





block8\_3\_mixed (Concatenate) activation 171[0][0] (None, None, None, 4 0 activation\_174[0][0] block8\_3\_conv (Conv2D) (None, None, None, 2 933920 block8\_3\_mixed[0][0] block8 3 (Lambda) (None, None, None, 2 0 block8\_2\_ac[0][0] block8\_3\_conv[0][0] (None, None, None, 2 0 block8\_3\_ac (Activation) block8\_3[0][0] conv2d 176 (Conv2D) (None, None, None, 1 399360 block8 3 ac[0][0] batch\_normalization\_176 (BatchN (None, None, None, 1 576 conv2d 176[0][0] activation 176 (Activation) (None, None, None, 1 0 batch normalization 1 76[0][0] conv2d 177 (Conv2D) (None, None, None, 2 129024 activation\_176[0][0] batch\_normalization\_177 (BatchN (None, None, None, 2 672 conv2d\_177[0][0] activation 177 (Activation) (None, None, None, 2 0 batch\_normalization\_1 77[0][0] conv2d 175 (Conv2D) (None, None, None, 1 399360 block8\_3\_ac[0][0] conv2d 178 (Conv2D) (None, None, None, 2 172032 activation\_177[0][0] batch\_normalization\_175 (BatchN (None, None, None, 1 576 conv2d\_175[0][0] batch\_normalization\_178 (BatchN (None, None, None, 2 768 conv2d\_178[0][0] activation 175 (Activation) (None, None, None, 1 0 batch\_normalization\_1 75[0][0] activation 178 (Activation) (None, None, None, 2 0 batch\_normalization\_1 78[0][0] (None, None, None, 4 0 block8\_4\_mixed (Concatenate) activation\_175[0][0] activation 178[0][0] (None, None, None, 2 933920 block8 4 mixed[0][0] block8\_4\_conv (Conv2D) block8\_4 (Lambda) block8\_3\_ac[0][0] (None, None, None, 2 0 block8 4 conv[0][0] block8 4 ac (Activation) (None, None, None, 2 0 block8 4[0][0] block8\_4\_ac[0][0] conv2d 180 (Conv2D) (None, None, None, 1 399360 batch normalization 180 (BatchN (None, None, None, 1 576 conv2d 180[0][0] activation 180 (Activation) (None, None, None, 1 0 batch normalization 1 80[0][0] conv2d 181 (Conv2D) (None, None, None, 2 129024 activation 180[0][0] batch normalization 181 (BatchN (None, None, None, 2 672 conv2d 181[0][0] activation 181 (Activation) (None, None, None, 2 0 batch normalization 1 81[0][0] conv2d 179 (Conv2D) (None, None, None, 1 399360 block8\_4\_ac[0][0] conv2d 182 (Conv2D) (None, None, None, 2 172032 activation 181[0][0] batch normalization 179 (BatchN (None, None, None, 1 576 conv2d 179[0][0] batch normalization 182 (BatchN (None, None, None, 2 768 conv2d 182[0][0] activation 179 (Activation) (None, None, None, 1 0 batch normalization 1 79[0][0] activation 182 (Activation) (None, None, None, 2 0 batch normalization 1 82[0][0] block8 5 mixed (Concatenate) (None, None, None, 4 0 activation\_179[0][0] activation 182[0][0] (None, None, None, 2 933920 block8 5 conv (Conv2D) block8\_5\_mixed[0][0] block8 5 (Lambda) (None, None, None, 2 0 block8\_4\_ac[0][0] block8\_5\_conv[0][0] block8 5 ac (Activation) (None, None, None, 2 0 block8\_5[0][0] conv2d 184 (Conv2D) (None, None, None, 1 399360 block8\_5\_ac[0][0] batch\_normalization\_184 (BatchN (None, None, None, 1 576 conv2d 184[0][0] activation 184 (Activation) batch normalization 1 (None, None, None, 1 0 84[0][0] conv2d 185 (Conv2D) (None, None, None, 2 129024 activation\_184[0][0] batch normalization 185 (BatchN (None, None, None, 2 672 conv2d 185[0][0] activation 185 (Activation) (None, None, None, 2 0 batch\_normalization\_1 85[0][0] conv2d 183 (Conv2D) (None, None, None, 1 399360 block8\_5\_ac[0][0] conv2d 186 (Conv2D) (None, None, None, 2 172032 activation\_185[0][0] batch normalization 183 (BatchN (None, None, None, 1 576 conv2d 183[0][0] batch\_normalization\_186 (BatchN (None, None, None, 2 768 conv2d 186[0][0] activation 183 (Activation) (None, None, None, 1 0 batch normalization 1 83[0][0] activation 186 (Activation) (None, None, None, 2 0 batch normalization 1 86[0][0] block8\_6\_mixed (Concatenate) (None, None, None, 