

```
1 from google.colab import drive
2 drive.mount("/content/drive")
```

Mounted at /content/drive

```
1 import numpy as np
2 import pandas as pd
3 import os
4 print(os.listdir("/content/drive/MyDrive/animated_faces/animeface-character-dataset/data/"))
```

```
['face_0_421_57.png', 'face_0_149_83.png', 'face_0_343_119.png', 'face_0_421_23.png', 'face_0_119_15.png', 'face_13_303_75.png', 'face_1
```

```
1 import numpy as np
2 import pandas as pd
3 import os
4 import time
5 import tensorflow as tf
6 import numpy as np
7 import glob
8 from glob import glob
9 import datetime
10 import random
11 from PIL import Image
12 import matplotlib.pyplot as plt
13 import seaborn as sns
14 %matplotlib inline
15 import keras
16 from keras.layers import Input, Dense, Reshape, Flatten, Dropout
17 from keras.layers import BatchNormalization, Activation, ZeroPadding2D
18 from keras.layers import LeakyReLU
19 from keras.layers import UpSampling2D, Conv2D, Conv2DTranspose
20 from keras.models import Sequential, Model
21 from keras.optimizers import Adam
22 import warnings
23 warnings.filterwarnings("ignore")
```

```
1 IMAGE_SIZE = 64
2 NOISE_SIZE = 100
3 LR_D = 0.00004
4 LR_G = 0.0004
5 BATCH_SIZE = 32
6 EPOCHS = 50
7 BETA1 = 0.5
8 WEIGHT_INIT_STDDEV = 0.02
9 EPSILON = 0.00005
10 SAMPLES_TO_SHOW = 8
```

```
1 def get_generator(z=(NOISE_SIZE,)):
2     # 4 x 4 x 512
3     input_layer = Input(z)
4     hid = Dense(4*4*512, activation='relu', name="Dense")(input_layer)
5     hid = LeakyReLU(alpha=0.2)(hid)
6     hid = Reshape((4, 4, 512))(hid)
7     hid = Conv2DTranspose(512, kernel_size=[5,5],
8                           strides=[2,2],
9                           padding="same",
10                          kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),name="trans_conv1")(hid)
11     hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_trans_conv1")(hid)
12     hid = LeakyReLU(alpha=0.2,name="trans_conv1_out")(hid)
13     hid = Conv2DTranspose(256, kernel_size=[5,5],
14                           strides=[2,2],
15                           padding="same",
16                          kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),name="trans_conv2")(hid)
17     hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_trans_conv2")(hid)
18     hid = LeakyReLU(alpha=0.2,name="trans_conv2_out")(hid)
19     hid = Conv2DTranspose(128, kernel_size=[5,5],
20                           strides=[2,2],
21                           padding="same",
22                          kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),name="trans_conv3")(hid)
23     hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_trans_conv3")(hid)
24     hid = LeakyReLU(alpha=0.2,name="trans_conv3_out")(hid)
25     hid = Conv2DTranspose(64, kernel_size=[5,5],
```

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26         strides=[2,2],
27         padding="same",
28         kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),name ="trans_conv4")(hid)
29     hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_trans_conv4")(hid)
30     hid = LeakyReLU(alpha=0.2,name ="trans_conv4_out")(hid)
31     hid = Conv2DTranspose(3, kernel_size=[5,5],
32         strides=[1,1],
33         padding="same",
34         kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),name ="logits")(hid)
35     out = Activation("tanh", name ="out")(hid)
36     model = Model(inputs=input_layer, outputs=out)
37     model.summary()
38     return model

```

