

assignment10-228-1

May 3, 2024

22b2224 Assignment 10

```
[ ]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import cv2
```

```
[ ]: import tensorflow as tf
from tensorflow import keras
from tensorflow.keras import backend as K
from tensorflow.keras import layers
import tensorflow_datasets as tfds
from keras.models import Sequential, Model
from keras.layers import
    ↳Dense, Flatten, Reshape, Dropout, LeakyReLU, Conv2DTranspose, Conv2D
from keras.optimizers import Adam, SGD
from keras.layers import LeakyReLU, BatchNormalization, Input
from skimage.metrics import structural_similarity as ssim
```

```
[ ]: from keras.datasets import mnist
(train_images, y_train), (_, _) = mnist.load_data()
    ↳ # loading mnist data
print(len(train_images))
train_images=train_images[(y_train==0) | (y_train==1) | (y_train==5) |
    ↳(y_train==7)] # taking images with labels 1,2,3,4 for demonstration
    ↳purposes only
train_images=train_images[:5000]
    ↳ # taking only 5000 images
```

Downloading data from <https://storage.googleapis.com/tensorflow/tf-keras-datasets/mnist.npz>
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[ ]: len(train_images)
```

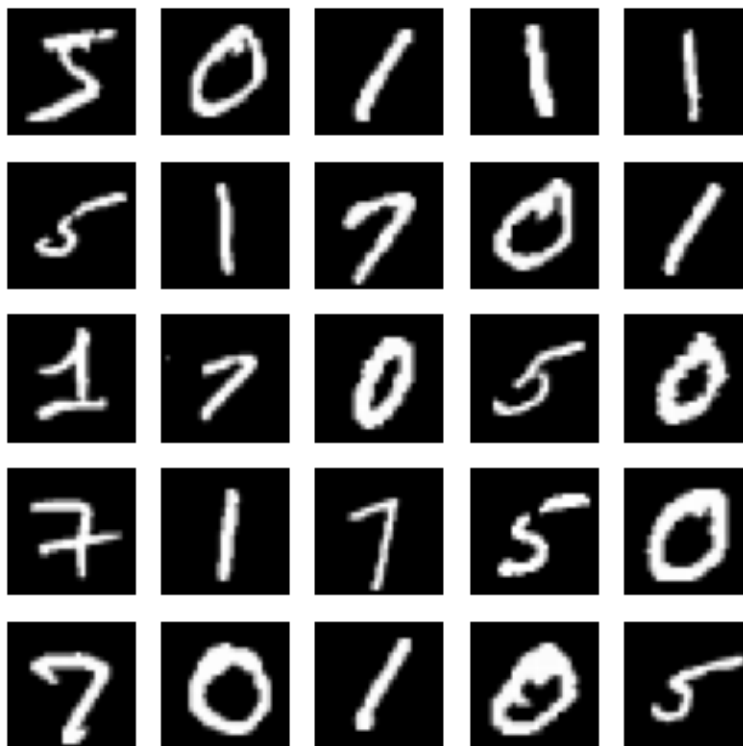
```
[ ]: 5000
```

```
[ ]: def plot_images(images):
    fig, axes = plt.subplots(5, 5, figsize=(5, 5))

    for i, ax in enumerate(axes.flat):
        ax.imshow(images[i], cmap='gray')
        ax.axis('off')

    plt.show()
```

```
[ ]: plot_images(train_images)
```



```
[ ]: train_images=train_images.astype("float32")/127.5-1 #_
      ↪normalising so that values are between -1 & +1
train_images=train_images.reshape(train_images.shape[0],28,28,1) #_
      ↪now train_images has shape [5000,28,28,1]
```

```
[ ]: def build_generator(latent_dim,input_shape):
    generator=Sequential([

        Dense(7*7*128 , input_dim=latent_dim),
        LeakyReLU(alpha=.2),
        Reshape((7, 7, 128)),
```

```

        BatchNormalization(),

        Conv2DTranspose(64 , (4,4) , padding="same" , strides=(2,2)),
        LeakyReLU(alpha=.2),
        BatchNormalization(),

        Conv2DTranspose(32 , (4,4) , padding="same" , strides=(2,2)),
        LeakyReLU(alpha=.2),
        BatchNormalization(),

