

Import

```

1
2
3 import os
4 import sys
5 from tempfile import NamedTemporaryFile
6 from urllib.request import urlopen
7 from urllib.parse import unquote, urlparse
8 from urllib.error import HTTPError
9 from zipfile import ZipFile
10 import tarfile
11 import shutil
12
13 CHUNK_SIZE = 40960
14 DATA_SOURCE_MAPPING = 'horse2zebra-dataset:https%3A%2F%2Fstorage.googleapis.com%2Fkaggle-data-sets%2F926321%2F1567596%2Ft
15
16 KAGGLE_INPUT_PATH='/kaggle/input'
17 KAGGLE_WORKING_PATH='/kaggle/working'
18 KAGGLE_SYMLINK='kaggle'
19
20 !umount /kaggle/input/ 2> /dev/null
21 shutil.rmtree('/kaggle/input', ignore_errors=True)
22 os.makedirs(KAGGLE_INPUT_PATH, 0o777, exist_ok=True)
23 os.makedirs(KAGGLE_WORKING_PATH, 0o777, exist_ok=True)
24
25 try:
26     os.symlink(KAGGLE_INPUT_PATH, os.path.join(".", 'input'), target_is_directory=True)
27 except FileExistsError:
28     pass
29 try:
30     os.symlink(KAGGLE_WORKING_PATH, os.path.join(".", 'working'), target_is_directory=True)
31 except FileExistsError:
32     pass
33
34 for data_source_mapping in DATA_SOURCE_MAPPING.split(','):
35     directory, download_url_encoded = data_source_mapping.split(':')
36     download_url = unquote(download_url_encoded)
37     filename = urlparse(download_url).path
38     destination_path = os.path.join(KAGGLE_INPUT_PATH, directory)
39     try:
40         with urlopen(download_url) as fileres, NamedTemporaryFile() as tfile:
41             total_length = fileres.headers['content-length']
42             print(f'Downloading {directory}, {total_length} bytes compressed')
43             dl = 0
44             data = fileres.read(CHUNK_SIZE)
45             while len(data) > 0:
46                 dl += len(data)
47                 tfile.write(data)
48                 done = int(50 * dl / int(total_length))
49                 sys.stdout.write(f"\r[{'=' * done}{' ' * (50-done)}] {dl} bytes downloaded")
50                 sys.stdout.flush()
51                 data = fileres.read(CHUNK_SIZE)
52             if filename.endswith('.zip'):
53                 with ZipFile(tfile) as zfile:
54                     zfile.extractall(destination_path)
55             else:
56                 with tarfile.open(tfile.name) as tarfile:
57                     tarfile.extractall(destination_path)
58             print(f'\nDownloaded and uncompressed: {directory}')
59     except HTTPError as e:
60         print(f'Failed to load (likely expired) {download_url} to path {destination_path}')
61         continue
62     except OSError as e:
63         print(f'Failed to load {download_url} to path {destination_path}')
64         continue
65
66 print('Data source import complete.')
67

```

```

Downloading horse2zebra-dataset, 116809009 bytes compressed
[=====] 116809009 bytes downloaded
Downloaded and uncompressed: horse2zebra-dataset
Downloading imagetoimage-translation-cyclegan, 523920850 bytes compressed
[=====] 523920850 bytes downloaded
Downloaded and uncompressed: imagetoimage-translation-cyclegan
Data source import complete.

```

Double-click (or enter) to edit

```

1 from IPython.display import clear_output as clear
2 !pip install tensorflow-addons
3 clear()

1 # Common
2 import os
3 import keras
4 import numpy as np
5 from glob import glob
6 from tqdm import tqdm
7 import tensorflow as tf
8 from random import random
9
10 # Data
11 import tensorflow.image as tfi
12 import matplotlib.pyplot as plt
13 from keras.preprocessing.image import load_img
14 from keras.preprocessing.image import img_to_array
15
16 # Model Layers
17 from keras.layers import ReLU
18 from keras.layers import Input
19 from keras.layers import Conv2D
20 from keras.layers import Dropout
21 from keras.layers import LeakyReLU
22 from keras.layers import Activation
23 from keras.layers import concatenate
24 from keras.layers import ZeroPadding2D
25 from keras.layers import Conv2DTranspose
26 from tensorflow_addons.layers import InstanceNormalization
27
28 # Model Functions
29 from keras.models import Model
30 from keras.models import load_model
31 from keras.models import Sequential
32 from keras.initializers import RandomNormal
33
34 # Optimizers
35 from tensorflow.keras.optimizers import Adam
36
37 # Loss
38 from keras.losses import BinaryCrossentropy
39
40 # Model Viz
41 from tensorflow.keras.utils import plot_model

/usr/local/lib/python3.10/dist-packages/tensorflow_addons/utils/tfa_eol_msg.py:23: UserWarning:

TensorFlow Addons (TFA) has ended development and introduction of new features.
TFA has entered a minimal maintenance and release mode until a planned end of life in May 2024.
Please modify downstream libraries to take dependencies from other repositories in our TensorFlow community (e.g. Keras,

For more information see: https://github.com/tensorflow/addons/issues/2807

warnings.warn(

