

cs2_hrnet

July 30, 2021

1 Libraries

```
[1]: import warnings
warnings.filterwarnings('ignore')
import os
import sys
import numpy as np
import pandas as pd
from tqdm import tqdm
pd.set_option("display.max_colwidth", -1)
import cv2
import matplotlib.pyplot as plt
from sklearn.model_selection import train_test_split
import seaborn as sns
import datetime
from PIL import Image, ImageStat
import math
import tensorflow as tf
from tensorflow.keras.models import Model
from tensorflow.keras.layers import Input
from tensorflow.keras.layers import Activation
from tensorflow.keras.layers import BatchNormalization
from tensorflow.keras.layers import Conv2D
from tensorflow.keras.layers import UpSampling2D
from tensorflow.keras.layers import Add
from tensorflow.keras.initializers import RandomNormal
%load_ext tensorboard
```

```
[2]: #seeding
seed = 2021
np.random.seed = seed
tf.seed = seed
```

```
[3]: from google.colab import files
files.upload()
```

<IPython.core.display.HTML object>

Saving kaggle.json to kaggle.json

```
[3]: {'kaggle.json':  
      b'{"username":"maksahu","key":"cff8c0f086aa6e0e50553f7ab0580687"}'}
```

```
[4]: !mkdir -p ~/.kaggle  
      !cp kaggle.json ~/.kaggle/  
      !chmod 600 ~/.kaggle/kaggle.json
```

2 Data

```
[5]: !kaggle competitions download -c data-science-bowl-2018
```

```
Warning: Looks like you're using an outdated API Version, please consider  
updating (server 1.5.12 / client 1.5.4)  
Downloading stage1_sample_submission.csv.zip to /content  
 0% 0.00/2.62k [00:00<?, ?B/s]  
100% 2.62k/2.62k [00:00<00:00, 4.78MB/s]  
Downloading stage2_sample_submission_final.csv.zip to /content  
 0% 0.00/112k [00:00<?, ?B/s]  
100% 112k/112k [00:00<00:00, 37.6MB/s]  
Downloading stage1_train_labels.csv.zip to /content  
 0% 0.00/2.67M [00:00<?, ?B/s]  
100% 2.67M/2.67M [00:00<00:00, 87.1MB/s]  
Downloading stage1_solution.csv.zip to /content  
 0% 0.00/386k [00:00<?, ?B/s]  
100% 386k/386k [00:00<00:00, 125MB/s]  
Downloading stage1_train.zip to /content  
 78% 62.0M/79.1M [00:00<00:00, 150MB/s]  
100% 79.1M/79.1M [00:00<00:00, 227MB/s]  
Downloading stage1_test.zip to /content  
 0% 0.00/9.10M [00:00<?, ?B/s]  
100% 9.10M/9.10M [00:00<00:00, 150MB/s]  
Downloading stage2_test_final.zip to /content  
 95% 263M/276M [00:01<00:00, 232MB/s]  
100% 276M/276M [00:01<00:00, 224MB/s]
```

```
[6]: #Creating these two folder  
      !mkdir train test
```

```
[7]: #Unzipping the training and testing folders into directories  
      print('Unzipping stage1_train.zip')  
      !unzip -q "/content/stage1_train.zip" -d train/  
      print('Unzipped stage1_train.zip')  
  
      print('Unzipping stage1_test.zip')  
      !unzip -q "/content/stage1_train.zip" -d test/
```

```
print('Unzipped stage1_test.zip')
```

```
Unzipping stage1_train.zip
Unzipped stage1_train.zip
Unzipping stage1_test.zip
Unzipped stage1_test.zip
```

```
[8]: # Root directories for training and testing
TRAIN_ROOT = './train'
TEST_ROOT = './test'
```

```
[9]: # Function to create a dataframe of files which will be used for further
      ↪ processing
def files_df(root_dir):
    subdir = os.listdir(root_dir)
    files = []
    df = pd.DataFrame()
    for dir in subdir:
        files.append(os.path.join(root_dir,dir))
    df['files'] = files
    return df
```

```
[10]: train_df = files_df(TRAIN_ROOT)
test_df = files_df(TEST_ROOT)
```

```
[11]: # Hyperparameters
IMG_WIDTH = 256
IMG_HEIGHT = 256
IMG_CHANNELS = 3
CLASSES = 1
BATCH_SIZE = 8
```

```
[12]: # Function which will create a dataframe of image paths and mask paths along
      ↪ with creating a single mask with multiple masks
def image_df(filename):
    image_paths = []
    mask_paths = []
    df = pd.DataFrame()
    for filename in tqdm(filename):
        file_path = os.path.join(filename, 'images')
        image_path = os.path.join(file_path, os.listdir(file_path)[0])
        image_paths.append(image_path)

        mask = np.zeros((IMG_WIDTH, IMG_HEIGHT, CLASSES))
        mask_dir = file_path.replace("images", "masks")
        masks = os.listdir(mask_dir)
        for m in masks:
```

```

        mask_path = os.path.join(mask_dir,m)
        mask_ = cv2.imread(mask_path, cv2.IMREAD_UNCHANGED)
        mask_ = cv2.resize(mask_,(IMG_WIDTH,IMG_HEIGHT),interpolation=cv2.
→INTER_NEAREST)
        mask_ = np.expand_dims(mask_, axis = -1)
        mask = np.maximum(mask,mask_)
        newmask_dir = mask_dir.replace("masks", "masks_")
        if not os.path.isdir(newmask_dir):
            os.mkdir(newmask_dir)
        newmask_path = image_path.replace("images", "masks_")
        mask_paths.append(newmask_path)
        cv2.imwrite(newmask_path, mask)
    df['images'] = image_paths
    df['masks'] = mask_paths
    return df

```

```

[13]: # Training dataframe
train_filenames = train_df['files']
train = image_df(train_filenames)

```

100%| | 670/670 [00:25<00:00, 25.79it/s]

```

[14]: train.head()

```

```

[14]:                                     images
masks
0  ./train/d910b2b1be8406caecfe31a503d412ffc4e3d488286242ebc7381836121dd4ef/imag
es/d910b2b1be8406caecfe31a503d412ffc4e3d488286242ebc7381836121dd4ef.png  ./train
/d910b2b1be8406caecfe31a503d412ffc4e3d488286242ebc7381836121dd4ef/masks_/d910b2b
1be8406caecfe31a503d412ffc4e3d488286242ebc7381836121dd4ef.png
1  ./train/a7f767ca9770b160f234780e172aeb35a50830ba10dc49c526f4712451abe1d2/imag
es/a7f767ca9770b160f234780e172aeb35a50830ba10dc49c526f4712451abe1d2.png  ./train
/a7f767ca9770b160f234780e172aeb35a50830ba10dc49c526f4712451abe1d2/masks_/a7f767c
a9770b160f234780e172aeb35a50830ba10dc49c526f4712451abe1d2.png
2  ./train/be1916d0e5592c17f971315b5de720ef6894173087399daed94a52ef109c1572/imag
es/be1916d0e5592c17f971315b5de720ef6894173087399daed94a52ef109c1572.png  ./train
/be1916d0e5592c17f971315b5de720ef6894173087399daed94a52ef109c1572/masks_/be1916d
0e5592c17f971315b5de720ef6894173087399daed94a52ef109c1572.png
3  ./train/d751ccb64fa767a65a966061218438bd1860695d96bbef11fdb2f0d3b8dedba8/imag
es/d751ccb64fa767a65a966061218438bd1860695d96bbef11fdb2f0d3b8dedba8.png  ./train
/d751ccb64fa767a65a966061218438bd1860695d96bbef11fdb2f0d3b8dedba8/masks_/d751ccb
64fa767a65a966061218438bd1860695d96bbef11fdb2f0d3b8dedba8.png
4  ./train/80632d6be60c8462e50d51bcf5caf15308931603095d6b5e772a115cd0d0470c/imag
es/80632d6be60c8462e50d51bcf5caf15308931603095d6b5e772a115cd0d0470c.png  ./train
/80632d6be60c8462e50d51bcf5caf15308931603095d6b5e772a115cd0d0470c/masks_/80632d6
be60c8462e50d51bcf5caf15308931603095d6b5e772a115cd0d0470c.png

```

3 Train Test Split

```
[15]: X_train, X_val = train_test_split(train, test_size=0.1, random_state=42)
```

```
[16]: X_train.head()
```

```
[16]:                                     images
masks
300  ./train/c304a1fdf3bca2f4b4580d2cac59942e2224a7678001bf5ed9d9852f57708932/im
ages/c304a1fdf3bca2f4b4580d2cac59942e2224a7678001bf5ed9d9852f57708932.png  ./tra
in/c304a1fdf3bca2f4b4580d2cac59942e2224a7678001bf5ed9d9852f57708932/masks_/c304a
1fdf3bca2f4b4580d2cac59942e2224a7678001bf5ed9d9852f57708932.png
60   ./train/9e4f8ec60a0d622a02c0e16eedcc0101f88ddefbcec2383946c4572b57a1e43a/im
ages/9e4f8ec60a0d622a02c0e16eedcc0101f88ddefbcec2383946c4572b57a1e43a.png  ./tra
in/9e4f8ec60a0d622a02c0e16eedcc0101f88ddefbcec2383946c4572b57a1e43a/masks_/9e4f8
ec60a0d622a02c0e16eedcc0101f88ddefbcec2383946c4572b57a1e43a.png
133  ./train/6c67b78e8164801059375ed9a607f61e67a7ae347e92e36a7f20514224541d56/im
ages/6c67b78e8164801059375ed9a607f61e67a7ae347e92e36a7f20514224541d56.png  ./tra
in/6c67b78e8164801059375ed9a607f61e67a7ae347e92e36a7f20514224541d56/masks_/6c67b
78e8164801059375ed9a607f61e67a7ae347e92e36a7f20514224541d56.png
30   ./train/0bda515e370294ed94efd36bd53782288acacb040c171df2ed97fd691fc9d8fe/im
ages/0bda515e370294ed94efd36bd53782288acacb040c171df2ed97fd691fc9d8fe.png  ./tra
in/0bda515e370294ed94efd36bd53782288acacb040c171df2ed97fd691fc9d8fe/masks_/0bda5
15e370294ed94efd36bd53782288acacb040c171df2ed97fd691fc9d8fe.png
69   ./train/623cf6987b3fac8f384c09f40d98c5e739c097aa9a9627054542aa27f7d38db1/im
ages/623cf6987b3fac8f384c09f40d98c5e739c097aa9a9627054542aa27f7d38db1.png  ./tra
in/623cf6987b3fac8f384c09f40d98c5e739c097aa9a9627054542aa27f7d38db1/masks_/623cf
6987b3fac8f384c09f40d98c5e739c097aa9a9627054542aa27f7d38db1.png
```

```
[17]: X_val.head()
```

```
[17]:                                     images
masks
361  ./train/c395870ad9f5a3ae651b50efab9b20c3e6b9aea15d4c731eb34c0cf9e3800a72/im
ages/c395870ad9f5a3ae651b50efab9b20c3e6b9aea15d4c731eb34c0cf9e3800a72.png  ./tra
in/c395870ad9f5a3ae651b50efab9b20c3e6b9aea15d4c731eb34c0cf9e3800a72/masks_/c3958
70ad9f5a3ae651b50efab9b20c3e6b9aea15d4c731eb34c0cf9e3800a72.png
158  ./train/fc345dac2205deb169bd70197f07f053bada80b61ffa69fd9b490758323ead69/im
ages/fc345dac2205deb169bd70197f07f053bada80b61ffa69fd9b490758323ead69.png  ./tra
in/fc345dac2205deb169bd70197f07f053bada80b61ffa69fd9b490758323ead69/masks_/fc345
dac2205deb169bd70197f07f053bada80b61ffa69fd9b490758323ead69.png
480  ./train/8f94a80b95a881d0efdec36affc915dca9609f4cba8134c4a91b219d418778aa/im
ages/8f94a80b95a881d0efdec36affc915dca9609f4cba8134c4a91b219d418778aa.png  ./tra
in/8f94a80b95a881d0efdec36affc915dca9609f4cba8134c4a91b219d418778aa/masks_/8f94a
80b95a881d0efdec36affc915dca9609f4cba8134c4a91b219d418778aa.png
640  ./train/2cfa61bef6542dd359717e9131ce6f076c415a3bd7f48cb093b0d7f3b2ca785d/im
ages/2cfa61bef6542dd359717e9131ce6f076c415a3bd7f48cb093b0d7f3b2ca785d.png  ./tra
```

```
in/2cfa61bef6542dd359717e9131ce6f076c415a3bd7f48cb093b0d7f3b2ca785d/masks_/2cfa61bef6542dd359717e9131ce6f076c415a3bd7f48cb093b0d7f3b2ca785d.png
275  ./train/0d2bf916cc8de90d02f4cd4c23ea79b227dbc45d845b4124ffea380c92d34c8c/images/0d2bf916cc8de90d02f4cd4c23ea79b227dbc45d845b4124ffea380c92d34c8c.png  ./train/0d2bf916cc8de90d02f4cd4c23ea79b227dbc45d845b4124ffea380c92d34c8c/masks_/0d2bf916cc8de90d02f4cd4c23ea79b227dbc45d845b4124ffea380c92d34c8c.png
```

4 Data Preprocessing

```
[18]: # Function to parse image and mask file path and convert them into image and mask
def parse_function(image_path, mask_path):
    image_string = tf.io.read_file(image_path)
    image = tf.image.decode_png(image_string, channels=IMG_CHANNELS)#
    image = tf.image.convert_image_dtype(image, tf.float32)
    image = tf.image.resize(image, [IMG_HEIGHT, IMG_WIDTH]) # height x width

    mask_string = tf.io.read_file(mask_path)
    mask = tf.image.decode_png(mask_string, channels=CLASSES)#
    mask = tf.image.convert_image_dtype(mask, tf.float32)
    mask = tf.image.resize(mask, [IMG_HEIGHT, IMG_WIDTH])
    return image, mask
```

```
[19]: # Training dataset
train_ds = tf.data.Dataset.from_tensor_slices((X_train['images'],
↪X_train['masks']))
train_ds = train_ds.shuffle(X_train.shape[0])
train_ds = train_ds.map(parse_function, num_parallel_calls=tf.data.AUTOTUNE)
train_ds = train_ds.batch(BATCH_SIZE)
train_ds = train_ds.prefetch(1)
```

```
[20]: # Validation dataset
val_ds = tf.data.Dataset.from_tensor_slices((X_val['images'], X_val['masks']))
val_ds = val_ds.map(parse_function, num_parallel_calls=tf.data.AUTOTUNE)
val_ds = val_ds.batch(BATCH_SIZE)
val_ds = val_ds.prefetch(1)
```

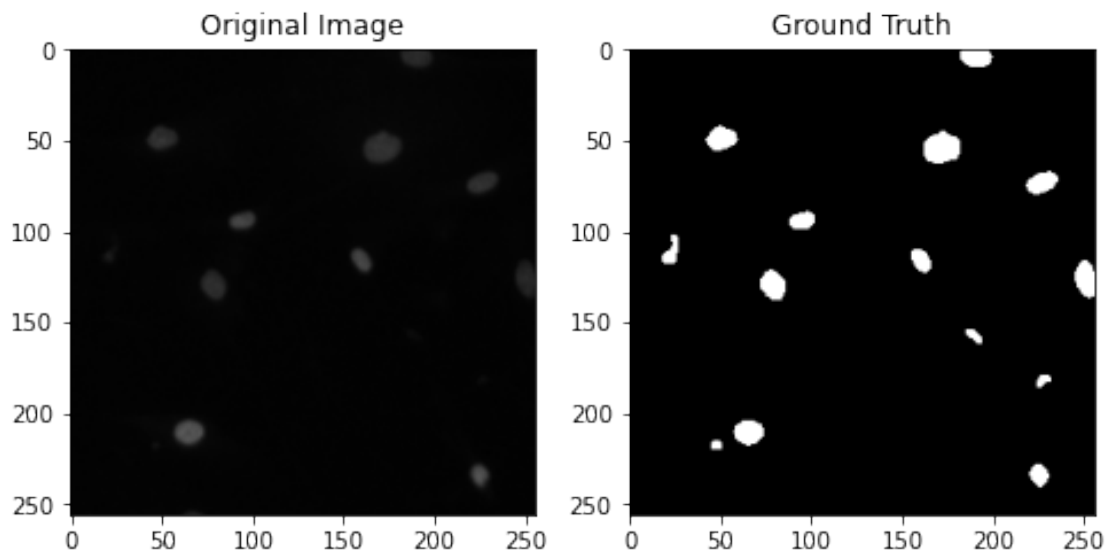
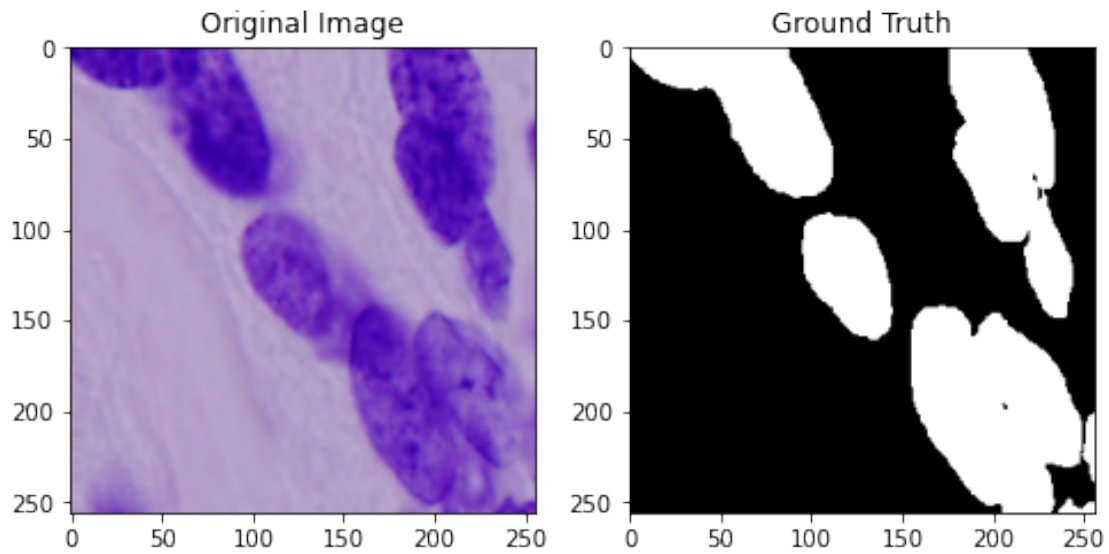
5 Sample of Train and Validation datasets

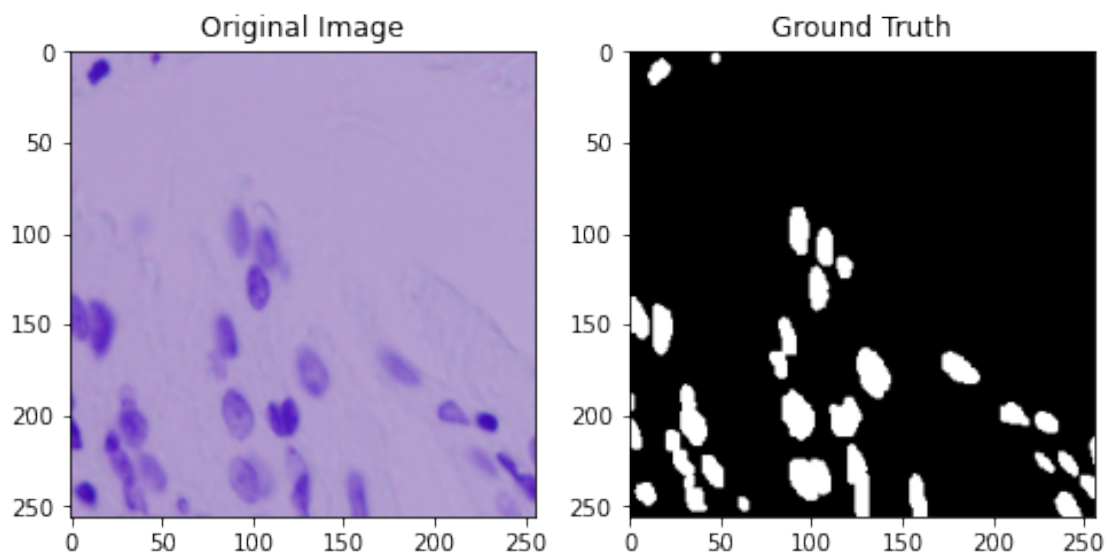
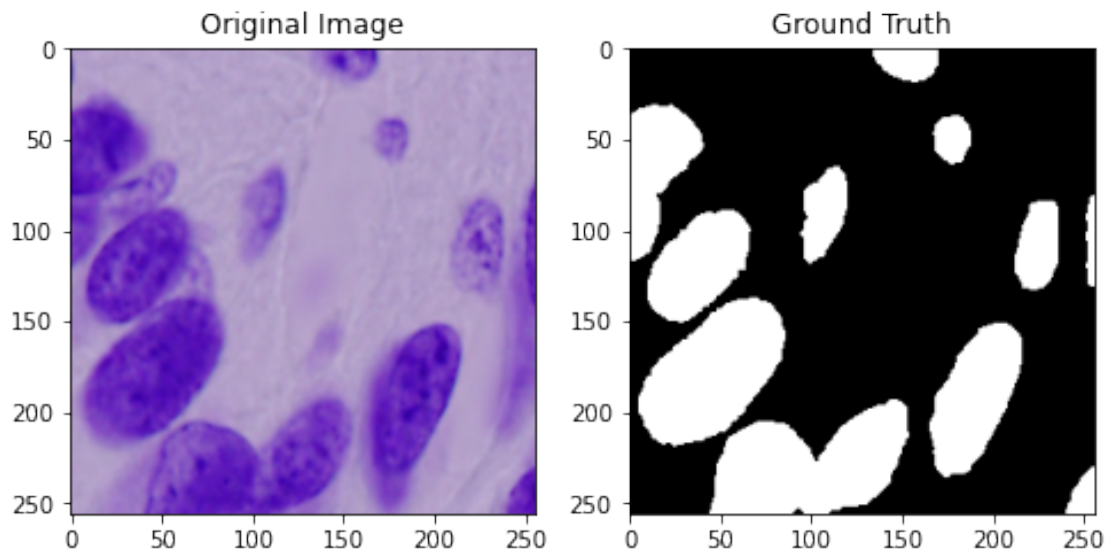
```
[21]: # Sample of training dataset
for image, mask in train_ds.take(1):
    for i in range(BATCH_SIZE):
        fig = plt.figure(figsize=(8,4))
        ax1 = fig.add_subplot(121)
        ax1.title.set_text('Original Image')
```

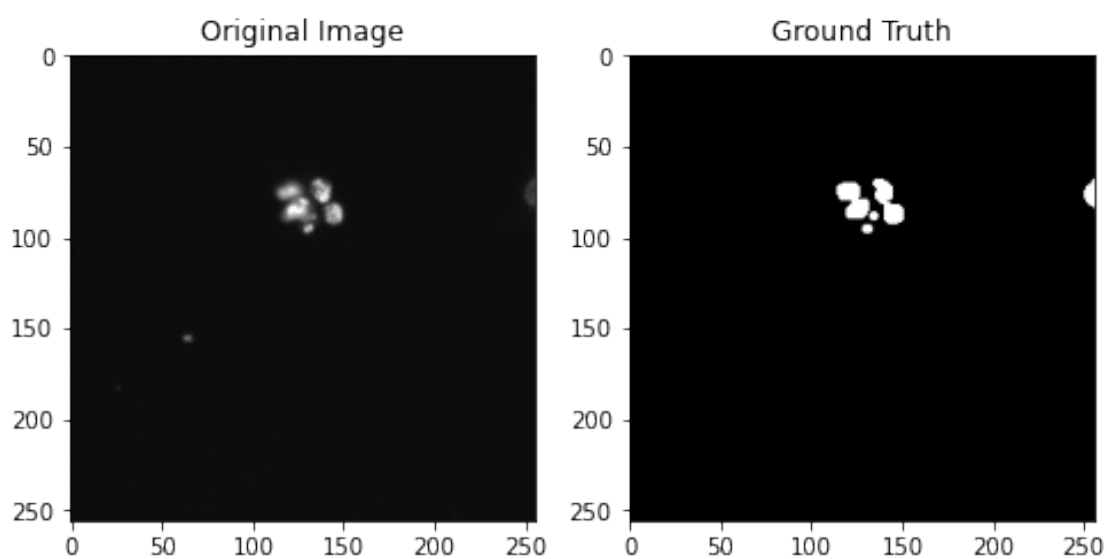
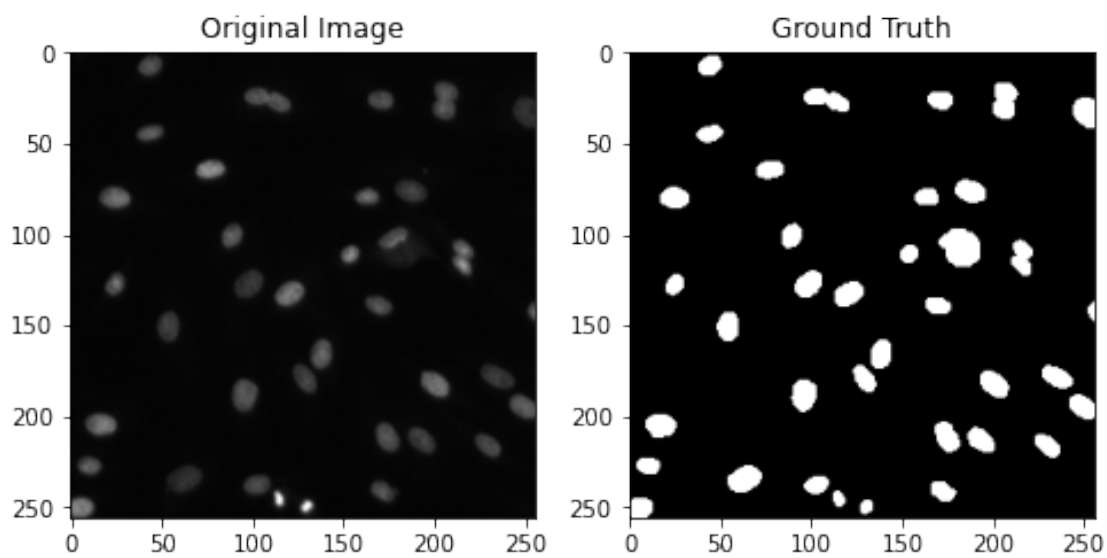
```

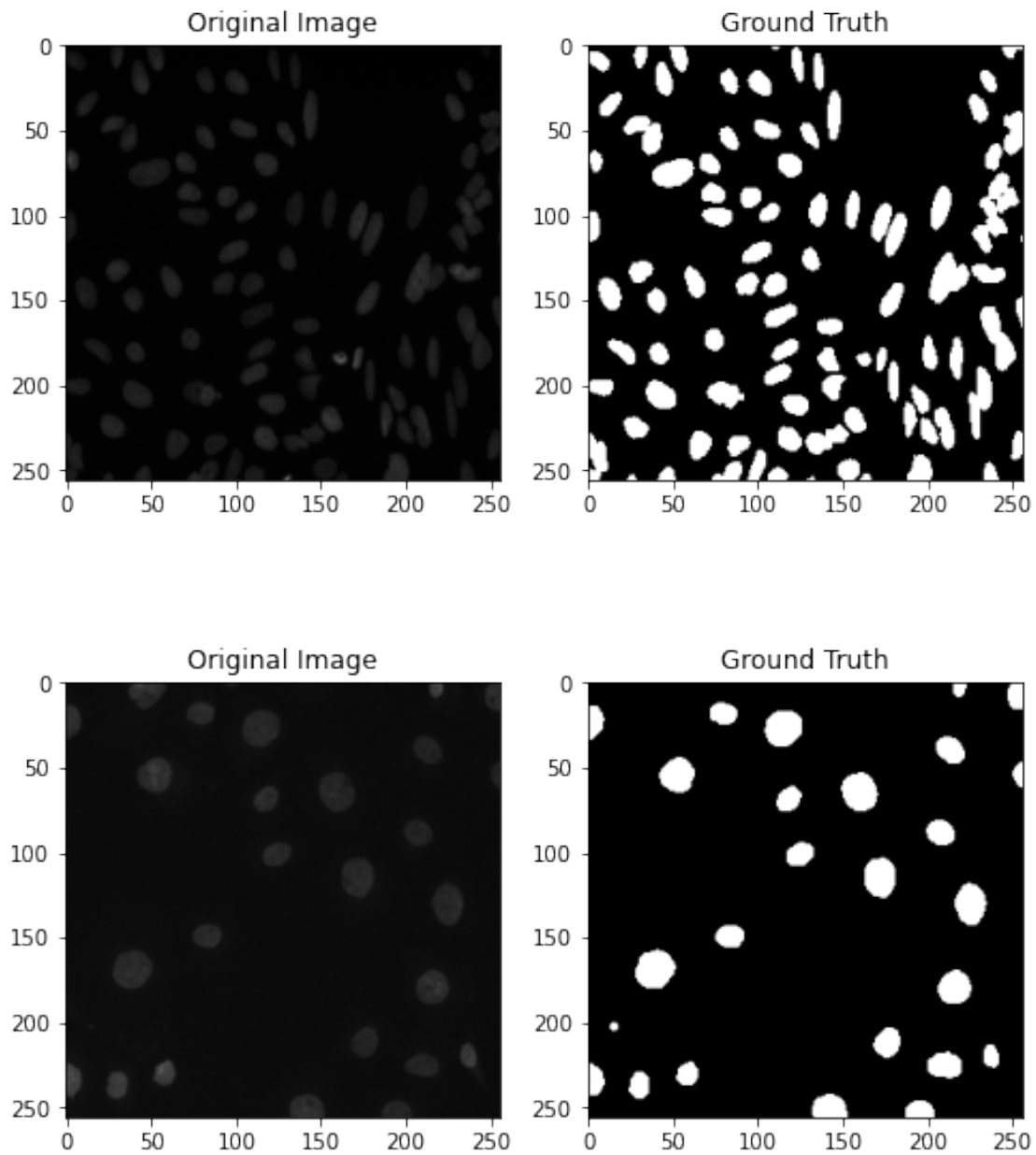
ax1.imshow(image[i])
ax2 = fig.add_subplot(122)
ax2.title.set_text('Ground Truth')
ax2.imshow(mask[i][:,:,0], cmap='gray')
plt.show()