        Conv2DTranspose(1 , (4,4) , padding="same" , activation="tanh"),

    ])

    return generator

```

```

[ ]: def build_discriminator(input_shape):
    discriminator=Sequential([

        Conv2D(64 , (3,3) , strides=(2,2) , padding="same" ,
↪input_shape=input_shape),
        LeakyReLU(alpha=.2),
        Dropout(rate=.4),

        Conv2D(64 , (3,3) , strides=(2,2) , padding="same" ,
↪input_shape=input_shape),
        LeakyReLU(alpha=.2),
        Dropout(rate=.4),

        Flatten(),

        Dense(1 , activation="sigmoid" )

    ])
    return discriminator

```

```

[ ]: def build_gan(generator, discriminator):
    discriminator.trainable = False # Freeze discriminator during GAN training

    gan_input = Input(shape=(latent_dim,))
    x = generator(gan_input)
    gan_output = discriminator(x)

    gan = Model(gan_input, gan_output)
    return gan

```

```
[ ]: latent_dim=100
      image_shape=(28,28,1)
```

```
[ ]: generator = build_generator(latent_dim, image_shape)
      generator.compile(loss='binary_crossentropy', optimizer=Adam(0.0002, 0.5))

      discriminator = build_discriminator(image_shape)
      discriminator.compile(loss='binary_crossentropy', optimizer=Adam(0.0002, 0.5),
        metrics=['accuracy'])

      gan = build_gan(generator, discriminator)
      gan.compile(loss='binary_crossentropy', optimizer=Adam(0.0002, 0.5))
```

```
[ ]: epochs = 400
      batch_size = 256
```

```
[ ]: def generate_real_samples(dataset, n_samples):
      idx = np.random.randint(0, train_images.shape[0], n_samples)
      X = train_images[idx]
      y = np.ones((n_samples, 1))
      return X, y

      # Generate fake samples using the generator
      def generate_fake_samples(generator, latent_dim, n_samples):
          noise = np.random.normal(0, 1, size=(n_samples, latent_dim))
          X = generator.predict(noise)
          y = np.zeros((n_samples, 1))
          return X, y

      # Generate points in latent space as input for the generator
      def generate_latent_points(latent_dim, n_samples):
          noise = np.random.normal(0, 1, size=(n_samples, latent_dim))
          return noise
```

```
[ ]: discriminator_loss=[]
      gan_loss=[]
      generated_list=[]
```

```
[ ]: def train(g_model, d_model, gan_model, dataset, latent_dim, n_epochs, n_batch):
      bat_per_epo = int(dataset.shape[0] / n_batch)
      half_batch = int(n_batch / 2)
      discriminator_loss=[]
      gan_loss=[]
      generated_list=[]
      # Manually enumerate epochs
      for i in range(n_epochs):
          # Enumerate batches over the training set
```

```

for j in range(bat_per_epo):
    batch_loss_d=[]
    batch_loss_g=[]
    # Get randomly selected 'real' samples
    X_real, y_real = generate_real_samples(dataset, half_batch)

    # Generate 'fake' examples
    X_fake, y_fake = generate_fake_samples(g_model, latent_dim,
↳half_batch)

    # Create training set for the discriminator
    X, y = np.vstack((X_real, X_fake)), np.vstack((y_real, y_fake))

    # Update discriminator model weights
    d_loss, _ = d_model.train_on_batch(X, y)
    batch_loss_d.append(d_loss)
    # Prepare points in latent space as input for the generator
    X_gan = generate_latent_points(latent_dim, n_batch)

    # Create inverted labels for the fake samples
    y_gan = np.ones((n_batch, 1))

    # Update the generator via the discriminator's error
    g_loss = gan_model.train_on_batch(X_gan, y_gan)
    batch_loss_g.append(g_loss)
    gan_loss=np.mean(batch_loss_g)
    gan_loss.append(gan_loss)
    dis_loss=np.mean(batch_loss_d)
    discriminator_loss.append(dis_loss)

