# HW1\_ProgressiveGrowingGAN

October 18, 2019

## 1 Part 2: Progressive growing GAN

Setting up the environment and helper functions

```
[1]: import os
   import tensorflow as tf
   import tensorflow_hub as hub
   import IPython.display
   import numpy as np
   import PIL. Image
   from scipy.stats import truncnorm
   import matplotlib.pyplot as plt
   from ipywidgets import interact, interactive, fixed, interact_manual
   import ipywidgets as widgets
[2]: def imgrid(imarray, cols=5, pad=1):
        if isinstance(imarray, np.ndarray):
            N, H, W, C = imarray.shape
       if isinstance(imarray, list):
           N = len(imarray)
       rows = N // cols + int(N % cols != 0)
       for i in range(N):
           plt.subplot(rows, cols, i+1)
           plt.title("%d"%i)
           plt.imshow(imarray[i])
           plt.axis('off')
   def interpolate(A, B, num_interps):
       alphas = np.linspace(0, 1, num_interps)
       return np.array([(1-a)*A + a*B for a in alphas])
```

Load the module from tf\_hub

```
[4]: # get the model from TF Hub
generate = hub.Module("https://tfhub.dev/google/progan-128/1")
[5]: # We must initialize some variables and constants in the model
initializer = tf.global_variables_initializer()
sess = tf.Session()
```

# [6]: # Generate 20 samples from random noise z = tf.random\_normal([20, 512]) images = generate(z) # run noise throught the model images, z\_values = sess.run([images, z]) # only by `sess.run()` we materialize\_ $\rightarrow$ the outputs of the model Let's try to run sess.run(z) a couple of times. z has been assigned above **once** - so regularly we'd expect it to get a single value. But watch what happens: [7]: sess.run(z)[0,:5] [7]: array([ 0.00826673, 1.9434319 , -2.2289834 , -0.6219041 , -2.0612514 ], dtype=float32) [8]: sess.run(z)[0,:5][8]: array([-0.8613947 , 0.82105726, -1.5195197 , 1.5004457 , 0.02612939], dtype=float32) [9]: plt.figure(figsize=(20,10)) imgrid(images,cols=7)

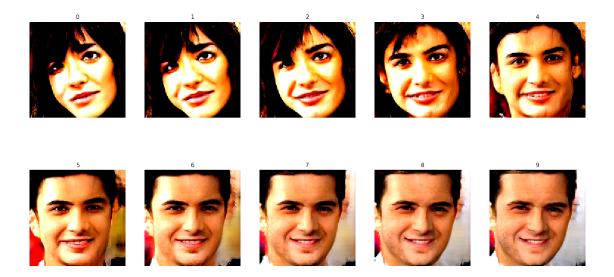
sess.run(initializer)

Interpolating between two faces using the z\_values from the session we ran

```
[13]: num_interps = 10
    z_interp = interpolate(z_values[11], z_values[14], num_interps)

[14]: images = generate(z_interp)
    images = sess.run(images)

[15]: plt.figure(figsize=(20,10))
    imgrid(images,cols=5)
```



### 2 Task 1:

- 1. Pick a face
- 2. Take the latent vector and create versions of that vector with some noise added to it, e.g.  $np.repeat(v, 10, axis=0) + 0.1 * tf.random_normal([10, 512]) here creating 10 versions of the vector with noise$

```
[51]: z_face = np.asarray([z_values[16]])
   images = generate(z_face)
   images = sess.run(images)

[52]: plt.figure(figsize=(10,5))
   imgrid(images,cols=1)
```

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[60]: z\_noisy = np.repeat(z\_face, 10, axis=0) + 0.3 \* tf.random\_normal([10, 512]) # I tried increasing and playing with the amounts of noise to explore the latent space around the z\_face I picked

[61]: images = generate(z\_noisy)
images = sess.run(images)

[63]: plt.figure(figsize=(20,10)) imgrid(images,cols=5)



#### 3 PG GAN from NVidia

[3]: import gdown gdown.download('https://drive.google.com/uc?

→id=188K19ucknC6wg1R6jbuPEhTq9zouf0x4', None, False)

Downloading...

From: https://drive.google.com/uc?id=188K19ucknC6wg1R6jbuPEhTq9zouf0x4To:

D:\Home\MediaLabs\CourseWork\Pattie\_CVGenerativeArtsML\week2\_hw\karras2018iclr-celebahq-1024x1024.pkl 277MB [00:26, 10.3MB/s]

- [3]: 'karras2018iclr-celebahq-1024x1024.pkl'

