```
1 from google.colab import drive
 2 drive.mount('/content/drive')
     Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.mount("/content/drive", force remount=True).
1 import pandas as pd
 2 import numpy as np
 3 import matplotlib.pyplot as plt
4 import cv2
5 from tqdm.notebook import tqdm
6 from tensorflow.keras.models import Sequential
7 from tensorflow.keras.layers import Input, Dense, Dropout, Flatten, Conv2D, MaxPool2D
8 import seaborn as sns
9 import tensorflow.keras.backend as K
10 from sklearn.model_selection import train_test_split
11 from sklearn.metrics import confusion matrix
12 from sklearn.metrics import f1_score
13 from tensorflow.keras import optimizers
14 from tensorflow.keras.models import Model
15 from tensorflow.keras.preprocessing.image import ImageDataGenerator
16 sns.set()
1 train_datagen = ImageDataGenerator(rescale=1./255,
2
                                      shear_range=0.3,
3
                                      zoom_range=0.3,
4
                                      width_shift_range=0.3,
                                      height_shift_range=0.3)
5
7 test_datagen = ImageDataGenerator(rescale=1./255)
9 train_generator = train_datagen.flow_from_directory('/content/drive/MyDrive/emoji_data/data/Train',
                                                       target_size=(150, 150),
10
                                                       batch_size=2,
11
                                                       color_mode='grayscale',
12
13
                                                       class_mode="sparse",
14
                                                       shuffle=True)
15
16 validation_generator = test_datagen.flow_from_directory('/content/drive/MyDrive/emoji_data/data/Valid',
17
                                                            target_size=(150, 150),
18
                                                           batch_size=2,
19
                                                            color_mode='grayscale',
                                                           class_mode="sparse")
20
     Found 50 images belonging to 5 classes.
     Found 50 images belonging to 5 classes.
1 import tensorflow as tf
2 def f1score(y, y_pred):
3 return f1_score(y, tf.math.argmax(y_pred, axis=1), average='micro')
4 def custom_f1score(y, y_pred):
5 return tf.py_function(f1score, (y, y_pred), tf.double)
1 class stop_training_callback(tf.keras.callbacks.Callback):
2
    def on_epoch_end(self, epoch, logs={}):
3
      if(logs.get('val_custom_f1score') > 0.98 and logs.get('custom_f1score') > 0.98):
4
         self.model.stop_training = True
1 K.clear_session()
2 ip = Input(shape = (150,150,1))
3 z = Conv2D(filters = 32, kernel_size = (64,64), padding='same', input_shape = (150,150,1), activation='relu')(ip)
4 z = Conv2D(filters = 64, kernel_size = (16,16), padding='same', input_shape = (150,150,1), activation='relu')(z)
5 z = Conv2D(filters = 128, kernel_size = (8,8), padding='same', input_shape = (150,150,1), activation='relu')(z)
6 z = MaxPool2D(pool\_size = (4,4))(z)
7 z = Flatten()(z)
8 z = Dense(32, activation='relu')(z)
9 op = Dense(5, activation='softmax')(z)
10 model = Model(inputs=ip, outputs=op)
11 \ \ model. compile (loss='sparse\_categorical\_crossentropy', optimizer=optimizers. Adam (lr=0.00001), \ metrics=[custom\_f1score])
     WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimizers.le
```