    # Summarize loss on this batch

    if (i + 1) % 10 == 0:
        print(f'Epoch {i + 1}/{n_epochs}, Batch {j + 1}/{bat_per_epo},
↳D Loss: {d_loss:.3f}, G Loss: {g_loss:.3f}')
    if (i + 1) % 10 == 0:
        num_samples=5
        noise = generate_latent_points(latent_dim, num_samples)
        generated_images = generator.predict(noise)
        generated_list.append(generated_images)

return discriminator_loss, gan_loss, generated_list

```

```

[ ]: discriminator_loss, gan_loss, generated_list=train(generator, discriminator,
↳gan, train_images, latent_dim, n_epochs=epochs, n_batch=batch_size)

```

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4/4	[=====]	- 0s 6ms/step
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4/4	[=====]	- 0s 8ms/step
4/4	[=====]	- 0s 14ms/step
4/4	[=====]	- 0s 9ms/step
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4/4	[=====]	- 0s 9ms/step
4/4	[=====]	- 0s 11ms/step
4/4	[=====]	- 0s 10ms/step
4/4	[=====]	- 0s 11ms/step
4/4	[=====]	- 0s 9ms/step
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Epoch 230/400, Batch 19/19, D Loss: 0.692, G Loss: 0.701
1/1 [=====] - 0s 20ms/step
4/4 [=====] - 0s 3ms/step
4/4 [=====] - 0s 11ms/step
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Epoch 260/400, Batch 19/19, D Loss: 0.695, G Loss: 0.703
1/1 [=====] - 0s 17ms/step
4/4 [=====] - 0s 4ms/step
4/4 [=====] - 0s 4ms/step
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Epoch 280/400, Batch 19/19, D Loss: 0.682, G Loss: 0.662
1/1 [=====] - 0s 18ms/step
4/4 [=====] - 0s 3ms/step
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Epoch 290/400, Batch 19/19, D Loss: 0.692, G Loss: 0.728
1/1 [=====] - 0s 37ms/step
4/4 [=====] - 0s 4ms/step
4/4 [=====] - 0s 5ms/step
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Epoch 300/400, Batch 19/19, D Loss: 0.689, G Loss: 0.678
1/1 [=====] - 0s 18ms/step
4/4 [=====] - 0s 3ms/step
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Epoch 330/400, Batch 19/19, D Loss: 0.688, G Loss: 0.715
1/1 [=====] - 0s 17ms/step
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Epoch 360/400, Batch 19/19, D Loss: 0.684, G Loss: 0.701
1/1 [=====] - 0s 18ms/step
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Epoch 380/400, Batch 19/19, D Loss: 0.674, G Loss: 0.681
1/1 [=====] - 0s 17ms/step
4/4 [=====] - 0s 3ms/step
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[illegible]

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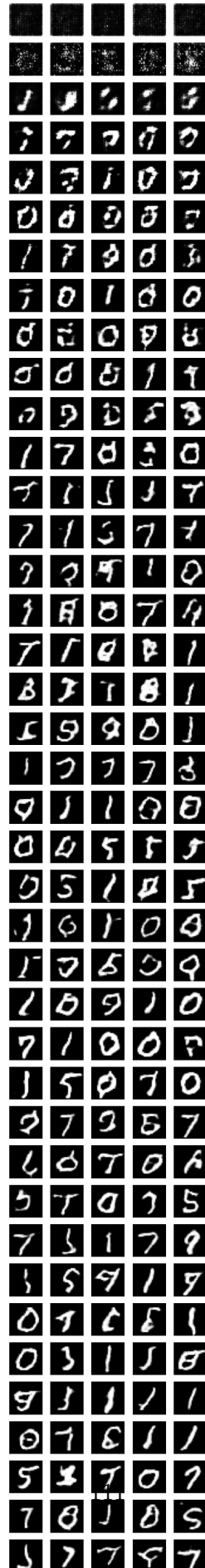
[illegible]

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```
4/4 [=====] - 0s 3ms/step
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4/4 [=====] - 0s 4ms/step
Epoch 400/400, Batch 19/19, D Loss: 0.684, G Loss: 0.721
1/1 [=====] - 0s 21ms/step
```

Question 1)

```
[ ]: fig, axes = plt.subplots(len(generated_list), 5, figsize=(5, len(generated_list)))
    for i in range(len(generated_list)):
        image_list=generated_list[i]
        for j in range(5):
            axes[i,j].imshow(image_list[j],cmap="gray")
            axes[i, j].axis('off')
    #plt.tight_layout()
    plt.show()
```