--2019-10-18 13:49:05-- https://raw.githubusercontent.com/tkarras/progressive\_g rowing\_of\_gans/master/tfutil.py
Resolving raw.githubusercontent.com (raw.githubusercontent.com)...
151.101.20.133
Connecting to raw.githubusercontent.com
(raw.githubusercontent.com)|151.101.20.133|:443... connected.
WARNING: cannot verify raw.githubusercontent.com's certificate, issued by 'CN=DigiCert SHA2 High Assurance Server CA,OU=www.digicert.com,O=DigiCert Inc,C=US':
 Unable to locally verify the issuer's authority.
HTTP request sent, awaiting response... 200 OK

```
Saving to: 'tfutil.py'
        OK ... ... ...
                                        100% 2.15M=0.02s
   2019-10-18 13:49:05 (2.15 MB/s) - 'tfutil.py' saved [37013/37013]
[5]: import tfutil
   import pickle
[6]: tf.reset_default_graph()
[7]: sess = tf.Session()
[8]: # Import network.
   with sess.as default():
       with open('karras2018iclr-celebahq-1024x1024.pkl', 'rb') as file:
            G, D, Gs = pickle.load(file)
   WARNING: Logging before flag parsing goes to stderr.
   W1018 13:49:23.104754 1292 deprecation wrapper.py:119] From
   D:\Home\MediaLabs\CourseWork\Pattie_CVGenerativeArtsML\week2_hw\tfutil.py:468:
   The name tf.get default graph is deprecated. Please use
   tf.compat.v1.get_default_graph instead.
   W1018 13:49:23.105751 1292 deprecation_wrapper.py:119] From
   D:\Home\MediaLabs\CourseWork\Pattie_CVGenerativeArtsML\week2_hw\tfutil.py:471:
   The name tf.variable_scope is deprecated. Please use tf.compat.v1.variable_scope
   instead.
   W1018 13:49:23.106768 1292 deprecation_wrapper.py:119] From
   D:\Home\MediaLabs\CourseWork\Pattie_CVGenerativeArtsML\week2_hw\tfutil.py:471:
   The name tf.AUTO_REUSE is deprecated. Please use tf.compat.v1.AUTO_REUSE
   instead.
   W1018 13:49:23.107747 1292 deprecation_wrapper.py:119] From
   D:\Home\MediaLabs\CourseWork\Pattie_CVGenerativeArtsML\week2_hw\tfutil.py:472:
   The name tf.get_variable_scope is deprecated. Please use
   tf.compat.v1.get_variable_scope instead.
   W1018 13:49:23.108744 1292 deprecation_wrapper.py:119] From
   D:\Home\MediaLabs\CourseWork\Pattie_CVGenerativeArtsML\week2_hw\tfutil.py:475:
   The name tf.placeholder is deprecated. Please use tf.compat.v1.placeholder
   instead.
```

Length: 37013 (36K) [text/plain]

#### Task2:

#### 4.0.1 Generate more faces

```
[20]: # Generate latent vectors.
     latents = np.random.RandomState(1000).randn(1000, *Gs.input_shapes[0][1:]) #__
     →1000 random latents
     # hand-picked top-10
     #latents = latents[[477, 56, 83, 887, 583, 391, 86, 340, 341, 415]]
     latents = latents[[0, 1, 2, 3, 4, 5, 6, 7, 8, 9]]
     # Generate dummy labels (not used by the official networks).
     labels = np.zeros([latents.shape[0]] + Gs.input_shapes[1][1:])
[21]: with sess.as_default():
         # Run the generator to produce a set of images.
         images = Gs.run(latents, labels, num_gpus=1)
     images = np.clip(np.rint((images + 1.0) / 2.0 * 255.0), 0.0, 255.0).astype(np.
     →uint8) # [-1,1] => [0,255]
     images = images.transpose(0, 2, 3, 1) # NCHW => NHWC
[22]: plt.figure(figsize=(20,10))
     imgrid(images)
```





















#### **5** Task3:

#### 5.0.1 Interpolate between 2 faces

```
[26]: z_interp = interpolate(latents[3], latents[9], 10)
z_interp.shape

[26]: (10, 512)

[27]: with sess.as_default():
    # Generate dummy labels (not used by the official networks).
    labels = np.zeros([z_interp.shape[0]] + Gs.input_shapes[1][1:])

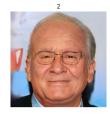
# Run the generator to produce a set of images.
    images = Gs.run(z_interp, labels, num_gpus=1)

    images = np.clip(np.rint((images + 1.0) / 2.0 * 255.0), 0.0, 255.0).
    astype(np.uint8) # [-1,1] => [0,255]
    images = images.transpose(0, 2, 3, 1) # NCHW => NHWC

[28]: plt.figure(figsize=(20,10))
    imgrid(images, cols=5)
```





















#### 6 Task3:

#### 6.0.1 Generate more noise variants of a single face

```
[29]: latent_face = np.asarray([latents[4]])
labels = np.zeros([latent_face.shape[0]] + Gs.input_shapes[1][1:])
```

```
[34]: with sess.as_default():
    # Run the generator to produce a set of images.
    images = Gs.run(latent_face, labels, num_gpus=1)

images = np.clip(np.rint((images + 1.0) / 2.0 * 255.0), 0.0, 255.0).astype(np.
    uint8) # [-1,1] => [0,255]
    images = images.transpose(0, 2, 3, 1) # NCHW => NHWC
[37]: plt.figure(figsize=(10,5))
    imgrid(images, cols=1)
```



```
[59]: latent_noisy = np.repeat(latent_face, 10, axis=0) + 0.1 * np.random.

→normal(0,5,[10, 512])

# I tried increasing and playing with the amounts of noise to explore the latent space around the z_face I picked

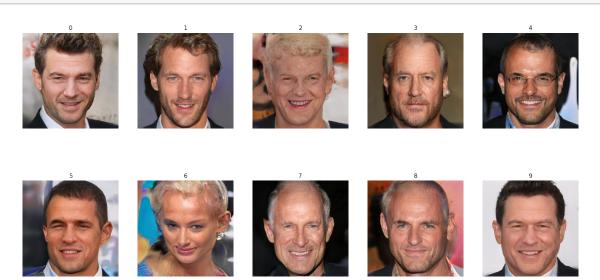
labels = np.zeros([latent_noisy.shape[0]] + Gs.input_shapes[1][1:])

[57]: with sess.as_default():

# Run the generator to produce a set of images.

images = Gs.run(latent_noisy, labels, num_gpus=1)
```

[58]: plt.figure(figsize=(20,10)) imgrid(images, cols=5)



[]: