

Task II: Quantum Generative Adversarial Network (QGAN) Part

You will explore how best to apply a quantum generative adversarial network (QGAN) to solve a High Energy Data analysis issue, more specifically, separating the signal events from the background events. You should use the Google Cirq and Tensorflow Quantum (TFQ) libraries for this task.

A set of input samples (simulated with Delphes) is provided in NumPy NPZ format Download Input. In the input file, there are only 100 samples for training and 100 samples for testing so it won't take much computing resources to accomplish this task. The signal events are labeled with 1 while the background events are labeled with 0.

Be sure to show that you understand how to fine tune your machine learning model to improve the performance. The performance can be evaluated with classification accuracy or Area Under ROC Curve (AUC).

Downloading the dataset

```
In [1]: !gdown --id 1r_MZB_crfpij6r3SxPDeU_3JD6t6AxAj -0 events.npz

Downloading...
From: https://drive.google.com/uc?id=1r_MZB_crfpij6r3SxPDeU_3JD6t6AxAj
To: /content/events.npz
100% 9.14k/9.14k [00:00<00:00, 25.4MB/s]</pre>
```

Setting up the required libraries

```
!pip install -q tensorflow==2.3.1
In [2]:
         !pip install -q tensorflow-quantum
         import tensorflow as tf
         import tensorflow quantum as tfq
         import cirq
         import sympy
         import numpy as np
         import seaborn as sns
         from sklearn.metrics import roc_curve, auc
         %matplotlib inline
         import matplotlib.pyplot as plt
         from cirq.contrib.svg import SVGCircuit
                                                 320.4MB 48kB/s
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                                                460kB 34.2MB/s
        ERROR: datascience 0.10.6 has requirement folium==0.2.1, but you'll have folium 0.8.3 which is incompatible.
        ERROR: albumentations 0.1.12 has requirement imgaug<0.2.7,>=0.2.5, but you'll have imgaug 0.2.9 which is incompatible.
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```
Loading the data
          data = np.load('./events.npz', allow_pickle=True)
In [3]:
          training_input = data['training_input']
          test_input = data['test_input']
          training_input
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      dtype=object)
 def prepare_data(training_input, test_input):
   x_train_0 = training_input.item()['0']
   x_train_1 = training_input.item()['1']
   x test 0 = test input.item()['0']
   x test 1 = test input.item()['1']
   x_{\text{train}} = \text{np.zeros}((\text{len}(x_{\text{train}}0) + \text{len}(x_{\text{train}}1), x_{\text{train}}0.\text{shape}[1]), dtype=np.float32)
   x_{test} = np_{zeros}((len(x_{test_0}) + len(x_{test_1}), x_{test_0}.shape[1]), dtype=np_{loat32})
   y_train = np.zeros((len(x_train_0) + len(x_train_1),), dtype=np.int32)
   y_test = np.zeros((len(x_test_0) + len(x_test_1),), dtype=np.int32)
   x_train[:len(x_train_0), :] = x_train_0
   x_train[len(x_train_0):, :] = x_train_1
   y_train[:len(x_train_0)] = 0
   y_train[len(x_train_0):] = 1
   x_{\text{test}}[:len(x_{\text{test}}_{0}), :] = x_{\text{test}}_{0}
   x_{test[len(x_{test_0}):, :] = x_{test_1}
   y_{\text{test}}[:len(x_{\text{test}}0)] = 0
   y_{\text{test[len(x_{\text{test_0}}):]} = 1
   idx1 = np.random.permutation(len(x_train))
   idx2 = np.random.permutation(len(x_test))
   x_train, y_train = x_train[idx1], y_train[idx1]
   x_test, y_test = x_test[idx2], y_test[idx2]
   print('Shape of the training set:', x_train.shape)
   print('Shape of the test set:', x_test.shape)
   return x_train, y_train, x_test, y_test
 x_train, y_train, x_test, y_test = prepare_data(training_input, test_input)
Shape of the training set: (100, 5)
Shape of the test set: (100, 5)
```

Approach

We will make use of a Quantum GAN in the following:

- 1. Train a GAN to produce samples that look like they came from quantum circuits.
- 2. Add a classification path to the discriminator and minimize both the minimax loss and classification loss.
- 3. We will use a random quantum circuit to generate random inputs for the generator. The intution behind this is that the data that was provided are the results (measurements) taken from some quantum experiment. So if we succeed in training a GAN which generates outputs similar to the experimental data, this will help in identifying new or other possible outcomes of the same quantum experiment which have been missed in the dataset provided.
- 4. Simultaneously training the discriminator to classify signal events and background events will help in identifying the signal events generated from the fully trained generator.

Data Generation

[0, 0, 0, 0, 1], [0, 0, 0, 0, 1], [0, 0, 0, 0, 1],

As provided in the dataset, each datapoint is 5-dimensional. Hence we will use 5 qubits and pass them through a random quantum circuit and then use these measurements as inputs to the GAN

```
def generate_circuit(qubits):
            """Generate a random circuit on qubits."""
           random_circuit = cirq.generate_boixo_2018_supremacy_circuits_v2(qubits, cz_depth=2, seed=123242)
           return random_circuit
         def generate_data(circuit, n_samples):
            """Draw `n_samples` samples from circuit into a tf.Tensor."""
           return tf.squeeze(tfq.layers.Sample()(circuit, repetitions=n_samples).to_tensor())
In [7]:
         # sample data and circuit structure
         qubits = cirq.GridQubit.rect(1, 5)
         random_circuit_m = generate_circuit(qubits) + cirq.measure_each(*qubits)
         SVGCircuit(random_circuit_m)
        findfont: Font family ['Arial'] not found. Falling back to DejaVu Sans.
Out[7]:
                                      Y^0.5
          (0, 0):
                     Н
                                                 Н
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          (0, 1):
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          (0, 3):
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          (0, 4):
                     Η
                                                         Μ
In [8]:
         generate_data(random_circuit_m, 10)
Out[8]: <tf.Tensor: shape=(10, 5), dtype=int8, numpy=</pre>
         array([[0, 0, 0, 0, 0],
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                [1, 0, 1, 0, 0]], dtype=int8)>
        We will generate 200 random training data
         N SAMPLES = 200
In [9]:
         N_{QUBITS} = 5
         QUBITS = cirq.GridQubit.rect(1, N_QUBITS)
         REFERENCE_CIRCUIT = generate_circuit(QUBITS)
         random_data = generate_data(REFERENCE_CIRCUIT, N_SAMPLES)
         random data
Out[9]: <tf.Tensor: shape=(200, 5), dtype=int8, numpy=
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[1, 1, 1, 1, 0]], dtype=int8)>
```