```



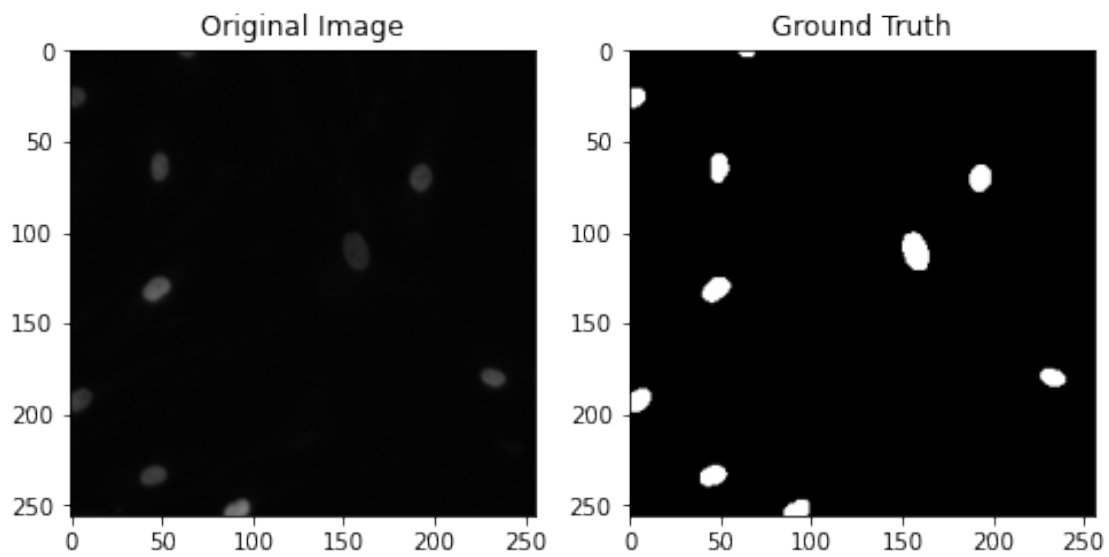
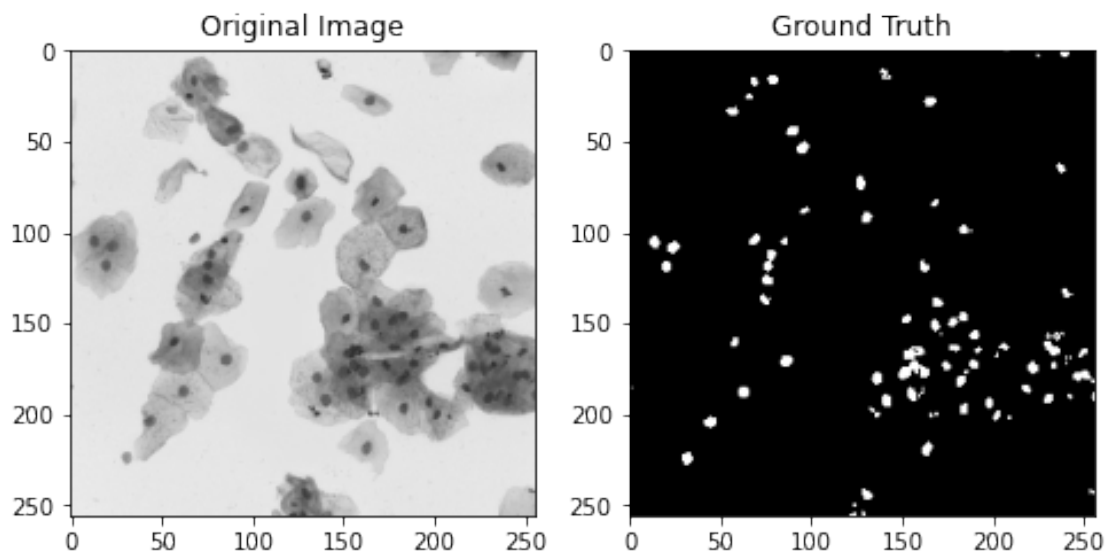


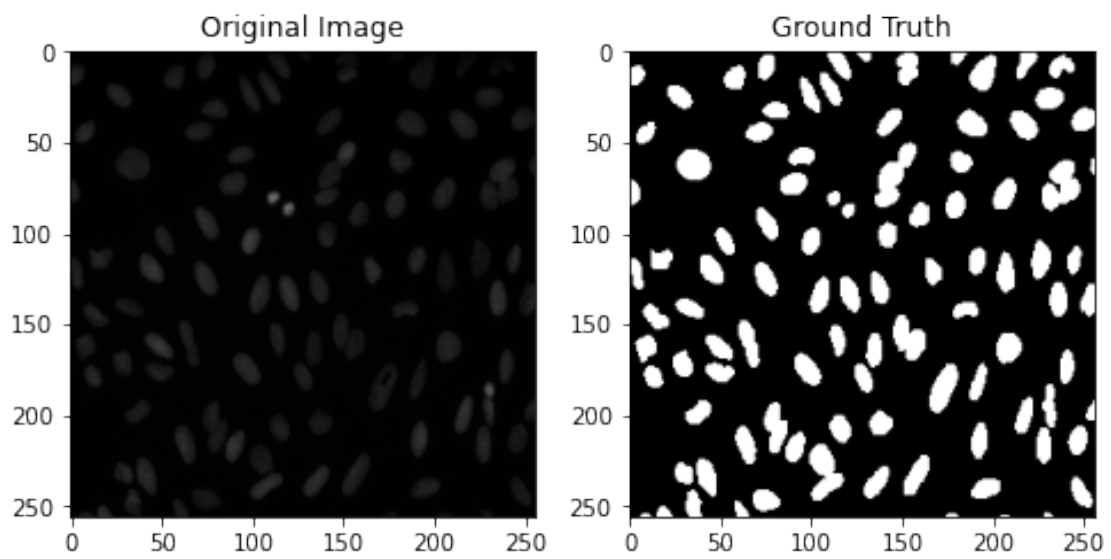
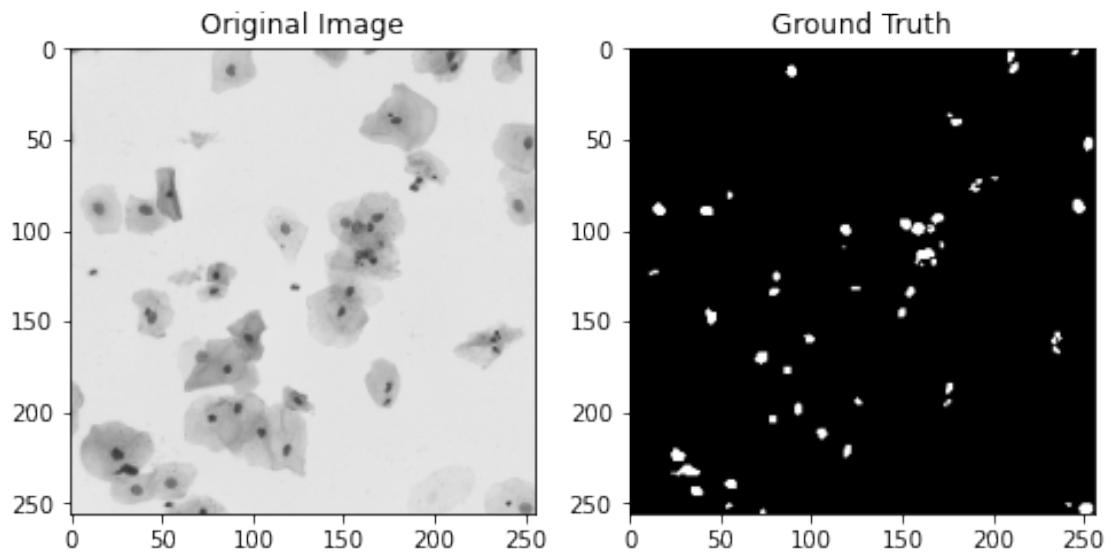


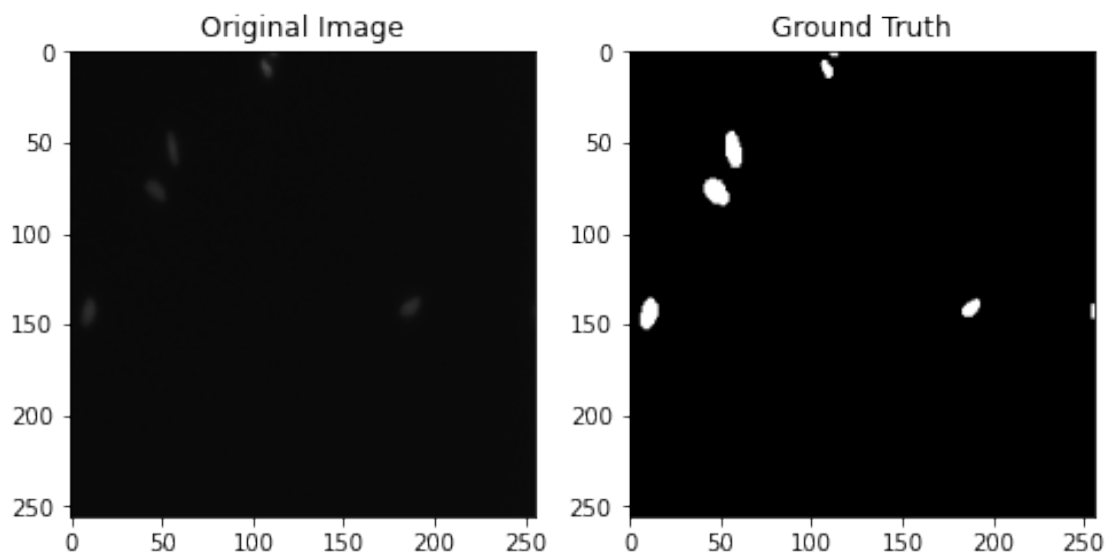
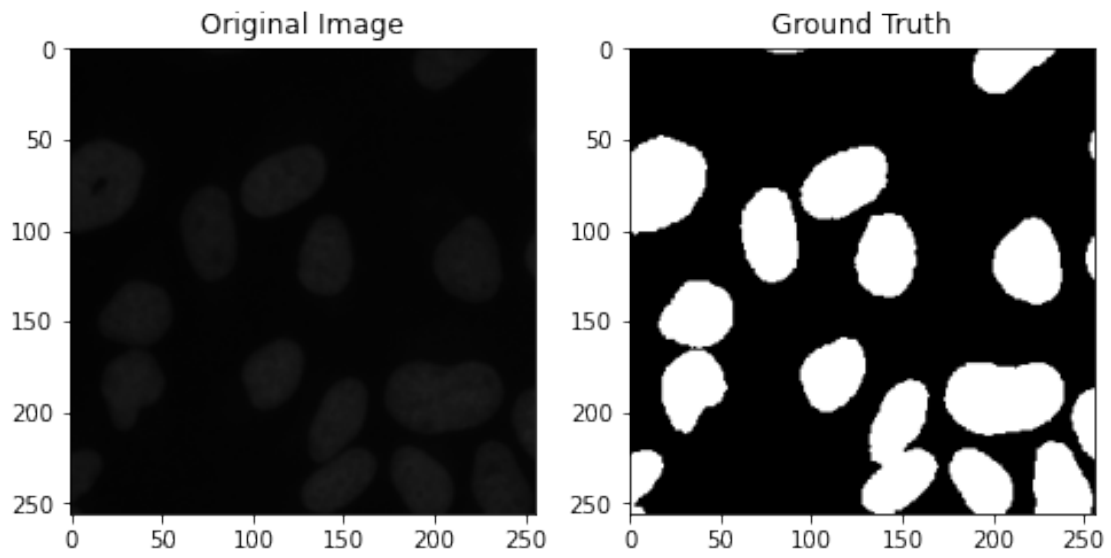


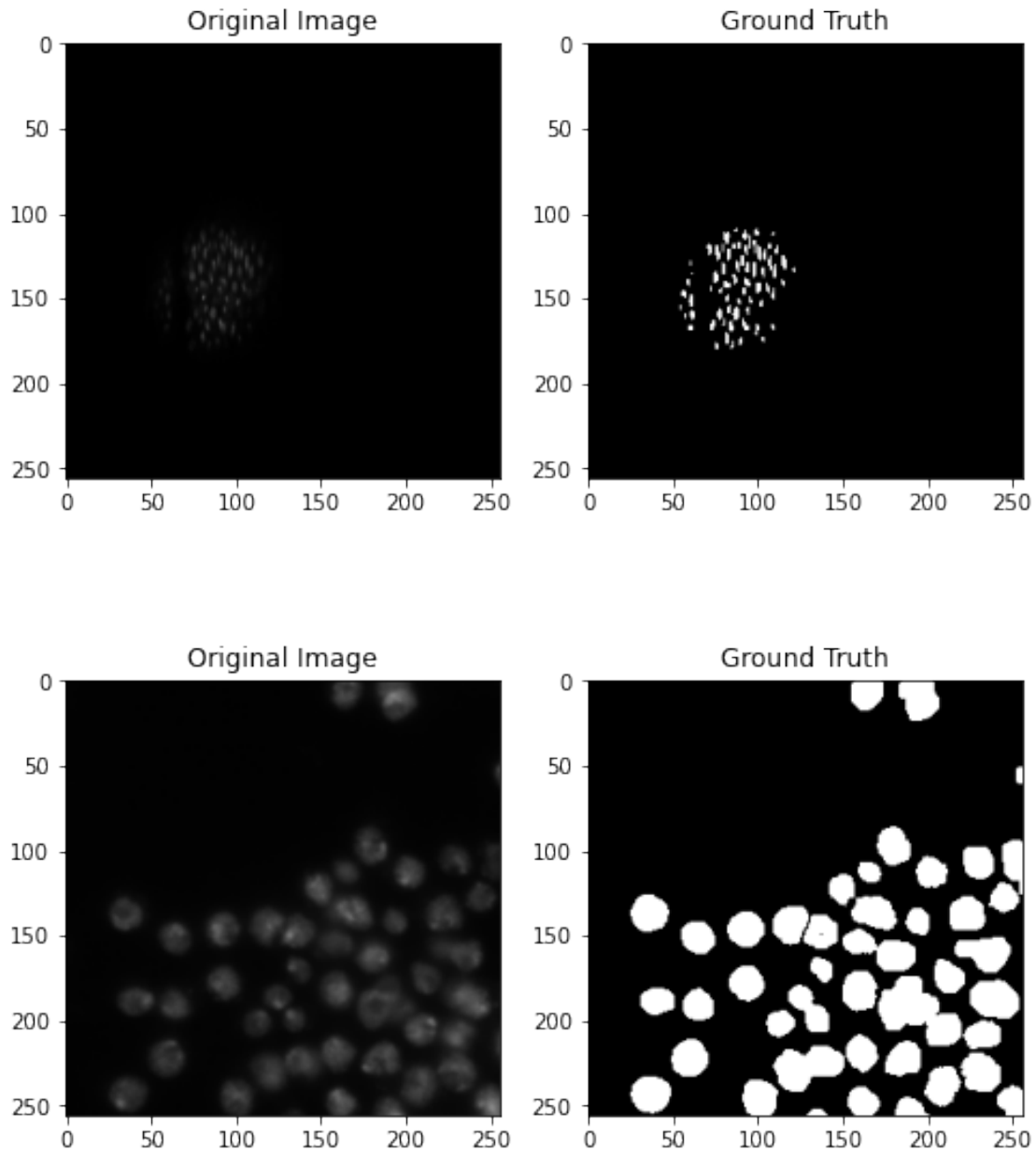
```
[22]: # Sample of validation dataset
for image, mask in val_ds.take(1):
    for i in range(BATCH_SIZE):
        fig = plt.figure(figsize=(8,4))
        ax1 = fig.add_subplot(121)
        ax1.title.set_text('Original Image')
        ax1.imshow(image[i])
        ax2 = fig.add_subplot(122)
        ax2.title.set_text('Ground Truth')
```

```
ax2.imshow(mask[i][:,:,0], cmap='gray')  
plt.show()
```









6 HRNet

6.1 Performance Metric

```
[23]: # Custom MeanIoU Metric function
class MeanIoU(tf.keras.metrics.Metric):
    def __init__(self, num_classes, thres=0.5, name='mean_iou', dtype=None):
        super(MeanIoU, self).__init__(name=name, dtype=dtype)
        self.num_classes = num_classes
```

```

self.thres = thres
self.total_cm = self.add_weight('total_confusion_matrix',
                                shape=(num_classes, num_classes),
                                initializer=tf.zeros_initializer())

def update_state(self, y_true, y_pred, sample_weight=None):

    y_true = tf.cast(y_true, self._dtype)
    y_pred = tf.cast(y_pred, self._dtype)
    if y_pred.shape.ndims > 1:
        y_pred = tf.reshape(y_pred, [-1])
    if y_true.shape.ndims > 1:
        y_true = tf.reshape(y_true, [-1])

    y_pred = tf.where(y_pred > self.thres, 1.0, 0.0)

    if sample_weight is not None:
        sample_weight = tf.cast(sample_weight, self._dtype)
        if sample_weight.shape.ndims > 1:
            sample_weight = tf.reshape(sample_weight, [-1])
    current_cm = tf.math.confusion_matrix(y_true,
                                          y_pred,
                                          self.num_classes,
                                          weights=sample_weight,
                                          dtype=self._dtype)

    return self.total_cm.assign_add(current_cm)

def result(self):
    sum_over_row = tf.cast(tf.reduce_sum(self.total_cm, axis=0), dtype=self.
↪_dtype)
    sum_over_col = tf.cast(tf.reduce_sum(self.total_cm, axis=1), dtype=self.
↪_dtype)
    true_positives = tf.cast(tf.linalg.tensor_diag_part(self.total_cm),
↪dtype=self._dtype)
    denominator = sum_over_row + sum_over_col - true_positives
    num_valid_entries = tf.reduce_sum(tf.cast(tf.math.
↪not_equal(denominator, 0), dtype=self._dtype))
    iou = tf.math.divide_no_nan(true_positives, denominator)
    return tf.math.divide_no_nan(tf.reduce_sum(iou, name='mean_iou'),
↪num_valid_entries)

def reset_states(self):
    # The state of the metric will be reset at the start of each epoch.
    tf.keras.backend.set_value(self.total_cm, np.zeros((self.num_classes,
↪self.num_classes)))

```

```

def get_config(self):
    config = {'num_classes': self.num_classes}
    base_config = super(MeanIoU, self).get_config()
    return dict(list(base_config.items()) + list(config.items()))

```

6.2 Architecture

```

[54]: # Hyperparameters
BN_MOMENTUM = 0.1
BN_EPSILON = 1e-5
INITIALIZER = 'he_normal' #RandomNormal(stddev=0.001)#'glorot_normal'

[55]: # Functions to build layers
# code referred from https://github.com/1044197988/TF.
↳Keras-Commonly-used-models/blob/master/
↳%E5%B8%B8%E7%94%A8%E5%88%86%E5%89%B2%E6%A8%A1%E5%9E%8B/HRNet.py
def conv(x, outsize, kernel_size, strides_=1, padding_='same', activation=None):
    return Conv2D(outsize, kernel_size, strides=strides_, padding=padding_,
                  kernel_initializer=INITIALIZER, use_bias=False,
                  activation=activation)(x)

def BasicBlock(x, size, downsampe=False):
    residual = x

    out = conv(x, size, 3)
    out = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(out)
    out = Activation('relu')(out)

    out = conv(out, size, 3)
    out = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(out)

    if downsampe:
        residual = conv(x, size, 1, padding_='valid')
        residual = BatchNormalization(epsilon=BN_EPSILON,
↳momentum=BN_MOMENTUM)(residual)

    out = Add()([out, residual])
    out = Activation('relu')(out)

    return out

def BottleNeckBlock(x, size, downsampe=False):
    residual = x

    out = conv(x, size, 1, padding_='valid')
    out = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(out)

```



```

out = Activation('relu')(out)

out = conv(out, size, 3)
out = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(out)
out = Activation('relu')(out)

out = conv(out, size * 4, 1, padding_='valid')
out = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(out)

if downsampe:
    residual = conv(x, size * 4, 1, padding_='valid')
    residual = BatchNormalization(epsilon=BN_EPSILON,
↪momentum=BN_MOMENTUM)(residual)

out = Add()([out, residual])
out = Activation('relu')(out)

return out

def layer1(x):
    x = BottleNeckBlock(x, 64, downsampe=True)
    x = BottleNeckBlock(x, 64)
    x = BottleNeckBlock(x, 64)
    x = BottleNeckBlock(x, 64)

    return x

def transition_layer(x, in_channels, out_channels):
    num_in = len(in_channels)
    num_out = len(out_channels)
    out = []

    for i in range(num_out):
        if i < num_in:
            if in_channels[i] != out_channels[i]:
                residual = conv(x[i], out_channels[i], 3)
                residual = BatchNormalization(epsilon=BN_EPSILON,
↪momentum=BN_MOMENTUM)(residual)
                residual = Activation('relu')(residual)
                out.append(residual)
            else:
                out.append(x[i])
        else:
            residual = conv(x[-1], out_channels[i], 3, strides_=2)
            residual = BatchNormalization(epsilon=BN_EPSILON,
↪momentum=BN_MOMENTUM)(residual)
            residual = Activation('relu')(residual)

```

```

        out.append(residual)

    return out

def branches(x, block_num, channels):
    out = []
    for i in range(len(channels)):
        residual = x[i]
        for j in range(block_num):
            residual = BasicBlock(residual, channels[i])
        out.append(residual)
    return out

def fuse_layers(x, channels, multi_scale_output=True):
    out = []

    for i in range(len(channels) if multi_scale_output else 1):
        residual = x[i]
        for j in range(len(channels)):
            if j > i:
                y = conv(x[j], channels[i], 1, padding='valid')
                y = BatchNormalization(epsilon=BN_EPSILON,
↪momentum=BN_MOMENTUM)(y)
                y = UpSampling2D(size=2 ** (j - i))(y)
                residual = Add()([residual, y])
            elif j < i:
                y = x[j]
                for k in range(i - j):
                    if k == i - j - 1:
                        y = conv(y, channels[i], 3, strides=2)
                        y = BatchNormalization(epsilon=BN_EPSILON,
↪momentum=BN_MOMENTUM)(y)
                    else:
                        y = conv(y, channels[j], 3, strides=2)
                        y = BatchNormalization(epsilon=BN_EPSILON,
↪momentum=BN_MOMENTUM)(y)
                y = Activation('relu')(y)
                residual = Add()([residual, y])

        residual = Activation('relu')(residual)
        out.append(residual)

    return out

```

[56]: *# Functions to create model*

```

# code referred from https://github.com/1044197988/TF.
↳Keras-Commonly-used-models/blob/master/
↳%E5%B8%B8%E7%94%A8%E5%88%86%E5%89%B2%E6%A8%A1%E5%9E%8B/HRNet.py
def HighResolutionModule(x, channels, multi_scale_output=True):
    residual = branches(x, 4, channels)
    out = fuse_layers(residual, channels, multi_scale_output=multi_scale_output)
    return out

def stage(x, num_modules, channels, multi_scale_output=True):
    out = x
    for i in range(num_modules):
        if i == num_modules - 1 and multi_scale_output == False:
            out = HighResolutionModule(out, channels, multi_scale_output=False)
        else:
            out = HighResolutionModule(out, channels)

    return out

def hrnet_keras(input_size=(256, 256, 3)):
    channels_2 = [32, 64]
    channels_3 = [32, 64, 128]
    channels_4 = [32, 64, 128, 256]
    num_modules_2 = 1
    num_modules_3 = 4
    num_modules_4 = 3

    inputs = Input(input_size)
    x = conv(inputs, 64, 3, strides=2)
    x = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(x)
    x = conv(x, 64, 3, strides=2)
    x = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(x)
    x = Activation('relu')(x)

    la1 = layer1(x)
    tr1 = transition_layer([la1], [256], channels_2)
    st2 = stage(tr1, num_modules_2, channels_2)
    tr2 = transition_layer(st2, channels_2, channels_3)
    st3 = stage(tr2, num_modules_3, channels_3)
    tr3 = transition_layer(st3, channels_3, channels_4)
    st4 = stage(tr3, num_modules_4, channels_4, multi_scale_output=False)
    up1 = UpSampling2D()(st4[0])
    up1 = conv(up1, 32, 3)
    up1 = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(up1)
    up1 = Activation('relu')(up1)
    up2 = UpSampling2D()(up1)

```

```

up2 = conv(up2, 32, 3)
up2 = BatchNormalization(epsilon=BN_EPSILON, momentum=BN_MOMENTUM)(up2)
up2 = Activation('relu')(up2)
final = conv(up2, 1, 1, padding_='valid', activation='sigmoid')

model = Model(inputs=inputs, outputs=final)

return model

```

```

[57]: model = hrnet_keras()
      model.summary()

```

Model: "model_2"

Layer (type)	Output Shape	Param #	Connected to
input_3 (InputLayer)	[(None, 256, 256, 3)]	0	
conv2d_590 (Conv2D)	(None, 128, 128, 64)	1728	input_3[0][0]
batch_normalization_588 (Batch Normalization)	(None, 128, 128, 64)	256	conv2d_590[0][0]
conv2d_591 (Conv2D)	(None, 64, 64, 64)	36864	batch_normalization_588[0][0]
batch_normalization_589 (Batch Normalization)	(None, 64, 64, 64)	256	conv2d_591[0][0]
activation_524 (Activation)	(None, 64, 64, 64)	0	batch_normalization_589[0][0]
conv2d_592 (Conv2D)	(None, 64, 64, 64)	4096	activation_524[0][0]
batch_normalization_590 (Batch Normalization)	(None, 64, 64, 64)	256	conv2d_592[0][0]

```

-----
activation_525 (Activation)      (None, 64, 64, 64)    0
batch_normalization_590[0][0]

-----

conv2d_593 (Conv2D)             (None, 64, 64, 64)    36864
activation_525[0][0]

-----

batch_normalization_591 (BatchN (None, 64, 64, 64)    256
conv2d_593[0][0]

-----

activation_526 (Activation)      (None, 64, 64, 64)    0
batch_normalization_591[0][0]

-----

conv2d_594 (Conv2D)             (None, 64, 64, 256)   16384
activation_526[0][0]

-----

conv2d_595 (Conv2D)             (None, 64, 64, 256)   16384
activation_524[0][0]

-----

batch_normalization_592 (BatchN (None, 64, 64, 256)   1024
conv2d_594[0][0]

-----

batch_normalization_593 (BatchN (None, 64, 64, 256)   1024
conv2d_595[0][0]

-----

add_322 (Add)                   (None, 64, 64, 256)   0
batch_normalization_592[0][0]
batch_normalization_593[0][0]

-----

activation_527 (Activation)      (None, 64, 64, 256)   0          add_322[0][0]

-----

conv2d_596 (Conv2D)             (None, 64, 64, 64)    16384
activation_527[0][0]

-----

batch_normalization_594 (BatchN (None, 64, 64, 64)    256
conv2d_596[0][0]