3

4 5

6

```
1 model.summarv()
```

```
Model: "model"
```

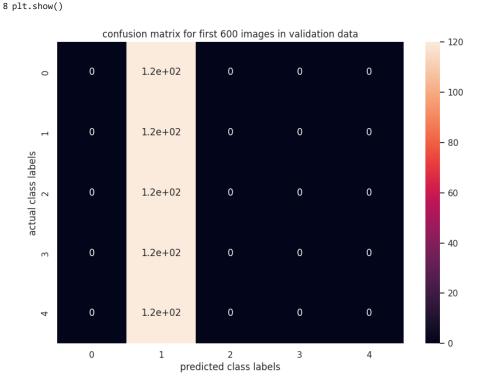
```
Layer (type)
                        Output Shape
                                           Param #
   input_1 (InputLayer)
                        [(None, 150, 150, 1)]
   conv2d (Conv2D)
                        (None, 150, 150, 32)
                                           131104
   conv2d 1 (Conv2D)
                        (None, 150, 150, 64)
                                           524352
   conv2d_2 (Conv2D)
                        (None, 150, 150, 128)
                                           524416
   max_pooling2d (MaxPooling2 (None, 37, 37, 128)
   flatten (Flatten)
                        (None, 175232)
                                           0
   dense (Dense)
                        (None, 32)
                                           5607456
   dense_1 (Dense)
                        (None, 5)
                                           165
   Total params: 6787493 (25.89 MB)
   Trainable params: 6787493 (25.89 MB)
   Non-trainable params: 0 (0.00 Byte)
1 callbacks = [stop_training_callback()]
2 model.fit(train_generator,
        epochs=10,
        validation_data=validation_generator,
        callbacks=callbacks,
        verbose=1)
   Epoch 1/10
   25/25 [====
           Epoch 2/10
   25/25 [============] - 443s 18s/step - loss: 1.5836 - custom_f1score: 0.2800 - val_loss: 1.3615 - val_custom_f1score:
   Epoch 3/10
   25/25 [=====
           Epoch 4/10
   25/25 [=====
           Epoch 5/10
   25/25 [==========] - 423s 17s/step - loss: 1.6112 - custom f1score: 0.1000 - val loss: 1.6116 - val custom f1score:
   Epoch 6/10
   25/25 [====
             =========== ] - 419s 17s/step - loss: 1.6105 - custom_f1score: 0.1800 - val_loss: 1.6112 - val_custom_f1score:
   Epoch 7/10
   25/25 [========= - 420s 17s/step - loss: 1.6080 - custom f1score: 0.2600 - val loss: 1.6321 - val custom f1score:
   Epoch 8/10
   25/25 [====
           Epoch 9/10
   25/25 [============] - 403s 16s/step - loss: 1.4059 - custom_f1score: 0.2800 - val_loss: 2.5547 - val_custom_f1score:
   Epoch 10/10
   25/25 [===========] - 396s 16s/step - loss: 1.8196 - custom_flscore: 0.2600 - val_loss: 1.6110 - val_custom_flscore:
   <keras.src.callbacks.History at 0x787f14ef2950>
                                       target_size=(150, 150),
                                       batch_size=1,
                                       color_mode='grayscale',
                                       class mode="sparse")
```

```
1 test_generator = test_datagen.flow_from_directory('/content/drive/MyDrive/emoji_data/data/Valid',
2
3
4
```