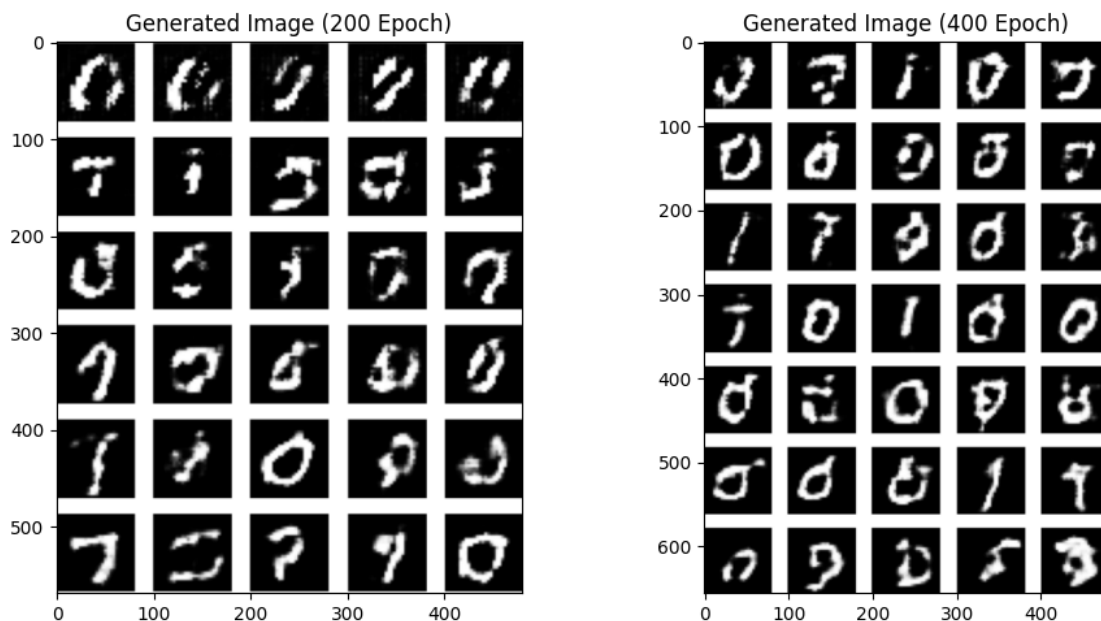
```
[ ]: # Load the images
image_200_epoch = cv2.imread('generated200epoch.png')
image_400_epoch = cv2.imread('generated400epoch.png')

# Plotting side by side
plt.figure(figsize=(10, 5))

# Plotting 200 epoch image
plt.subplot(1, 2, 1)
plt.imshow(cv2.cvtColor(image_200_epoch, cv2.COLOR_BGR2RGB)) # Convert BGR to RGB
plt.title('Generated Image (200 Epoch)')

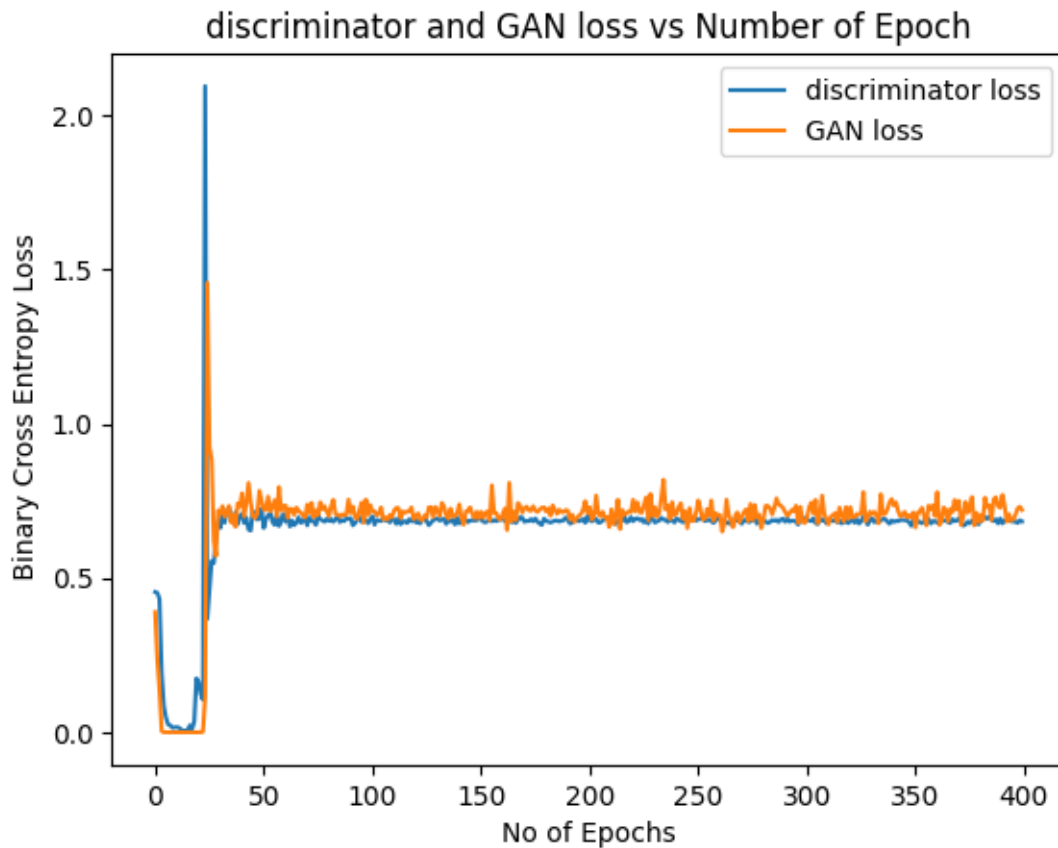
# Plotting 400 epoch image
plt.subplot(1, 2, 2)
plt.imshow(cv2.cvtColor(image_400_epoch, cv2.COLOR_BGR2RGB)) # Convert BGR to RGB
plt.title('Generated Image (400 Epoch)')

plt.tight_layout()
plt.show()
```