```

```

-----
activation_528 (Activation)      (None, 64, 64, 64)    0
batch_normalization_594[0][0]

-----

conv2d_597 (Conv2D)             (None, 64, 64, 64)    36864
activation_528[0][0]

-----

batch_normalization_595 (BatchN (None, 64, 64, 64)    256
conv2d_597[0][0]

-----

activation_529 (Activation)      (None, 64, 64, 64)    0
batch_normalization_595[0][0]

-----

conv2d_598 (Conv2D)             (None, 64, 64, 256)   16384
activation_529[0][0]

-----

batch_normalization_596 (BatchN (None, 64, 64, 256)   1024
conv2d_598[0][0]

-----

add_323 (Add)                   (None, 64, 64, 256)   0
batch_normalization_596[0][0]
activation_527[0][0]

-----

activation_530 (Activation)      (None, 64, 64, 256)   0          add_323[0][0]

-----

conv2d_599 (Conv2D)             (None, 64, 64, 64)    16384
activation_530[0][0]

-----

batch_normalization_597 (BatchN (None, 64, 64, 64)    256
conv2d_599[0][0]

-----

activation_531 (Activation)      (None, 64, 64, 64)    0
batch_normalization_597[0][0]

-----

conv2d_600 (Conv2D)             (None, 64, 64, 64)    36864
activation_531[0][0]

-----

```

```

-----
batch_normalization_598 (BatchN (None, 64, 64, 64) 256
conv2d_600[0] [0]
-----

-----
activation_532 (Activation) (None, 64, 64, 64) 0
batch_normalization_598[0] [0]
-----

-----
conv2d_601 (Conv2D) (None, 64, 64, 256) 16384
activation_532[0] [0]
-----

-----
batch_normalization_599 (BatchN (None, 64, 64, 256) 1024
conv2d_601[0] [0]
-----

-----
add_324 (Add) (None, 64, 64, 256) 0
batch_normalization_599[0] [0]
activation_530[0] [0]
-----

-----
activation_533 (Activation) (None, 64, 64, 256) 0 add_324[0] [0]
-----

-----
conv2d_602 (Conv2D) (None, 64, 64, 64) 16384
activation_533[0] [0]
-----

-----
batch_normalization_600 (BatchN (None, 64, 64, 64) 256
conv2d_602[0] [0]
-----

-----
activation_534 (Activation) (None, 64, 64, 64) 0
batch_normalization_600[0] [0]
-----

-----
conv2d_603 (Conv2D) (None, 64, 64, 64) 36864
activation_534[0] [0]
-----

-----
batch_normalization_601 (BatchN (None, 64, 64, 64) 256
conv2d_603[0] [0]
-----

-----
activation_535 (Activation) (None, 64, 64, 64) 0
batch_normalization_601[0] [0]
-----

```

```

-----
conv2d_604 (Conv2D)                (None, 64, 64, 256) 16384
activation_535[0][0]
-----

-----
batch_normalization_602 (BatchN (None, 64, 64, 256) 1024
conv2d_604[0][0]
-----

-----
add_325 (Add)                      (None, 64, 64, 256) 0
batch_normalization_602[0][0]
activation_533[0][0]
-----

-----
activation_536 (Activation)         (None, 64, 64, 256) 0          add_325[0][0]
-----

-----
conv2d_605 (Conv2D)                (None, 64, 64, 32) 73728
activation_536[0][0]
-----

-----
batch_normalization_603 (BatchN (None, 64, 64, 32) 128
conv2d_605[0][0]
-----

-----
conv2d_606 (Conv2D)                (None, 32, 32, 64) 147456
activation_536[0][0]
-----

-----
activation_537 (Activation)         (None, 64, 64, 32) 0
batch_normalization_603[0][0]
-----

-----
batch_normalization_604 (BatchN (None, 32, 32, 64) 256
conv2d_606[0][0]
-----

-----
conv2d_607 (Conv2D)                (None, 64, 64, 32) 9216
activation_537[0][0]
-----

-----
activation_538 (Activation)         (None, 32, 32, 64) 0
batch_normalization_604[0][0]
-----

-----
batch_normalization_605 (BatchN (None, 64, 64, 32) 128
conv2d_607[0][0]
-----

```



```

-----
conv2d_615 (Conv2D)          (None, 32, 32, 64)    36864
activation_538[0][0]
-----

-----
activation_539 (Activation)   (None, 64, 64, 32)    0
batch_normalization_605[0][0]
-----

-----
batch_normalization_613 (BatchN (None, 32, 32, 64)    256
conv2d_615[0][0]
-----

-----
conv2d_608 (Conv2D)          (None, 64, 64, 32)    9216
activation_539[0][0]
-----

-----
activation_547 (Activation)   (None, 32, 32, 64)    0
batch_normalization_613[0][0]
-----

-----
batch_normalization_606 (BatchN (None, 64, 64, 32)    128
conv2d_608[0][0]
-----

-----
conv2d_616 (Conv2D)          (None, 32, 32, 64)    36864
activation_547[0][0]
-----

-----
add_326 (Add)                (None, 64, 64, 32)    0
batch_normalization_606[0][0]
activation_537[0][0]
-----

-----
batch_normalization_614 (BatchN (None, 32, 32, 64)    256
conv2d_616[0][0]
-----

-----
activation_540 (Activation)   (None, 64, 64, 32)    0          add_326[0][0]
-----

-----
add_330 (Add)                (None, 32, 32, 64)    0
batch_normalization_614[0][0]
activation_538[0][0]
-----

-----
conv2d_609 (Conv2D)          (None, 64, 64, 32)    9216
activation_540[0][0]

```

```

-----
activation_548 (Activation)      (None, 32, 32, 64)    0          add_330[0][0]
-----

batch_normalization_607 (BatchN (None, 64, 64, 32)    128
conv2d_609[0][0]
-----

conv2d_617 (Conv2D)            (None, 32, 32, 64)    36864
activation_548[0][0]
-----

activation_541 (Activation)      (None, 64, 64, 32)    0
batch_normalization_607[0][0]
-----

batch_normalization_615 (BatchN (None, 32, 32, 64)    256
conv2d_617[0][0]
-----

conv2d_610 (Conv2D)            (None, 64, 64, 32)    9216
activation_541[0][0]
-----

activation_549 (Activation)      (None, 32, 32, 64)    0
batch_normalization_615[0][0]
-----

batch_normalization_608 (BatchN (None, 64, 64, 32)    128
conv2d_610[0][0]
-----

conv2d_618 (Conv2D)            (None, 32, 32, 64)    36864
activation_549[0][0]
-----

add_327 (Add)                  (None, 64, 64, 32)    0
batch_normalization_608[0][0]
activation_540[0][0]
-----

batch_normalization_616 (BatchN (None, 32, 32, 64)    256
conv2d_618[0][0]
-----

activation_542 (Activation)      (None, 64, 64, 32)    0          add_327[0][0]
-----

```

```

-----
add_331 (Add) (None, 32, 32, 64) 0
batch_normalization_616[0][0]
activation_548[0][0]
-----

-----
conv2d_611 (Conv2D) (None, 64, 64, 32) 9216
activation_542[0][0]
-----

-----
activation_550 (Activation) (None, 32, 32, 64) 0 add_331[0][0]
-----

-----
batch_normalization_609 (BatchN (None, 64, 64, 32) 128
conv2d_611[0][0]
-----

-----
conv2d_619 (Conv2D) (None, 32, 32, 64) 36864
activation_550[0][0]
-----

-----
activation_543 (Activation) (None, 64, 64, 32) 0
batch_normalization_609[0][0]
-----

-----
batch_normalization_617 (BatchN (None, 32, 32, 64) 256
conv2d_619[0][0]
-----

-----
conv2d_612 (Conv2D) (None, 64, 64, 32) 9216
activation_543[0][0]
-----

-----
activation_551 (Activation) (None, 32, 32, 64) 0
batch_normalization_617[0][0]
-----

-----
batch_normalization_610 (BatchN (None, 64, 64, 32) 128
conv2d_612[0][0]
-----

-----
conv2d_620 (Conv2D) (None, 32, 32, 64) 36864
activation_551[0][0]
-----

-----
add_328 (Add) (None, 64, 64, 32) 0
batch_normalization_610[0][0]
activation_542[0][0]

```

```

-----
-----
batch_normalization_618 (BatchN (None, 32, 32, 64) 256
conv2d_620[0][0]
-----
-----
activation_544 (Activation) (None, 64, 64, 32) 0 add_328[0][0]
-----
-----
add_332 (Add) (None, 32, 32, 64) 0
batch_normalization_618[0][0]
activation_550[0][0]
-----
-----
conv2d_613 (Conv2D) (None, 64, 64, 32) 9216
activation_544[0][0]
-----
-----
activation_552 (Activation) (None, 32, 32, 64) 0 add_332[0][0]
-----
-----
batch_normalization_611 (BatchN (None, 64, 64, 32) 128
conv2d_613[0][0]
-----
-----
conv2d_621 (Conv2D) (None, 32, 32, 64) 36864
activation_552[0][0]
-----
-----
activation_545 (Activation) (None, 64, 64, 32) 0
batch_normalization_611[0][0]
-----
-----
batch_normalization_619 (BatchN (None, 32, 32, 64) 256
conv2d_621[0][0]
-----
-----
conv2d_614 (Conv2D) (None, 64, 64, 32) 9216
activation_545[0][0]
-----
-----
activation_553 (Activation) (None, 32, 32, 64) 0
batch_normalization_619[0][0]
-----
-----
batch_normalization_612 (BatchN (None, 64, 64, 32) 128
conv2d_614[0][0]
-----

```

```

-----
conv2d_622 (Conv2D) (None, 32, 32, 64) 36864
activation_553[0][0]
-----

-----
add_329 (Add) (None, 64, 64, 32) 0
batch_normalization_612[0][0]
activation_544[0][0]
-----

-----
batch_normalization_620 (BatchN (None, 32, 32, 64) 256
conv2d_622[0][0]
-----

-----
activation_546 (Activation) (None, 64, 64, 32) 0 add_329[0][0]
-----

-----
add_333 (Add) (None, 32, 32, 64) 0
batch_normalization_620[0][0]
activation_552[0][0]
-----

-----
activation_554 (Activation) (None, 32, 32, 64) 0 add_333[0][0]
-----

-----
conv2d_624 (Conv2D) (None, 32, 32, 64) 18432
activation_546[0][0]
-----

-----
conv2d_623 (Conv2D) (None, 32, 32, 32) 2048
activation_554[0][0]
-----

-----
batch_normalization_622 (BatchN (None, 32, 32, 64) 256
conv2d_624[0][0]
-----

-----
batch_normalization_621 (BatchN (None, 32, 32, 32) 128
conv2d_623[0][0]
-----

-----
add_335 (Add) (None, 32, 32, 64) 0
activation_554[0][0]
batch_normalization_622[0][0]
-----

-----
up_sampling2d_60 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_621[0][0]

```

```

-----
-----
activation_556 (Activation)      (None, 32, 32, 64)  0          add_335[0][0]
-----
-----
add_334 (Add)                   (None, 64, 64, 32)  0
activation_546[0][0]
up_sampling2d_60[0][0]
-----
-----
conv2d_625 (Conv2D)             (None, 16, 16, 128) 73728
activation_556[0][0]
-----
-----
activation_555 (Activation)      (None, 64, 64, 32)  0          add_334[0][0]
-----
-----
batch_normalization_623 (BatchN (None, 16, 16, 128) 512
conv2d_625[0][0]
-----
-----
conv2d_626 (Conv2D)             (None, 64, 64, 32)  9216
activation_555[0][0]
-----
-----
conv2d_634 (Conv2D)             (None, 32, 32, 64)  36864
activation_556[0][0]
-----
-----
activation_557 (Activation)      (None, 16, 16, 128)  0
batch_normalization_623[0][0]
-----
-----
batch_normalization_624 (BatchN (None, 64, 64, 32)  128
conv2d_626[0][0]
-----
-----
batch_normalization_632 (BatchN (None, 32, 32, 64)  256
conv2d_634[0][0]
-----
-----
conv2d_642 (Conv2D)             (None, 16, 16, 128) 147456
activation_557[0][0]
-----
-----
activation_558 (Activation)      (None, 64, 64, 32)  0
batch_normalization_624[0][0]
-----

```

```

-----
activation_566 (Activation)      (None, 32, 32, 64)    0
batch_normalization_632[0][0]
-----

-----
batch_normalization_640 (BatchN (None, 16, 16, 128)  512
conv2d_642[0][0]
-----

-----
conv2d_627 (Conv2D)             (None, 64, 64, 32)    9216
activation_558[0][0]
-----

-----
conv2d_635 (Conv2D)             (None, 32, 32, 64)    36864
activation_566[0][0]
-----

-----
activation_574 (Activation)      (None, 16, 16, 128)   0
batch_normalization_640[0][0]
-----

-----
batch_normalization_625 (BatchN (None, 64, 64, 32)    128
conv2d_627[0][0]
-----

-----
batch_normalization_633 (BatchN (None, 32, 32, 64)    256
conv2d_635[0][0]
-----

-----
conv2d_643 (Conv2D)             (None, 16, 16, 128)  147456
activation_574[0][0]
-----

-----
add_336 (Add)                   (None, 64, 64, 32)    0
batch_normalization_625[0][0]
activation_555[0][0]
-----

-----
add_340 (Add)                   (None, 32, 32, 64)    0
batch_normalization_633[0][0]
activation_556[0][0]
-----

-----
batch_normalization_641 (BatchN (None, 16, 16, 128)  512
conv2d_643[0][0]
-----

-----
activation_559 (Activation)      (None, 64, 64, 32)    0          add_336[0][0]

```

```

-----
-----
activation_567 (Activation)      (None, 32, 32, 64)  0          add_340[0][0]
-----
-----
add_344 (Add)                   (None, 16, 16, 128) 0
batch_normalization_641[0][0]
activation_557[0][0]
-----
-----
conv2d_628 (Conv2D)             (None, 64, 64, 32)  9216
activation_559[0][0]
-----
-----
conv2d_636 (Conv2D)             (None, 32, 32, 64)  36864
activation_567[0][0]
-----
-----
activation_575 (Activation)      (None, 16, 16, 128) 0          add_344[0][0]
-----
-----
batch_normalization_626 (BatchN (None, 64, 64, 32)  128
conv2d_628[0][0]
-----
-----
batch_normalization_634 (BatchN (None, 32, 32, 64)  256
conv2d_636[0][0]
-----
-----
conv2d_644 (Conv2D)             (None, 16, 16, 128) 147456
activation_575[0][0]
-----
-----
activation_560 (Activation)      (None, 64, 64, 32)  0
batch_normalization_626[0][0]
-----
-----
activation_568 (Activation)      (None, 32, 32, 64)  0
batch_normalization_634[0][0]
-----
-----
batch_normalization_642 (BatchN (None, 16, 16, 128) 512
conv2d_644[0][0]
-----
-----
conv2d_629 (Conv2D)             (None, 64, 64, 32)  9216
activation_560[0][0]
-----

```



```

-----
conv2d_637 (Conv2D)          (None, 32, 32, 64)    36864
activation_568[0][0]
-----

-----
activation_576 (Activation)   (None, 16, 16, 128)   0
batch_normalization_642[0][0]
-----

-----
batch_normalization_627 (BatchN (None, 64, 64, 32)    128
conv2d_629[0][0]
-----

-----
batch_normalization_635 (BatchN (None, 32, 32, 64)    256
conv2d_637[0][0]
-----

-----
conv2d_645 (Conv2D)          (None, 16, 16, 128)   147456
activation_576[0][0]
-----

-----
add_337 (Add)                (None, 64, 64, 32)    0
batch_normalization_627[0][0]
activation_559[0][0]
-----

-----
add_341 (Add)                (None, 32, 32, 64)    0
batch_normalization_635[0][0]
activation_567[0][0]
-----

-----
batch_normalization_643 (BatchN (None, 16, 16, 128)   512
conv2d_645[0][0]
-----

-----
activation_561 (Activation)   (None, 64, 64, 32)    0          add_337[0][0]
-----

-----
activation_569 (Activation)   (None, 32, 32, 64)    0          add_341[0][0]
-----

-----
add_345 (Add)                (None, 16, 16, 128)   0
batch_normalization_643[0][0]
activation_575[0][0]
-----

-----
conv2d_630 (Conv2D)          (None, 64, 64, 32)    9216
activation_561[0][0]

```

```

-----
conv2d_638 (Conv2D)          (None, 32, 32, 64)  36864
activation_569[0][0]
-----
activation_577 (Activation)    (None, 16, 16, 128)  0          add_345[0][0]
-----
batch_normalization_628 (BatchN (None, 64, 64, 32)  128
conv2d_630[0][0]
-----
batch_normalization_636 (BatchN (None, 32, 32, 64)  256
conv2d_638[0][0]
-----
conv2d_646 (Conv2D)          (None, 16, 16, 128) 147456
activation_577[0][0]
-----
activation_562 (Activation)    (None, 64, 64, 32)  0
batch_normalization_628[0][0]
-----
activation_570 (Activation)    (None, 32, 32, 64)  0
batch_normalization_636[0][0]
-----
batch_normalization_644 (BatchN (None, 16, 16, 128) 512
conv2d_646[0][0]
-----
conv2d_631 (Conv2D)          (None, 64, 64, 32)  9216
activation_562[0][0]
-----
conv2d_639 (Conv2D)          (None, 32, 32, 64)  36864
activation_570[0][0]
-----
activation_578 (Activation)    (None, 16, 16, 128)  0
batch_normalization_644[0][0]
-----
batch_normalization_629 (BatchN (None, 64, 64, 32)  128
conv2d_631[0][0]
-----

```

```

-----
batch_normalization_637 (BatchN (None, 32, 32, 64) 256
conv2d_639[0][0]
-----

conv2d_647 (Conv2D) (None, 16, 16, 128) 147456
activation_578[0][0]
-----

add_338 (Add) (None, 64, 64, 32) 0
batch_normalization_629[0][0]
activation_561[0][0]
-----

add_342 (Add) (None, 32, 32, 64) 0
batch_normalization_637[0][0]
activation_569[0][0]
-----

batch_normalization_645 (BatchN (None, 16, 16, 128) 512
conv2d_647[0][0]
-----

activation_563 (Activation) (None, 64, 64, 32) 0 add_338[0][0]
-----

activation_571 (Activation) (None, 32, 32, 64) 0 add_342[0][0]
-----

add_346 (Add) (None, 16, 16, 128) 0
batch_normalization_645[0][0]
activation_577[0][0]
-----

conv2d_632 (Conv2D) (None, 64, 64, 32) 9216
activation_563[0][0]
-----

conv2d_640 (Conv2D) (None, 32, 32, 64) 36864
activation_571[0][0]
-----

activation_579 (Activation) (None, 16, 16, 128) 0 add_346[0][0]
-----

batch_normalization_630 (BatchN (None, 64, 64, 32) 128
conv2d_632[0][0]
-----

```

batch_normalization_638 (BatchN (None, 32, 32, 64) 256
conv2d_640[0][0]

conv2d_648 (Conv2D) (None, 16, 16, 128) 147456
activation_579[0][0]

activation_564 (Activation) (None, 64, 64, 32) 0
batch_normalization_630[0][0]

activation_572 (Activation) (None, 32, 32, 64) 0
batch_normalization_638[0][0]

batch_normalization_646 (BatchN (None, 16, 16, 128) 512
conv2d_648[0][0]

conv2d_633 (Conv2D) (None, 64, 64, 32) 9216
activation_564[0][0]

conv2d_641 (Conv2D) (None, 32, 32, 64) 36864
activation_572[0][0]

activation_580 (Activation) (None, 16, 16, 128) 0
batch_normalization_646[0][0]

batch_normalization_631 (BatchN (None, 64, 64, 32) 128
conv2d_633[0][0]

batch_normalization_639 (BatchN (None, 32, 32, 64) 256
conv2d_641[0][0]

conv2d_649 (Conv2D) (None, 16, 16, 128) 147456
activation_580[0][0]

add_339 (Add) (None, 64, 64, 32) 0
batch_normalization_631[0][0]
activation_563[0][0]

```

-----
-----
add_343 (Add) (None, 32, 32, 64) 0
batch_normalization_639[0][0]
activation_571[0][0]
-----
-----
batch_normalization_647 (BatchN (None, 16, 16, 128) 512
conv2d_649[0][0]
-----
-----
activation_565 (Activation) (None, 64, 64, 32) 0 add_339[0][0]
-----
-----
activation_573 (Activation) (None, 32, 32, 64) 0 add_343[0][0]
-----
-----
add_347 (Add) (None, 16, 16, 128) 0
batch_normalization_647[0][0]
activation_579[0][0]
-----
-----
conv2d_650 (Conv2D) (None, 32, 32, 32) 2048
activation_573[0][0]
-----
-----
activation_581 (Activation) (None, 16, 16, 128) 0 add_347[0][0]
-----
-----
conv2d_654 (Conv2D) (None, 32, 32, 32) 9216
activation_565[0][0]
-----
-----
batch_normalization_648 (BatchN (None, 32, 32, 32) 128
conv2d_650[0][0]
-----
-----
conv2d_651 (Conv2D) (None, 16, 16, 32) 4096
activation_581[0][0]
-----
-----
batch_normalization_652 (BatchN (None, 32, 32, 32) 128
conv2d_654[0][0]
-----
-----
up_sampling2d_61 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_648[0][0]
-----

```

```

-----
batch_normalization_649 (BatchN (None, 16, 16, 32) 128
conv2d_651[0] [0]
-----
-----
activation_584 (Activation) (None, 32, 32, 32) 0
batch_normalization_652[0] [0]
-----
-----
add_348 (Add) (None, 64, 64, 32) 0
activation_565[0] [0]
up_sampling2d_61[0] [0]
-----
-----
up_sampling2d_62 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_649[0] [0]
-----
-----
conv2d_655 (Conv2D) (None, 16, 16, 128) 36864
activation_584[0] [0]
-----
-----
add_349 (Add) (None, 64, 64, 32) 0 add_348[0] [0]
up_sampling2d_62[0] [0]
-----
-----
conv2d_652 (Conv2D) (None, 32, 32, 64) 18432
activation_565[0] [0]
-----
-----
conv2d_653 (Conv2D) (None, 16, 16, 64) 8192
activation_581[0] [0]
-----
-----
batch_normalization_653 (BatchN (None, 16, 16, 128) 512
conv2d_655[0] [0]
-----
-----
conv2d_656 (Conv2D) (None, 16, 16, 128) 73728
activation_573[0] [0]
-----
-----
activation_582 (Activation) (None, 64, 64, 32) 0 add_349[0] [0]
-----
-----
batch_normalization_650 (BatchN (None, 32, 32, 64) 256
conv2d_652[0] [0]
-----

```

```

-----
batch_normalization_651 (BatchN (None, 16, 16, 64) 256
conv2d_653[0][0]
-----
-----
add_352 (Add) (None, 16, 16, 128) 0
activation_581[0][0]
batch_normalization_653[0][0]
-----
-----
batch_normalization_654 (BatchN (None, 16, 16, 128) 512
conv2d_656[0][0]
-----
-----
conv2d_657 (Conv2D) (None, 64, 64, 32) 9216
activation_582[0][0]
-----
-----
add_350 (Add) (None, 32, 32, 64) 0
activation_573[0][0]
batch_normalization_650[0][0]
-----
-----
up_sampling2d_63 (UpSampling2D) (None, 32, 32, 64) 0
batch_normalization_651[0][0]
-----
-----
add_353 (Add) (None, 16, 16, 128) 0 add_352[0][0]
batch_normalization_654[0][0]
-----
-----
batch_normalization_655 (BatchN (None, 64, 64, 32) 128
conv2d_657[0][0]
-----
-----
add_351 (Add) (None, 32, 32, 64) 0 add_350[0][0]
up_sampling2d_63[0][0]
-----
-----
activation_585 (Activation) (None, 16, 16, 128) 0 add_353[0][0]
-----
-----
activation_586 (Activation) (None, 64, 64, 32) 0
batch_normalization_655[0][0]
-----
-----
activation_583 (Activation) (None, 32, 32, 64) 0 add_351[0][0]
-----

```

```

-----
conv2d_673 (Conv2D)          (None, 16, 16, 128)  147456
activation_585[0][0]
-----

conv2d_658 (Conv2D)          (None, 64, 64, 32)   9216
activation_586[0][0]
-----

conv2d_665 (Conv2D)          (None, 32, 32, 64)   36864
activation_583[0][0]
-----

batch_normalization_671 (BatchN (None, 16, 16, 128)  512
conv2d_673[0][0]
-----

batch_normalization_656 (BatchN (None, 64, 64, 32)   128
conv2d_658[0][0]
-----

batch_normalization_663 (BatchN (None, 32, 32, 64)   256
conv2d_665[0][0]
-----

activation_602 (Activation)    (None, 16, 16, 128)  0
batch_normalization_671[0][0]
-----

add_354 (Add)                 (None, 64, 64, 32)   0
batch_normalization_656[0][0]
activation_582[0][0]
-----

activation_594 (Activation)    (None, 32, 32, 64)   0
batch_normalization_663[0][0]
-----

conv2d_674 (Conv2D)          (None, 16, 16, 128)  147456
activation_602[0][0]
-----

activation_587 (Activation)    (None, 64, 64, 32)   0          add_354[0][0]
-----

conv2d_666 (Conv2D)          (None, 32, 32, 64)   36864
activation_594[0][0]
-----

```



```

-----
batch_normalization_672 (BatchN (None, 16, 16, 128) 512
conv2d_674[0][0]
-----

-----
conv2d_659 (Conv2D) (None, 64, 64, 32) 9216
activation_587[0][0]
-----

-----
batch_normalization_664 (BatchN (None, 32, 32, 64) 256
conv2d_666[0][0]
-----

-----
add_362 (Add) (None, 16, 16, 128) 0
batch_normalization_672[0][0]
activation_585[0][0]
-----

-----
batch_normalization_657 (BatchN (None, 64, 64, 32) 128
conv2d_659[0][0]
-----

-----
add_358 (Add) (None, 32, 32, 64) 0
batch_normalization_664[0][0]
activation_583[0][0]
-----

-----
activation_603 (Activation) (None, 16, 16, 128) 0 add_362[0][0]
-----

-----
activation_588 (Activation) (None, 64, 64, 32) 0
batch_normalization_657[0][0]
-----

-----
activation_595 (Activation) (None, 32, 32, 64) 0 add_358[0][0]
-----

-----
conv2d_675 (Conv2D) (None, 16, 16, 128) 147456
activation_603[0][0]
-----

-----
conv2d_660 (Conv2D) (None, 64, 64, 32) 9216
activation_588[0][0]
-----

-----
conv2d_667 (Conv2D) (None, 32, 32, 64) 36864
activation_595[0][0]
-----

```

```

-----
batch_normalization_673 (BatchN (None, 16, 16, 128) 512
conv2d_675[0][0]
-----
-----
batch_normalization_658 (BatchN (None, 64, 64, 32) 128
conv2d_660[0][0]
-----
-----
batch_normalization_665 (BatchN (None, 32, 32, 64) 256
conv2d_667[0][0]
-----
-----
activation_604 (Activation) (None, 16, 16, 128) 0
batch_normalization_673[0][0]
-----
-----
add_355 (Add) (None, 64, 64, 32) 0
batch_normalization_658[0][0]
activation_587[0][0]
-----
-----
activation_596 (Activation) (None, 32, 32, 64) 0
batch_normalization_665[0][0]
-----
-----
conv2d_676 (Conv2D) (None, 16, 16, 128) 147456
activation_604[0][0]
-----
-----
activation_589 (Activation) (None, 64, 64, 32) 0 add_355[0][0]
-----
-----
conv2d_668 (Conv2D) (None, 32, 32, 64) 36864
activation_596[0][0]
-----
-----
batch_normalization_674 (BatchN (None, 16, 16, 128) 512
conv2d_676[0][0]
-----
-----
conv2d_661 (Conv2D) (None, 64, 64, 32) 9216
activation_589[0][0]
-----
-----
batch_normalization_666 (BatchN (None, 32, 32, 64) 256
conv2d_668[0][0]
-----

```

```

-----
add_363 (Add) (None, 16, 16, 128) 0
batch_normalization_674[0][0]
activation_603[0][0]
-----

batch_normalization_659 (BatchN (None, 64, 64, 32) 128
conv2d_661[0][0]
-----

add_359 (Add) (None, 32, 32, 64) 0
batch_normalization_666[0][0]
activation_595[0][0]
-----

activation_605 (Activation) (None, 16, 16, 128) 0 add_363[0][0]
-----

activation_590 (Activation) (None, 64, 64, 32) 0
batch_normalization_659[0][0]
-----

activation_597 (Activation) (None, 32, 32, 64) 0 add_359[0][0]
-----

conv2d_677 (Conv2D) (None, 16, 16, 128) 147456
activation_605[0][0]
-----

conv2d_662 (Conv2D) (None, 64, 64, 32) 9216
activation_590[0][0]
-----

conv2d_669 (Conv2D) (None, 32, 32, 64) 36864
activation_597[0][0]
-----

batch_normalization_675 (BatchN (None, 16, 16, 128) 512
conv2d_677[0][0]
-----

batch_normalization_660 (BatchN (None, 64, 64, 32) 128
conv2d_662[0][0]
-----

batch_normalization_667 (BatchN (None, 32, 32, 64) 256
conv2d_669[0][0]
-----

