = train_datagen.flow_from_directory('../Pract_2/CNN Practicum/train/',
                                                               target size = (64, 64),
                                                               color_mode = 'grayscale',
         13
         14
                                                               batch_size = 32,
         15
                                                               class_mode = 'categorical')
         17
            validation_generator = test_datagen.flow_from_directory('../Pract_2/CNN Practicum/val/',
         18
                 target_size=(64, 64),
         19
                 color_mode = 'grayscale',
         20
                 batch_size=32,
                 class_mode='categorical')
         22
            test set = test datagen.flow from directory('../Pract 2/CNN Practicum/test/',
         23
         24
                                                          target size = (64, 64),
         25
                                                          shuffle=False,
         26
                                                          color_mode = '
                                                                       'grayscale',
                                                          batch_size = 32,
                                                          class_mode = 'categorical')
         28
```

### (Qns 2)

Below is the structure of CNN model using sequential with 2 convolution layers and 2 max pooling layers and run 30 epochs:

```
In [4]: 1 # Let's build the CNN model
        3 cnn = Sequential()
        4
        5 #Convolution
        6 cnn.add(Conv2D(32, (3, 3), activation="relu", input_shape=(64, 64, 1)))
       8 #Pooling
       9 cnn.add(MaxPooling2D(pool_size = (2, 2)))
       10
       11 # 2nd Convolution
       12 cnn.add(Conv2D(32, (3, 3), activation="relu"))
       13
       14 # 2nd Pooling Layer
       15 cnn.add(MaxPooling2D(pool_size = (2, 2)))
       16
       17 # Flatten the layer
       18 cnn.add(Flatten())
       20 # Fully Connected Layers
       21 cnn.add(Dense(activation = 'relu', units = 128))
       22 cnn.add(Dense(activation = 'softmax', units = 2))
       23
       24
       25 # Compile the Neural network
       26 | cnn.compile(optimizer = 'adam', loss = 'categorical_crossentropy', metrics = ['accuracy'])
In [6]: 1 cnn.summary()
       Model: "sequential"
       Layer (type)
                                                     Param #
                              Output Shape
       ______
       conv2d (Conv2D)
                              (None, 62, 62, 32)
       max_pooling2d (MaxPooling2D (None, 31, 31, 32)
       conv2d 1 (Conv2D)
                       (None, 29, 29, 32)
                                                9248
        max_pooling2d_1 (MaxPooling (None, 14, 14, 32)
       flatten (Flatten)
                               (None, 6272)
                                                     802944
                               (None, 128)
       dense (Dense)
       dense_1 (Dense)
                               (None, 2)
                                                     258
       ______
       Total params: 812,770
       Trainable params: 812,770
       Non-trainable params: 0
In [7]:
                 cnn_model = cnn.fit(training_set,
              1
                            steps_per_epoch = len(training_set),
              2
                            epochs = 30,
              3
                            validation_data = validation_generator)
              4
```

# (Qns 3)

```
In [12]:
                print(classification_report(test_set.classes, y_pred_test))
                           precision
                                          recall f1-score
                                                                support
                        0
                                 0.94
                                            0.97
                                                        0.95
                                                                    150
                        1
                                 0.97
                                            0.93
                                                        0.95
                                                                    150
                                                        0.95
                                                                    300
                accuracy
                                 0.95
                                            0.95
                                                        0.95
                                                                    300
               macro avg
           weighted avg
                                 0.95
                                            0.95
                                                        0.95
                                                                    300
In [13]:
                cm=confusion_matrix(test_set.classes, y_pred_test)
             2
                cm
Out[13]: array([[146,
                            4],
                   [ 10, 140]], dtype=int64)
             from sklearn.metrics import confusion_matrix, ConfusionMatrixDisplay
In [14]:
           2
             disp = ConfusionMatrixDisplay(confusion_matrix=cm)
           3 disp.plot()
             plt.show()
                                                140
                                               120
                    146
                                               - 100
          Frue label
                                               80
                                               60
                                  140
                    10
            1
                                               40
                                               20
                     0
                                   1
                       Predicted label
```

Based on the classification report and confusion matrix shown above, the accuracy on the test dataset using this CNN model is around 95%. This seems that this model can detect unseen signatures at high accuracy rate. However, the structure of model is not optimal, and the training accuracy is not very high even though it can learn the signature using CNN. Thus, there are rooms for improvement in this model.