Building a Model

This GAN will be used to produce measurements corresponding to signal/background events.

```
def make_generator():
In [10]:
            """Construct generator model."""
            model = tf.keras.Sequential()
            model.add(tf.keras.layers.Dense(256, use_bias=False, input_shape=(N_QUBITS,), activation='elu'))
            model.add(tf.keras.layers.Dense(128, activation='relu'))
            model.add(tf.keras.layers.Dropout(0.3))
            model.add(tf.keras.layers.Dense(64, activation='relu'))
            model.add(tf.keras.layers.Dropout(0.3))
            model.add(tf.keras.layers.Dense(N_QUBITS, activation=tf.keras.activations.tanh))
            return model
          def make_discriminator():
            """Construct discriminator model along with a classifier."""
            inp = tf.keras.Input(shape=(N_QUBITS, ), dtype=tf.float32)
            out = tf.keras.layers.Dense(256, use_bias=False, activation='elu')(inp)
            out = tf.keras.layers.Dense(128, activation='relu')(out)
            out = tf.keras.layers.Dropout(0.4)(out)
            out = tf.keras.layers.Dense(64, activation='relu')(out)
```

```
out = tf.keras.layers.Dropout(0.3)(out)
            classification = tf.keras.layers.Dense(2, activation='softmax')(out)
            discrimination = tf.keras.layers.Dense(1, activation='sigmoid')(out)
            model = tf.keras.Model(inputs=[inp], outputs=[discrimination, classification])
            return model
        Let us instantiate our models, define the losses and define the train_step function which will be executed in each epoch
In [11]:
          generator = make_generator()
          discriminator = make_discriminator()
          cross_entropy = tf.keras.losses.BinaryCrossentropy(from_logits=True)
In [12]:
          def discriminator_loss(real_output, fake_output):
            """Computes the discriminator loss."""
            real_loss = cross_entropy(tf.ones_like(real_output), real_output)
            fake_loss = cross_entropy(tf.zeros_like(fake_output), fake_output)
            total_loss = real_loss + fake_loss
            return total_loss
          def generator_loss(fake_output):
            """Compute the generator loss."""
            return cross_entropy(tf.ones_like(fake_output), fake_output)
          generator_optimizer = tf.keras.optimizers.Adam(learning_rate=0.0002, beta_1=0.5)
          discriminator_optimizer = tf.keras.optimizers.Adam(learning_rate=0.0002, beta_1=0.5)
In [13]:
          BATCH_SIZE = 16
          bce = tf.keras.losses.BinaryCrossentropy(from_logits=False)
          # auc = tf.keras.metrics.AUC()
          @tf.function
          def train_step(images, labels, noise):
            """Run train step on provided image batch."""
            with tf.GradientTape() as gen_tape, tf.GradientTape() as disc_tape:
              generated_data = generator(noise, training=True)
              real_output, real_preds = discriminator(images, training=True)
              fake_output, fake_preds = discriminator(generated_data, training=True)
              gen_loss = generator_loss(fake_output)
              disc loss = discriminator loss(real output, fake output)
              disc_loss = disc_loss + bce(tf.one_hot(tf.squeeze(labels), depth=2), real_preds)
            gradients_of_generator = gen_tape.gradient(gen_loss, generator.trainable_variables)
            gradients of discriminator = disc tape gradient(disc loss, discriminator trainable variables)
            generator_optimizer.apply_gradients(zip(gradients_of_generator, generator.trainable_variables))
            discriminator_optimizer.apply_gradients(zip(gradients_of_discriminator, discriminator.trainable_variables))
            # auc.update_state(tf.one_hot(tf.squeeze(labels), depth=2), real_preds)
            return gen_loss, disc_loss
In [14]:
          def train(data, labels, noise, epochs):
            """Launch full training for the given number of epochs."""
            batched_data = tf.data.Dataset.from_tensor_slices(data).batch(BATCH_SIZE)
            batched_labels = tf.data.Dataset.from_tensor_slices(labels).batch(BATCH_SIZE)
            batched_noise = tf.data.Dataset.from_tensor_slices(noise).batch(BATCH_SIZE)
            AUC = tf.keras.metrics.AUC()
            g_losses = []
            d_losses = []
            \# aucs = []
            for epoch in range(epochs):
              g_epoch_losses = []
              d_epoch_losses = []
              # aucs_epoch = []
              for i, (data_batch, labels_batch, noise_batch) in enumerate(zip(batched_data, batched_labels, batched_noise)):
                gl, dl = train step(data batch, labels batch, noise batch)
                g_epoch_losses.append(gl)
                d epoch losses.append(dl)
                # aucs_epoch.append(auc_roc)
              g_losses.append(tf.reduce_mean(g_epoch_losses))
              d_losses.append(tf.reduce_mean(d_epoch_losses))
              print('Epoch: {}, Generator Loss: {}, Discriminator Loss: {}'.format(epoch, tf.reduce_mean(g_epoch_losses), tf.reduce_mean(d_epoch_losses)