```

```

-----
activation_606 (Activation)      (None, 16, 16, 128)  0
batch_normalization_675[0][0]

-----

add_356 (Add)                   (None, 64, 64, 32)   0
batch_normalization_660[0][0]
activation_589[0][0]

-----

activation_598 (Activation)      (None, 32, 32, 64)   0
batch_normalization_667[0][0]

-----

conv2d_678 (Conv2D)             (None, 16, 16, 128) 147456
activation_606[0][0]

-----

activation_591 (Activation)      (None, 64, 64, 32)   0          add_356[0][0]

-----

conv2d_670 (Conv2D)             (None, 32, 32, 64)   36864
activation_598[0][0]

-----

batch_normalization_676 (BatchN (None, 16, 16, 128) 512
conv2d_678[0][0]

-----

conv2d_663 (Conv2D)             (None, 64, 64, 32)   9216
activation_591[0][0]

-----

batch_normalization_668 (BatchN (None, 32, 32, 64)   256
conv2d_670[0][0]

-----

add_364 (Add)                   (None, 16, 16, 128)  0
batch_normalization_676[0][0]
activation_605[0][0]

-----

batch_normalization_661 (BatchN (None, 64, 64, 32)   128
conv2d_663[0][0]

-----

add_360 (Add)                   (None, 32, 32, 64)   0
batch_normalization_668[0][0]

```

activation_597[0][0]

activation_607 (Activation) (None, 16, 16, 128) 0 add_364[0][0]

activation_592 (Activation) (None, 64, 64, 32) 0
batch_normalization_661[0][0]

activation_599 (Activation) (None, 32, 32, 64) 0 add_360[0][0]

conv2d_679 (Conv2D) (None, 16, 16, 128) 147456
activation_607[0][0]

conv2d_664 (Conv2D) (None, 64, 64, 32) 9216
activation_592[0][0]

conv2d_671 (Conv2D) (None, 32, 32, 64) 36864
activation_599[0][0]

batch_normalization_677 (BatchN (None, 16, 16, 128) 512
conv2d_679[0][0]

batch_normalization_662 (BatchN (None, 64, 64, 32) 128
conv2d_664[0][0]

batch_normalization_669 (BatchN (None, 32, 32, 64) 256
conv2d_671[0][0]

activation_608 (Activation) (None, 16, 16, 128) 0
batch_normalization_677[0][0]

add_357 (Add) (None, 64, 64, 32) 0
batch_normalization_662[0][0]
activation_591[0][0]

activation_600 (Activation) (None, 32, 32, 64) 0
batch_normalization_669[0][0]

```

-----
conv2d_680 (Conv2D)          (None, 16, 16, 128) 147456
activation_608[0][0]

-----
activation_593 (Activation)   (None, 64, 64, 32)  0          add_357[0][0]
-----
conv2d_672 (Conv2D)          (None, 32, 32, 64)  36864
activation_600[0][0]
-----
batch_normalization_678 (BatchN (None, 16, 16, 128) 512
conv2d_680[0][0]
-----
batch_normalization_670 (BatchN (None, 32, 32, 64)  256
conv2d_672[0][0]
-----
add_365 (Add)                (None, 16, 16, 128) 0
batch_normalization_678[0][0]
activation_607[0][0]
-----
conv2d_685 (Conv2D)          (None, 32, 32, 32)  9216
activation_593[0][0]
-----
add_361 (Add)                (None, 32, 32, 64)  0
batch_normalization_670[0][0]
activation_599[0][0]
-----
activation_609 (Activation)   (None, 16, 16, 128) 0          add_365[0][0]
-----
batch_normalization_683 (BatchN (None, 32, 32, 32) 128
conv2d_685[0][0]
-----
activation_601 (Activation)   (None, 32, 32, 64)  0          add_361[0][0]
-----
conv2d_683 (Conv2D)          (None, 32, 32, 64)  18432
activation_593[0][0]
-----

```

```

-----
conv2d_684 (Conv2D)          (None, 16, 16, 64)    8192
activation_609[0][0]

```

```

-----
activation_612 (Activation)   (None, 32, 32, 32)    0
batch_normalization_683[0][0]

```

```

-----
conv2d_681 (Conv2D)          (None, 32, 32, 32)    2048
activation_601[0][0]

```

```

-----
batch_normalization_681 (BatchN (None, 32, 32, 64)    256
conv2d_683[0][0]

```

```

-----
batch_normalization_682 (BatchN (None, 16, 16, 64)    256
conv2d_684[0][0]

```

```

-----
conv2d_686 (Conv2D)          (None, 16, 16, 128)   36864
activation_612[0][0]

```

```

-----
batch_normalization_679 (BatchN (None, 32, 32, 32)    128
conv2d_681[0][0]

```

```

-----
conv2d_682 (Conv2D)          (None, 16, 16, 32)    4096
activation_609[0][0]

```

```

-----
add_368 (Add)                (None, 32, 32, 64)    0
activation_601[0][0]
batch_normalization_681[0][0]

```

```

-----
up_sampling2d_66 (UpSampling2D) (None, 32, 32, 64)    0
batch_normalization_682[0][0]

```

```

-----
batch_normalization_684 (BatchN (None, 16, 16, 128)   512
conv2d_686[0][0]

```

```

-----
conv2d_687 (Conv2D)          (None, 16, 16, 128)   73728
activation_601[0][0]

```

```

-----
-----
up_sampling2d_64 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_679[0][0]
-----
-----
batch_normalization_680 (BatchN (None, 16, 16, 32) 128
conv2d_682[0][0]
-----
-----
add_369 (Add) (None, 32, 32, 64) 0 add_368[0][0]
up_sampling2d_66[0][0]
-----
-----
add_370 (Add) (None, 16, 16, 128) 0
activation_609[0][0]
batch_normalization_684[0][0]
-----
-----
batch_normalization_685 (BatchN (None, 16, 16, 128) 512
conv2d_687[0][0]
-----
-----
add_366 (Add) (None, 64, 64, 32) 0
activation_593[0][0]
up_sampling2d_64[0][0]
-----
-----
up_sampling2d_65 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_680[0][0]
-----
-----
activation_611 (Activation) (None, 32, 32, 64) 0 add_369[0][0]
-----
-----
add_371 (Add) (None, 16, 16, 128) 0 add_370[0][0]
batch_normalization_685[0][0]
-----
-----
add_367 (Add) (None, 64, 64, 32) 0 add_366[0][0]
up_sampling2d_65[0][0]
-----
-----
conv2d_696 (Conv2D) (None, 32, 32, 64) 36864
activation_611[0][0]
-----
-----
activation_613 (Activation) (None, 16, 16, 128) 0 add_371[0][0]

```



```

-----
activation_610 (Activation)      (None, 64, 64, 32)    0          add_367[0][0]
-----

batch_normalization_694 (BatchN (None, 32, 32, 64)    256
conv2d_696[0][0]
-----

conv2d_704 (Conv2D)              (None, 16, 16, 128)  147456
activation_613[0][0]
-----

conv2d_688 (Conv2D)              (None, 64, 64, 32)   9216
activation_610[0][0]
-----

activation_622 (Activation)      (None, 32, 32, 64)    0
batch_normalization_694[0][0]
-----

batch_normalization_702 (BatchN (None, 16, 16, 128)  512
conv2d_704[0][0]
-----

batch_normalization_686 (BatchN (None, 64, 64, 32)   128
conv2d_688[0][0]
-----

conv2d_697 (Conv2D)              (None, 32, 32, 64)   36864
activation_622[0][0]
-----

activation_630 (Activation)      (None, 16, 16, 128)  0
batch_normalization_702[0][0]
-----

activation_614 (Activation)      (None, 64, 64, 32)    0
batch_normalization_686[0][0]
-----

batch_normalization_695 (BatchN (None, 32, 32, 64)   256
conv2d_697[0][0]
-----

conv2d_705 (Conv2D)              (None, 16, 16, 128)  147456
activation_630[0][0]
-----

```

```

-----
conv2d_689 (Conv2D)          (None, 64, 64, 32)    9216
activation_614[0][0]
-----

-----
add_376 (Add)                (None, 32, 32, 64)    0
batch_normalization_695[0][0]
activation_611[0][0]
-----

-----
batch_normalization_703 (BatchN (None, 16, 16, 128)  512
conv2d_705[0][0]
-----

-----
batch_normalization_687 (BatchN (None, 64, 64, 32)    128
conv2d_689[0][0]
-----

-----
activation_623 (Activation)   (None, 32, 32, 64)    0          add_376[0][0]
-----

-----
add_380 (Add)                (None, 16, 16, 128)  0
batch_normalization_703[0][0]
activation_613[0][0]
-----

-----
add_372 (Add)                (None, 64, 64, 32)    0
batch_normalization_687[0][0]
activation_610[0][0]
-----

-----
conv2d_698 (Conv2D)          (None, 32, 32, 64)    36864
activation_623[0][0]
-----

-----
activation_631 (Activation)   (None, 16, 16, 128)  0          add_380[0][0]
-----

-----
activation_615 (Activation)   (None, 64, 64, 32)    0          add_372[0][0]
-----

-----
batch_normalization_696 (BatchN (None, 32, 32, 64)    256
conv2d_698[0][0]
-----

-----
conv2d_706 (Conv2D)          (None, 16, 16, 128)  147456
activation_631[0][0]
-----

```

conv2d_690 (Conv2D) (None, 64, 64, 32) 9216
activation_615[0][0]

activation_624 (Activation) (None, 32, 32, 64) 0
batch_normalization_696[0][0]

batch_normalization_704 (BatchN (None, 16, 16, 128) 512
conv2d_706[0][0]

batch_normalization_688 (BatchN (None, 64, 64, 32) 128
conv2d_690[0][0]

conv2d_699 (Conv2D) (None, 32, 32, 64) 36864
activation_624[0][0]

activation_632 (Activation) (None, 16, 16, 128) 0
batch_normalization_704[0][0]

activation_616 (Activation) (None, 64, 64, 32) 0
batch_normalization_688[0][0]

batch_normalization_697 (BatchN (None, 32, 32, 64) 256
conv2d_699[0][0]

conv2d_707 (Conv2D) (None, 16, 16, 128) 147456
activation_632[0][0]

conv2d_691 (Conv2D) (None, 64, 64, 32) 9216
activation_616[0][0]

add_377 (Add) (None, 32, 32, 64) 0
batch_normalization_697[0][0]
activation_623[0][0]

batch_normalization_705 (BatchN (None, 16, 16, 128) 512
conv2d_707[0][0]

```

-----
-----
batch_normalization_689 (BatchN (None, 64, 64, 32) 128
conv2d_691[0][0]
-----
-----
activation_625 (Activation) (None, 32, 32, 64) 0 add_377[0][0]
-----
-----
add_381 (Add) (None, 16, 16, 128) 0
batch_normalization_705[0][0]
activation_631[0][0]
-----
-----
add_373 (Add) (None, 64, 64, 32) 0
batch_normalization_689[0][0]
activation_615[0][0]
-----
-----
conv2d_700 (Conv2D) (None, 32, 32, 64) 36864
activation_625[0][0]
-----
-----
activation_633 (Activation) (None, 16, 16, 128) 0 add_381[0][0]
-----
-----
activation_617 (Activation) (None, 64, 64, 32) 0 add_373[0][0]
-----
-----
batch_normalization_698 (BatchN (None, 32, 32, 64) 256
conv2d_700[0][0]
-----
-----
conv2d_708 (Conv2D) (None, 16, 16, 128) 147456
activation_633[0][0]
-----
-----
conv2d_692 (Conv2D) (None, 64, 64, 32) 9216
activation_617[0][0]
-----
-----
activation_626 (Activation) (None, 32, 32, 64) 0
batch_normalization_698[0][0]
-----
-----
batch_normalization_706 (BatchN (None, 16, 16, 128) 512
conv2d_708[0][0]
-----

```

```

-----
batch_normalization_690 (BatchN (None, 64, 64, 32) 128
conv2d_692[0][0]
-----

-----
conv2d_701 (Conv2D) (None, 32, 32, 64) 36864
activation_626[0][0]
-----

-----
activation_634 (Activation) (None, 16, 16, 128) 0
batch_normalization_706[0][0]
-----

-----
activation_618 (Activation) (None, 64, 64, 32) 0
batch_normalization_690[0][0]
-----

-----
batch_normalization_699 (BatchN (None, 32, 32, 64) 256
conv2d_701[0][0]
-----

-----
conv2d_709 (Conv2D) (None, 16, 16, 128) 147456
activation_634[0][0]
-----

-----
conv2d_693 (Conv2D) (None, 64, 64, 32) 9216
activation_618[0][0]
-----

-----
add_378 (Add) (None, 32, 32, 64) 0
batch_normalization_699[0][0]
activation_625[0][0]
-----

-----
batch_normalization_707 (BatchN (None, 16, 16, 128) 512
conv2d_709[0][0]
-----

-----
batch_normalization_691 (BatchN (None, 64, 64, 32) 128
conv2d_693[0][0]
-----

-----
activation_627 (Activation) (None, 32, 32, 64) 0 add_378[0][0]
-----

-----
add_382 (Add) (None, 16, 16, 128) 0
batch_normalization_707[0][0]
activation_633[0][0]

```

```

-----
-----
add_374 (Add) (None, 64, 64, 32) 0
batch_normalization_691[0][0]
activation_617[0][0]
-----
-----
conv2d_702 (Conv2D) (None, 32, 32, 64) 36864
activation_627[0][0]
-----
-----
activation_635 (Activation) (None, 16, 16, 128) 0 add_382[0][0]
-----
-----
activation_619 (Activation) (None, 64, 64, 32) 0 add_374[0][0]
-----
-----
batch_normalization_700 (BatchN (None, 32, 32, 64) 256
conv2d_702[0][0]
-----
-----
conv2d_710 (Conv2D) (None, 16, 16, 128) 147456
activation_635[0][0]
-----
-----
conv2d_694 (Conv2D) (None, 64, 64, 32) 9216
activation_619[0][0]
-----
-----
activation_628 (Activation) (None, 32, 32, 64) 0
batch_normalization_700[0][0]
-----
-----
batch_normalization_708 (BatchN (None, 16, 16, 128) 512
conv2d_710[0][0]
-----
-----
batch_normalization_692 (BatchN (None, 64, 64, 32) 128
conv2d_694[0][0]
-----
-----
conv2d_703 (Conv2D) (None, 32, 32, 64) 36864
activation_628[0][0]
-----
-----
activation_636 (Activation) (None, 16, 16, 128) 0
batch_normalization_708[0][0]
-----

```

```

-----
activation_620 (Activation)      (None, 64, 64, 32)    0
batch_normalization_692[0][0]

-----

batch_normalization_701 (BatchN (None, 32, 32, 64)    256
conv2d_703[0][0]

-----

conv2d_711 (Conv2D)             (None, 16, 16, 128)  147456
activation_636[0][0]

-----

conv2d_695 (Conv2D)             (None, 64, 64, 32)   9216
activation_620[0][0]

-----

add_379 (Add)                   (None, 32, 32, 64)    0
batch_normalization_701[0][0]
activation_627[0][0]

-----

batch_normalization_709 (BatchN (None, 16, 16, 128)  512
conv2d_711[0][0]

-----

batch_normalization_693 (BatchN (None, 64, 64, 32)   128
conv2d_695[0][0]

-----

activation_629 (Activation)      (None, 32, 32, 64)    0          add_379[0][0]

-----

add_383 (Add)                   (None, 16, 16, 128)    0
batch_normalization_709[0][0]
activation_635[0][0]

-----

add_375 (Add)                   (None, 64, 64, 32)    0
batch_normalization_693[0][0]
activation_619[0][0]

-----

conv2d_712 (Conv2D)             (None, 32, 32, 32)   2048
activation_629[0][0]

-----

activation_637 (Activation)      (None, 16, 16, 128)    0          add_383[0][0]

```

```

-----
activation_621 (Activation)      (None, 64, 64, 32)    0          add_375[0][0]
-----

batch_normalization_710 (BatchN (None, 32, 32, 32)    128
conv2d_712[0][0]
-----

conv2d_713 (Conv2D)             (None, 16, 16, 32)    4096
activation_637[0][0]
-----

up_sampling2d_67 (UpSampling2D) (None, 64, 64, 32)    0
batch_normalization_710[0][0]
-----

batch_normalization_711 (BatchN (None, 16, 16, 32)    128
conv2d_713[0][0]
-----

conv2d_716 (Conv2D)             (None, 32, 32, 32)    9216
activation_621[0][0]
-----

add_384 (Add)                   (None, 64, 64, 32)    0
activation_621[0][0]
up_sampling2d_67[0][0]
-----

up_sampling2d_68 (UpSampling2D) (None, 64, 64, 32)    0
batch_normalization_711[0][0]
-----

batch_normalization_714 (BatchN (None, 32, 32, 32)    128
conv2d_716[0][0]
-----

add_385 (Add)                   (None, 64, 64, 32)    0          add_384[0][0]
up_sampling2d_68[0][0]
-----

conv2d_714 (Conv2D)             (None, 32, 32, 64)    18432
activation_621[0][0]
-----

conv2d_715 (Conv2D)             (None, 16, 16, 64)    8192
activation_637[0][0]

```



```

-----
activation_640 (Activation)      (None, 32, 32, 32)    0
batch_normalization_714[0][0]

-----

activation_638 (Activation)      (None, 64, 64, 32)    0          add_385[0][0]

-----

batch_normalization_712 (BatchN (None, 32, 32, 64)    256
conv2d_714[0][0]

-----

batch_normalization_713 (BatchN (None, 16, 16, 64)    256
conv2d_715[0][0]

-----

conv2d_717 (Conv2D)              (None, 16, 16, 128)  36864
activation_640[0][0]

-----

conv2d_719 (Conv2D)              (None, 64, 64, 32)   9216
activation_638[0][0]

-----

add_386 (Add)                    (None, 32, 32, 64)    0
activation_629[0][0]
batch_normalization_712[0][0]

-----

up_sampling2d_69 (UpSampling2D) (None, 32, 32, 64)    0
batch_normalization_713[0][0]

-----

batch_normalization_715 (BatchN (None, 16, 16, 128)  512
conv2d_717[0][0]

-----

conv2d_718 (Conv2D)              (None, 16, 16, 128)  73728
activation_629[0][0]

-----

batch_normalization_717 (BatchN (None, 64, 64, 32)    128
conv2d_719[0][0]

-----

add_387 (Add)                    (None, 32, 32, 64)    0          add_386[0][0]
up_sampling2d_69[0][0]

```

```

-----
-----
add_388 (Add) (None, 16, 16, 128) 0
activation_637[0][0]
batch_normalization_715[0][0]
-----
-----
batch_normalization_716 (BatchN (None, 16, 16, 128) 512
conv2d_718[0][0]
-----
-----
activation_642 (Activation) (None, 64, 64, 32) 0
batch_normalization_717[0][0]
-----
-----
activation_639 (Activation) (None, 32, 32, 64) 0 add_387[0][0]
-----
-----
add_389 (Add) (None, 16, 16, 128) 0 add_388[0][0]
batch_normalization_716[0][0]
-----
-----
conv2d_720 (Conv2D) (None, 64, 64, 32) 9216
activation_642[0][0]
-----
-----
conv2d_727 (Conv2D) (None, 32, 32, 64) 36864
activation_639[0][0]
-----
-----
activation_641 (Activation) (None, 16, 16, 128) 0 add_389[0][0]
-----
-----
batch_normalization_718 (BatchN (None, 64, 64, 32) 128
conv2d_720[0][0]
-----
-----
batch_normalization_725 (BatchN (None, 32, 32, 64) 256
conv2d_727[0][0]
-----
-----
conv2d_735 (Conv2D) (None, 16, 16, 128) 147456
activation_641[0][0]
-----
-----
add_390 (Add) (None, 64, 64, 32) 0
batch_normalization_718[0][0]
activation_638[0][0]

```

```

-----
-----
activation_650 (Activation)      (None, 32, 32, 64)    0
batch_normalization_725[0][0]

-----
-----
batch_normalization_733 (BatchN (None, 16, 16, 128) 512
conv2d_735[0][0]

-----
-----
activation_643 (Activation)      (None, 64, 64, 32)    0          add_390[0][0]

-----
-----
conv2d_728 (Conv2D)             (None, 32, 32, 64)    36864
activation_650[0][0]

-----
-----
activation_658 (Activation)      (None, 16, 16, 128)   0
batch_normalization_733[0][0]

-----
-----
conv2d_721 (Conv2D)             (None, 64, 64, 32)    9216
activation_643[0][0]

-----
-----
batch_normalization_726 (BatchN (None, 32, 32, 64)    256
conv2d_728[0][0]

-----
-----
conv2d_736 (Conv2D)             (None, 16, 16, 128)   147456
activation_658[0][0]

-----
-----
batch_normalization_719 (BatchN (None, 64, 64, 32)    128
conv2d_721[0][0]

-----
-----
add_394 (Add)                   (None, 32, 32, 64)    0
batch_normalization_726[0][0]
activation_639[0][0]

-----
-----
batch_normalization_734 (BatchN (None, 16, 16, 128) 512
conv2d_736[0][0]

-----
-----
activation_644 (Activation)      (None, 64, 64, 32)    0
batch_normalization_719[0][0]

```

```

-----
-----
activation_651 (Activation)      (None, 32, 32, 64)    0          add_394[0] [0]
-----
-----
add_398 (Add)                    (None, 16, 16, 128)  0
batch_normalization_734[0] [0]
activation_641[0] [0]
-----
-----
conv2d_722 (Conv2D)              (None, 64, 64, 32)   9216
activation_644[0] [0]
-----
-----
conv2d_729 (Conv2D)              (None, 32, 32, 64)   36864
activation_651[0] [0]
-----
-----
activation_659 (Activation)      (None, 16, 16, 128)  0          add_398[0] [0]
-----
-----
batch_normalization_720 (BatchN (None, 64, 64, 32)   128
conv2d_722[0] [0]
-----
-----
batch_normalization_727 (BatchN (None, 32, 32, 64)   256
conv2d_729[0] [0]
-----
-----
conv2d_737 (Conv2D)              (None, 16, 16, 128)  147456
activation_659[0] [0]
-----
-----
add_391 (Add)                    (None, 64, 64, 32)   0
batch_normalization_720[0] [0]
activation_643[0] [0]
-----
-----
activation_652 (Activation)      (None, 32, 32, 64)   0
batch_normalization_727[0] [0]
-----
-----
batch_normalization_735 (BatchN (None, 16, 16, 128)  512
conv2d_737[0] [0]
-----
-----
activation_645 (Activation)      (None, 64, 64, 32)   0          add_391[0] [0]
-----

```

```

-----
conv2d_730 (Conv2D)          (None, 32, 32, 64)    36864
activation_652[0][0]
-----

-----
activation_660 (Activation)   (None, 16, 16, 128)   0
batch_normalization_735[0][0]
-----

-----
conv2d_723 (Conv2D)          (None, 64, 64, 32)    9216
activation_645[0][0]
-----

-----
batch_normalization_728 (BatchN (None, 32, 32, 64)    256
conv2d_730[0][0]
-----

-----
conv2d_738 (Conv2D)          (None, 16, 16, 128)   147456
activation_660[0][0]
-----

-----
batch_normalization_721 (BatchN (None, 64, 64, 32)    128
conv2d_723[0][0]
-----

-----
add_395 (Add)                (None, 32, 32, 64)    0
batch_normalization_728[0][0]
activation_651[0][0]
-----

-----
batch_normalization_736 (BatchN (None, 16, 16, 128)   512
conv2d_738[0][0]
-----

-----
activation_646 (Activation)   (None, 64, 64, 32)    0
batch_normalization_721[0][0]
-----

-----
activation_653 (Activation)   (None, 32, 32, 64)    0          add_395[0][0]
-----

-----
add_399 (Add)                (None, 16, 16, 128)   0
batch_normalization_736[0][0]
activation_659[0][0]
-----

-----
conv2d_724 (Conv2D)          (None, 64, 64, 32)    9216
activation_646[0][0]

```

```

-----
conv2d_731 (Conv2D)          (None, 32, 32, 64)  36864
activation_653[0][0]
-----
activation_661 (Activation)    (None, 16, 16, 128)  0          add_399[0][0]
-----
batch_normalization_722 (BatchN (None, 64, 64, 32)  128
conv2d_724[0][0]
-----
batch_normalization_729 (BatchN (None, 32, 32, 64)  256
conv2d_731[0][0]
-----
conv2d_739 (Conv2D)          (None, 16, 16, 128) 147456
activation_661[0][0]
-----
add_392 (Add)                (None, 64, 64, 32)  0
batch_normalization_722[0][0]
activation_645[0][0]
-----
activation_654 (Activation)    (None, 32, 32, 64)  0
batch_normalization_729[0][0]
-----
batch_normalization_737 (BatchN (None, 16, 16, 128)  512
conv2d_739[0][0]
-----
activation_647 (Activation)    (None, 64, 64, 32)  0          add_392[0][0]
-----
conv2d_732 (Conv2D)          (None, 32, 32, 64)  36864
activation_654[0][0]
-----
activation_662 (Activation)    (None, 16, 16, 128)  0
batch_normalization_737[0][0]
-----
conv2d_725 (Conv2D)          (None, 64, 64, 32)  9216
activation_647[0][0]
-----

```

```

-----
batch_normalization_730 (BatchN (None, 32, 32, 64) 256
conv2d_732[0][0]
-----

-----
conv2d_740 (Conv2D) (None, 16, 16, 128) 147456
activation_662[0][0]
-----

-----
batch_normalization_723 (BatchN (None, 64, 64, 32) 128
conv2d_725[0][0]
-----

-----
add_396 (Add) (None, 32, 32, 64) 0
batch_normalization_730[0][0]
activation_653[0][0]
-----

-----
batch_normalization_738 (BatchN (None, 16, 16, 128) 512
conv2d_740[0][0]
-----

-----
activation_648 (Activation) (None, 64, 64, 32) 0
batch_normalization_723[0][0]
-----

-----
activation_655 (Activation) (None, 32, 32, 64) 0 add_396[0][0]
-----

-----
add_400 (Add) (None, 16, 16, 128) 0
batch_normalization_738[0][0]
activation_661[0][0]
-----

-----
conv2d_726 (Conv2D) (None, 64, 64, 32) 9216
activation_648[0][0]
-----

-----
conv2d_733 (Conv2D) (None, 32, 32, 64) 36864
activation_655[0][0]
-----

-----
activation_663 (Activation) (None, 16, 16, 128) 0 add_400[0][0]
-----

-----
batch_normalization_724 (BatchN (None, 64, 64, 32) 128
conv2d_726[0][0]
-----

```

```

-----
batch_normalization_731 (BatchN (None, 32, 32, 64) 256
conv2d_733[0] [0]
-----

conv2d_741 (Conv2D) (None, 16, 16, 128) 147456
activation_663[0] [0]
-----

add_393 (Add) (None, 64, 64, 32) 0
batch_normalization_724[0] [0]
activation_647[0] [0]
-----

activation_656 (Activation) (None, 32, 32, 64) 0
batch_normalization_731[0] [0]
-----

batch_normalization_739 (BatchN (None, 16, 16, 128) 512
conv2d_741[0] [0]
-----

activation_649 (Activation) (None, 64, 64, 32) 0 add_393[0] [0]
-----

conv2d_734 (Conv2D) (None, 32, 32, 64) 36864
activation_656[0] [0]
-----

activation_664 (Activation) (None, 16, 16, 128) 0
batch_normalization_739[0] [0]
-----

batch_normalization_732 (BatchN (None, 32, 32, 64) 256
conv2d_734[0] [0]
-----

conv2d_742 (Conv2D) (None, 16, 16, 128) 147456
activation_664[0] [0]
-----

conv2d_747 (Conv2D) (None, 32, 32, 32) 9216
activation_649[0] [0]
-----

add_397 (Add) (None, 32, 32, 64) 0
batch_normalization_732[0] [0]
activation_655[0] [0]

```



```

-----
batch_normalization_740 (BatchN (None, 16, 16, 128) 512
conv2d_742[0][0]
-----
batch_normalization_745 (BatchN (None, 32, 32, 32) 128
conv2d_747[0][0]
-----
activation_657 (Activation) (None, 32, 32, 64) 0 add_397[0][0]
-----
add_401 (Add) (None, 16, 16, 128) 0
batch_normalization_740[0][0]
activation_663[0][0]
-----
activation_668 (Activation) (None, 32, 32, 32) 0
batch_normalization_745[0][0]
-----
conv2d_743 (Conv2D) (None, 32, 32, 32) 2048
activation_657[0][0]
-----
activation_665 (Activation) (None, 16, 16, 128) 0 add_401[0][0]
-----
conv2d_748 (Conv2D) (None, 16, 16, 128) 36864
activation_668[0][0]
-----
batch_normalization_741 (BatchN (None, 32, 32, 32) 128
conv2d_743[0][0]
-----
conv2d_744 (Conv2D) (None, 16, 16, 32) 4096
activation_665[0][0]
-----
conv2d_745 (Conv2D) (None, 32, 32, 64) 18432
activation_649[0][0]
-----
conv2d_746 (Conv2D) (None, 16, 16, 64) 8192
activation_665[0][0]
-----