4 0 activation\_183[0][0] activation\_186[0][0] block8\_6\_conv (Conv2D) (None, None, None, 2 933920 block8\_6\_mixed[0][0] block8\_6 (Lambda) (None, None, None, 2 0 block8\_5\_ac[0][0] block8\_6\_conv[0][0] block8\_6\_ac (Activation) (None, None, None, 2 0 block8\_6[0][0] conv2d 188 (Conv2D) (None, None, None, 1 399360 block8\_6\_ac[0][0] batch normalization 188 (BatchN (None, None, None, 1 576 conv2d 188[0][0] activation 188 (Activation) (None, None, None, 1 0 batch normalization 1 [0][0]88 conv2d 189 (Conv2D) (None, None, None, 2 129024 activation\_188[0][0] batch\_normalization\_189 (BatchN (None, None, None, 2 672 conv2d\_189[0][0] activation 189 (Activation) (None, None, None, 2 0 batch normalization 1 89[0][0] conv2d 187 (Conv2D) (None, None, None, 1 399360 block8\_6\_ac[0][0] conv2d 190 (Conv2D) (None, None, None, 2 172032 activation\_189[0][0] batch\_normalization\_187 (BatchN (None, None, None, 1 576 conv2d 187[0][0] batch normalization 190 (BatchN (None, None, None, 2 768 conv2d 190[0][0] activation 187 (Activation) (None, None, None, 1 0 batch normalization 1 87[0][0] activation 190 (Activation) (None, None, None, 2 0 batch normalization 1 90[0][0] block8 7 mixed (Concatenate) (None, None, None, 4 0 activation\_187[0][0] activation\_190[0][0] block8\_7\_conv (Conv2D) (None, None, None, 2 933920 block8\_7\_mixed[0][0] block8 7 (Lambda) (None, None, None, 2 0 block8\_6\_ac[0][0] block8\_7\_conv[0][0] block8\_7\_ac (Activation) (None, None, None, 2 0 block8 7[0][0] conv2d 192 (Conv2D) (None, None, None, 1 399360 block8\_7\_ac[0][0] batch normalization 192 (BatchN (None, None, None, 1 576 conv2d\_192[0][0] activation 192 (Activation) (None, None, None, 1 0 batch normalization 1 92[0][0] conv2d 193 (Conv2D) (None, None, None, 2 129024 activation 192[0][0] batch normalization 193 (BatchN (None, None, None, 2 672 conv2d 193[0][0] activation 193 (Activation) (None, None, None, 2 0 batch\_normalization\_1 93[0][0] conv2d 191 (Conv2D) (None, None, None, 1 399360 block8\_7\_ac[0][0] conv2d 194 (Conv2D) (None, None, None, 2 172032 activation\_193[0][0] batch normalization 191 (BatchN (None, None, None, 1 576 conv2d 191[0][0] conv2d\_194[0][0] batch normalization 194 (BatchN (None, None, None, 2 768 activation 191 (Activation) (None, None, None, 1 0 batch normalization 1 91[0][0] activation 194 (Activation) (None, None, None, 2 0 batch normalization 1 94[0][0] block8 8 mixed (Concatenate) (None, None, None, 4 0 activation\_191[0][0] activation 194[0][0] (None, None, None, 2 933920 block8 8 conv (Conv2D) block8\_8\_mixed[0][0] (None, None, None, 2 0 block8 8 (Lambda) block8\_7\_ac[0][0] block8\_8\_conv[0][0] block8 8 ac (Activation) (None, None, None, 2 0 block8 8[0][0] conv2d 196 (Conv2D) (None, None, None, 1 399360 block8\_8\_ac[0][0] batch normalization 196 (BatchN (None, None, None, 1 576 conv2d 196[0][0] activation 196 (Activation) (None, None, None, 1 0 batch normalization 1 96[0][0] conv2d 197 (Conv2D) activation 196[0][0] (None, None, None, 2 129024 batch normalization 197 (BatchN (None, None, None, 2 672 conv2d\_197[0][0] activation 197 (Activation) batch normalization 1 (None, None, None, 2 0 97[0][0] conv2d 195 (Conv2D) (None, None, None, 1 399360 block8\_8\_ac[0][0] conv2d 198 (Conv2D) (None, None, None, 2 172032 activation 197[0][0] batch\_normalization\_195 (BatchN (None, None, None, 1 576 conv2d\_195[0][0] conv2d 198[0][0] batch\_normalization\_198 (BatchN (None, None, None, 2 768 activation\_195 (Activation) (None, None, None, 1 0 batch\_normalization\_1 95[0][0] activation 198 (Activation) batch normalization 1 (None, None, None, 2 0 98[0][0] block8\_9\_mixed (Concatenate) (None, None, None, 4 0 