              # aucs.append(tf.reduce_mean(aucs_epoch))
            return g_losses, d_losses
In [15]:
          gen_losses, disc_losses = train(x_train, y_train, random_data, 1000)
         Epoch: 0, Generator Loss: 0.47245699167251587, Discriminator Loss: 2.1309597492218018
         Epoch: 1, Generator Loss: 0.47354671359062195, Discriminator Loss: 2.0846550464630127
         Epoch: 2, Generator Loss: 0.4747970402240753, Discriminator Loss: 2.075195550918579
         Epoch: 3, Generator Loss: 0.47502169013023376, Discriminator Loss: 2.042206048965454
         Epoch: 4, Generator Loss: 0.4750267565250397, Discriminator Loss: 2.0312952995300293
         Epoch: 5, Generator Loss: 0.4736452102661133, Discriminator Loss: 2.017235040664673
         Epoch: 6, Generator Loss: 0.4720909893512726, Discriminator Loss: 1.9946978092193604
         Epoch: 7, Generator Loss: 0.46873971819877625, Discriminator Loss: 1.9959081411361694
         Epoch: 8, Generator Loss: 0.46720847487449646, Discriminator Loss: 1.9918718338012695
         Epoch: 9, Generator Loss: 0.46549269556999207, Discriminator Loss: 2.028303384780884
         Epoch: 10, Generator Loss: 0.46618860960006714, Discriminator Loss: 1.9572858810424805
         Epoch: 11, Generator Loss: 0.4672021269798279, Discriminator Loss: 1.956483244895935
         Epoch: 12, Generator Loss: 0.4674927294254303, Discriminator Loss: 1.9482008218765259
         Epoch: 13, Generator Loss: 0.4675862491130829, Discriminator Loss: 1.9636048078536987
         Epoch: 14, Generator Loss: 0.4748061001300812, Discriminator Loss: 1.9643497467041016
         Epoch: 15, Generator Loss: 0.4778321087360382, Discriminator Loss: 1.9405934810638428
         Epoch: 16, Generator Loss: 0.47958749532699585, Discriminator Loss: 1.9556820392608643
```

```
Epoch: 17, Generator Loss: 0.4828241467475891, Discriminator Loss: 1.90898597240448
Epoch: 18, Generator Loss: 0.4819352924823761, Discriminator Loss: 1.9337685108184814
Epoch: 19, Generator Loss: 0.48568472266197205, Discriminator Loss: 1.9421571493148804
Epoch: 20, Generator Loss: 0.49434393644332886, Discriminator Loss: 1.9321893453598022
Epoch: 21, Generator Loss: 0.4991462528705597, Discriminator Loss: 1.930079460144043
Epoch: 22, Generator Loss: 0.5063033699989319, Discriminator Loss: 1.8862199783325195
Epoch: 23, Generator Loss: 0.505766749382019, Discriminator Loss: 1.917807936668396
Epoch: 24, Generator Loss: 0.49457839131355286, Discriminator Loss: 1.9039415121078491
Epoch: 25, Generator Loss: 0.48733657598495483, Discriminator Loss: 1.9469871520996094
Epoch: 26, Generator Loss: 0.47996988892555237, Discriminator Loss: 1.9616447687149048
Epoch: 27, Generator Loss: 0.4782406687736511, Discriminator Loss: 1.9432618618011475
Epoch: 28, Generator Loss: 0.47633519768714905, Discriminator Loss: 1.9124267101287842
Epoch: 29, Generator Loss: 0.4723445773124695, Discriminator Loss: 1.9401410818099976
Epoch: 30, Generator Loss: 0.4662209451198578, Discriminator Loss: 1.899164080619812
Epoch: 31, Generator Loss: 0.4601726233959198, Discriminator Loss: 1.965654969215393
Epoch: 32, Generator Loss: 0.4676465094089508, Discriminator Loss: 1.9388188123703003
Epoch: 33, Generator Loss: 0.47172150015830994, Discriminator Loss: 1.9266111850738525
Epoch: 34, Generator Loss: 0.49127528071403503, Discriminator Loss: 1.8824323415756226
Epoch: 35, Generator Loss: 0.4991036057472229, Discriminator Loss: 1.9555609226226807
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Epoch: 37, Generator Loss: 0.5053252577781677, Discriminator Loss: 1.889276146888733
Epoch: 38, Generator Loss: 0.4996817409992218, Discriminator Loss: 1.9249626398086548
Epoch: 39, Generator Loss: 0.4961780905723572, Discriminator Loss: 1.906009316444397
Epoch: 40, Generator Loss: 0.4840833842754364, Discriminator Loss: 1.929800033569336
Epoch: 41, Generator Loss: 0.4854932129383087, Discriminator Loss: 1.9467328786849976
Epoch: 42, Generator Loss: 0.495086133480072, Discriminator Loss: 1.9553041458129883
Epoch: 43, Generator Loss: 0.5065574049949646, Discriminator Loss: 1.9479920864105225
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Epoch: 45, Generator Loss: 0.5243074297904968, Discriminator Loss: 1.910927414894104
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Epoch: 50, Generator Loss: 0.5417134165763855, Discriminator Loss: 1.9112889766693115
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Epoch: 60, Generator Loss: 0.5039676427841187, Discriminator Loss: 1.8997727632522583
Epoch: 61, Generator Loss: 0.528506338596344, Discriminator Loss: 1.8672453165054321
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Epoch: 63, Generator Loss: 0.5410000681877136, Discriminator Loss: 1.8588272333145142
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Epoch: 66, Generator Loss: 0.532818615436554, Discriminator Loss: 1.8661795854568481
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Epoch: 68, Generator Loss: 0.5526874661445618, Discriminator Loss: 1.8613594770431519
Epoch: 69, Generator Loss: 0.5561595559120178, Discriminator Loss: 1.8321349620819092