```

batch_normalization_746 (BatchN (None, 16, 16, 128) 512
conv2d_748[0][0]

conv2d_749 (Conv2D) (None, 16, 16, 128) 73728
activation_657[0][0]

up_sampling2d_70 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_741[0][0]

batch_normalization_742 (BatchN (None, 16, 16, 32) 128
conv2d_744[0][0]

batch_normalization_743 (BatchN (None, 32, 32, 64) 256
conv2d_745[0][0]

batch_normalization_744 (BatchN (None, 16, 16, 64) 256
conv2d_746[0][0]

add_406 (Add) (None, 16, 16, 128) 0
activation_665[0][0]
batch_normalization_746[0][0]

batch_normalization_747 (BatchN (None, 16, 16, 128) 512
conv2d_749[0][0]

add_402 (Add) (None, 64, 64, 32) 0
activation_649[0][0]
up_sampling2d_70[0][0]

up_sampling2d_71 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_742[0][0]

add_404 (Add) (None, 32, 32, 64) 0
activation_657[0][0]
batch_normalization_743[0][0]

up_sampling2d_72 (UpSampling2D)	(None, 32, 32, 64)	0	
batch_normalization_744[0][0]			

add_407 (Add)	(None, 16, 16, 128)	0	add_406[0][0]
batch_normalization_747[0][0]			

add_403 (Add)	(None, 64, 64, 32)	0	add_402[0][0]
up_sampling2d_71[0][0]			

add_405 (Add)	(None, 32, 32, 64)	0	add_404[0][0]
up_sampling2d_72[0][0]			

activation_669 (Activation)	(None, 16, 16, 128)	0	add_407[0][0]

activation_666 (Activation)	(None, 64, 64, 32)	0	add_403[0][0]

activation_667 (Activation)	(None, 32, 32, 64)	0	add_405[0][0]

conv2d_750 (Conv2D)	(None, 8, 8, 256)	294912	
activation_669[0][0]			

conv2d_751 (Conv2D)	(None, 64, 64, 32)	9216	
activation_666[0][0]			

conv2d_759 (Conv2D)	(None, 32, 32, 64)	36864	
activation_667[0][0]			

batch_normalization_748 (BatchN	(None, 8, 8, 256)	1024	
conv2d_750[0][0]			

batch_normalization_749 (BatchN	(None, 64, 64, 32)	128	
conv2d_751[0][0]			

batch_normalization_757 (BatchN	(None, 32, 32, 64)	256	
conv2d_759[0][0]			

```
-----
conv2d_767 (Conv2D)          (None, 16, 16, 128)  147456
activation_669[0][0]
```

```
-----
activation_670 (Activation)   (None, 8, 8, 256)    0
batch_normalization_748[0][0]
```

```
-----
activation_671 (Activation)   (None, 64, 64, 32)   0
batch_normalization_749[0][0]
```

```
-----
activation_679 (Activation)   (None, 32, 32, 64)   0
batch_normalization_757[0][0]
```

```
-----
batch_normalization_765 (BatchN (None, 16, 16, 128)  512
conv2d_767[0][0]
```

```
-----
conv2d_775 (Conv2D)          (None, 8, 8, 256)    589824
activation_670[0][0]
```

```
-----
conv2d_752 (Conv2D)          (None, 64, 64, 32)   9216
activation_671[0][0]
```

```
-----
conv2d_760 (Conv2D)          (None, 32, 32, 64)   36864
activation_679[0][0]
```

```
-----
activation_687 (Activation)   (None, 16, 16, 128)  0
batch_normalization_765[0][0]
```

```
-----
batch_normalization_773 (BatchN (None, 8, 8, 256)    1024
conv2d_775[0][0]
```

```
-----
batch_normalization_750 (BatchN (None, 64, 64, 32)   128
conv2d_752[0][0]
```

```
-----
batch_normalization_758 (BatchN (None, 32, 32, 64)   256
conv2d_760[0][0]
```

```

-----
conv2d_768 (Conv2D)          (None, 16, 16, 128)  147456
activation_687[0][0]
-----

-----
activation_695 (Activation)   (None, 8, 8, 256)    0
batch_normalization_773[0][0]
-----

-----
add_408 (Add)                (None, 64, 64, 32)   0
batch_normalization_750[0][0]
activation_666[0][0]
-----

-----
add_412 (Add)                (None, 32, 32, 64)   0
batch_normalization_758[0][0]
activation_667[0][0]
-----

-----
batch_normalization_766 (BatchN (None, 16, 16, 128)  512
conv2d_768[0][0]
-----

-----
conv2d_776 (Conv2D)          (None, 8, 8, 256)    589824
activation_695[0][0]
-----

-----
activation_672 (Activation)   (None, 64, 64, 32)   0          add_408[0][0]
-----

-----
activation_680 (Activation)   (None, 32, 32, 64)   0          add_412[0][0]
-----

-----
add_416 (Add)                (None, 16, 16, 128)  0
batch_normalization_766[0][0]
activation_669[0][0]
-----

-----
batch_normalization_774 (BatchN (None, 8, 8, 256)    1024
conv2d_776[0][0]
-----

-----
conv2d_753 (Conv2D)          (None, 64, 64, 32)   9216
activation_672[0][0]
-----

-----
conv2d_761 (Conv2D)          (None, 32, 32, 64)   36864
activation_680[0][0]

```

```

-----
activation_688 (Activation)      (None, 16, 16, 128)  0          add_416[0][0]
-----

add_420 (Add)                   (None, 8, 8, 256)    0
batch_normalization_774[0][0]
activation_670[0][0]
-----

batch_normalization_751 (BatchN (None, 64, 64, 32)  128
conv2d_753[0][0]
-----

batch_normalization_759 (BatchN (None, 32, 32, 64)  256
conv2d_761[0][0]
-----

conv2d_769 (Conv2D)             (None, 16, 16, 128)  147456
activation_688[0][0]
-----

activation_696 (Activation)      (None, 8, 8, 256)    0          add_420[0][0]
-----

activation_673 (Activation)      (None, 64, 64, 32)   0
batch_normalization_751[0][0]
-----

activation_681 (Activation)      (None, 32, 32, 64)   0
batch_normalization_759[0][0]
-----

batch_normalization_767 (BatchN (None, 16, 16, 128)  512
conv2d_769[0][0]
-----

conv2d_777 (Conv2D)             (None, 8, 8, 256)    589824
activation_696[0][0]
-----

conv2d_754 (Conv2D)             (None, 64, 64, 32)   9216
activation_673[0][0]
-----

conv2d_762 (Conv2D)             (None, 32, 32, 64)   36864
activation_681[0][0]
-----

```

```

-----
activation_689 (Activation)      (None, 16, 16, 128)  0
batch_normalization_767[0][0]
-----

-----
batch_normalization_775 (BatchN (None, 8, 8, 256)    1024
conv2d_777[0][0]
-----

-----
batch_normalization_752 (BatchN (None, 64, 64, 32)    128
conv2d_754[0][0]
-----

-----
batch_normalization_760 (BatchN (None, 32, 32, 64)    256
conv2d_762[0][0]
-----

-----
conv2d_770 (Conv2D)              (None, 16, 16, 128) 147456
activation_689[0][0]
-----

-----
activation_697 (Activation)      (None, 8, 8, 256)    0
batch_normalization_775[0][0]
-----

-----
add_409 (Add)                    (None, 64, 64, 32)    0
batch_normalization_752[0][0]
activation_672[0][0]
-----

-----
add_413 (Add)                    (None, 32, 32, 64)    0
batch_normalization_760[0][0]
activation_680[0][0]
-----

-----
batch_normalization_768 (BatchN (None, 16, 16, 128)  512
conv2d_770[0][0]
-----

-----
conv2d_778 (Conv2D)              (None, 8, 8, 256)    589824
activation_697[0][0]
-----

-----
activation_674 (Activation)      (None, 64, 64, 32)    0          add_409[0][0]
-----

-----
activation_682 (Activation)      (None, 32, 32, 64)    0          add_413[0][0]
-----

```

```

-----
add_417 (Add) (None, 16, 16, 128) 0
batch_normalization_768[0][0]
activation_688[0][0]
-----

batch_normalization_776 (BatchN (None, 8, 8, 256) 1024
conv2d_778[0][0]
-----

conv2d_755 (Conv2D) (None, 64, 64, 32) 9216
activation_674[0][0]
-----

conv2d_763 (Conv2D) (None, 32, 32, 64) 36864
activation_682[0][0]
-----

activation_690 (Activation) (None, 16, 16, 128) 0 add_417[0][0]
-----

add_421 (Add) (None, 8, 8, 256) 0
batch_normalization_776[0][0]
activation_696[0][0]
-----

batch_normalization_753 (BatchN (None, 64, 64, 32) 128
conv2d_755[0][0]
-----

batch_normalization_761 (BatchN (None, 32, 32, 64) 256
conv2d_763[0][0]
-----

conv2d_771 (Conv2D) (None, 16, 16, 128) 147456
activation_690[0][0]
-----

activation_698 (Activation) (None, 8, 8, 256) 0 add_421[0][0]
-----

activation_675 (Activation) (None, 64, 64, 32) 0
batch_normalization_753[0][0]
-----

activation_683 (Activation) (None, 32, 32, 64) 0
batch_normalization_761[0][0]
-----

```



```

-----
batch_normalization_769 (BatchN (None, 16, 16, 128) 512
conv2d_771[0][0]
-----

conv2d_779 (Conv2D) (None, 8, 8, 256) 589824
activation_698[0][0]
-----

conv2d_756 (Conv2D) (None, 64, 64, 32) 9216
activation_675[0][0]
-----

conv2d_764 (Conv2D) (None, 32, 32, 64) 36864
activation_683[0][0]
-----

activation_691 (Activation) (None, 16, 16, 128) 0
batch_normalization_769[0][0]
-----

batch_normalization_777 (BatchN (None, 8, 8, 256) 1024
conv2d_779[0][0]
-----

batch_normalization_754 (BatchN (None, 64, 64, 32) 128
conv2d_756[0][0]
-----

batch_normalization_762 (BatchN (None, 32, 32, 64) 256
conv2d_764[0][0]
-----

conv2d_772 (Conv2D) (None, 16, 16, 128) 147456
activation_691[0][0]
-----

activation_699 (Activation) (None, 8, 8, 256) 0
batch_normalization_777[0][0]
-----

add_410 (Add) (None, 64, 64, 32) 0
batch_normalization_754[0][0]
activation_674[0][0]
-----

add_414 (Add) (None, 32, 32, 64) 0
batch_normalization_762[0][0]

```

```

activation_682[0][0]
-----
-----
batch_normalization_770 (BatchN (None, 16, 16, 128) 512
conv2d_772[0][0]
-----
-----
conv2d_780 (Conv2D) (None, 8, 8, 256) 589824
activation_699[0][0]
-----
-----
activation_676 (Activation) (None, 64, 64, 32) 0 add_410[0][0]
-----
-----
activation_684 (Activation) (None, 32, 32, 64) 0 add_414[0][0]
-----
-----
add_418 (Add) (None, 16, 16, 128) 0
batch_normalization_770[0][0]
activation_690[0][0]
-----
-----
batch_normalization_778 (BatchN (None, 8, 8, 256) 1024
conv2d_780[0][0]
-----
-----
conv2d_757 (Conv2D) (None, 64, 64, 32) 9216
activation_676[0][0]
-----
-----
conv2d_765 (Conv2D) (None, 32, 32, 64) 36864
activation_684[0][0]
-----
-----
activation_692 (Activation) (None, 16, 16, 128) 0 add_418[0][0]
-----
-----
add_422 (Add) (None, 8, 8, 256) 0
batch_normalization_778[0][0]
activation_698[0][0]
-----
-----
batch_normalization_755 (BatchN (None, 64, 64, 32) 128
conv2d_757[0][0]
-----
-----
batch_normalization_763 (BatchN (None, 32, 32, 64) 256
conv2d_765[0][0]

```

```

-----
conv2d_773 (Conv2D)          (None, 16, 16, 128)  147456
activation_692[0][0]
-----
activation_700 (Activation)   (None, 8, 8, 256)    0          add_422[0][0]
-----
activation_677 (Activation)   (None, 64, 64, 32)   0
batch_normalization_755[0][0]
-----
activation_685 (Activation)   (None, 32, 32, 64)   0
batch_normalization_763[0][0]
-----
batch_normalization_771 (BatchN (None, 16, 16, 128)  512
conv2d_773[0][0]
-----
conv2d_781 (Conv2D)          (None, 8, 8, 256)    589824
activation_700[0][0]
-----
conv2d_758 (Conv2D)          (None, 64, 64, 32)   9216
activation_677[0][0]
-----
conv2d_766 (Conv2D)          (None, 32, 32, 64)   36864
activation_685[0][0]
-----
activation_693 (Activation)   (None, 16, 16, 128)  0
batch_normalization_771[0][0]
-----
batch_normalization_779 (BatchN (None, 8, 8, 256)    1024
conv2d_781[0][0]
-----
batch_normalization_756 (BatchN (None, 64, 64, 32)   128
conv2d_758[0][0]
-----
batch_normalization_764 (BatchN (None, 32, 32, 64)   256
conv2d_766[0][0]
-----

```

```

-----
conv2d_774 (Conv2D)          (None, 16, 16, 128)  147456
activation_693[0][0]
-----

-----
activation_701 (Activation)   (None, 8, 8, 256)    0
batch_normalization_779[0][0]
-----

-----
add_411 (Add)                (None, 64, 64, 32)   0
batch_normalization_756[0][0]
activation_676[0][0]
-----

-----
add_415 (Add)                (None, 32, 32, 64)   0
batch_normalization_764[0][0]
activation_684[0][0]
-----

-----
batch_normalization_772 (BatchN (None, 16, 16, 128)  512
conv2d_774[0][0]
-----

-----
conv2d_782 (Conv2D)          (None, 8, 8, 256)    589824
activation_701[0][0]
-----

-----
activation_678 (Activation)   (None, 64, 64, 32)   0          add_411[0][0]
-----

-----
activation_686 (Activation)   (None, 32, 32, 64)   0          add_415[0][0]
-----

-----
add_419 (Add)                (None, 16, 16, 128)  0
batch_normalization_772[0][0]
activation_692[0][0]
-----

-----
batch_normalization_780 (BatchN (None, 8, 8, 256)    1024
conv2d_782[0][0]
-----

-----
conv2d_783 (Conv2D)          (None, 32, 32, 32)   2048
activation_686[0][0]
-----

-----
activation_694 (Activation)   (None, 16, 16, 128)  0          add_419[0][0]
-----

```

```

-----
add_423 (Add) (None, 8, 8, 256) 0
batch_normalization_780[0][0]
activation_700[0][0]
-----

-----
conv2d_793 (Conv2D) (None, 32, 32, 32) 9216
activation_678[0][0]
-----

-----
batch_normalization_781 (BatchN (None, 32, 32, 32) 128
conv2d_783[0][0]
-----

-----
conv2d_784 (Conv2D) (None, 16, 16, 32) 4096
activation_694[0][0]
-----

-----
activation_702 (Activation) (None, 8, 8, 256) 0 add_423[0][0]
-----

-----
batch_normalization_791 (BatchN (None, 32, 32, 32) 128
conv2d_793[0][0]
-----

-----
up_sampling2d_73 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_781[0][0]
-----

-----
batch_normalization_782 (BatchN (None, 16, 16, 32) 128
conv2d_784[0][0]
-----

-----
conv2d_785 (Conv2D) (None, 8, 8, 32) 8192
activation_702[0][0]
-----

-----
conv2d_789 (Conv2D) (None, 32, 32, 32) 9216
activation_678[0][0]
-----

-----
activation_707 (Activation) (None, 32, 32, 32) 0
batch_normalization_791[0][0]
-----

-----
add_424 (Add) (None, 64, 64, 32) 0
activation_678[0][0]
up_sampling2d_73[0][0]

```

```

-----
-----
up_sampling2d_74 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_782[0][0]
-----
-----
batch_normalization_783 (BatchN (None, 8, 8, 32) 128
conv2d_785[0][0]
-----
-----
batch_normalization_787 (BatchN (None, 32, 32, 32) 128
conv2d_789[0][0]
-----
-----
conv2d_794 (Conv2D) (None, 16, 16, 32) 9216
activation_707[0][0]
-----
-----
add_425 (Add) (None, 64, 64, 32) 0 add_424[0][0]
up_sampling2d_74[0][0]
-----
-----
up_sampling2d_75 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_783[0][0]
-----
-----
activation_705 (Activation) (None, 32, 32, 32) 0
batch_normalization_787[0][0]
-----
-----
batch_normalization_792 (BatchN (None, 16, 16, 32) 128
conv2d_794[0][0]
-----
-----
conv2d_796 (Conv2D) (None, 16, 16, 64) 36864
activation_686[0][0]
-----
-----
add_426 (Add) (None, 64, 64, 32) 0 add_425[0][0]
up_sampling2d_75[0][0]
-----
-----
conv2d_786 (Conv2D) (None, 32, 32, 64) 18432
activation_678[0][0]
-----
-----
conv2d_787 (Conv2D) (None, 16, 16, 64) 8192
activation_694[0][0]

```

```

-----
conv2d_790 (Conv2D)          (None, 16, 16, 128)  36864
activation_705[0][0]

-----

activation_708 (Activation)    (None, 16, 16, 32)    0
batch_normalization_792[0][0]

-----

batch_normalization_794 (BatchN (None, 16, 16, 64)    256
conv2d_796[0][0]

-----

activation_703 (Activation)    (None, 64, 64, 32)    0          add_426[0][0]

-----

batch_normalization_784 (BatchN (None, 32, 32, 64)    256
conv2d_786[0][0]

-----

batch_normalization_785 (BatchN (None, 16, 16, 64)    256
conv2d_787[0][0]

-----

conv2d_788 (Conv2D)          (None, 8, 8, 64)      16384
activation_702[0][0]

-----

batch_normalization_788 (BatchN (None, 16, 16, 128)  512
conv2d_790[0][0]

-----

conv2d_791 (Conv2D)          (None, 16, 16, 128)  73728
activation_686[0][0]

-----

conv2d_792 (Conv2D)          (None, 8, 8, 128)     32768
activation_702[0][0]

-----

conv2d_795 (Conv2D)          (None, 8, 8, 256)     73728
activation_708[0][0]

-----

activation_709 (Activation)    (None, 16, 16, 64)    0
batch_normalization_794[0][0]
-----

```

```

-----
conv2d_799 (Conv2D)          (None, 64, 64, 32)    9216
activation_703[0][0]
-----

-----
add_427 (Add)                (None, 32, 32, 64)    0
activation_686[0][0]
batch_normalization_784[0][0]
-----

-----
up_sampling2d_76 (UpSampling2D) (None, 32, 32, 64)    0
batch_normalization_785[0][0]
-----

-----
batch_normalization_786 (BatchN (None, 8, 8, 64)      256
conv2d_788[0][0]
-----

-----
add_430 (Add)                (None, 16, 16, 128)   0
activation_694[0][0]
batch_normalization_788[0][0]
-----

-----
batch_normalization_789 (BatchN (None, 16, 16, 128)   512
conv2d_791[0][0]
-----

-----
batch_normalization_790 (BatchN (None, 8, 8, 128)     512
conv2d_792[0][0]
-----

-----
batch_normalization_793 (BatchN (None, 8, 8, 256)     1024
conv2d_795[0][0]
-----

-----
conv2d_797 (Conv2D)          (None, 8, 8, 256)     147456
activation_709[0][0]
-----

-----
batch_normalization_797 (BatchN (None, 64, 64, 32)    128
conv2d_799[0][0]
-----

-----
add_428 (Add)                (None, 32, 32, 64)    0          add_427[0][0]
up_sampling2d_76[0][0]
-----

-----
up_sampling2d_77 (UpSampling2D) (None, 32, 32, 64)    0

```



```

batch_normalization_786[0][0]
-----
-----
add_431 (Add) (None, 16, 16, 128) 0 add_430[0][0]
batch_normalization_789[0][0]
-----
-----
up_sampling2d_78 (UpSampling2D) (None, 16, 16, 128) 0
batch_normalization_790[0][0]
-----
-----
add_433 (Add) (None, 8, 8, 256) 0
activation_702[0][0]
batch_normalization_793[0][0]
-----
-----
batch_normalization_795 (BatchN (None, 8, 8, 256) 1024
conv2d_797[0][0]
-----
-----
conv2d_798 (Conv2D) (None, 8, 8, 256) 294912
activation_694[0][0]
-----
-----
activation_711 (Activation) (None, 64, 64, 32) 0
batch_normalization_797[0][0]
-----
-----
add_429 (Add) (None, 32, 32, 64) 0 add_428[0][0]
up_sampling2d_77[0][0]
-----
-----
add_432 (Add) (None, 16, 16, 128) 0 add_431[0][0]
up_sampling2d_78[0][0]
-----
-----
add_434 (Add) (None, 8, 8, 256) 0 add_433[0][0]
batch_normalization_795[0][0]
-----
-----
batch_normalization_796 (BatchN (None, 8, 8, 256) 1024
conv2d_798[0][0]
-----
-----
conv2d_800 (Conv2D) (None, 64, 64, 32) 9216
activation_711[0][0]
-----
-----

```

activation_704 (Activation)	(None, 32, 32, 64)	0	add_429[0][0]

activation_706 (Activation)	(None, 16, 16, 128)	0	add_432[0][0]

add_435 (Add)	(None, 8, 8, 256)	0	add_434[0][0]
batch_normalization_796[0][0]			

batch_normalization_798 (BatchN	(None, 64, 64, 32)	128	
conv2d_800[0][0]			

conv2d_807 (Conv2D)	(None, 32, 32, 64)	36864	
activation_704[0][0]			

conv2d_815 (Conv2D)	(None, 16, 16, 128)	147456	
activation_706[0][0]			

activation_710 (Activation)	(None, 8, 8, 256)	0	add_435[0][0]

add_436 (Add)	(None, 64, 64, 32)	0	
batch_normalization_798[0][0]			
activation_703[0][0]			

batch_normalization_805 (BatchN	(None, 32, 32, 64)	256	
conv2d_807[0][0]			

batch_normalization_813 (BatchN	(None, 16, 16, 128)	512	
conv2d_815[0][0]			

conv2d_823 (Conv2D)	(None, 8, 8, 256)	589824	
activation_710[0][0]			

activation_712 (Activation)	(None, 64, 64, 32)	0	add_436[0][0]

activation_719 (Activation)	(None, 32, 32, 64)	0	
batch_normalization_805[0][0]			

```

-----
activation_727 (Activation)      (None, 16, 16, 128)  0
batch_normalization_813[0][0]
-----

-----
batch_normalization_821 (BatchN (None, 8, 8, 256)    1024
conv2d_823[0][0]
-----

-----
conv2d_801 (Conv2D)              (None, 64, 64, 32)   9216
activation_712[0][0]
-----

-----
conv2d_808 (Conv2D)              (None, 32, 32, 64)   36864
activation_719[0][0]
-----

-----
conv2d_816 (Conv2D)              (None, 16, 16, 128)  147456
activation_727[0][0]
-----

-----
activation_735 (Activation)      (None, 8, 8, 256)    0
batch_normalization_821[0][0]
-----

-----
batch_normalization_799 (BatchN (None, 64, 64, 32)   128
conv2d_801[0][0]
-----

-----
batch_normalization_806 (BatchN (None, 32, 32, 64)   256
conv2d_808[0][0]
-----

-----
batch_normalization_814 (BatchN (None, 16, 16, 128)  512
conv2d_816[0][0]
-----

-----
conv2d_824 (Conv2D)              (None, 8, 8, 256)    589824
activation_735[0][0]
-----

-----
activation_713 (Activation)      (None, 64, 64, 32)   0
batch_normalization_799[0][0]
-----

-----
add_440 (Add)                    (None, 32, 32, 64)   0
batch_normalization_806[0][0]
activation_704[0][0]

```

```

-----
-----
add_444 (Add) (None, 16, 16, 128) 0
batch_normalization_814[0][0]
activation_706[0][0]
-----

-----
batch_normalization_822 (BatchN (None, 8, 8, 256) 1024
conv2d_824[0][0]
-----

-----
conv2d_802 (Conv2D) (None, 64, 64, 32) 9216
activation_713[0][0]
-----

-----
activation_720 (Activation) (None, 32, 32, 64) 0 add_440[0][0]
-----

-----
activation_728 (Activation) (None, 16, 16, 128) 0 add_444[0][0]
-----

-----
add_448 (Add) (None, 8, 8, 256) 0
batch_normalization_822[0][0]
activation_710[0][0]
-----

-----
batch_normalization_800 (BatchN (None, 64, 64, 32) 128
conv2d_802[0][0]
-----

-----
conv2d_809 (Conv2D) (None, 32, 32, 64) 36864
activation_720[0][0]
-----

-----
conv2d_817 (Conv2D) (None, 16, 16, 128) 147456
activation_728[0][0]
-----

-----
activation_736 (Activation) (None, 8, 8, 256) 0 add_448[0][0]
-----

-----
add_437 (Add) (None, 64, 64, 32) 0
batch_normalization_800[0][0]
activation_712[0][0]
-----

-----
batch_normalization_807 (BatchN (None, 32, 32, 64) 256
conv2d_809[0][0]

```

```

-----
-----
batch_normalization_815 (BatchN (None, 16, 16, 128) 512
conv2d_817[0][0]
-----
-----
conv2d_825 (Conv2D) (None, 8, 8, 256) 589824
activation_736[0][0]
-----
-----
activation_714 (Activation) (None, 64, 64, 32) 0 add_437[0][0]
-----
-----
activation_721 (Activation) (None, 32, 32, 64) 0
batch_normalization_807[0][0]
-----
-----
activation_729 (Activation) (None, 16, 16, 128) 0
batch_normalization_815[0][0]
-----
-----
batch_normalization_823 (BatchN (None, 8, 8, 256) 1024
conv2d_825[0][0]
-----
-----
conv2d_803 (Conv2D) (None, 64, 64, 32) 9216
activation_714[0][0]
-----
-----
conv2d_810 (Conv2D) (None, 32, 32, 64) 36864
activation_721[0][0]
-----
-----
conv2d_818 (Conv2D) (None, 16, 16, 128) 147456
activation_729[0][0]
-----
-----
activation_737 (Activation) (None, 8, 8, 256) 0
batch_normalization_823[0][0]
-----
-----
batch_normalization_801 (BatchN (None, 64, 64, 32) 128
conv2d_803[0][0]
-----
-----
batch_normalization_808 (BatchN (None, 32, 32, 64) 256
conv2d_810[0][0]
-----

```

```

-----
batch_normalization_816 (BatchN (None, 16, 16, 128) 512
conv2d_818[0][0]
-----

conv2d_826 (Conv2D) (None, 8, 8, 256) 589824
activation_737[0][0]
-----

activation_715 (Activation) (None, 64, 64, 32) 0
batch_normalization_801[0][0]
-----

add_441 (Add) (None, 32, 32, 64) 0
batch_normalization_808[0][0]
activation_720[0][0]
-----

add_445 (Add) (None, 16, 16, 128) 0
batch_normalization_816[0][0]
activation_728[0][0]
-----

batch_normalization_824 (BatchN (None, 8, 8, 256) 1024
conv2d_826[0][0]
-----

conv2d_804 (Conv2D) (None, 64, 64, 32) 9216
activation_715[0][0]
-----

activation_722 (Activation) (None, 32, 32, 64) 0 add_441[0][0]
-----

activation_730 (Activation) (None, 16, 16, 128) 0 add_445[0][0]
-----

add_449 (Add) (None, 8, 8, 256) 0
batch_normalization_824[0][0]
activation_736[0][0]
-----

batch_normalization_802 (BatchN (None, 64, 64, 32) 128
conv2d_804[0][0]
-----

conv2d_811 (Conv2D) (None, 32, 32, 64) 36864
activation_722[0][0]

```

```

-----
conv2d_819 (Conv2D)          (None, 16, 16, 128)  147456
activation_730[0][0]

-----

activation_738 (Activation)   (None, 8, 8, 256)    0          add_449[0][0]

-----

add_438 (Add)                (None, 64, 64, 32)   0
batch_normalization_802[0][0]
activation_714[0][0]

-----

batch_normalization_809 (BatchN (None, 32, 32, 64)  256
conv2d_811[0][0]

-----

batch_normalization_817 (BatchN (None, 16, 16, 128)  512
conv2d_819[0][0]

-----

conv2d_827 (Conv2D)          (None, 8, 8, 256)    589824
activation_738[0][0]

-----

activation_716 (Activation)   (None, 64, 64, 32)   0          add_438[0][0]

-----

activation_723 (Activation)   (None, 32, 32, 64)   0
batch_normalization_809[0][0]

-----

activation_731 (Activation)   (None, 16, 16, 128)  0
batch_normalization_817[0][0]

-----

batch_normalization_825 (BatchN (None, 8, 8, 256)    1024
conv2d_827[0][0]

-----

conv2d_805 (Conv2D)          (None, 64, 64, 32)   9216
activation_716[0][0]

-----

conv2d_812 (Conv2D)          (None, 32, 32, 64)   36864
activation_723[0][0]

-----