```

Custom Functions

```

1 def show_image(image, title=None):
2     '''
3     The function takes in an image and plots it using Matplotlib.
4     '''
5     plt.imshow(image)
6     plt.title(title)
7     plt.axis('off')

```

Data

```

1 root_horse_path = '../input/horse2zebra-dataset/trainA'
2 root_zebra_path = '../input/horse2zebra-dataset/trainB'
3 horse_paths = sorted(glob(root_horse_path + '/*.jpg'))[:1000]
4 zebra_paths = sorted(glob(root_zebra_path + '/*.jpg'))[:1000]

```

```

1 SIZE = 256
2 horse_images, zebra_images = np.zeros(shape=(len(horse_paths),SIZE,SIZE,3)), np.zeros(shape=(len(horse_paths),SIZE,SIZE,3))
3 for i,(horse_path, zebra_path) in tqdm(enumerate(zip(horse_paths, zebra_paths)), desc='Loading'):
4
5     horse_image = img_to_array(load_img(horse_path))
6     horse_image = tfi.resize(tf.cast(horse_image, tf.float32)/255., (SIZE, SIZE))
7
8     zebra_image = img_to_array(load_img(zebra_path))
9     zebra_image = tfi.resize(tf.cast(zebra_image,tf.float32)/255., (SIZE, SIZE))
10
11     # as the data is unpaired so we don't have to worry about, positioning the images.
12
13     horse_images[i] = horse_image
14     zebra_images[i] = zebra_image

```

Loading: 1000it [00:10, 98.83it/s]

```

1 dataset = [horse_images, zebra_images]

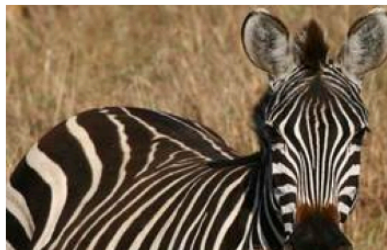
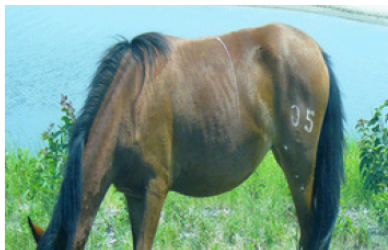
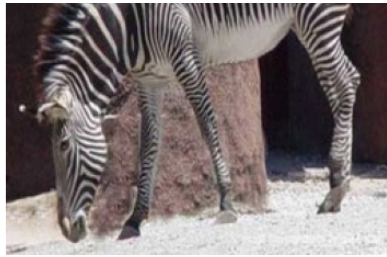
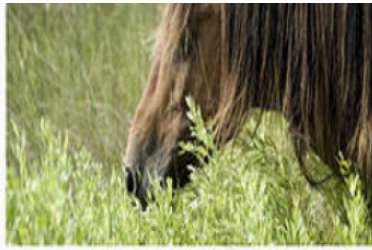
```

▼ Data Viz

```

1 # Visualizing
2 for i in range(10):
3     id = np.random.randint(len(horse_images))
4     horse, zebra = horse_images[id], zebra_images[id]
5
6     plt.figure(figsize=(10,8))
7
8     plt.subplot(1,2,1)
9     show_image(horse)
10
11     plt.subplot(1,2,2)
12     show_image(zebra)
13     plt.show()

```



✓ Generator

```

1 def ResidualBlock(filters, layer, index):
2     # init = RandomNormal(stddev=0.02)
3
4     x = Conv2D(filters, kernel_size=3, strides=1, padding='same', kernel_initializer='he_normal', use_bias=False, name="E
5     x = InstanceNormalization(axis=-1, name="Block_{}_Normalization1".format(index))(x)
6     x = ReLU(name="Block_{}_ReLU".format(index))(x)
7
8     x = Conv2D(filters, kernel_size=3, strides=1, padding='same', kernel_initializer='he_normal', use_bias=False, name="E
9     x = InstanceNormalization(axis=-1, name="Block_{}_Normalization2".format(index))(x)
10
11     x = concatenate([x, layer], name="Block_{}_Merge".format(index))
12
13     return x

```

Let's create the **main model architecture**.

```

1 def downsample(filters, layer, size=3, strides=2, activation=None, index=None, norm=True):
2     x = Conv2D(filters, kernel_size=size, strides=strides, padding='same', kernel_initializer='he_normal', use_bias=False
3     if norm:
4         x = InstanceNormalization(axis=-1, name="Encoder_{}_Normalization".format(index))(x)
5     if activation is not None:
6         x = Activation(activation, name="Encoder_{}_Activation".format(index))(x)
7     else:
8         x = LeakyReLU( name="Encoder_{}_LeakyReLU".format(index))(x)
9     return x