Epoch: 70, Generator Loss: 0.5518271327018738, Discriminator Loss: 1.8868277072906494
Epoch: 71, Generator Loss: 0.5390034914016724, Discriminator Loss: 1.887233018875122
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Epoch: 85, Generator Loss: 0.508942723274231, Discriminator Loss: 1.9320131540298462
Epoch: 86, Generator Loss: 0.5214599370956421, Discriminator Loss: 1.8895044326782227
Epoch: 87, Generator Loss: 0.5359059572219849, Discriminator Loss: 1.8706740140914917
Epoch: 88, Generator Loss: 0.5441693067550659, Discriminator Loss: 1.8912113904953003
Epoch: 89, Generator Loss: 0.5526143908500671, Discriminator Loss: 1.8730275630950928
Epoch: 90, Generator Loss: 0.5570126175880432, Discriminator Loss: 1.8783923387527466
Epoch: 91, Generator Loss: 0.5619910955429077, Discriminator Loss: 1.8808168172836304
Epoch: 92, Generator Loss: 0.5604825615882874, Discriminator Loss: 1.8524006605148315
Epoch: 93, Generator Loss: 0.5525741577148438, Discriminator Loss: 1.8538178205490112
Epoch: 94, Generator Loss: 0.5485913157463074, Discriminator Loss: 1.8798120021820068
Epoch: 95, Generator Loss: 0.5469285845756531, Discriminator Loss: 1.8844879865646362
Epoch: 96, Generator Loss: 0.5451406240463257, Discriminator Loss: 1.8655368089675903
Epoch: 97, Generator Loss: 0.5373668074607849, Discriminator Loss: 1.8591585159301758
Epoch: 98, Generator Loss: 0.5433589816093445, Discriminator Loss: 1.8414385318756104
Epoch: 99, Generator Loss: 0.5540968775749207, Discriminator Loss: 1.8172370195388794
Epoch: 100, Generator Loss: 0.5645535588264465, Discriminator Loss: 1.8407418727874756
Epoch: 101, Generator Loss: 0.5749638676643372, Discriminator Loss: 1.8057104349136353
Epoch: 102, Generator Loss: 0.5700496435165405, Discriminator Loss: 1.8277219533920288
Epoch: 103, Generator Loss: 0.5735805630683899, Discriminator Loss: 1.7969226837158203
Epoch: 104, Generator Loss: 0.5604730248451233, Discriminator Loss: 1.8470449447631836
Epoch: 105, Generator Loss: 0.5590295195579529, Discriminator Loss: 1.8898046016693115
Epoch: 106, Generator Loss: 0.5458016395568848, Discriminator Loss: 1.8857128620147705
Epoch: 107, Generator Loss: 0.5512093305587769, Discriminator Loss: 1.875548005104065
Epoch: 108, Generator Loss: 0.5583423376083374, Discriminator Loss: 1.867981195449829
Epoch: 109, Generator Loss: 0.5647979974746704, Discriminator Loss: 1.8331958055496216
Epoch: 110, Generator Loss: 0.5678556561470032, Discriminator Loss: 1.8380311727523804
Epoch: 111, Generator Loss: 0.5705403089523315, Discriminator Loss: 1.8400055170059204
Epoch: 112, Generator Loss: 0.5687400698661804, Discriminator Loss: 1.865172028541565
Epoch: 113, Generator Loss: 0.5678566694259644, Discriminator Loss: 1.8431841135025024
Epoch: 114, Generator Loss: 0.5811198353767395, Discriminator Loss: 1.8377007246017456
Epoch: 115, Generator Loss: 0.5826096534729004, Discriminator Loss: 1.7986491918563843
Epoch: 116, Generator Loss: 0.5792993903160095, Discriminator Loss: 1.8398023843765259
Epoch: 117, Generator Loss: 0.5840440392494202, Discriminator Loss: 1.8061217069625854
Epoch: 118, Generator Loss: 0.5829824209213257, Discriminator Loss: 1.798681616783142
Epoch: 119, Generator Loss: 0.5748141407966614, Discriminator Loss: 1.8183003664016724
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Epoch: 120, Generator Loss: 0.579166054725647, Discriminator Loss: 1.8069028854370117
Epoch: 121, Generator Loss: 0.5761149525642395, Discriminator Loss: 1.8490674495697021
Epoch: 122, Generator Loss: 0.5651600360870361, Discriminator Loss: 1.8124849796295166
Epoch: 123, Generator Loss: 0.5722929239273071, Discriminator Loss: 1.8468486070632935
Epoch: 124, Generator Loss: 0.5626228451728821, Discriminator Loss: 1.7711504697799683
Epoch: 125, Generator Loss: 0.5709100365638733, Discriminator Loss: 1.82460618019104
Epoch: 126, Generator Loss: 0.5566639304161072, Discriminator Loss: 1.8116308450698853
Epoch: 127, Generator Loss: 0.557690441608429, Discriminator Loss: 1.852997064590454
Epoch: 128, Generator Loss: 0.5517714619636536, Discriminator Loss: 1.8209640979766846
Epoch: 129, Generator Loss: 0.5520617365837097, Discriminator Loss: 1.8207871913909912
Epoch: 130, Generator Loss: 0.5489395260810852, Discriminator Loss: 1.8778486251831055
Epoch: 131, Generator Loss: 0.5518161654472351, Discriminator Loss: 1.85513436794281
Epoch: 132, Generator Loss: 0.5678400993347168, Discriminator Loss: 1.8305803537368774
Epoch: 133, Generator Loss: 0.569003701210022, Discriminator Loss: 1.7880452871322632
Epoch: 134, Generator Loss: 0.573340892791748, Discriminator Loss: 1.7983888387680054
Epoch: 135, Generator Loss: 0.5840587615966797, Discriminator Loss: 1.8284927606582642
Epoch: 136, Generator Loss: 0.5904276967048645, Discriminator Loss: 1.7948226928710938
Epoch: 137, Generator Loss: 0.5902224779129028, Discriminator Loss: 1.8270350694656372
Epoch: 138, Generator Loss: 0.5911105871200562, Discriminator Loss: 1.8259629011154175
Epoch: 139, Generator Loss: 0.58720862865448, Discriminator Loss: 1.78156578540802
Epoch: 140, Generator Loss: 0.5888800024986267, Discriminator Loss: 1.7946158647537231