The generated images at 400 epochs exhibit sharper details and clearer contours compared to those generated at 200 epochs, indicating improved image quality with prolonged training.


```
[ ]: plt.plot(discriminator_loss,label="discriminator loss")
plt.plot(gan_loss,label="GAN loss")
plt.legend()
plt.title("discriminator and GAN loss vs Number of Epoch")
plt.xlabel("No of Epochs")
plt.ylabel(" Binary Cross Entropy Loss")
plt.show()
```



Question 2)

```
[ ]: from skimage.metrics import structural_similarity as ssim
# Library: scikit-image (skimage)
# Algorithm used is Structural Similarity Index (SSIM)

# Load original image of digit '7'
original_image = cv2.imread('Original.png', cv2.IMREAD_GRAYSCALE)

# Load generated images of digit '7' for default epochs and double epochs
generated_image_default_epochs = cv2.imread('Epoch200.png', cv2.
↳IMREAD_GRAYSCALE)
```

```

generated_image_double_epochs = cv2.imread('Epoch400.png', cv2.IMREAD_GRAYSCALE)

# Resize original image to match the dimensions of the generated images
original_image_resized = cv2.resize(original_image,
    ↳(generated_image_default_epochs.shape[1], generated_image_default_epochs.
    ↳shape[0]), interpolation=cv2.INTER_AREA)

# Resize generated images to match the dimensions of the original image
generated_image_default_epochs_resized = cv2.
    ↳resize(generated_image_default_epochs, (original_image_resized.shape[1],
    ↳original_image_resized.shape[0]), interpolation=cv2.INTER_AREA)
generated_image_double_epochs_resized = cv2.
    ↳resize(generated_image_double_epochs, (original_image_resized.shape[1],
    ↳original_image_resized.shape[0]), interpolation=cv2.INTER_AREA)

# Compute SSIM score for each comparison
ssim_score_default_epochs = ssim(original_image_resized,
    ↳generated_image_default_epochs_resized)
ssim_score_double_epochs = ssim(original_image_resized,
    ↳generated_image_double_epochs_resized)

# Plot the original image and generated images
plt.figure(figsize=(12, 6))

plt.subplot(1, 3, 1)
plt.imshow(original_image_resized, cmap='gray')
plt.title('Original Image')

plt.subplot(1, 3, 2)
plt.imshow(generated_image_default_epochs_resized, cmap='gray')
plt.title('Generated Image (Default Epochs)\nSSIM Score: {:.4f}'.
    ↳format(ssim_score_default_epochs))

plt.subplot(1, 3, 3)
plt.imshow(generated_image_double_epochs_resized, cmap='gray')
plt.title('Generated Image (Double Epochs)\nSSIM Score: {:.4f}'.
    ↳format(ssim_score_double_epochs))

plt.tight_layout()
plt.show()

```