```

1 def get_discriminator(input_shape=(IMAGE_SIZE, IMAGE_SIZE,3)):
2     input_layer = Input(input_shape)
3     hid = Conv2D(filters=32,
4         kernel_size=[5,5],
5         strides=[2,2],
6         padding="same",
7         kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),
8         name = "conv1")(input_layer)
9     hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_norm1")(hid)
10    hid = LeakyReLU(alpha=0.2, name="conv1_out")(hid)
11    hid = Conv2D(filters=64,
12        kernel_size=[5,5],
13        strides=[2,2],
14        padding="same",
15        kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),
16        name = "conv2")(hid)
17    hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_norm2")(hid)
18    hid = LeakyReLU(alpha=0.2, name="conv2_out")(hid)
19    hid = Conv2D(filters=128,
20        kernel_size=[5,5],
21        strides=[2,2],
22        padding="same",
23        kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),
24        name = "conv3")(hid)
25    hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_norm3")(hid)
26    hid = LeakyReLU(alpha=0.2, name="conv3_out")(hid)
27    hid = Conv2D(filters=256,
28        kernel_size=[5,5],
29        strides=[1,1],
30        padding="same",
31        kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),
32        name = "conv4")(hid)
33    hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_norm4")(hid)
34    hid = LeakyReLU(alpha=0.2, name="conv4_out")(hid)
35    hid = Conv2D(filters=512,
36        kernel_size=[5,5],
37        strides=[2,2],
38        padding="same",
39        kernel_initializer= keras.initializers.TruncatedNormal(stddev=WEIGHT_INIT_STDDEV),
40        name = "conv5")(hid)
41    hid = BatchNormalization(momentum=0.9, epsilon=EPSILON, name="batch_norm5")(hid)
42    hid = LeakyReLU(alpha=0.2, name="conv5_out")(hid)
43    hid = Flatten(name = "flatten")(hid)
44    out = Dense(1, activation='sigmoid', name = "logit")(hid)
45    model = Model(inputs= input_layer, outputs=out)
46    model.summary()
47    return model

```

```

1 discriminator = get_discriminator((IMAGE_SIZE, IMAGE_SIZE,3))
2 discriminator.compile(loss='binary_crossentropy',optimizer=Adam(lr=LR_D, beta_1=BETA1),metrics=[ 'accuracy' ])
3 discriminator.trainable = False
4 generator = get_generator((NOISE_SIZE,))
5 gan_input = Input(shape=(NOISE_SIZE,))
6 x = generator(gan_input)
7 gan_out = discriminator(x)
8 gan = Model(gan_input, gan_out)
9 gan.summary()
10 gan.compile(loss='binary_crossentropy',optimizer=Adam(lr=LR_G, beta_1=BETA1))
11

```

```

)

trans_conv2 (Conv2DTranspose) (None, 16, 16, 256) 3277056
se)

batch_trans_conv2 (BatchNormalization) (None, 16, 16, 256) 1024

trans_conv2_out (LeakyReLU) (None, 16, 16, 256) 0
)

trans_conv3 (Conv2DTranspose) (None, 32, 32, 128) 819328
se)

batch_trans_conv3 (BatchNormalization) (None, 32, 32, 128) 512

trans_conv3_out (LeakyReLU) (None, 32, 32, 128) 0
)

trans_conv4 (Conv2DTranspose) (None, 64, 64, 64) 204864
se)

batch_trans_conv4 (BatchNormalization) (None, 64, 64, 64) 256

trans_conv4_out (LeakyReLU) (None, 64, 64, 64) 0
)

logits (Conv2DTranspose) (None, 64, 64, 3) 4803

out (Activation) (None, 64, 64, 3) 0

```

```

=====
Total params: 11691395 (44.60 MB)
Trainable params: 11689475 (44.59 MB)
Non-trainable params: 1920 (7.50 KB)

```

```
Model: "model_2"
```

Layer (type)	Output Shape	Param #
input_3 (InputLayer)	[(None, 100)]	0
model_1 (Functional)	(None, 64, 64, 3)	11691395
model (Functional)	(None, 1)	4367553

```

=====
Total params: 16058948 (61.26 MB)
Trainable params: 11689475 (44.59 MB)
Non-trainable params: 4369473 (16.67 MB)

```

```
WARNING:absl:lr is deprecated in Keras optimizer, please use learning_rate or use the legacy optimizer, e.g.,tf.keras.optimizers
```

```

1 def show_samples(sample_images, name, epoch):
2     figure, axes = plt.subplots(1, len(sample_images), figsize = (IMAGE_SIZE, IMAGE_SIZE))
3     for index, axis in enumerate(axes):
4         axis.axis('off')
5         image_array = sample_images[index]
6         axis.imshow(image_array)
7         image = Image.fromarray(image_array)
8     plt.show()
9     plt.close()
10 def test(input_z, epoch):
11     samples = generator.predict(input_z[:SAMPLES_TO_SHOW])
12     sample_images = [((sample + 1.0) * 127.5).astype(np.uint8) for sample in samples]
13     show_samples(sample_images, OUTPUT_DIR + "samples", epoch)
14 def summarize_epoch(d_losses, g_losses, data_shape, epoch, duration, input_z):
15     minibatch_size = int(data_shape[0]//BATCH_SIZE)
16     print("Epoch {}/{}".format(epoch, EPOCHS),
17           "\nDuration: {:.5f}".format(duration),
18           "\nD Loss: {:.5f}".format(np.mean(d_losses[-minibatch_size:])),
19           "\nG Loss: {:.5f}".format(np.mean(g_losses[-minibatch_size:])))
20     fig, ax = plt.subplots()
21     plt.plot(d_losses, label='Discriminator', alpha=0.6)
22     plt.plot(g_losses, label='Generator', alpha=0.6)
23     plt.title("Losses")
24     plt.legend()
25     plt.savefig(OUTPUT_DIR + "losses_" + str(epoch) + ".png")

```