```

The **downsample layer**, will simply **decrease the size of the input image by 2**.

```

1 def upsample(filters, layer, size=3, strides=2, index=None):
2     x = Conv2DTranspose(filters, kernel_size=size, strides=strides, padding='same', kernel_initializer='he_normal', use_t
3     x = InstanceNormalization(axis=-1, name="Decoder_{}_Normalization".format(index))(x)
4     x = ReLU( name="Encoder_{}_ReLU".format(index))(x)
5     return x

```

Upsample will perform the **exact opposite** and will **increase the image size by 2**.

```

1 def Generator(n_resnet=9, name="Generator"):
2
3     inp_image = Input(shape=(SIZE, SIZE, 3), name="InputImage")          # 256 x 256 x3
4
5     x = downsample(64, inp_image, size=7, strides=1, index=1)             # 256 x 256 x 64
6     x = downsample(128, x, index=2)                                       # 128 x 128 x 128
7     x = downsample(256, x, index=3)                                       # 64 x 64 x 256
8
9     for i in range(n_resnet):
10         x = ResidualBlock(256, x, index=i+4)                             # (64 x 64 x 256) x n_resnet
11
12     x = upsample(128, x, index=13)                                         # 128 x 128 x 128
13     x = upsample(64, x, index=14)                                         # 256 x 256 x 64
14     x = downsample(3, x, size=7, strides=1, activation='tanh', index=15) # 256 x 256 x 3
15
16     model = Model(
17         inputs=inp_image,
18         outputs=x,
19         name=name
20     )
21     return model

```

✓ Discriminator

```

1 def Discriminator(name='Discriminator'):
2     init = RandomNormal(stddev=0.02)
3     src_img = Input(shape=(SIZE, SIZE, 3), name="InputImage")          # 256 x 256 x 3
4     x = downsample(64, src_img, size=4, strides=2, index=1, norm=False) # 128 x 128 x 64
5     x = downsample(128, x, size=4, strides=2, index=2)                  # 64 x 64 x 128
6     x = downsample(256, x, size=4, strides=2, index=3)                  # 32 x 32 x 256
7     x = downsample(512, x, size=4, strides=2, index=4)                  # 16 x 16 x 512
8     x = downsample(512, x, size=4, strides=2, index=5)                  # 8 x 8 x 512 # we can try out a different architecture
9     patch_out = Conv2D(1, kernel_size=4, padding='same', kernel_initializer=init, use_bias=False)(x) # 8 x 8 x 1
10
11     model = Model(
12         inputs=src_img,
13         outputs=patch_out,
14         name=name
15     )
16     model.compile(
17         loss='mse',
18         optimizer=Adam(learning_rate=2e-4, beta_1=0.5),
19         loss_weights=[0.5]
20     )
21     return model

```

✓ Training Functions

```
1 def CombineModel(g_model1, g_model2, d_model, name):
2     # train the Generator
3     g_model1.trainable = True
4
5     # Stop the Discriminator and 2nd Generator
6     d_model.trainable = False
7     g_model2.trainable = False
8
9     # Adversarial Loss
10    input_gen = Input(shape=(SIZE, SIZE, 3))
11    gen_1_out = g_model1(input_gen)
12    dis_out = d_model(gen_1_out)
13
14    # Identity Loss
15    input_id = Input(shape=(SIZE, SIZE, 3))
16    output_id = g_model1(input_id)
17
18    # Cycle Loss - Forward
19    output_f = g_model2(gen_1_out)
20
21    # Cycle Loss - Backward
22    gen_2_out = g_model2(input_id)
23    output_b = g_model1(gen_2_out)
24
25    # Final Model
26    model = Model(
27        inputs=[input_gen, input_id],
28        outputs=[dis_out, output_id, output_f, output_b],
29        name=name
30    )
31    model.compile(
32        loss=['mse', 'mae', 'mae', 'mae'],
33        loss_weights=[1,5,10,10],
34        optimizer= Adam(learning_rate=2e-4, beta_1=0.5)
35    )
36    return model
```

```
1 def generate_real_samples(n_samples, dataset):
2     ix = np.random.randint(0,dataset.shape[0], n_samples)
3     X = dataset[ix]
4     y = np.ones(shape=(n_samples, 8, 8, 1))
5     return X, y
```

```
1 def generate_fake_samples(g_model, dataset):
2     X = g_model.predict(dataset)
3     y = np.zeros(shape=(len(dataset), 8, 8, 1))
4     return X, y
```

```
1 def update_image_pool(pool, images, max_size=50):
2     selected = list()
3     for image in images:
4         if len(pool) < max_size:
5             pool.append(image)
6             selected.append(image)
7         elif random() < 0.5:
8             selected.append(image)
9         else:
10            ix = np.random.randint(0,len(pool))
11            selected.append(pool[ix])
12            pool[ix] = image
13    return np.asarray(selected)
```