activation\_195[0][0] activation\_198[0][0] block8\_9\_conv (Conv2D) (None, None, None, 2 933920 block8\_9\_mixed[0][0] block8\_9 (Lambda) (None, None, None, 2 0 block8\_8\_ac[0][0] block8\_9\_conv[0][0] block8\_9\_ac (Activation) (None, None, None, 2 0 block8\_9[0][0] conv2d 200 (Conv2D) (None, None, None, 1 399360 block8\_9\_ac[0][0] batch\_normalization\_200 (BatchN (None, None, None, 1 576 conv2d 200[0][0] activation 200 (Activation) (None, None, None, 1 0 batch normalization 2 [0][0]00 conv2d 201 (Conv2D) (None, None, None, 2 129024 activation\_200[0][0] batch\_normalization\_201 (BatchN (None, None, None, 2 672 conv2d\_201[0][0] activation\_201 (Activation) (None, None, None, 2 0 batch\_normalization\_2 01[0][0] conv2d\_199 (Conv2D) (None, None, None, 1 399360 block8\_9\_ac[0][0] conv2d\_202 (Conv2D) (None, None, None, 2 172032 activation\_201[0][0] batch\_normalization\_199 (BatchN (None, None, None, 1 576 conv2d 199[0][0] batch\_normalization\_202 (BatchN (None, None, None, 2 768 conv2d\_202[0][0] activation 199 (Activation) (None, None, None, 1 0 batch normalization 1 99[0][0] activation\_202 (Activation) (None, None, None, 2 0 batch\_normalization\_2 02[0][0] block8\_10\_mixed (Concatenate) (None, None, None, 4 0 activation\_199[0][0] activation\_202[0][0] block8 10 conv (Conv2D) (None, None, None, 2 933920 block8 10 mixed[0][0] block8\_10 (Lambda) (None, None, None, 2 0 block8\_9\_ac[0][0] block8\_10\_conv[0][0] conv\_7b (Conv2D) (None, None, None, 1 3194880 block8 10[0][0] conv 7b bn (BatchNormalization) (None, None, None, 1 4608 conv\_7b[0][0] conv\_7b\_ac (Activation) (None, None, None, 1 0 conv\_7b\_bn[0][0] global max pooling2d (GlobalMax (None, 1536) 0 conv\_7b\_ac[0][0] dense (Dense) (None, 128) 196736 global\_max\_pooling2d [0][0] dense 1 (Dense) (None, 64) 8256 dense[0][0] dense 2 (Dense) (None, 32) 2080 dense 1[0][0] dropout (Dropout) dense\_2[0][0] (None, 32)  $\cap$ dense\_3 (Dense) 99 (None, 3) dropout[0][0] Total params: 54,543,907 Trainable params: 54,483,363 Non-trainable params: 60,544 #congelando os neuronios já treinados na ImageNet, queremos retreinar somente a ultima for l in model.layers: if 1.name.split('\_')[0] != 'dense': l.trainable=False else: l.trainable=True #iniciando objeto que apanhara todas as imagens de treino, processando as imagens com train data gen = tf.keras.preprocessing.image.ImageDataGenerator(preprocessing function #iniciando objeto que apanhara todas as imagens de teste, processando as imagens com o test data gen = tf.keras.preprocessing.image.ImageDataGenerator(preprocessing function #CARREGANDO PRÓPRIO DATASET PARA USO #definindo gerador de imagens de treino train\_generator = train\_data\_gen.flow\_from\_directory('shapes\_split/train', target\_size=(224, 224), # tamanho da batch size=batch, class mode='categorical', shuffle=True) #definindo gerador de imagens de teste test\_generator = test\_data\_gen.flow\_from\_directory('shapes\_split/test', target\_size=(224, 224), # tamanho da batch size=batch, class mode='categorical', shuffle=True) Found 240 images belonging to 3 classes. Found 60 images belonging to 3 classes. lr = tf.keras.optimizers.Adam(learning rate=0.001) #estabelecendo taxa de otimização model.compile(optimizer=lr, loss='categorical crossentropy', metrics=['accuracy']) #definicao dos steps step size train = train generator.n//train generator.batch size step size test = test generator.n//test generator.batch size #treinando e testando o modelo history = model.fit\_generator(generator=train\_generator, steps\_per\_epoch=step\_size\_train, epochs=epochs, validation data=test generator, validation\_steps=step\_size\_test) \python\keras\engine\training.py:1940: UserWarning: `Model.fit\_generator` is deprecate