```

```

-----
conv2d_820 (Conv2D)          (None, 16, 16, 128)  147456
activation_731[0][0]
-----

-----
activation_739 (Activation)   (None, 8, 8, 256)    0
batch_normalization_825[0][0]
-----

-----
batch_normalization_803 (BatchN (None, 64, 64, 32)  128
conv2d_805[0][0]
-----

-----
batch_normalization_810 (BatchN (None, 32, 32, 64)  256
conv2d_812[0][0]
-----

-----
batch_normalization_818 (BatchN (None, 16, 16, 128)  512
conv2d_820[0][0]
-----

-----
conv2d_828 (Conv2D)          (None, 8, 8, 256)    589824
activation_739[0][0]
-----

-----
activation_717 (Activation)   (None, 64, 64, 32)    0
batch_normalization_803[0][0]
-----

-----
add_442 (Add)                (None, 32, 32, 64)    0
batch_normalization_810[0][0]
activation_722[0][0]
-----

-----
add_446 (Add)                (None, 16, 16, 128)    0
batch_normalization_818[0][0]
activation_730[0][0]
-----

-----
batch_normalization_826 (BatchN (None, 8, 8, 256)  1024
conv2d_828[0][0]
-----

-----
conv2d_806 (Conv2D)          (None, 64, 64, 32)    9216
activation_717[0][0]
-----

-----
activation_724 (Activation)   (None, 32, 32, 64)    0          add_442[0][0]

```



```

-----
activation_732 (Activation)      (None, 16, 16, 128)  0          add_446[0][0]
-----

add_450 (Add)                   (None, 8, 8, 256)    0
batch_normalization_826[0][0]
activation_738[0][0]
-----

batch_normalization_804 (BatchN (None, 64, 64, 32)  128
conv2d_806[0][0]
-----

conv2d_813 (Conv2D)             (None, 32, 32, 64)   36864
activation_724[0][0]
-----

conv2d_821 (Conv2D)             (None, 16, 16, 128)  147456
activation_732[0][0]
-----

activation_740 (Activation)      (None, 8, 8, 256)    0          add_450[0][0]
-----

add_439 (Add)                   (None, 64, 64, 32)   0
batch_normalization_804[0][0]
activation_716[0][0]
-----

batch_normalization_811 (BatchN (None, 32, 32, 64)   256
conv2d_813[0][0]
-----

batch_normalization_819 (BatchN (None, 16, 16, 128)  512
conv2d_821[0][0]
-----

conv2d_829 (Conv2D)             (None, 8, 8, 256)    589824
activation_740[0][0]
-----

activation_718 (Activation)      (None, 64, 64, 32)   0          add_439[0][0]
-----

activation_725 (Activation)      (None, 32, 32, 64)   0
batch_normalization_811[0][0]
-----

```

```

-----
activation_733 (Activation)      (None, 16, 16, 128)  0
batch_normalization_819[0][0]

-----

batch_normalization_827 (BatchN (None, 8, 8, 256)    1024
conv2d_829[0][0]

-----

conv2d_814 (Conv2D)              (None, 32, 32, 64)   36864
activation_725[0][0]

-----

conv2d_822 (Conv2D)              (None, 16, 16, 128)  147456
activation_733[0][0]

-----

activation_741 (Activation)      (None, 8, 8, 256)    0
batch_normalization_827[0][0]

-----

conv2d_841 (Conv2D)              (None, 32, 32, 32)   9216
activation_718[0][0]

-----

batch_normalization_812 (BatchN (None, 32, 32, 64)    256
conv2d_814[0][0]

-----

batch_normalization_820 (BatchN (None, 16, 16, 128)  512
conv2d_822[0][0]

-----

conv2d_830 (Conv2D)              (None, 8, 8, 256)    589824
activation_741[0][0]

-----

batch_normalization_839 (BatchN (None, 32, 32, 32)    128
conv2d_841[0][0]

-----

add_443 (Add)                    (None, 32, 32, 64)    0
batch_normalization_812[0][0]
activation_724[0][0]

-----

add_447 (Add)                    (None, 16, 16, 128)  0
batch_normalization_820[0][0]

```

activation_732[0][0]

batch_normalization_828 (BatchN (None, 8, 8, 256) 1024
conv2d_830[0][0]

conv2d_837 (Conv2D) (None, 32, 32, 32) 9216
activation_718[0][0]

activation_747 (Activation) (None, 32, 32, 32) 0
batch_normalization_839[0][0]

activation_726 (Activation) (None, 32, 32, 64) 0 add_443[0][0]

activation_734 (Activation) (None, 16, 16, 128) 0 add_447[0][0]

add_451 (Add) (None, 8, 8, 256) 0
batch_normalization_828[0][0]
activation_740[0][0]

batch_normalization_835 (BatchN (None, 32, 32, 32) 128
conv2d_837[0][0]

conv2d_842 (Conv2D) (None, 16, 16, 32) 9216
activation_747[0][0]

activation_742 (Activation) (None, 8, 8, 256) 0 add_451[0][0]

conv2d_834 (Conv2D) (None, 32, 32, 64) 18432
activation_718[0][0]

conv2d_835 (Conv2D) (None, 16, 16, 64) 8192
activation_734[0][0]

activation_745 (Activation) (None, 32, 32, 32) 0
batch_normalization_835[0][0]

```

-----
batch_normalization_840 (BatchN (None, 16, 16, 32)    128
conv2d_842[0][0]
-----

-----
conv2d_844 (Conv2D)          (None, 16, 16, 64)    36864
activation_726[0][0]
-----

-----
batch_normalization_832 (BatchN (None, 32, 32, 64)    256
conv2d_834[0][0]
-----

-----
batch_normalization_833 (BatchN (None, 16, 16, 64)    256
conv2d_835[0][0]
-----

-----
conv2d_836 (Conv2D)          (None, 8, 8, 64)      16384
activation_742[0][0]
-----

-----
conv2d_838 (Conv2D)          (None, 16, 16, 128)   36864
activation_745[0][0]
-----

-----
activation_748 (Activation)   (None, 16, 16, 32)    0
batch_normalization_840[0][0]
-----

-----
batch_normalization_842 (BatchN (None, 16, 16, 64)    256
conv2d_844[0][0]
-----

-----
conv2d_831 (Conv2D)          (None, 32, 32, 32)    2048
activation_726[0][0]
-----

-----
add_455 (Add)                (None, 32, 32, 64)    0
activation_726[0][0]
batch_normalization_832[0][0]
-----

-----
up_sampling2d_82 (UpSampling2D) (None, 32, 32, 64)    0
batch_normalization_833[0][0]
-----

-----
batch_normalization_834 (BatchN (None, 8, 8, 64)      256
conv2d_836[0][0]

```

```

-----
-----
batch_normalization_836 (BatchN (None, 16, 16, 128) 512
conv2d_838[0][0]
-----
-----
conv2d_839 (Conv2D) (None, 16, 16, 128) 73728
activation_726[0][0]
-----
-----
conv2d_840 (Conv2D) (None, 8, 8, 128) 32768
activation_742[0][0]
-----
-----
conv2d_843 (Conv2D) (None, 8, 8, 256) 73728
activation_748[0][0]
-----
-----
activation_749 (Activation) (None, 16, 16, 64) 0
batch_normalization_842[0][0]
-----
-----
batch_normalization_829 (BatchN (None, 32, 32, 32) 128
conv2d_831[0][0]
-----
-----
conv2d_832 (Conv2D) (None, 16, 16, 32) 4096
activation_734[0][0]
-----
-----
add_456 (Add) (None, 32, 32, 64) 0 add_455[0][0]
up_sampling2d_82[0][0]
-----
-----
up_sampling2d_83 (UpSampling2D) (None, 32, 32, 64) 0
batch_normalization_834[0][0]
-----
-----
add_458 (Add) (None, 16, 16, 128) 0
activation_734[0][0]
batch_normalization_836[0][0]
-----
-----
batch_normalization_837 (BatchN (None, 16, 16, 128) 512
conv2d_839[0][0]
-----
-----
batch_normalization_838 (BatchN (None, 8, 8, 128) 512

```

```

conv2d_840[0][0]
-----
-----
batch_normalization_841 (BatchN (None, 8, 8, 256)    1024
conv2d_843[0][0]
-----
-----
conv2d_845 (Conv2D)          (None, 8, 8, 256)    147456
activation_749[0][0]
-----
-----
up_sampling2d_79 (UpSampling2D) (None, 64, 64, 32)    0
batch_normalization_829[0][0]
-----
-----
batch_normalization_830 (BatchN (None, 16, 16, 32)    128
conv2d_832[0][0]
-----
-----
conv2d_833 (Conv2D)          (None, 8, 8, 32)    8192
activation_742[0][0]
-----
-----
add_457 (Add)                (None, 32, 32, 64)    0          add_456[0][0]
up_sampling2d_83[0][0]
-----
-----
add_459 (Add)                (None, 16, 16, 128)    0          add_458[0][0]
batch_normalization_837[0][0]
-----
-----
up_sampling2d_84 (UpSampling2D) (None, 16, 16, 128)    0
batch_normalization_838[0][0]
-----
-----
add_461 (Add)                (None, 8, 8, 256)    0
activation_742[0][0]
batch_normalization_841[0][0]
-----
-----
batch_normalization_843 (BatchN (None, 8, 8, 256)    1024
conv2d_845[0][0]
-----
-----
conv2d_846 (Conv2D)          (None, 8, 8, 256)    294912
activation_734[0][0]
-----
-----

```

add_452 (Add)	(None, 64, 64, 32)	0	
activation_718[0][0]			
up_sampling2d_79[0][0]			

up_sampling2d_80 (UpSampling2D)	(None, 64, 64, 32)	0	
batch_normalization_830[0][0]			

batch_normalization_831 (BatchN	(None, 8, 8, 32)	128	
conv2d_833[0][0]			

activation_744 (Activation)	(None, 32, 32, 64)	0	add_457[0][0]

add_460 (Add)	(None, 16, 16, 128)	0	add_459[0][0]
up_sampling2d_84[0][0]			

add_462 (Add)	(None, 8, 8, 256)	0	add_461[0][0]
batch_normalization_843[0][0]			

batch_normalization_844 (BatchN	(None, 8, 8, 256)	1024	
conv2d_846[0][0]			

add_453 (Add)	(None, 64, 64, 32)	0	add_452[0][0]
up_sampling2d_80[0][0]			

up_sampling2d_81 (UpSampling2D)	(None, 64, 64, 32)	0	
batch_normalization_831[0][0]			

conv2d_855 (Conv2D)	(None, 32, 32, 64)	36864	
activation_744[0][0]			

activation_746 (Activation)	(None, 16, 16, 128)	0	add_460[0][0]

add_463 (Add)	(None, 8, 8, 256)	0	add_462[0][0]
batch_normalization_844[0][0]			

add_454 (Add)	(None, 64, 64, 32)	0	add_453[0][0]

up_sampling2d_81[0][0]

batch_normalization_853 (BatchN (None, 32, 32, 64) 256
conv2d_855[0][0]

conv2d_863 (Conv2D) (None, 16, 16, 128) 147456
activation_746[0][0]

activation_750 (Activation) (None, 8, 8, 256) 0 add_463[0][0]

activation_743 (Activation) (None, 64, 64, 32) 0 add_454[0][0]

activation_759 (Activation) (None, 32, 32, 64) 0
batch_normalization_853[0][0]

batch_normalization_861 (BatchN (None, 16, 16, 128) 512
conv2d_863[0][0]

conv2d_871 (Conv2D) (None, 8, 8, 256) 589824
activation_750[0][0]

conv2d_847 (Conv2D) (None, 64, 64, 32) 9216
activation_743[0][0]

conv2d_856 (Conv2D) (None, 32, 32, 64) 36864
activation_759[0][0]

activation_767 (Activation) (None, 16, 16, 128) 0
batch_normalization_861[0][0]

batch_normalization_869 (BatchN (None, 8, 8, 256) 1024
conv2d_871[0][0]

batch_normalization_845 (BatchN (None, 64, 64, 32) 128
conv2d_847[0][0]


```

-----
batch_normalization_854 (BatchN (None, 32, 32, 64) 256
conv2d_856[0] [0]
-----

-----
conv2d_864 (Conv2D) (None, 16, 16, 128) 147456
activation_767[0] [0]
-----

-----
activation_775 (Activation) (None, 8, 8, 256) 0
batch_normalization_869[0] [0]
-----

-----
activation_751 (Activation) (None, 64, 64, 32) 0
batch_normalization_845[0] [0]
-----

-----
add_468 (Add) (None, 32, 32, 64) 0
batch_normalization_854[0] [0]
activation_744[0] [0]
-----

-----
batch_normalization_862 (BatchN (None, 16, 16, 128) 512
conv2d_864[0] [0]
-----

-----
conv2d_872 (Conv2D) (None, 8, 8, 256) 589824
activation_775[0] [0]
-----

-----
conv2d_848 (Conv2D) (None, 64, 64, 32) 9216
activation_751[0] [0]
-----

-----
activation_760 (Activation) (None, 32, 32, 64) 0 add_468[0] [0]
-----

-----
add_472 (Add) (None, 16, 16, 128) 0
batch_normalization_862[0] [0]
activation_746[0] [0]
-----

-----
batch_normalization_870 (BatchN (None, 8, 8, 256) 1024
conv2d_872[0] [0]
-----

-----
batch_normalization_846 (BatchN (None, 64, 64, 32) 128
conv2d_848[0] [0]

```

```

-----
conv2d_857 (Conv2D)          (None, 32, 32, 64)  36864
activation_760[0][0]

-----
activation_768 (Activation)    (None, 16, 16, 128)  0          add_472[0][0]

-----
add_476 (Add)                 (None, 8, 8, 256)   0
batch_normalization_870[0][0]
activation_750[0][0]

-----
add_464 (Add)                 (None, 64, 64, 32)   0
batch_normalization_846[0][0]
activation_743[0][0]

-----
batch_normalization_855 (BatchN (None, 32, 32, 64)  256
conv2d_857[0][0]

-----
conv2d_865 (Conv2D)          (None, 16, 16, 128) 147456
activation_768[0][0]

-----
activation_776 (Activation)    (None, 8, 8, 256)   0          add_476[0][0]

-----
activation_752 (Activation)    (None, 64, 64, 32)   0          add_464[0][0]

-----
activation_761 (Activation)    (None, 32, 32, 64)   0
batch_normalization_855[0][0]

-----
batch_normalization_863 (BatchN (None, 16, 16, 128)  512
conv2d_865[0][0]

-----
conv2d_873 (Conv2D)          (None, 8, 8, 256)   589824
activation_776[0][0]

-----
conv2d_849 (Conv2D)          (None, 64, 64, 32)   9216
activation_752[0][0]
-----

```

```

-----
conv2d_858 (Conv2D)          (None, 32, 32, 64)    36864
activation_761[0][0]
-----

```

```

-----
activation_769 (Activation)   (None, 16, 16, 128)   0
batch_normalization_863[0][0]
-----

```

```

-----
batch_normalization_871 (BatchN (None, 8, 8, 256)    1024
conv2d_873[0][0]
-----

```

```

-----
batch_normalization_847 (BatchN (None, 64, 64, 32)    128
conv2d_849[0][0]
-----

```

```

-----
batch_normalization_856 (BatchN (None, 32, 32, 64)    256
conv2d_858[0][0]
-----

```

```

-----
conv2d_866 (Conv2D)          (None, 16, 16, 128)   147456
activation_769[0][0]
-----

```

```

-----
activation_777 (Activation)   (None, 8, 8, 256)     0
batch_normalization_871[0][0]
-----

```

```

-----
activation_753 (Activation)   (None, 64, 64, 32)    0
batch_normalization_847[0][0]
-----

```

```

-----
add_469 (Add)                (None, 32, 32, 64)    0
batch_normalization_856[0][0]
activation_760[0][0]
-----

```

```

-----
batch_normalization_864 (BatchN (None, 16, 16, 128)   512
conv2d_866[0][0]
-----

```

```

-----
conv2d_874 (Conv2D)          (None, 8, 8, 256)     589824
activation_777[0][0]
-----

```

```

-----
conv2d_850 (Conv2D)          (None, 64, 64, 32)    9216
activation_753[0][0]
-----

```

```

-----
activation_762 (Activation)      (None, 32, 32, 64)  0          add_469[0][0]
-----

add_473 (Add)                   (None, 16, 16, 128) 0
batch_normalization_864[0][0]
activation_768[0][0]
-----

batch_normalization_872 (BatchN (None, 8, 8, 256)  1024
conv2d_874[0][0]
-----

batch_normalization_848 (BatchN (None, 64, 64, 32)  128
conv2d_850[0][0]
-----

conv2d_859 (Conv2D)             (None, 32, 32, 64)  36864
activation_762[0][0]
-----

activation_770 (Activation)      (None, 16, 16, 128) 0          add_473[0][0]
-----

add_477 (Add)                   (None, 8, 8, 256)  0
batch_normalization_872[0][0]
activation_776[0][0]
-----

add_465 (Add)                   (None, 64, 64, 32)  0
batch_normalization_848[0][0]
activation_752[0][0]
-----

batch_normalization_857 (BatchN (None, 32, 32, 64)  256
conv2d_859[0][0]
-----

conv2d_867 (Conv2D)             (None, 16, 16, 128) 147456
activation_770[0][0]
-----

activation_778 (Activation)      (None, 8, 8, 256)  0          add_477[0][0]
-----

activation_754 (Activation)      (None, 64, 64, 32)  0          add_465[0][0]
-----

```

```

-----
activation_763 (Activation)      (None, 32, 32, 64)    0
batch_normalization_857[0][0]

-----

batch_normalization_865 (BatchN (None, 16, 16, 128)  512
conv2d_867[0][0]

-----

conv2d_875 (Conv2D)              (None, 8, 8, 256)    589824
activation_778[0][0]

-----

conv2d_851 (Conv2D)              (None, 64, 64, 32)   9216
activation_754[0][0]

-----

conv2d_860 (Conv2D)              (None, 32, 32, 64)   36864
activation_763[0][0]

-----

activation_771 (Activation)      (None, 16, 16, 128)  0
batch_normalization_865[0][0]

-----

batch_normalization_873 (BatchN (None, 8, 8, 256)    1024
conv2d_875[0][0]

-----

batch_normalization_849 (BatchN (None, 64, 64, 32)   128
conv2d_851[0][0]

-----

batch_normalization_858 (BatchN (None, 32, 32, 64)   256
conv2d_860[0][0]

-----

conv2d_868 (Conv2D)              (None, 16, 16, 128)  147456
activation_771[0][0]

-----

activation_779 (Activation)      (None, 8, 8, 256)    0
batch_normalization_873[0][0]

-----

activation_755 (Activation)      (None, 64, 64, 32)   0
batch_normalization_849[0][0]

```

```

-----
add_470 (Add) (None, 32, 32, 64) 0
batch_normalization_858[0][0]
activation_762[0][0]
-----

-----
batch_normalization_866 (BatchN (None, 16, 16, 128) 512
conv2d_868[0][0]
-----

-----
conv2d_876 (Conv2D) (None, 8, 8, 256) 589824
activation_779[0][0]
-----

-----
conv2d_852 (Conv2D) (None, 64, 64, 32) 9216
activation_755[0][0]
-----

-----
activation_764 (Activation) (None, 32, 32, 64) 0 add_470[0][0]
-----

-----
add_474 (Add) (None, 16, 16, 128) 0
batch_normalization_866[0][0]
activation_770[0][0]
-----

-----
batch_normalization_874 (BatchN (None, 8, 8, 256) 1024
conv2d_876[0][0]
-----

-----
batch_normalization_850 (BatchN (None, 64, 64, 32) 128
conv2d_852[0][0]
-----

-----
conv2d_861 (Conv2D) (None, 32, 32, 64) 36864
activation_764[0][0]
-----

-----
activation_772 (Activation) (None, 16, 16, 128) 0 add_474[0][0]
-----

-----
add_478 (Add) (None, 8, 8, 256) 0
batch_normalization_874[0][0]
activation_778[0][0]
-----

-----
add_466 (Add) (None, 64, 64, 32) 0
batch_normalization_850[0][0]

```

```

activation_754[0][0]
-----
-----
batch_normalization_859 (BatchN (None, 32, 32, 64)    256
conv2d_861[0][0]
-----
-----
conv2d_869 (Conv2D)          (None, 16, 16, 128)  147456
activation_772[0][0]
-----
-----
activation_780 (Activation)    (None, 8, 8, 256)    0          add_478[0][0]
-----
-----
activation_756 (Activation)    (None, 64, 64, 32)   0          add_466[0][0]
-----
-----
activation_765 (Activation)    (None, 32, 32, 64)   0
batch_normalization_859[0][0]
-----
-----
batch_normalization_867 (BatchN (None, 16, 16, 128)  512
conv2d_869[0][0]
-----
-----
conv2d_877 (Conv2D)          (None, 8, 8, 256)    589824
activation_780[0][0]
-----
-----
conv2d_853 (Conv2D)          (None, 64, 64, 32)   9216
activation_756[0][0]
-----
-----
conv2d_862 (Conv2D)          (None, 32, 32, 64)   36864
activation_765[0][0]
-----
-----
activation_773 (Activation)    (None, 16, 16, 128)  0
batch_normalization_867[0][0]
-----
-----
batch_normalization_875 (BatchN (None, 8, 8, 256)    1024
conv2d_877[0][0]
-----
-----
batch_normalization_851 (BatchN (None, 64, 64, 32)   128
conv2d_853[0][0]
-----

```

```

-----
batch_normalization_860 (BatchN (None, 32, 32, 64) 256
conv2d_862[0] [0]
-----

-----
conv2d_870 (Conv2D) (None, 16, 16, 128) 147456
activation_773[0] [0]
-----

-----
activation_781 (Activation) (None, 8, 8, 256) 0
batch_normalization_875[0] [0]
-----

-----
activation_757 (Activation) (None, 64, 64, 32) 0
batch_normalization_851[0] [0]
-----

-----
add_471 (Add) (None, 32, 32, 64) 0
batch_normalization_860[0] [0]
activation_764[0] [0]
-----

-----
batch_normalization_868 (BatchN (None, 16, 16, 128) 512
conv2d_870[0] [0]
-----

-----
conv2d_878 (Conv2D) (None, 8, 8, 256) 589824
activation_781[0] [0]
-----

-----
conv2d_854 (Conv2D) (None, 64, 64, 32) 9216
activation_757[0] [0]
-----

-----
activation_766 (Activation) (None, 32, 32, 64) 0 add_471[0] [0]
-----

-----
add_475 (Add) (None, 16, 16, 128) 0
batch_normalization_868[0] [0]
activation_772[0] [0]
-----

-----
batch_normalization_876 (BatchN (None, 8, 8, 256) 1024
conv2d_878[0] [0]
-----

-----
batch_normalization_852 (BatchN (None, 64, 64, 32) 128
conv2d_854[0] [0]

```



```

-----
conv2d_879 (Conv2D)                (None, 32, 32, 32)    2048
activation_766[0][0]

-----
activation_774 (Activation)         (None, 16, 16, 128)   0                add_475[0][0]
-----
add_479 (Add)                      (None, 8, 8, 256)     0
batch_normalization_876[0][0]
activation_780[0][0]

-----
add_467 (Add)                      (None, 64, 64, 32)    0
batch_normalization_852[0][0]
activation_756[0][0]

-----
batch_normalization_877 (BatchN (None, 32, 32, 32)    128
conv2d_879[0][0]

-----
conv2d_880 (Conv2D)                (None, 16, 16, 32)    4096
activation_774[0][0]

-----
activation_782 (Activation)         (None, 8, 8, 256)     0                add_479[0][0]
-----
activation_758 (Activation)         (None, 64, 64, 32)    0                add_467[0][0]
-----
up_sampling2d_85 (UpSampling2D) (None, 64, 64, 32)    0
batch_normalization_877[0][0]

-----
batch_normalization_878 (BatchN (None, 16, 16, 32)    128
conv2d_880[0][0]

-----
conv2d_881 (Conv2D)                (None, 8, 8, 32)      8192
activation_782[0][0]

-----
add_480 (Add)                      (None, 64, 64, 32)    0
activation_758[0][0]
up_sampling2d_85[0][0]

```

```

-----
-----
up_sampling2d_86 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_878[0][0]
-----
-----
batch_normalization_879 (BatchN (None, 8, 8, 32) 128
conv2d_881[0][0]
-----
-----
add_481 (Add) (None, 64, 64, 32) 0 add_480[0][0]
up_sampling2d_86[0][0]
-----
-----
up_sampling2d_87 (UpSampling2D) (None, 64, 64, 32) 0
batch_normalization_879[0][0]
-----
-----
add_482 (Add) (None, 64, 64, 32) 0 add_481[0][0]
up_sampling2d_87[0][0]
-----
-----
activation_783 (Activation) (None, 64, 64, 32) 0 add_482[0][0]
-----
-----
up_sampling2d_88 (UpSampling2D) (None, 128, 128, 32) 0
activation_783[0][0]
-----
-----
conv2d_882 (Conv2D) (None, 128, 128, 32) 9216
up_sampling2d_88[0][0]
-----
-----
batch_normalization_880 (BatchN (None, 128, 128, 32) 128
conv2d_882[0][0]
-----
-----
activation_784 (Activation) (None, 128, 128, 32) 0
batch_normalization_880[0][0]
-----
-----
up_sampling2d_89 (UpSampling2D) (None, 256, 256, 32) 0
activation_784[0][0]
-----
-----
conv2d_883 (Conv2D) (None, 256, 256, 32) 9216
up_sampling2d_89[0][0]
-----

```

```

-----
batch_normalization_881 (BatchN (None, 256, 256, 32) 128
conv2d_883[0][0]
-----

```

```

-----
activation_785 (Activation)      (None, 256, 256, 32) 0
batch_normalization_881[0][0]
-----

```

```

-----
conv2d_884 (Conv2D)              (None, 256, 256, 1) 32
activation_785[0][0]
=====

```

```

=====
Total params: 28,608,608
Trainable params: 28,554,144
Non-trainable params: 54,464
-----

```

```

[58]: mean_iou = MeanIoU(2, 0.4)

model.compile(optimizer='adam', loss='binary_crossentropy', metrics=[mean_iou])

```

6.3 Callbacks

```

[59]: !rm -rf ./model_save/

```

```

[60]: # Modelcheckpoint callback
if not os.path.exists('model_save'):
    os.makedirs('model_save')
filepath="model_save/weights-{epoch:04d}.hdf5"
checkpoint = tf.keras.callbacks.ModelCheckpoint(filepath=filepath,
                                                save_best_only=True,
                                                mode='auto',
                                                monitor='val_loss')

```

```

[61]: !rm -rf ./model/

```

```

[62]: # Tensorboard Callback
log_dir = os.path.join("model", datetime.datetime.now().
    ↳strftime("%Y%m%d-%H%M%S"))
tensorboard_callback = tf.keras.callbacks.TensorBoard(log_dir=log_dir,
                                                        histogram_freq=1,
                                                        write_graph=True)

```

6.4 Training

```
[63]: callbacks_list = [checkpoint, tensorboard_callback]
      history = model.fit(train_ds,
                          initial_epoch = 0,
                          epochs=30,
                          callbacks=callbacks_list,
                          validation_data=val_ds)
```

Epoch 1/30

76/76 [=====] - 55s 398ms/step - loss: 0.3061 -
mean_iou: 0.6544 - val_loss: 2.6546 - val_mean_iou: 0.6599

Epoch 2/30

76/76 [=====] - 23s 298ms/step - loss: 0.1733 -
mean_iou: 0.7930 - val_loss: 3.1867 - val_mean_iou: 0.7570

Epoch 3/30

76/76 [=====] - 22s 291ms/step - loss: 0.1224 -
mean_iou: 0.8435 - val_loss: 0.7679 - val_mean_iou: 0.2655

Epoch 4/30

76/76 [=====] - 22s 291ms/step - loss: 0.1087 -
mean_iou: 0.8517 - val_loss: 0.6303 - val_mean_iou: 0.7287

Epoch 5/30

76/76 [=====] - 22s 290ms/step - loss: 0.1011 -
mean_iou: 0.8555 - val_loss: 0.1152 - val_mean_iou: 0.8424

Epoch 6/30

76/76 [=====] - 22s 294ms/step - loss: 0.0919 -
mean_iou: 0.8672 - val_loss: 0.1221 - val_mean_iou: 0.8189

Epoch 7/30

76/76 [=====] - 22s 288ms/step - loss: 0.0851 -
mean_iou: 0.8772 - val_loss: 0.0942 - val_mean_iou: 0.8850

Epoch 8/30

76/76 [=====] - 22s 293ms/step - loss: 0.0798 -
mean_iou: 0.8831 - val_loss: 0.1510 - val_mean_iou: 0.8596

Epoch 9/30

76/76 [=====] - 23s 299ms/step - loss: 0.0759 -
mean_iou: 0.8868 - val_loss: 0.5305 - val_mean_iou: 0.6982

Epoch 10/30

76/76 [=====] - 23s 295ms/step - loss: 0.0766 -
mean_iou: 0.8851 - val_loss: 0.0911 - val_mean_iou: 0.8752