```

26 plt.show()
27 plt.close()
28 test(input_z, epoch)
29 def get_batches(data):
30     batches = []
31     for i in range(int(data.shape[0]/BATCH_SIZE)):
32         batch = data[i * BATCH_SIZE:(i + 1) * BATCH_SIZE]
33         augmented_images = []
34         for img in batch:
35             image = Image.fromarray(img)
36             if random.choice([True, False]):
37                 image = image.transpose(Image.FLIP_LEFT_RIGHT)
38             augmented_images.append(np.asarray(image))
39         batch = np.asarray(augmented_images)
40         normalized_batch = (batch / 127.5) - 1.0
41         batches.append(normalized_batch)
42     return np.array(batches)

1 INPUT_DATA_DIR = "/content/drive/MyDrive/animated_faces/animeface-character-dataset/data/"
2 OUTPUT_DIR = ""

```

```

1 from PIL import Image
2 import re
3 exclude_img = []
4 exclude_img = [s + ".png" for s in exclude_img]
5 print("Image Samples")
6 input_images = np.asarray([np.asarray(Image.open(file).resize((IMAGE_SIZE, IMAGE_SIZE))) for file in glob(INPUT_DATA_DIR + '*') if file not in exclude_img])
7 print("Input: " + str(input_images.shape))
8 np.random.shuffle(input_images)
9 sample_images = random.sample(list(input_images), SAMPLES_TO_SHOW)
10 show_samples(sample_images, OUTPUT_DIR + "inputs", 0)

```

Image Samples
Input: (60, 64, 64, 3)



```

1 print("Training Starts!")
2 warnings.filterwarnings("ignore")
3 d_losses = []
4 g_losses = []
5 cum_d_loss = 0
6 cum_g_loss = 0
7 for epoch in range(EPOCHS):
8     epoch += 1
9     start_time = time.time()
10    for batch_images in get_batches(input_images):
11        noise_data = np.random.normal(0, 1, size=(BATCH_SIZE, NOISE_SIZE))
12        generated_images = generator.predict(noise_data)
13        noise_prop = 0.05
14        real_labels = np.zeros((BATCH_SIZE, 1)) + np.random.uniform(low=0.0, high=0.1, size=(BATCH_SIZE, 1))
15        flipped_idx = np.random.choice(np.arange(len(real_labels)), size=int(noise_prop*len(real_labels)))
16        real_labels[flipped_idx] = 1 - real_labels[flipped_idx]
17        d_loss_real = discriminator.train_on_batch(batch_images, real_labels)
18        fake_labels = np.ones((BATCH_SIZE, 1)) - np.random.uniform(low=0.0, high=0.1, size=(BATCH_SIZE, 1))
19        flipped_idx = np.random.choice(np.arange(len(fake_labels)), size=int(noise_prop*len(fake_labels)))
20        fake_labels[flipped_idx] = 1 - fake_labels[flipped_idx]
21        d_loss_fake = discriminator.train_on_batch(generated_images, fake_labels)
22        d_loss = 0.5 * np.add(d_loss_real, d_loss_fake)
23        cum_d_loss += d_loss
24        d_losses.append(d_loss[0])
25        noise_data = np.random.normal(0, 1, size=(BATCH_SIZE, NOISE_SIZE))
26        g_loss = gan.train_on_batch(noise_data, np.zeros((BATCH_SIZE, 1)))
27        cum_g_loss += g_loss
28        g_losses.append(g_loss)
29    if epoch > 0 and epoch % 20 == 0 :
30        print("saving model")
31        discriminator.save_weights("desc-simposon-model.h5-" + str(epoch))
32        gan.save_weights("gan-simposon-model.h5-" + str(epoch))
33    summarize_epoch(d_losses, g_losses, input_images.shape, epoch, time.time()-start_time, noise_data)

```