d and will be removed in a future version. Please use `Model.fit`, which supports gene warnings.warn('`Model.fit\_generator` is deprecated and ' Epoch 1/10 7/7 [============= ] - 43s 5s/step - loss: 1.8096 - accuracy: 0.4913 val loss: 0.1582 - val accuracy: 0.9688 Epoch 2/10 7/7 [==========] - 30s 4s/step - loss: 0.4413 - accuracy: 0.8016 val loss: 0.0601 - val accuracy: 1.0000 Epoch 3/10 val loss: 0.0250 - val accuracy: 1.0000 Epoch 4/10 7/7 [============= ] - 35s 5s/step - loss: 0.1570 - accuracy: 0.9296 val loss: 0.0244 - val accuracy: 0.9688 Epoch 5/10 7/7 [============ ] - 38s 5s/step - loss: 0.0660 - accuracy: 0.9752 val loss: 0.1089 - val accuracy: 0.9375 Epoch 6/10 7/7 [=========== ] - 31s 4s/step - loss: 0.0505 - accuracy: 0.9853 val loss: 0.0236 - val accuracy: 1.0000 Epoch 7/10 7/7 [=========== ] - 31s 5s/step - loss: 0.0497 - accuracy: 0.9831 val\_loss: 0.0300 - val\_accuracy: 0.9688 Epoch 8/10 7/7 [============ ] - 31s 4s/step - loss: 0.0543 - accuracy: 0.9675 val loss: 0.0578 - val accuracy: 0.9688 Epoch 9/10 7/7 [=========== ] - 31s 4s/step - loss: 0.0276 - accuracy: 0.9904 val loss: 6.5682e-04 - val accuracy: 1.0000 Epoch 10/10 7/7 [============ ] - 32s 5s/step - loss: 0.0245 - accuracy: 0.9918 val\_loss: 0.0028 - val\_accuracy: 1.0000 #Avaliando o modelo loss train, train acc = model.evaluate generator(train generator, steps=step size train loss test, test acc = model.evaluate generator(test generator, steps=step size test) print('Train: %.3f, Test: %.3f' % (train acc, test acc)) c:\users\vinicius\appdata\local\programs\python\python39\lib\site-packages\tensorflow \python\keras\engine\training.py:1973: UserWarning: `Model.evaluate generator` is depr ecated and will be removed in a future version. Please use `Model.evaluate`, which sup ports generators. warnings.warn('`Model.evaluate generator` is deprecated and ' Train: 1.000, Test: 1.000 #Apresentando resultados em graficos plt.title('Loss') plt.plot(history.history['loss'], label='train') plt.plot(history.history['val\_loss'], label='test') plt.legend() plt.show() Loss 1.2 train test 1.0 0.8 0.6 0.4 0.2 0.0 In [14]: # Criando graficos para visualização dos resultados plt.title('Accuracy') plt.plot(history.history['accuracy'], label='train') plt.plot(history.history['val accuracy'], label='test') plt.legend() plt.show() Accuracy 1.00 0.95 0.90 0.85 0.80 0.75 0.70 train 0.65 test print('Criando classificações..') labels = os.listdir('shapes split/test') print('Rótulos', labels) #criando estruturas para métricas de avaliação, processo um pouco mais demorado Y pred = model.predict generator(test generator) print('Preds Created') y pred = np.argmax(Y pred, axis=1) print('Preds 1D created') Criando classificações.. Rótulos ['circles', 'squares', 'triangles'] \python\keras\engine\training.py:2001: UserWarning: `Model.predict generator` is depre cated and will be removed in a future version. Please use `Model.predict`, which suppo rts generators. warnings.warn('`Model.predict\_generator` is deprecated and ' Preds Created Preds 1D created classification = classification report(test generator.classes, y pred, target names=1 print('----') print(classification) matrix = confusion\_matrix(test\_generator.classes, y\_pred) df cm = pd.DataFrame(matrix, index = [i for i in range(3)], columns = [i for i in range(3)]) plt.figure(figsize = (10,7))print('----') sn.heatmap(df cm, annot=True, linewidths=2.5) -----CLASSIFICATION----precision recall f1-score support 0.35 0.35 0.35 circles 0.30 0.30 0.30 20 squares 0.25 triangles 0.25 0.25 60 0.30 accuracy 0.30 0.30 0.30 60 macro avg 0.30 0.30 0.30 weighted avg -----MATRIX-----Out[16]: <AxesSubplot:> - 9.0 - 8.5 - 8.0 - 7.5 9 - 7.0 - 6.5 - 6.0 - 5.5