Epoch: 141, Generator Loss: 0.597480297088623, Discriminator Loss: 1.7780158519744873
Epoch: 142, Generator Loss: 0.5790091156959534, Discriminator Loss: 1.823628544807434
Epoch: 143, Generator Loss: 0.5797544717788696, Discriminator Loss: 1.80972158908844
Epoch: 144, Generator Loss: 0.5684879422187805, Discriminator Loss: 1.8595277070999146
Epoch: 145, Generator Loss: 0.5740483403205872, Discriminator Loss: 1.817771077156067
Epoch: 146, Generator Loss: 0.5724102854728699, Discriminator Loss: 1.8568506240844727
Epoch: 147, Generator Loss: 0.5741368532180786, Discriminator Loss: 1.9016492366790771
Epoch: 148, Generator Loss: 0.579916775226593, Discriminator Loss: 1.8537720441818237
Epoch: 149, Generator Loss: 0.5835942029953003, Discriminator Loss: 1.8422173261642456
Epoch: 150, Generator Loss: 0.5833085179328918, Discriminator Loss: 1.8590223789215088
Epoch: 151, Generator Loss: 0.5836254954338074, Discriminator Loss: 1.8254939317703247
Epoch: 152, Generator Loss: 0.5880081057548523, Discriminator Loss: 1.8115910291671753
Epoch: 153, Generator Loss: 0.5933859944343567, Discriminator Loss: 1.808287501335144
Epoch: 154, Generator Loss: 0.5825670957565308, Discriminator Loss: 1.8200031518936157
Epoch: 155, Generator Loss: 0.5794199109077454, Discriminator Loss: 1.835432767868042
Epoch: 156, Generator Loss: 0.5831654667854309, Discriminator Loss: 1.8381356000900269
Epoch: 157, Generator Loss: 0.580565333366394, Discriminator Loss: 1.8432129621505737
Epoch: 158, Generator Loss: 0.5798083543777466, Discriminator Loss: 1.8292144536972046
Epoch: 159, Generator Loss: 0.5763370394706726, Discriminator Loss: 1.7972300052642822
Epoch: 160, Generator Loss: 0.5822525024414062, Discriminator Loss: 1.8135697841644287
Epoch: 161, Generator Loss: 0.5730393528938293, Discriminator Loss: 1.8364251852035522
Epoch: 162, Generator Loss: 0.5786271095275879, Discriminator Loss: 1.809244155883789
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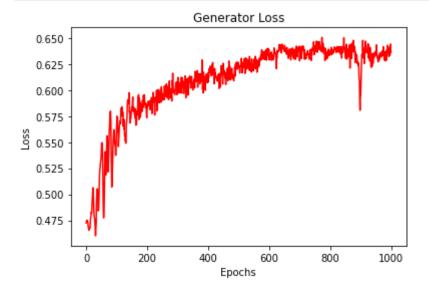
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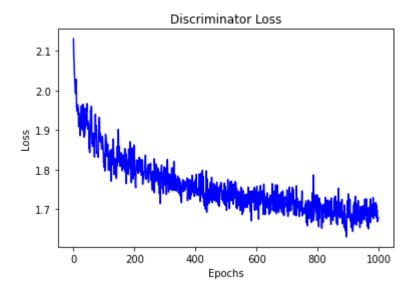
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Epoch: 857, Generator Loss: 0.6359347105026245, Discriminator Loss: 1.707425832748413
Epoch: 858, Generator Loss: 0.6367241740226746, Discriminator Loss: 1.733296513557434
Epoch: 859, Generator Loss: 0.6393744349479675, Discriminator Loss: 1.6991841793060303
Epoch: 860, Generator Loss: 0.6320887804031372, Discriminator Loss: 1.7001105546951294
Epoch: 861, Generator Loss: 0.635322093963623, Discriminator Loss: 1.7083816528320312
Epoch: 862, Generator Loss: 0.6430221796035767, Discriminator Loss: 1.6943413019180298
Epoch: 863, Generator Loss: 0.6410456895828247, Discriminator Loss: 1.6638883352279663
Epoch: 864, Generator Loss: 0.6392334699630737, Discriminator Loss: 1.718955159187317
Epoch: 865, Generator Loss: 0.6211353540420532, Discriminator Loss: 1.7111988067626953
Epoch: 866, Generator Loss: 0.6371739506721497, Discriminator Loss: 1.6606483459472656
Epoch: 867, Generator Loss: 0.6441218256950378, Discriminator Loss: 1.7216088771820068
Epoch: 868, Generator Loss: 0.633323609828949, Discriminator Loss: 1.7141531705856323
Epoch: 869, Generator Loss: 0.6402632594108582, Discriminator Loss: 1.75322425365448
Epoch: 870, Generator Loss: 0.6303567290306091, Discriminator Loss: 1.6897600889205933
Epoch: 871, Generator Loss: 0.6314951181411743, Discriminator Loss: 1.7112127542495728
Epoch: 872, Generator Loss: 0.6400039792060852, Discriminator Loss: 1.693636178970337
Epoch: 873, Generator Loss: 0.6428221464157104, Discriminator Loss: 1.678946614265442
Epoch: 874, Generator Loss: 0.6458247303962708, Discriminator Loss: 1.7110283374786377
Epoch: 875, Generator Loss: 0.636971116065979, Discriminator Loss: 1.7175434827804565
Epoch: 876, Generator Loss: 0.6477259397506714, Discriminator Loss: 1.6788673400878906
Epoch: 877, Generator Loss: 0.6371446251869202, Discriminator Loss: 1.686362862586975
Epoch: 878, Generator Loss: 0.6396459341049194, Discriminator Loss: 1.7156505584716797
Epoch: 879, Generator Loss: 0.6423745155334473, Discriminator Loss: 1.687855839729309
Epoch: 880, Generator Loss: 0.6365724205970764, Discriminator Loss: 1.7251335382461548
Epoch: 881, Generator Loss: 0.639528751373291, Discriminator Loss: 1.6634085178375244
Epoch: 882, Generator Loss: 0.6264707446098328, Discriminator Loss: 1.6942683458328247
Epoch: 883, Generator Loss: 0.6363297700881958, Discriminator Loss: 1.6807814836502075
Epoch: 884, Generator Loss: 0.6331359148025513, Discriminator Loss: 1.6812387704849243
Epoch: 885, Generator Loss: 0.6345130801200867, Discriminator Loss: 1.6824169158935547
Epoch: 886, Generator Loss: 0.6333543658256531, Discriminator Loss: 1.6845369338989258
Epoch: 887, Generator Loss: 0.6336969137191772, Discriminator Loss: 1.6539266109466553
Epoch: 888, Generator Loss: 0.6307460069656372, Discriminator Loss: 1.6949117183685303
Epoch: 889, Generator Loss: 0.6252238154411316, Discriminator Loss: 1.710692048072815
Epoch: 890, Generator Loss: 0.627385139465332, Discriminator Loss: 1.6570669412612915
Epoch: 891, Generator Loss: 0.6262462735176086, Discriminator Loss: 1.6463682651519775