Found 50 images belonging to 5 classes.

```
1 \text{ num} = 0
2 y_pred = []
3 y_true = []
4 for img, y_actual in test_generator:
      if num==10:
6
          break
      pred_label = model.predict(img).argmax()
8
       y_pred.append(pred_label)
9
      y_true.append(y_actual[0])
10
       num+=1
```

```
1/1 [======] - 1s 1s/step
  1/1 [======] - 1s 1s/step
  1/1 [======] - 1s 1s/step
  1/1 [======] - 2s 2s/step
  1/1 [======] - 2s 2s/step
  1/1 [======] - 1s 1s/step
  1/1 [======] - 1s 1s/step
  1/1 [======] - 1s 1s/step
  1/1 [======] - 1s 1s/step
1 cm = confusion_matrix(y_true, y_pred)
2 df_cm = pd.DataFrame(cm, index=np.arange(5), columns=np.arange(5))
3 plt.figure(figsize = (10,7))
4 sns.heatmap(df_cm, annot=True)
5 plt.xlabel('predicted class labels')
6 plt.ylabel('actual class labels')
7 plt.title('confusion matrix for first 600 images in validation data')
```



```
1 plt.figure(figsize=(16,16))
2 for i,j in enumerate(test_generator):
      if i==5:
4
          break
      pred_label = model.predict(j[0]).argmax()
5
      actual_label = j[1][0]
      plt.subplot(4,4,i+1)
8
      img = j[0][0][:,:,0]
      plt.imshow(img, cmap='gray')
9
10
      plt.title(f'actual: {actual_label} | predicted: {pred_label}')
11
      plt.axis('off')
12 plt.show()
```

```
1/1 [======= ] - 3s 3s/step
    1/1 [======] - 3s 3s/step
    1/1 [=======] - 2s 2s/step
    1/1 [======] - 1s 1s/step
                             actual: 4.0 | predicted: 1
                                                  actual: 1.0 | predicted: 1
       actual: 0.0 | predicted: 1
1 model.save_weights('model_weights.h5')
1 import cv2
2 import time
3 import numpy as np
4 import tensorflow.keras.backend as K
5 from sklearn.metrics import f1_score
6 from tensorflow.keras.models import Sequential
7 from tensorflow.keras.optimizers import RMSprop
8 from tensorflow.keras.models import Model
9 from tensorflow.keras.layers import Dense, Dropout, Flatten, Conv2D, MaxPool2D, Input
10 from tensorflow.keras import optimizers
11 import tensorflow as tf
1 def create_model():
      K.clear_session()
3
      ip = Input(shape = (150,150,1))
      z = Conv2D(filters = 32, kernel_size = (64,64), padding='same', input_shape = (150,150,1), activation='relu')(ip)
5
      z = Conv2D(filters = 64, kernel_size = (16,16), padding='same', input_shape = (150,150,1), activation='relu')(z)
6
      z = Conv2D(filters = 128, kernel_size = (8,8), padding='same', input_shape = (150,150,1), activation='relu')(z)
      z = MaxPool2D(pool\_size = (4,4))(z)
      z = Flatten()(z)
8
9
      z = Dense(32, activation='relu')(z)
10
      op = Dense(5, activation='softmax')(z)
11
      model = Model(inputs=ip, outputs=op)
12
      return model
13 model = create model()
14 model.load_weights('model_weights.h5')
1 def hand_detect(img, type='haar'):
2
      cv2.imshow('output', img)
3
      key = cv2.waitKey(20)
      if key == 27: # exit on ESC
4
 5
          cv2.destroyAllWindows()
6
      hand_img = img.copy()
7
      if type=='yolo':
8
          width, height, inference_time, results = yolo.inference(img)
9
      elif type=='haar':
10
          results = cascade.detectMultiScale(hand_img, scaleFactor=1.3, minNeighbors=7)
11
      if len(results) > 0:
12
          if type=='yolo':
13
              _,_,_, x, y, w, h = results[0]
14
              return x,y,150,150
15
          elif type=='haar':
16
              x, y, w, h = results[0]
17
              return x-50,y-70,150,150
18
      else:
19
          return []
1 def main():
2
      roi = []
3
      while(len(roi) == 0):
4
          ret, frame = cap.read()
5
          frame = cv2.flip(frame, 1)
          roi = hand_detect(frame)
```

```
cv2.destroyAllWindows()
8
      ret = tracker.init(frame, roi)
9
      cv2.destroyAllWindows()
10
      c = 0
11
      d = c+1
12
      while True:
13
           ret, frame = cap.read()
           frame = cv2.flip(frame, 1)
14
15
          success, roi = tracker.update(frame)
16
           (x,y,w,h) = tuple(map(int, roi))
17
          if success:
18
              pt1 = (x,y)
              pt2 = (x+w, y+h)
19
20
              square = frame[y:y+h, x:x+w]
21
              gray = cv2.cvtColor(square, cv2.COLOR_BGR2GRAY)
22
              gray_ = cv2.medianBlur(gray, 7)
23
              hand = contours(gray, th=150)[0]
24
              im = np.array([hand])
              im = im.reshape(-1,150,150,1)
25
26
              result = pred(im)
27
              cv2.rectangle(frame, pt1, pt2, (255,255,0), 3) .
28
               emo = icon(result)
              frame_copy = paste(frame, emo)
29
30
               (a,b) = hand.shape
31
               for i in range(3):
32
                   hand = hand*255
33
                   frame_copy[0:a, 0:b, i] = hand
34
          else:
              cv2.putText(frame, 'Failed to detect object', (100,200), cv2.FONT_HERSHEY_SIMPLEX, 2, 255)
35
36
              cv2.imshow('output', frame_copy)
37
              roi = []
38
              while(len(roi) == 0):
39
40
                   ret, frame = cap.read()
41
                   frame = cv2.flip(frame, 1)
42
                   roi = hand_detect(frame)
43
           cv2.imshow('output', frame_copy)
44
45
           if cv2.waitKey(1) \& 0xFF == 27:
46
            break
47
      cap.release()
48
      cv2.destroyAllWindows()
1 def contours(diff, th=100):
2 thresholded = cv2.threshold(diff, th, 255, cv2.THRESH_BINARY_INV)
3
    contours, hierarchy = cv2.findContours(thresholded.copy(), cv2.RETR_EXTERNAL, cv2.CHAIN_APPROX_SIMPLE)
4
    if len(contours) == 0:
5
        return None
    else:
6
        hand_segment = max(contours, key=cv2.contourArea)
8
    return (thresholded, hand_segment)
1 def pred(img):
      return model.predict(img).argmax(axis=1)[0]
1 \text{ emoji} = []
2 for i in range(1,6):
      img = cv2.imread(f'/content/drive/MyDrive/emoji_data/emoji/{i}.png', -1)
4
      emoji.append(img)
1 def icon(x, e=emoji):
      return e[x - 1]
1 def paste(frame, s_img, pt1, pt2):
2
      x, y = pt1
3
      x_w, y_h = pt2
4
      n = min(x_w-x, y_h-y)
      s_{img} = cv2.resize(s_{img}, dsize=(n,n))
      1_img = frame
7
      (x_offset,y_offset,_) = (frame.shape)
8
      (y_offset, x_offset) = (x_offset//2 - 72, y_offset//2 - 72)
      y1, y2 = y_offset, y_offset + s_img.shape[0]
      x1, x2 = x_offset, x_offset + s_img.shape[1]
10
```

```
11
12    alpha_s = s_img[:, :, 3] / 255.0
13    alpha_l = 1.0 - alpha_s
14
15    for c in range(0, 3):
16         l_img[y:y_h, x:x_w, c] = (alpha_s * s_img[:, :, c] + alpha_l * l_img[y:y_h, x:x_w, c])
17    return l_img
```