Epoch 11/30

76/76 [=====] - 22s 287ms/step - loss: 0.0740 -
mean_iou: 0.8889 - val_loss: 4.0136 - val_mean_iou: 0.5084

Epoch 12/30

76/76 [=====] - 22s 293ms/step - loss: 0.0698 -
mean_iou: 0.8933 - val_loss: 0.4382 - val_mean_iou: 0.7836

Epoch 13/30

76/76 [=====] - 22s 294ms/step - loss: 0.0695 -
mean_iou: 0.8937 - val_loss: 0.0748 - val_mean_iou: 0.8893

Epoch 14/30
76/76 [=====] - 22s 291ms/step - loss: 0.0693 -
mean_iou: 0.8924 - val_loss: 0.0771 - val_mean_iou: 0.8951
Epoch 15/30
76/76 [=====] - 22s 289ms/step - loss: 0.0734 -
mean_iou: 0.8884 - val_loss: 0.5585 - val_mean_iou: 0.7932
Epoch 16/30
76/76 [=====] - 22s 293ms/step - loss: 0.0691 -
mean_iou: 0.8945 - val_loss: 0.1398 - val_mean_iou: 0.8390
Epoch 17/30
76/76 [=====] - 22s 293ms/step - loss: 0.0696 -
mean_iou: 0.8929 - val_loss: 0.1735 - val_mean_iou: 0.8172
Epoch 18/30
76/76 [=====] - 22s 293ms/step - loss: 0.0685 -
mean_iou: 0.8943 - val_loss: 0.1042 - val_mean_iou: 0.8703
Epoch 19/30
76/76 [=====] - 22s 291ms/step - loss: 0.0632 -
mean_iou: 0.9003 - val_loss: 0.1549 - val_mean_iou: 0.8508
Epoch 20/30
76/76 [=====] - 23s 296ms/step - loss: 0.0606 -
mean_iou: 0.9043 - val_loss: 0.2205 - val_mean_iou: 0.7688
Epoch 21/30
76/76 [=====] - 23s 295ms/step - loss: 0.0623 -
mean_iou: 0.9010 - val_loss: 0.0738 - val_mean_iou: 0.8933
Epoch 22/30
76/76 [=====] - 23s 297ms/step - loss: 0.0609 -
mean_iou: 0.9029 - val_loss: 0.0965 - val_mean_iou: 0.8540
Epoch 23/30
76/76 [=====] - 22s 291ms/step - loss: 0.0595 -
mean_iou: 0.9048 - val_loss: 0.1178 - val_mean_iou: 0.8473
Epoch 24/30
76/76 [=====] - 22s 292ms/step - loss: 0.0575 -
mean_iou: 0.9070 - val_loss: 0.0719 - val_mean_iou: 0.8822
Epoch 25/30
76/76 [=====] - 23s 295ms/step - loss: 0.0589 -
mean_iou: 0.9065 - val_loss: 0.0774 - val_mean_iou: 0.8812
Epoch 26/30
76/76 [=====] - 22s 294ms/step - loss: 0.0561 -
mean_iou: 0.9092 - val_loss: 0.0644 - val_mean_iou: 0.9034
Epoch 27/30
76/76 [=====] - 23s 298ms/step - loss: 0.0569 -
mean_iou: 0.9077 - val_loss: 0.1343 - val_mean_iou: 0.7942
Epoch 28/30
76/76 [=====] - 22s 289ms/step - loss: 0.0546 -
mean_iou: 0.9112 - val_loss: 0.1397 - val_mean_iou: 0.8083
Epoch 29/30
76/76 [=====] - 22s 292ms/step - loss: 0.0527 -
mean_iou: 0.9144 - val_loss: 0.0667 - val_mean_iou: 0.8983

Epoch 30/30

76/76 [=====] - 22s 288ms/step - loss: 0.0505 -
mean_iou: 0.9166 - val_loss: 0.0676 - val_mean_iou: 0.8950

```
[64]: initial_epoch = int(sorted(os.listdir('model_save'))[-1].split('.')[0].  
    ↪split('-')[-1])  
history = model.fit(train_ds,  
                    initial_epoch = initial_epoch,  
                    epochs=60,  
                    callbacks=callbacks_list,  
                    validation_data=val_ds)
```

Epoch 27/60

76/76 [=====] - 25s 332ms/step - loss: 0.0502 -
mean_iou: 0.9171 - val_loss: 0.0608 - val_mean_iou: 0.9077

Epoch 28/60

76/76 [=====] - 22s 291ms/step - loss: 0.0475 -
mean_iou: 0.9212 - val_loss: 0.0717 - val_mean_iou: 0.8994

Epoch 29/60

76/76 [=====] - 22s 289ms/step - loss: 0.0486 -
mean_iou: 0.9207 - val_loss: 0.0635 - val_mean_iou: 0.9059

Epoch 30/60

76/76 [=====] - 22s 294ms/step - loss: 0.0469 -
mean_iou: 0.9227 - val_loss: 0.0811 - val_mean_iou: 0.8719

Epoch 31/60

76/76 [=====] - 23s 298ms/step - loss: 0.0470 -
mean_iou: 0.9220 - val_loss: 0.1497 - val_mean_iou: 0.8395

Epoch 32/60

76/76 [=====] - 22s 287ms/step - loss: 0.0470 -
mean_iou: 0.9220 - val_loss: 0.1512 - val_mean_iou: 0.8349

Epoch 33/60

76/76 [=====] - 22s 293ms/step - loss: 0.0459 -
mean_iou: 0.9233 - val_loss: 0.0735 - val_mean_iou: 0.8900

Epoch 34/60

76/76 [=====] - 22s 294ms/step - loss: 0.0460 -
mean_iou: 0.9235 - val_loss: 0.0694 - val_mean_iou: 0.8977

Epoch 35/60

76/76 [=====] - 23s 299ms/step - loss: 0.0455 -
mean_iou: 0.9245 - val_loss: 0.0637 - val_mean_iou: 0.9020

Epoch 36/60

76/76 [=====] - 22s 285ms/step - loss: 0.0431 -
mean_iou: 0.9281 - val_loss: 0.1270 - val_mean_iou: 0.8275

Epoch 37/60

76/76 [=====] - 23s 300ms/step - loss: 0.0425 -
mean_iou: 0.9285 - val_loss: 0.1428 - val_mean_iou: 0.8398

Epoch 38/60

76/76 [=====] - 22s 288ms/step - loss: 0.0420 -
mean_iou: 0.9293 - val_loss: 0.0851 - val_mean_iou: 0.8753

Epoch 39/60
76/76 [=====] - 22s 290ms/step - loss: 0.0428 -
mean_iou: 0.9282 - val_loss: 0.0729 - val_mean_iou: 0.8883
Epoch 40/60
76/76 [=====] - 22s 292ms/step - loss: 0.0396 -
mean_iou: 0.9334 - val_loss: 0.3640 - val_mean_iou: 0.8195
Epoch 41/60
76/76 [=====] - 23s 298ms/step - loss: 0.0400 -
mean_iou: 0.9328 - val_loss: 0.0736 - val_mean_iou: 0.8980
Epoch 42/60
76/76 [=====] - 22s 288ms/step - loss: 0.0377 -
mean_iou: 0.9361 - val_loss: 0.0842 - val_mean_iou: 0.8792
Epoch 43/60
76/76 [=====] - 22s 290ms/step - loss: 0.0381 -
mean_iou: 0.9353 - val_loss: 0.0761 - val_mean_iou: 0.8862
Epoch 44/60
76/76 [=====] - 22s 294ms/step - loss: 0.0382 -
mean_iou: 0.9352 - val_loss: 0.0679 - val_mean_iou: 0.8988
Epoch 45/60
76/76 [=====] - 23s 298ms/step - loss: 0.0357 -
mean_iou: 0.9390 - val_loss: 0.0696 - val_mean_iou: 0.9040
Epoch 46/60
76/76 [=====] - 22s 290ms/step - loss: 0.0343 -
mean_iou: 0.9412 - val_loss: 0.0710 - val_mean_iou: 0.9025
Epoch 47/60
76/76 [=====] - 22s 284ms/step - loss: 0.0337 -
mean_iou: 0.9422 - val_loss: 0.0715 - val_mean_iou: 0.9087
Epoch 48/60
76/76 [=====] - 23s 298ms/step - loss: 0.0327 -
mean_iou: 0.9435 - val_loss: 0.1064 - val_mean_iou: 0.8439
Epoch 49/60
76/76 [=====] - 22s 285ms/step - loss: 0.0321 -
mean_iou: 0.9446 - val_loss: 0.0880 - val_mean_iou: 0.8877
Epoch 50/60
76/76 [=====] - 23s 300ms/step - loss: 0.0325 -
mean_iou: 0.9439 - val_loss: 0.0720 - val_mean_iou: 0.8954
Epoch 51/60
76/76 [=====] - 22s 289ms/step - loss: 0.0321 -
mean_iou: 0.9446 - val_loss: 0.0750 - val_mean_iou: 0.8976
Epoch 52/60
76/76 [=====] - 23s 298ms/step - loss: 0.0312 -
mean_iou: 0.9461 - val_loss: 0.0695 - val_mean_iou: 0.9077
Epoch 53/60
76/76 [=====] - 22s 289ms/step - loss: 0.0300 -
mean_iou: 0.9480 - val_loss: 0.0841 - val_mean_iou: 0.8984
Epoch 54/60
76/76 [=====] - 22s 289ms/step - loss: 0.0304 -
mean_iou: 0.9473 - val_loss: 0.0724 - val_mean_iou: 0.9040

```

Epoch 55/60
76/76 [=====] - 22s 287ms/step - loss: 0.0289 -
mean_iou: 0.9498 - val_loss: 0.0768 - val_mean_iou: 0.8979
Epoch 56/60
76/76 [=====] - 23s 295ms/step - loss: 0.0278 -
mean_iou: 0.9517 - val_loss: 0.0734 - val_mean_iou: 0.9022
Epoch 57/60
76/76 [=====] - 23s 299ms/step - loss: 0.0269 -
mean_iou: 0.9530 - val_loss: 0.0894 - val_mean_iou: 0.8795
Epoch 58/60
76/76 [=====] - 22s 292ms/step - loss: 0.0263 -
mean_iou: 0.9541 - val_loss: 0.0756 - val_mean_iou: 0.9040
Epoch 59/60
76/76 [=====] - 23s 296ms/step - loss: 0.0250 -
mean_iou: 0.9563 - val_loss: 0.1016 - val_mean_iou: 0.8968
Epoch 60/60
76/76 [=====] - 22s 288ms/step - loss: 0.0280 -
mean_iou: 0.9515 - val_loss: 0.0872 - val_mean_iou: 0.8966

```

6.5 Tensorboard

```
[65]: %tensorboard --logdir model
```

<IPython.core.display.Javascript object>

6.6 Inference

```

[66]: for image, mask in val_ds.take(1):
        for i in range(BATCH_SIZE):
            #plt.figure(figsize=(8,4))
            #plt.subplot(131)
            #plt.imshow(image[i])
            #plt.subplot(132)
            #plt.imshow(mask[i][:,:,0], cmap = 'gray')

            pred_mask = model.predict(image[i][np.newaxis,:,:,:])
            #plt.subplot(133)
            #plt.imshow(pred_mask[0,:,:,0], cmap = 'gray')
            #plt.show()

            fig = plt.figure(figsize=(8,4))
            ax1 = fig.add_subplot(131)
            ax1.title.set_text('Original Image')
            ax1.imshow(image[i])
            ax2 = fig.add_subplot(132)
            ax2.title.set_text('Ground Truth')
            ax2.imshow(mask[i][:,:,0], cmap='gray')

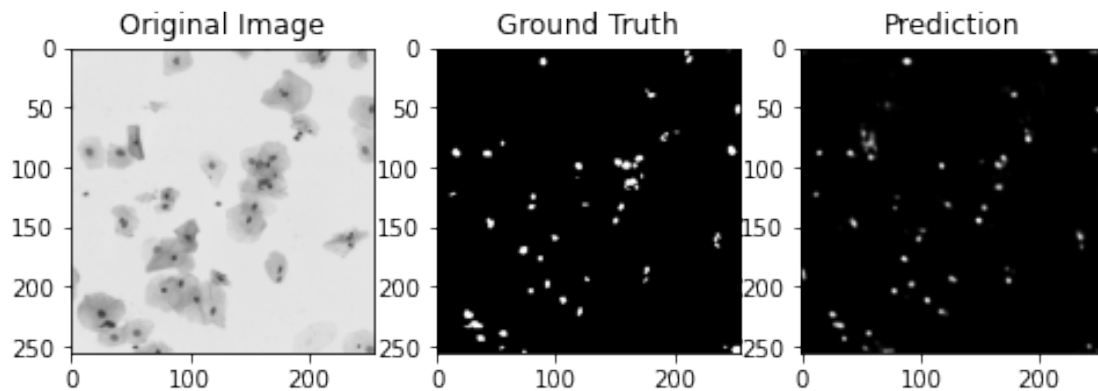
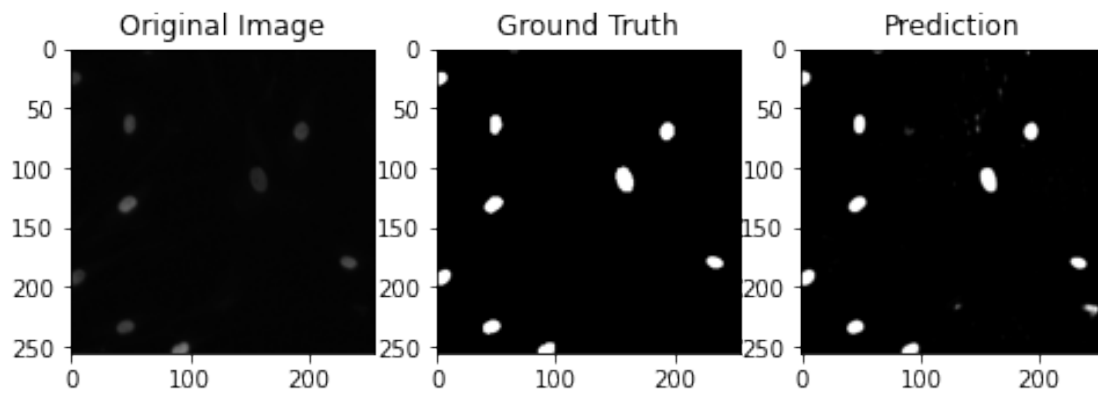
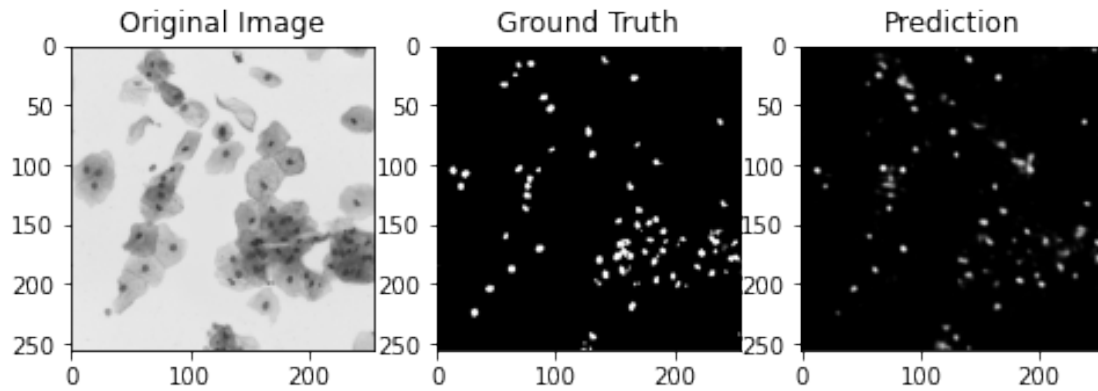
```

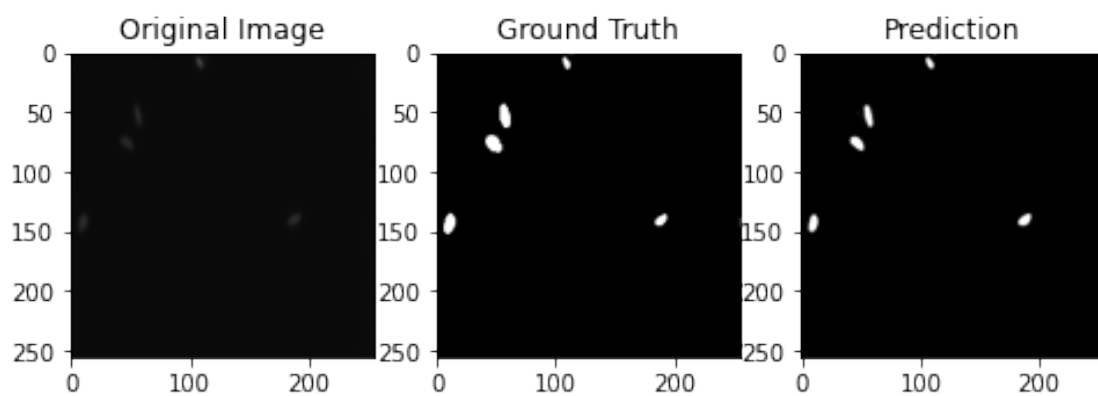
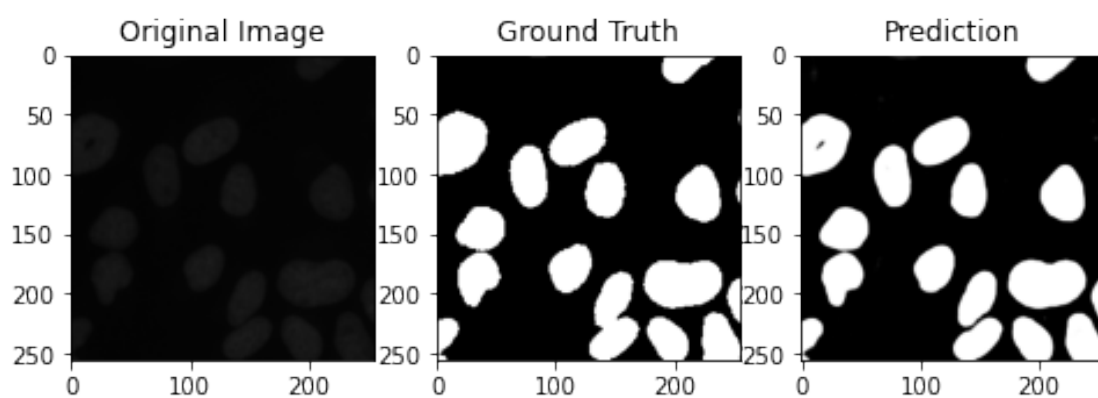
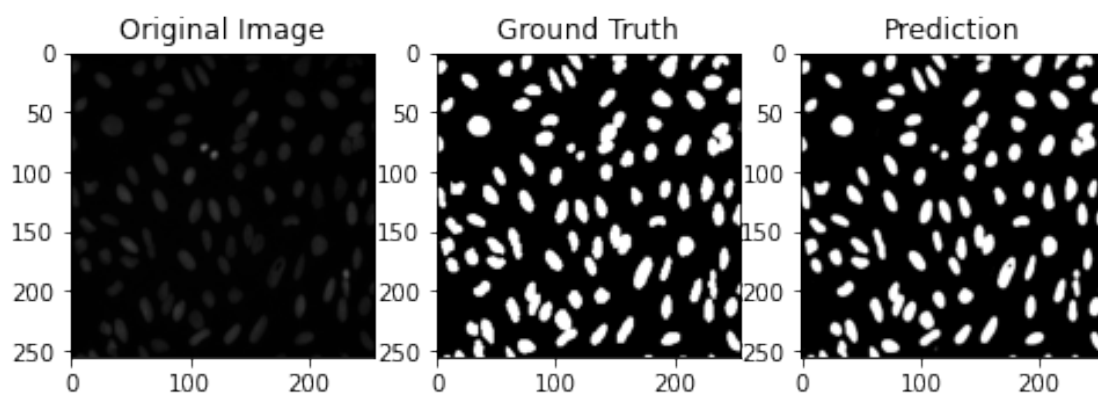


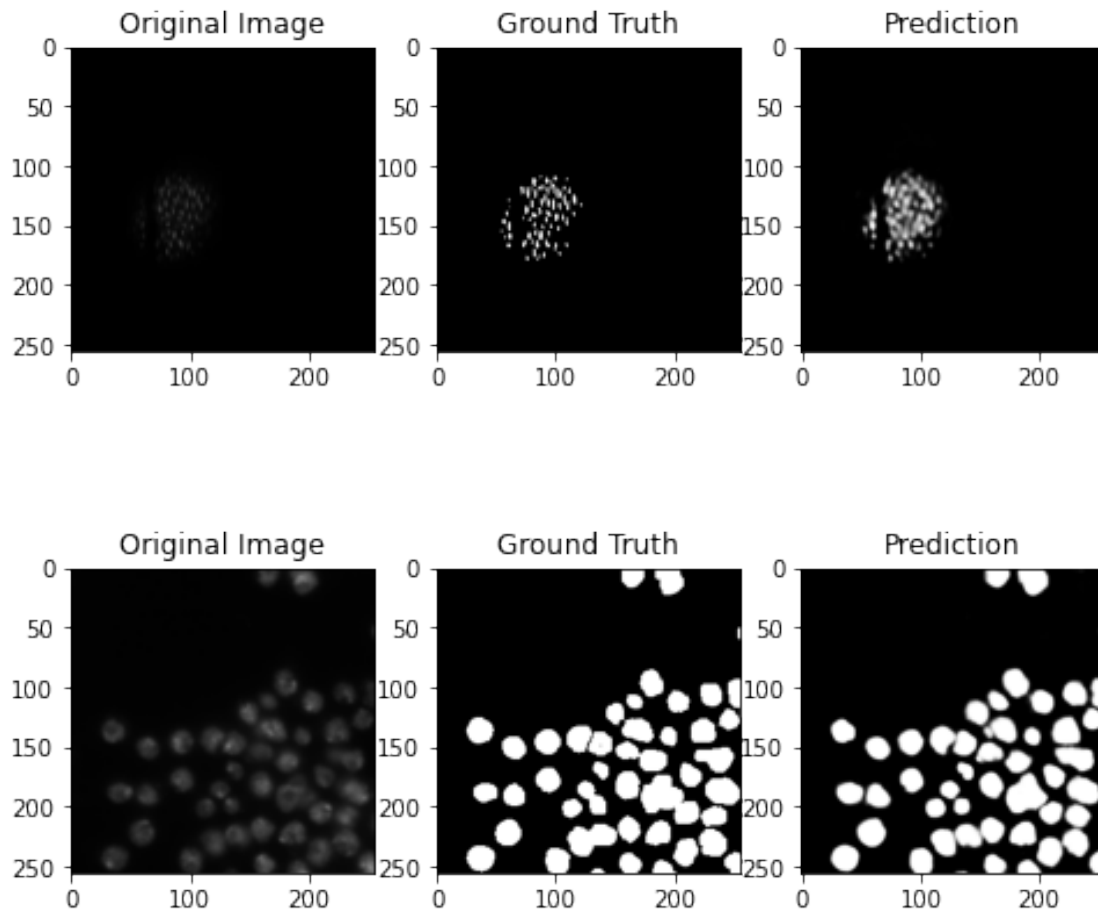
```

ax3 = fig.add_subplot(133)
ax3.title.set_text('Prediction')
ax3.imshow(pred_mask[0,:,:], cmap='gray')
plt.show()

```







```
[67]: test_filenames = test_df['files']
for filename in test_filenames[:5]:
    file_path = os.path.join(filename, 'images')
    image_path = os.path.join(file_path, os.listdir(file_path)[0])
    image_string = tf.io.read_file(image_path)
    image = tf.image.decode_png(image_string, channels=IMG_CHANNELS) #
    image = tf.image.convert_image_dtype(image, tf.float32)
    image = tf.image.resize(image, [IMG_HEIGHT, IMG_WIDTH]) # height x width

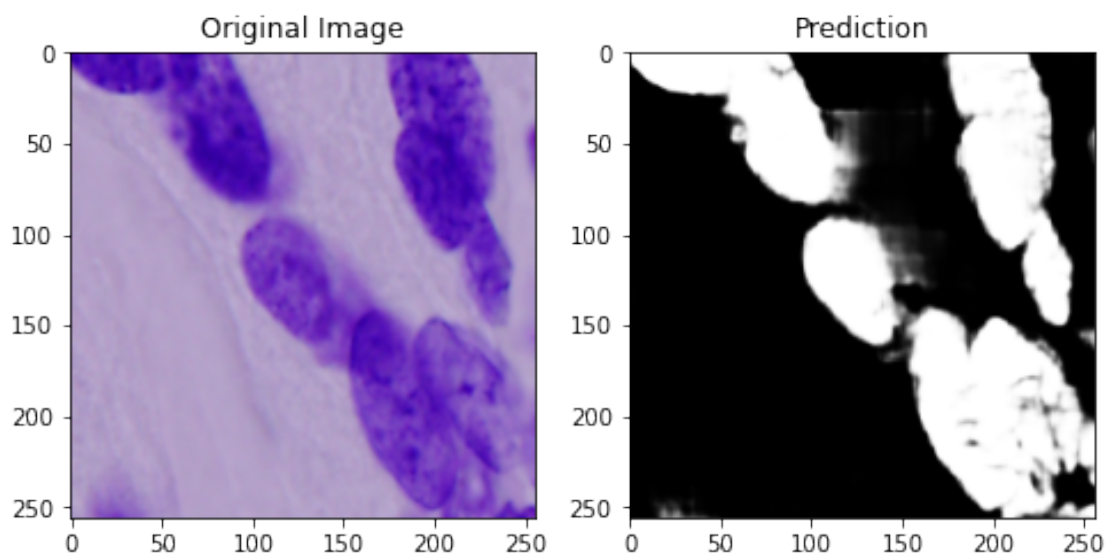
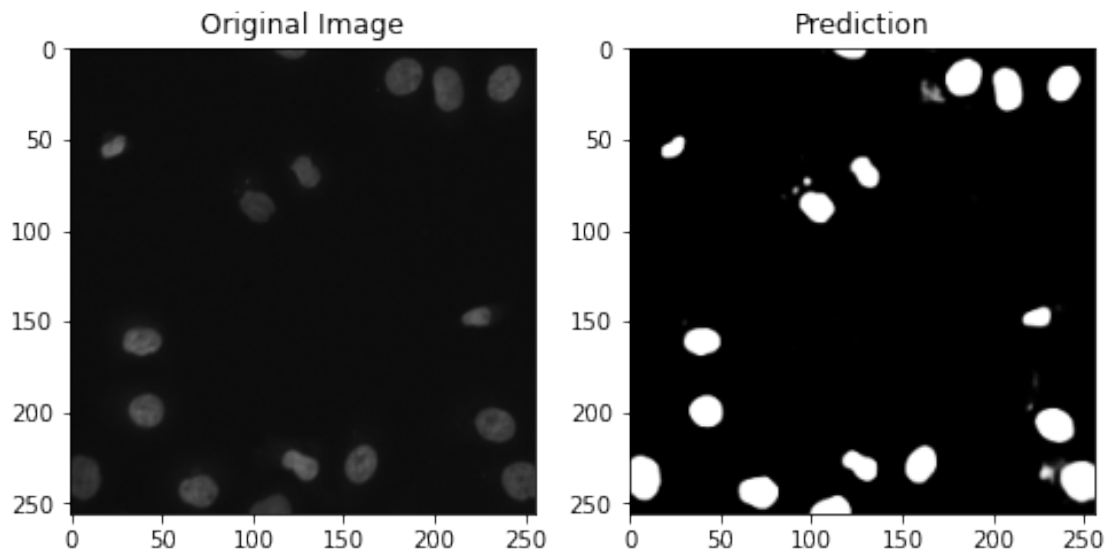
    pred_mask = model.predict(image[np.newaxis, :, :, :])

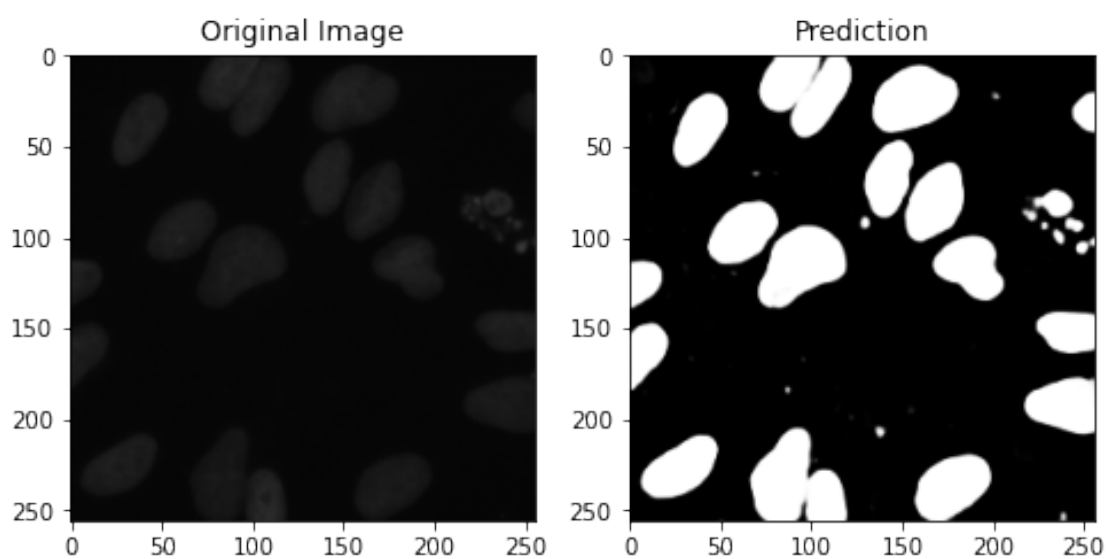
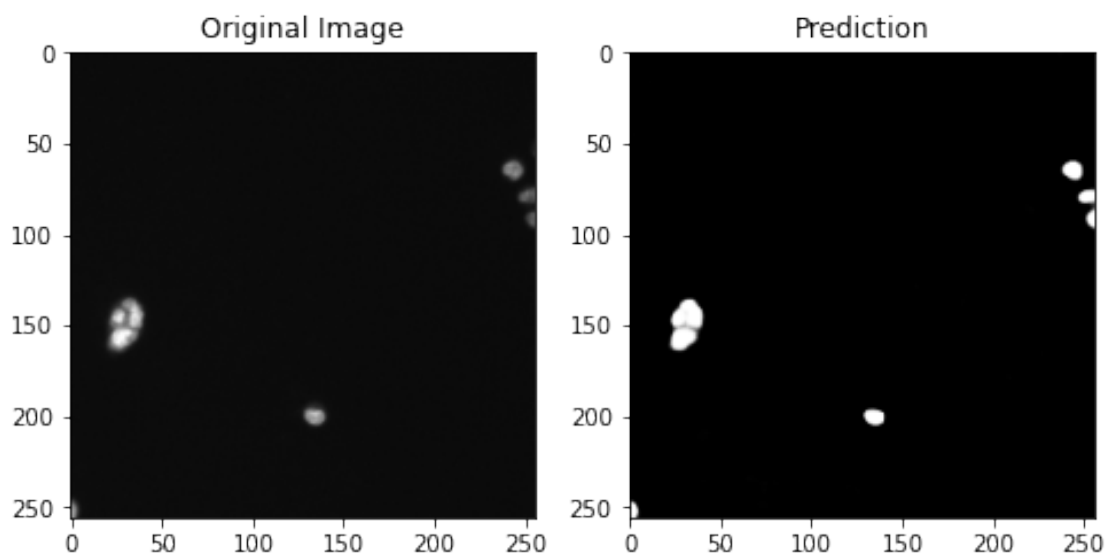
    #plt.figure(figsize=(10,6))
    #plt.subplot(121)
    #plt.imshow(image)
    #plt.subplot(122)
    #plt.imshow(pred_mask[0, :, :, 0], cmap='gray')
    #plt.show()
```