Epoch: 892, Generator Loss: 0.6234726309776306, Discriminator Loss: 1.6701829433441162
Epoch: 893, Generator Loss: 0.6259358525276184, Discriminator Loss: 1.6574891805648804
Epoch: 894, Generator Loss: 0.6196761727333069, Discriminator Loss: 1.630321741104126
Epoch: 895, Generator Loss: 0.6110453009605408, Discriminator Loss: 1.6615698337554932
Epoch: 896, Generator Loss: 0.6089054346084595, Discriminator Loss: 1.6878702640533447
Epoch: 897, Generator Loss: 0.5893152952194214, Discriminator Loss: 1.6784001588821411
Epoch: 898, Generator Loss: 0.5806256532669067, Discriminator Loss: 1.7031055688858032
Epoch: 899, Generator Loss: 0.5936278700828552, Discriminator Loss: 1.7227181196212769
Epoch: 900, Generator Loss: 0.5950087308883667, Discriminator Loss: 1.6783860921859741
Epoch: 901, Generator Loss: 0.6084210276603699, Discriminator Loss: 1.696806788444519
Epoch: 902, Generator Loss: 0.6181274056434631, Discriminator Loss: 1.739035725593567
Epoch: 903, Generator Loss: 0.6269658207893372, Discriminator Loss: 1.685637354850769
Epoch: 904, Generator Loss: 0.6342068910598755, Discriminator Loss: 1.686490774154663
Epoch: 905, Generator Loss: 0.6317269206047058, Discriminator Loss: 1.679091453552246
Epoch: 906, Generator Loss: 0.6326245069503784, Discriminator Loss: 1.7252031564712524
Epoch: 907, Generator Loss: 0.6478039026260376, Discriminator Loss: 1.6916368007659912
Epoch: 908, Generator Loss: 0.6308037638664246, Discriminator Loss: 1.6706141233444214
Epoch: 909, Generator Loss: 0.6395400166511536, Discriminator Loss: 1.6865588426589966
Epoch: 910, Generator Loss: 0.6323443055152893, Discriminator Loss: 1.6538845300674438
Epoch: 911, Generator Loss: 0.6362345814704895, Discriminator Loss: 1.688287615776062
Epoch: 912, Generator Loss: 0.6255181431770325, Discriminator Loss: 1.6665467023849487
Epoch: 913, Generator Loss: 0.628047525882721, Discriminator Loss: 1.6794970035552979
Epoch: 914, Generator Loss: 0.6418572068214417, Discriminator Loss: 1.6809141635894775
Epoch: 915, Generator Loss: 0.6363096237182617, Discriminator Loss: 1.6441090106964111
Epoch: 916, Generator Loss: 0.6470140218734741, Discriminator Loss: 1.6459091901779175
Epoch: 917, Generator Loss: 0.6374820470809937, Discriminator Loss: 1.6837809085845947
Epoch: 918, Generator Loss: 0.637663722038269, Discriminator Loss: 1.6946274042129517
Epoch: 919, Generator Loss: 0.6363003849983215, Discriminator Loss: 1.7117233276367188
Epoch: 920, Generator Loss: 0.6385345458984375, Discriminator Loss: 1.66178297996521
Epoch: 921, Generator Loss: 0.6357702612876892, Discriminator Loss: 1.718018651008606
Epoch: 922, Generator Loss: 0.6381059288978577, Discriminator Loss: 1.6883289813995361
Epoch: 923, Generator Loss: 0.6421740651130676, Discriminator Loss: 1.7118912935256958
Epoch: 924, Generator Loss: 0.6446447372436523, Discriminator Loss: 1.680925726890564
Epoch: 925, Generator Loss: 0.6308678984642029, Discriminator Loss: 1.732790231704712
Epoch: 926, Generator Loss: 0.6432791352272034, Discriminator Loss: 1.6762536764144897
Epoch: 927, Generator Loss: 0.639890193939209, Discriminator Loss: 1.6833150386810303
Epoch: 928, Generator Loss: 0.6336304545402527, Discriminator Loss: 1.6602153778076172
Epoch: 929, Generator Loss: 0.634384274482727, Discriminator Loss: 1.713458776473999
Epoch: 930, Generator Loss: 0.628100574016571, Discriminator Loss: 1.7039058208465576
Epoch: 931, Generator Loss: 0.640991747379303, Discriminator Loss: 1.681329607963562
Epoch: 932, Generator Loss: 0.6284685730934143, Discriminator Loss: 1.680267333984375
Epoch: 933, Generator Loss: 0.6274628639221191, Discriminator Loss: 1.7218033075332642
Epoch: 934, Generator Loss: 0.62213534116745, Discriminator Loss: 1.6702983379364014
Epoch: 935, Generator Loss: 0.6218461990356445, Discriminator Loss: 1.6963831186294556
Epoch: 936, Generator Loss: 0.6280765533447266, Discriminator Loss: 1.677954077720642
Epoch: 937, Generator Loss: 0.6227008104324341, Discriminator Loss: 1.6869243383407593
Epoch: 938, Generator Loss: 0.6239262223243713, Discriminator Loss: 1.685616135597229
Epoch: 939, Generator Loss: 0.6353870630264282, Discriminator Loss: 1.6538950204849243
Epoch: 940, Generator Loss: 0.6255449652671814, Discriminator Loss: 1.7068887948989868
Epoch: 941, Generator Loss: 0.6268711686134338, Discriminator Loss: 1.6749986410140991
Epoch: 942, Generator Loss: 0.6303912997245789, Discriminator Loss: 1.6767746210098267
Epoch: 943, Generator Loss: 0.6338239908218384, Discriminator Loss: 1.6887978315353394
```

```
Epoch: 944, Generator Loss: 0.6312969326972961, Discriminator Loss: 1.6725139617919922
         Epoch: 945, Generator Loss: 0.6357641220092773, Discriminator Loss: 1.664347767829895
         Epoch: 946, Generator Loss: 0.6355920433998108, Discriminator Loss: 1.6929203271865845
         Epoch: 947, Generator Loss: 0.6344780325889587, Discriminator Loss: 1.7087287902832031
         Epoch: 948, Generator Loss: 0.6370449662208557, Discriminator Loss: 1.6726773977279663
         Epoch: 949, Generator Loss: 0.6338468790054321, Discriminator Loss: 1.6801801919937134