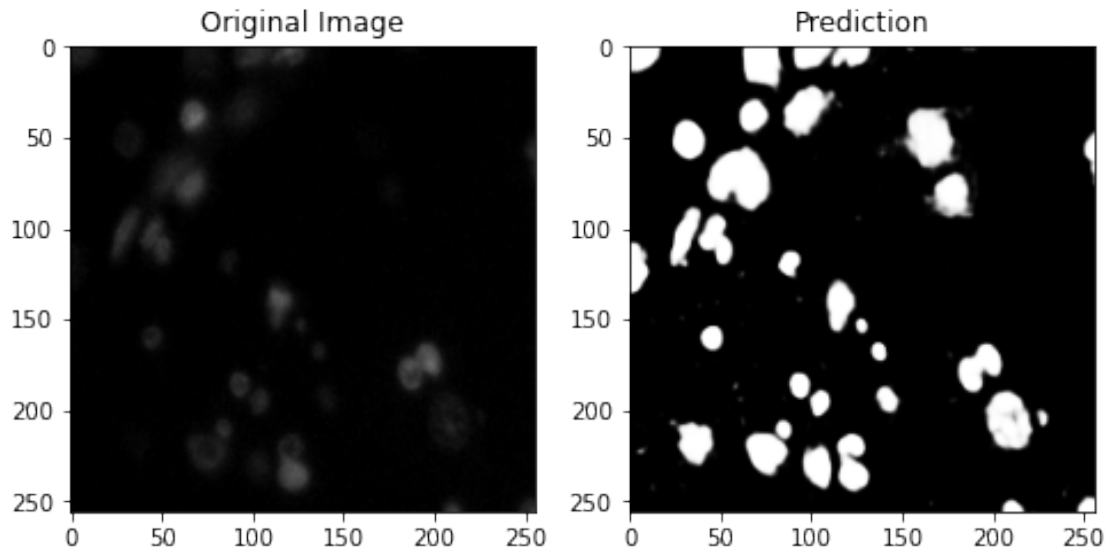
```

fig = plt.figure(figsize=(8,4))
ax1 = fig.add_subplot(121)
ax1.title.set_text('Original Image')
ax1.imshow(image)
ax2 = fig.add_subplot(122)
ax2.title.set_text('Prediction')
ax2.imshow(pred_mask[0,:,:], cmap='gray')
plt.show()

```







7 EDA

```
[68]: # Function to create a dataframe with iou_scores and image and mask paths.
def metric_df(data):
    iou_scores = []
    m = MeanIoU(2, 0.4)
    for i in range(len(data)):
        image_path = data['images'].iloc[i]
        mask_path = data['masks'].iloc[i]
        image_string = tf.io.read_file(image_path)
        image = tf.image.decode_png(image_string, channels=IMG_CHANNELS)#
        image = tf.image.convert_image_dtype(image, tf.float32)
        image = tf.image.resize(image, [IMG_HEIGHT, IMG_WIDTH]) # height x width

        mask_string = tf.io.read_file(mask_path)
        mask = tf.image.decode_png(mask_string, channels=CLASSES)#
        mask = tf.image.convert_image_dtype(mask, tf.float32)
        mask = tf.image.resize(mask, [IMG_HEIGHT, IMG_WIDTH])

        pred_mask = model.predict(image[np.newaxis,:,:,:])
        m.update_state(mask, pred_mask)
        iou_score = m.result().numpy()
        iou_scores.append(iou_score)
    data['iou_scores'] = iou_scores
    return data
```

```
[69]: df = X_train.copy()
df = metric_df(df)
df = df.sort_values('iou_scores')
df.head()
```

```
[69]:
```

	iou_scores	images	...
133	0.884343	./train/6c67b78e8164801059375ed9a607f61e67a7ae347e92e36a7f20514224541d56/images/6c67b78e8164801059375ed9a607f61e67a7ae347e92e36a7f20514224541d56.png	...
30	0.891180	./train/0bda515e370294ed94efd36bd53782288acacb040c171df2ed97fd691fc9d8fe/images/0bda515e370294ed94efd36bd53782288acacb040c171df2ed97fd691fc9d8fe.png	...
69	0.899990	./train/623cf6987b3fac8f384c09f40d98c5e739c097aa9a9627054542aa27f7d38db1/images/623cf6987b3fac8f384c09f40d98c5e739c097aa9a9627054542aa27f7d38db1.png	...
292	0.900523	./train/c75139ef0546d2240b37afb3219eb74a06b7977818697d5c3138796472483af3/images/c75139ef0546d2240b37afb3219eb74a06b7977818697d5c3138796472483af3.png	...
395	0.903477	./train/c1afe66cd139f996fd984f5f2622903730ec2f1192d90608154f07f7ef6cdb4b/images/c1afe66cd139f996fd984f5f2622903730ec2f1192d90608154f07f7ef6cdb4b.png	...

[5 rows x 3 columns]

```
[70]: df.tail()
```

```
[70]:
```

	iou_scores	images	...
526	0.938505	./train/54fe2d3416951cbc48f8718624c86a7ae58b6022a7fa75591b13f625cf53658b/images/54fe2d3416951cbc48f8718624c86a7ae58b6022a7fa75591b13f625cf53658b.png	...
350	0.938551	./train/b7a86f4968071e0f963fa87ef314fdd1b6c73a66355431cc53a37e193ba6be9b/images/b7a86f4968071e0f963fa87ef314fdd1b6c73a66355431cc53a37e193ba6be9b.png	...
192	0.939031	./train/1023509cf8d4c155467800f89508690be9513431992f470594281cd37dbd020d/images/1023509cf8d4c155467800f89508690be9513431992f470594281cd37dbd020d.png	...
456	0.939193	./train/23830d0e51245fc0c9e410efa4c17d2a7d83a0104a3777130119ab892de47a4e/images/23830d0e51245fc0c9e410efa4c17d2a7d83a0104a3777130119ab892de47a4e.png	...
108	0.939272	./train/62570c4ff1c5ab6d9d383aba9f25e604768520b4266afd40fdf4734a694c8bc3/images/62570c4ff1c5ab6d9d383aba9f25e604768520b4266afd40fdf4734a694c8bc3.png	...

[5 rows x 3 columns]

7.1 Best Output samples

```
[71]: d1 = df.tail()
      for i in range(5):
          image_path = d1['images'].iloc[i]
          mask_path = d1['masks'].iloc[i]
          image_string = tf.io.read_file(image_path)
          image = tf.image.decode_png(image_string, channels=IMG_CHANNELS)#
          image = tf.image.convert_image_dtype(image, tf.float32)
          image = tf.image.resize(image, [IMG_HEIGHT, IMG_WIDTH]) # height x width

          mask_string = tf.io.read_file(mask_path)
          mask = tf.image.decode_png(mask_string, channels=CLASSES)#
          mask = tf.image.convert_image_dtype(mask, tf.float32)
          mask = tf.image.resize(mask, [IMG_HEIGHT, IMG_WIDTH])

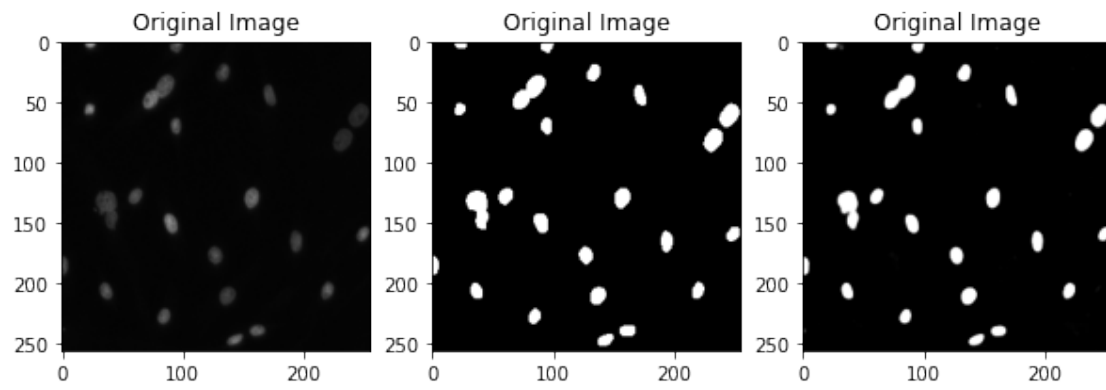
          pred_mask = model.predict(image[np.newaxis,:,:,:])

          fig = plt.figure(figsize=(10,6))

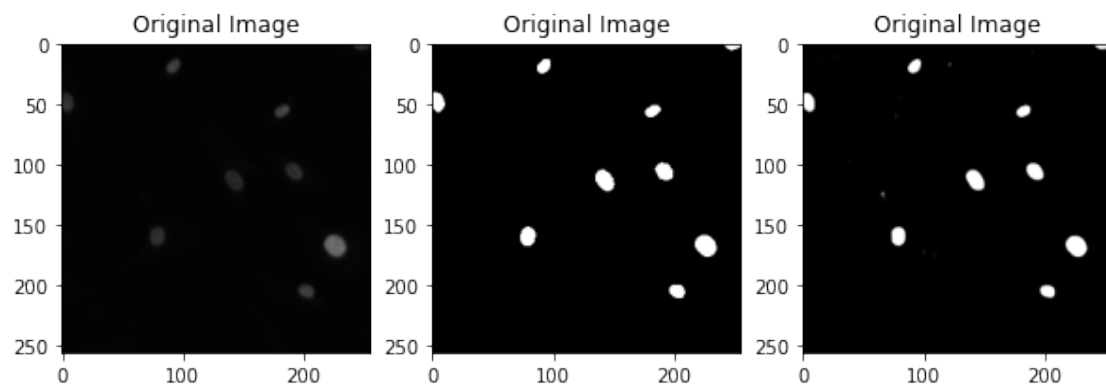
          ax1 = fig.add_subplot(131)
          ax1.title.set_text('Original Image')
          ax1.imshow(image)
          ax2 = fig.add_subplot(132)
          ax2.title.set_text('Original Image')
          ax2.imshow(mask[:, :, 0], cmap='gray')
          ax3 = fig.add_subplot(133)
          ax3.title.set_text('Original Image')

          ax3.imshow(pred_mask[0, :, :, 0], cmap='gray')
          fig.suptitle('IoU Score: ' + str(d1['iou_scores'].iloc[i]))
          plt.show()
```

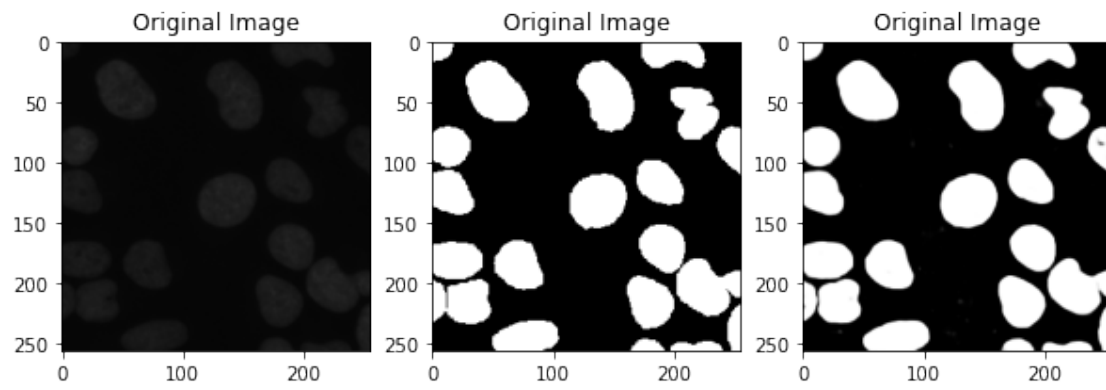

IoU Score: 0.938504695892334



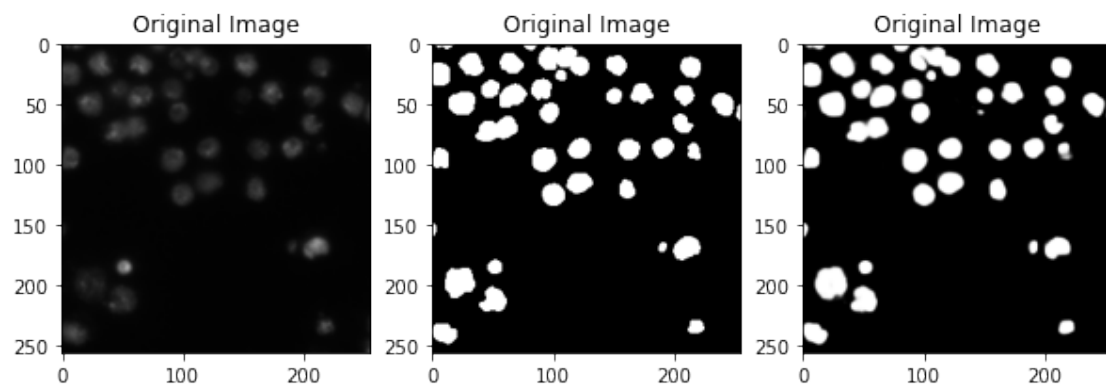
IoU Score: 0.938550591468811



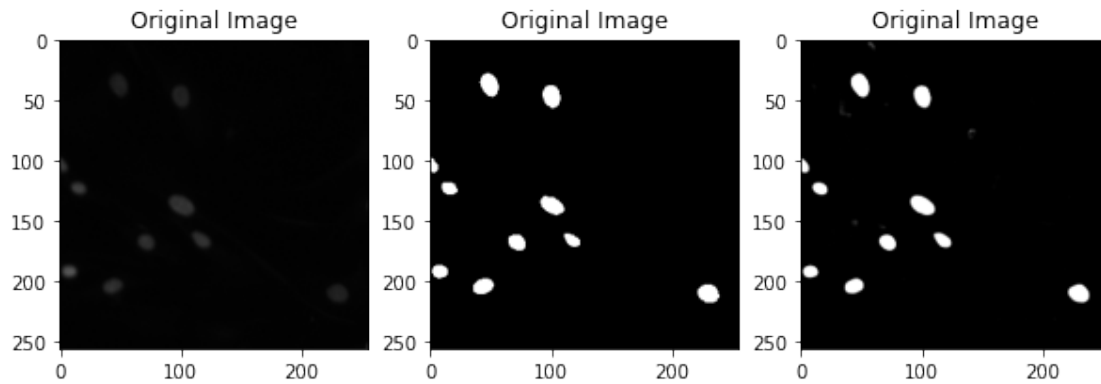
IoU Score: 0.9390305280685425



IoU Score: 0.9391932487487793



IoU Score: 0.939271867275238



7.2 Worst Output Samples

```
[72]: d2 = df.head()
for i in range(5):
    image_path = d2['images'].iloc[i]
    mask_path = d2['masks'].iloc[i]
    image_string = tf.io.read_file(image_path)
    image = tf.image.decode_png(image_string, channels=IMG_CHANNELS)#
    image = tf.image.convert_image_dtype(image, tf.float32)
    image = tf.image.resize(image, [IMG_HEIGHT, IMG_WIDTH]) # height x width

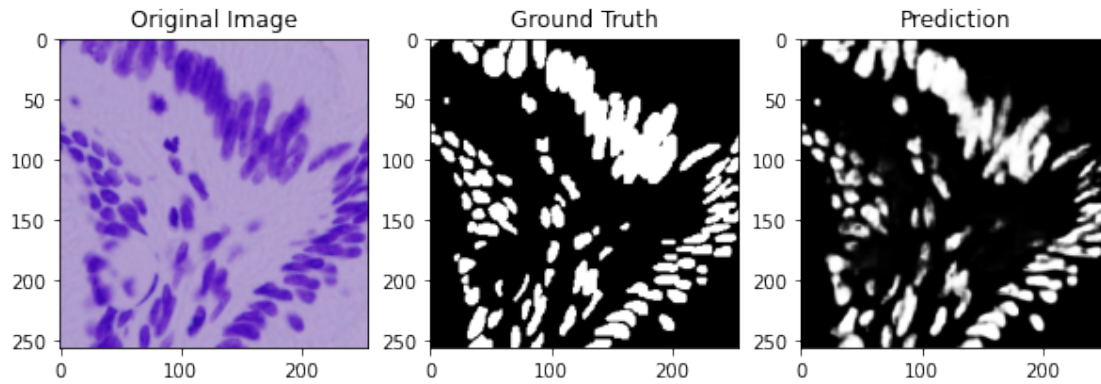
    mask_string = tf.io.read_file(mask_path)
    mask = tf.image.decode_png(mask_string, channels=CLASSES)#
    mask = tf.image.convert_image_dtype(mask, tf.float32)
    mask = tf.image.resize(mask, [IMG_HEIGHT, IMG_WIDTH])

    pred_mask = model.predict(image[np.newaxis,:,:,:])

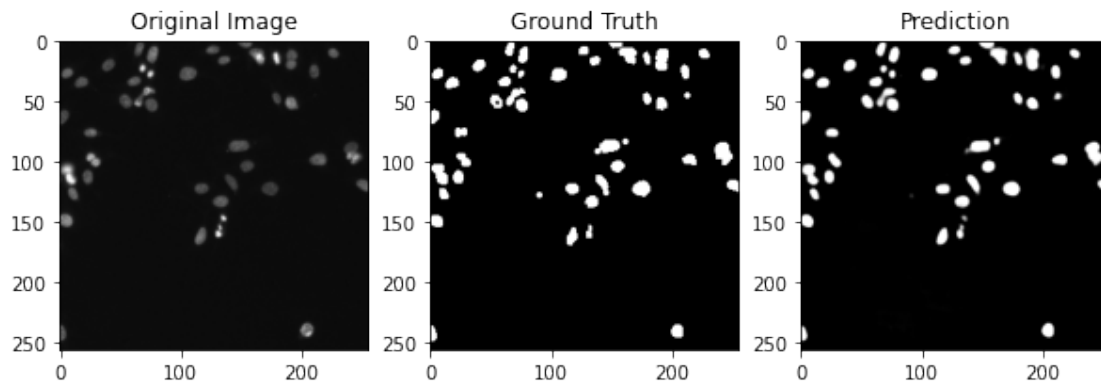
    fig = plt.figure(figsize=(10,6))
    fig.suptitle('IoU Score: '+str(d2['iou_scores'].iloc[i]))
    ax1 = fig.add_subplot(131)
    ax1.title.set_text('Original Image')
    ax1.imshow(image)
    ax2 = fig.add_subplot(132)
    ax2.title.set_text('Ground Truth')
    ax2.imshow(mask[:, :, 0], cmap='gray')
    ax3 = fig.add_subplot(133)
```

```
ax3.title.set_text('Prediction')
ax3.imshow(pred_mask[0,:,:], cmap='gray')
plt.show()
```

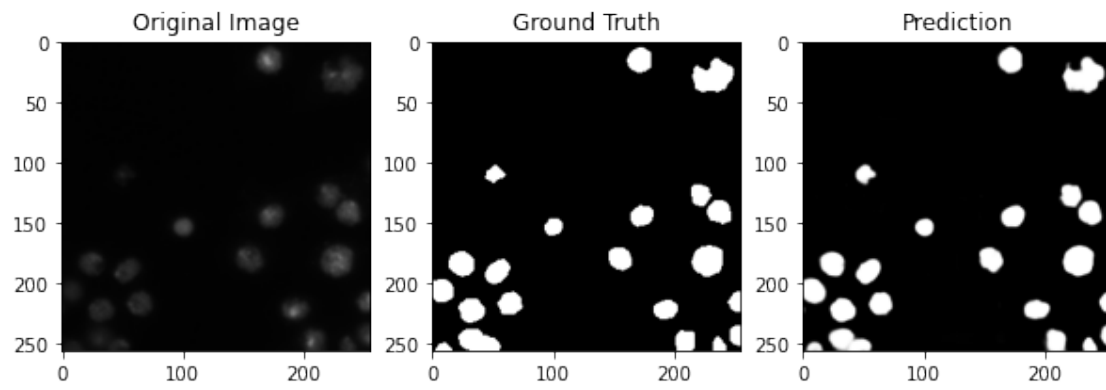
IoU Score: 0.884343147277832



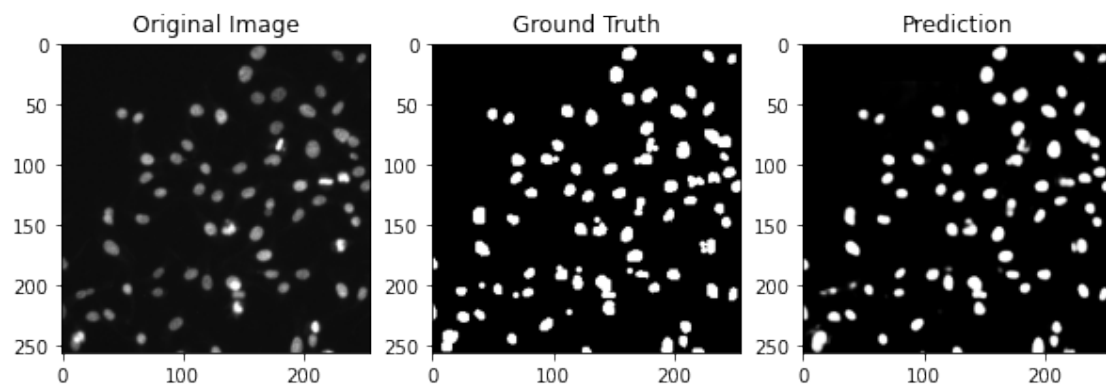
IoU Score: 0.8911800384521484



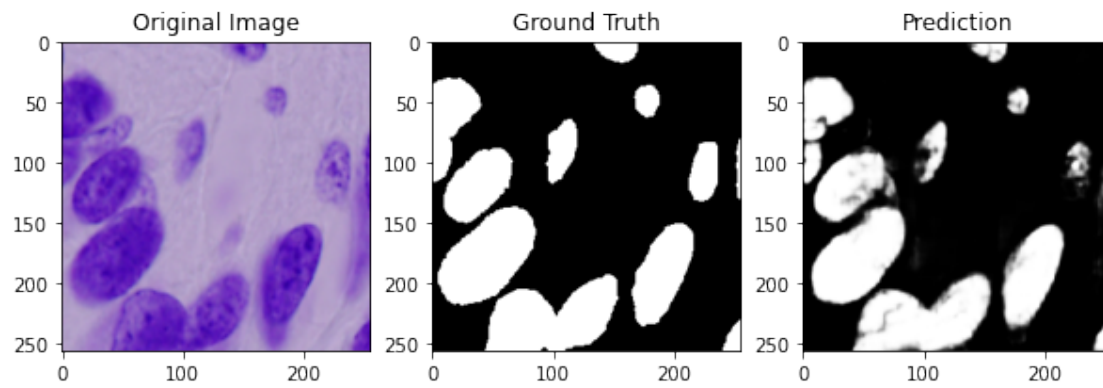
IoU Score: 0.8999901413917542



IoU Score: 0.9005234837532043



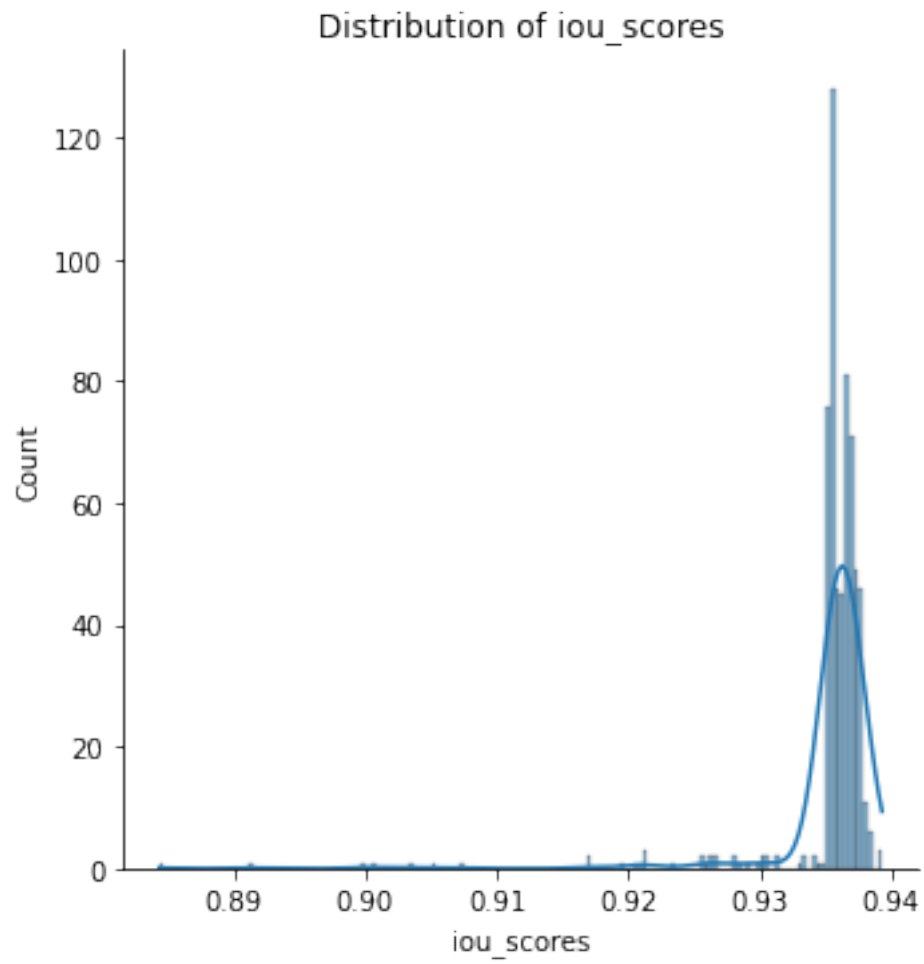
IoU Score: 0.9034774899482727



7.3 Distribution of 'iou_scores'

```
[74]: sns.displot(data=df, x="iou_scores", kde=True)  
      plt.title('Distribution of iou_scores')
```

```
[74]: Text(0.5, 1.0, 'Distribution of iou_scores')
```



- It can be seen from the plot that the distribution of the iou scores is almost normal distribution.
- It is centered towards 0.94.
- This is the expected behaviour.