         Epoch: 950, Generator Loss: 0.6355018615722656, Discriminator Loss: 1.6800497770309448
         Epoch: 951, Generator Loss: 0.6333072781562805, Discriminator Loss: 1.6958855390548706
         Epoch: 952, Generator Loss: 0.6434340476989746, Discriminator Loss: 1.7081499099731445
         Epoch: 953, Generator Loss: 0.6333805322647095, Discriminator Loss: 1.6935558319091797
         Epoch: 954, Generator Loss: 0.6309642791748047, Discriminator Loss: 1.6745455265045166
         Epoch: 955, Generator Loss: 0.6322129368782043, Discriminator Loss: 1.7257508039474487
         Epoch: 956, Generator Loss: 0.6317318677902222, Discriminator Loss: 1.6952502727508545
         Epoch: 957, Generator Loss: 0.6272238492965698, Discriminator Loss: 1.685602068901062
         Epoch: 958, Generator Loss: 0.6272782683372498, Discriminator Loss: 1.6854733228683472
         Epoch: 959, Generator Loss: 0.6281878352165222, Discriminator Loss: 1.704763650894165
         Epoch: 960, Generator Loss: 0.6337061524391174, Discriminator Loss: 1.7262060642242432
         Epoch: 961, Generator Loss: 0.6293194890022278, Discriminator Loss: 1.6699055433273315
         Epoch: 962, Generator Loss: 0.6295179724693298, Discriminator Loss: 1.6724413633346558
         Epoch: 963, Generator Loss: 0.63577800989151, Discriminator Loss: 1.6568288803100586
         Epoch: 964, Generator Loss: 0.6349766850471497, Discriminator Loss: 1.7035229206085205
         Epoch: 965, Generator Loss: 0.6352488398551941, Discriminator Loss: 1.6847354173660278
         Epoch: 966, Generator Loss: 0.6351518034934998, Discriminator Loss: 1.6948264837265015
         Epoch: 967, Generator Loss: 0.6317045092582703, Discriminator Loss: 1.6505043506622314
         Epoch: 968, Generator Loss: 0.6336820721626282, Discriminator Loss: 1.6887558698654175
         Epoch: 969, Generator Loss: 0.6333118081092834, Discriminator Loss: 1.7049213647842407
         Epoch: 970, Generator Loss: 0.637515127658844, Discriminator Loss: 1.6735632419586182
         Epoch: 971, Generator Loss: 0.6353568434715271, Discriminator Loss: 1.6840907335281372
         Epoch: 972, Generator Loss: 0.6334907412528992, Discriminator Loss: 1.7031806707382202
         Epoch: 973, Generator Loss: 0.6330669522285461, Discriminator Loss: 1.7264310121536255
         Epoch: 974, Generator Loss: 0.6417250633239746, Discriminator Loss: 1.6666183471679688
         Epoch: 975, Generator Loss: 0.6333022713661194, Discriminator Loss: 1.709949254989624
         Epoch: 976, Generator Loss: 0.6356392502784729, Discriminator Loss: 1.680402159690857
         Epoch: 977, Generator Loss: 0.6288182139396667, Discriminator Loss: 1.6912410259246826
         Epoch: 978, Generator Loss: 0.6300433278083801, Discriminator Loss: 1.6921145915985107
         Epoch: 979, Generator Loss: 0.6340363621711731, Discriminator Loss: 1.7116554975509644
         Epoch: 980, Generator Loss: 0.6366215944290161, Discriminator Loss: 1.6998025178909302
         Epoch: 981, Generator Loss: 0.630303680896759, Discriminator Loss: 1.698089599609375
         Epoch: 982, Generator Loss: 0.6280173063278198, Discriminator Loss: 1.7295455932617188
         Epoch: 983, Generator Loss: 0.6353344321250916, Discriminator Loss: 1.6763545274734497
         Epoch: 984, Generator Loss: 0.6382136940956116, Discriminator Loss: 1.695070505142212
         Epoch: 985, Generator Loss: 0.6287041306495667, Discriminator Loss: 1.7148630619049072
         Epoch: 986, Generator Loss: 0.6358261704444885, Discriminator Loss: 1.7039293050765991
         Epoch: 987, Generator Loss: 0.6369396448135376, Discriminator Loss: 1.710388422012329
         Epoch: 988, Generator Loss: 0.6430006623268127, Discriminator Loss: 1.7004451751708984
         Epoch: 989, Generator Loss: 0.641998827457428, Discriminator Loss: 1.6955468654632568
         Epoch: 990, Generator Loss: 0.6413463950157166, Discriminator Loss: 1.6835832595825195
         Epoch: 991, Generator Loss: 0.6373505592346191, Discriminator Loss: 1.7167655229568481
         Epoch: 992, Generator Loss: 0.63306725025177, Discriminator Loss: 1.682011365890503
         Epoch: 993, Generator Loss: 0.6322460770606995, Discriminator Loss: 1.7110320329666138
         Epoch: 994, Generator Loss: 0.6407507658004761, Discriminator Loss: 1.6788114309310913
         Epoch: 995, Generator Loss: 0.6386731266975403, Discriminator Loss: 1.6980780363082886
         Epoch: 996, Generator Loss: 0.6336122155189514, Discriminator Loss: 1.6756762266159058
         Epoch: 997, Generator Loss: 0.6423583626747131, Discriminator Loss: 1.6685248613357544
         Epoch: 998, Generator Loss: 0.6442269086837769, Discriminator Loss: 1.6736946105957031
         Epoch: 999, Generator Loss: 0.6363301277160645, Discriminator Loss: 1.6785545349121094
In [16]:
          plt.title('Generator Loss')
          plt.plot(gen_losses, 'r-')
          plt.xlabel('Epochs')
          plt.ylabel('Loss')
          plt.show()
```



```
In [17]: plt.title('Discriminator Loss')
    plt.plot(disc_losses, 'b-')
    plt.xlabel('Epochs')
    plt.ylabel('Loss')
    plt.show()
```



Using the Discriminator for Classification

plt.ylabel('True Positive Rate')

plt.legend(loc="lower right")

plt.show()

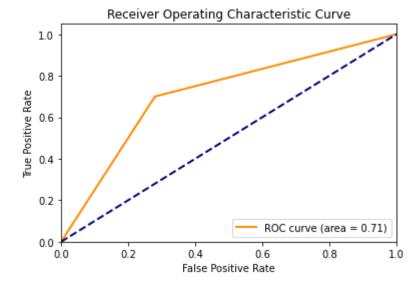
plt.title('Receiver Operating Characteristic Curve')

_, train_predictions = discriminator(tf.convert_to_tensor(x_train))

In [18]:

We will now evaluate the performance of discriminator on the original training data as a classifier. We will check both the classification accuracy and Area Under ROC Curve as the metrics.

```
train_predictions.shape
Out[18]: TensorShape([100, 2])
          binary_accuracy = tf.keras.metrics.BinaryAccuracy()
In [19]:
          binary_accuracy.update_state(tf.one_hot(tf.squeeze(y_train), depth=2), train_predictions)
          print('Training Accuracy: %.4f %s' % (binary_accuracy.result().numpy()*100, '%'))
         Training Accuracy: 88.0000 %
          fpr, tpr, _ = roc_curve(y_train, tf.argmax(train_predictions,1).numpy())
In [20]:
          roc_auc = auc(fpr, tpr)
          plt.figure()
          lw = 2
          plt.plot(fpr, tpr, color='darkorange',
          lw=lw, label='ROC curve (area = %0.2f)' % roc_auc)
          plt.plot([0, 1], [0, 1], color='navy', lw=lw, linestyle='--')
          plt.xlim([0.0, 1.0])
          plt.ylim([0.0, 1.05])
          plt.xlabel('False Positive Rate')
          plt.ylabel('True Positive Rate')
          plt.title('Receiver Operating Characteristic Curve')
          plt.legend(loc="lower right")
          plt.show()
                      Receiver Operating Characteristic Curve
            1.0
            0.8
          True Positive Rate
            0.6
            0.4
                                             ROC curve (area = 0.88)
            0.0
                        0.2
                                  0.4
              0.0
                                            0.6
                                                     0.8
                                                               1.0
                                 False Positive Rate
           _, test_predictions = discriminator(tf.convert_to_tensor(x_test))
          test_predictions.shape
Out[21]: TensorShape([100, 2])
          binary accuracy = tf.keras.metrics.BinaryAccuracy()
          binary_accuracy.update_state(tf.one_hot(tf.squeeze(y_test), depth=2), test_predictions)
          print('Test Accuracy: %.4f %s' % (binary_accuracy.result().numpy()*100, '%'))
          Test Accuracy: 71.0000 %
          fpr, tpr, _ = roc_curve(y_test, tf.argmax(test_predictions,1).numpy())
In [23]:
          roc_auc = auc(fpr, tpr)
          plt.figure()
          lw = 2
          plt.plot(fpr, tpr, color='darkorange',
          lw=lw, label='ROC curve (area = %0.2f)' % roc_auc)
          plt.plot([0, 1], [0, 1], color='navy', lw=lw, linestyle='--')
          plt.xlim([0.0, 1.0])
          plt.ylim([0.0, 1.05])
          plt.xlabel('False Positive Rate')
```



We will now look at the predictions on the generated synthetic data.

```
In [24]: generator_outputs = generator(random_data)
generator_outputs.shape

Out[24]: TensorShape([200, 5])

In [25]: __, predictions_synthetic = discriminator(generator_outputs)
predictions_synthetic.shape

Out[25]: TensorShape([200, 2])

In [26]: predicted_labels_synthetic = tf.argmax(predictions_synthetic, 1)
predicted_labels_synthetic[:20]
```