# MaskRcnn for article localization

I took Mark Rcnn is because, it is a kind of widely used in Instance segmentation

Mask R-CNN is simple to train and adds only a small overhead to Faster R-CNN, running at 5 fps.

Mask rcnn works with tensorflow 1.x

```
In [ ]:
!pip install tensorflow==1.15.0
In [ ]:
!pip install keras==2.1.5
In [1]:
import os
import gc
import sys
import json
import glob
import random
from pathlib import Path
import cv2
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import itertools
from tqdm import tqdm
from imgaug import augmenters as iaa
from sklearn.model selection import StratifiedKFold, KFold
Using TensorFlow backend.
In [2]:
print(tf. version )
print(keras.__version__)
1.15.0
```

# Data

2.1.5

I took data from "imaterialist-fashion-2019-FGVC6" kaggle competetion.

```
In [6]:
```

```
Wget --header="Host: storage.googleapis.com" --header="User-Agent: Mozilla/5.0 (Windows NT 10.0; Win64; x64) AppleWebKit/537.36 (KHTML, like Gecko) Chrome/89.0.4389.128 Safari/5 37.36" --header="Accept: text/html,application/xhtml+xml,application/xml;q=0.9,image/avif,image/webp,image/apng,*/*;q=0.8,application/signed-exchange;v=b3;q=0.9" --header="Accept-Language: en-IN,en-GB;q=0.9,en-US;q=0.8,en;q=0.7" --header="Referer: https://www.kaggle.com/" "https://storage.googleapis.com/kaggle-competitions-data/kaggle-v2/13032/862545/compressed/train.zip?GoogleAccessId=web-data@kaggle-161607.iam.gserviceaccount.com&Expires=1619337466&Signature=nvdLwfDZFSNAFG21H0I7u4yFyejVgxt931FohrPfCHu%2FNeBumlCoAFhBFIJDBReBEiVOYiRL17SvsYvMe8%2BybSkfdPM0YF3gbN9CRuVrD3eMiTr7swENvrUGZ3GuullkH5QxjlK%2FWiHGpwMaPJkOdU6Ma08BjXyHMRuZrj5u1B7iZbDz04jE97Z7RvonthVa15jCG1cWXnmsLrewc1pkc001S1BJ2hruBesV07TLiRGQDrWthQxgW7fpmcADMVhxEmq94aSd686XM7URgD%2BwNXh8xyax4qcJp0M44hJmgbBI3Q81YJPJvvfuxxiqLk5FfFiRPvLmHGKojRGpsTntJw%3D%3D&response-content-disposition=attachment%3B+filename%3Dtrain.zip" -c-0 'train.zip' -c-0 'train.zip'
```

--2021-04-22 07:58:05-- https://storage.googleapis.com/kaggle-competitions-data/kaggle-v

2/13032/862545/compressed/train.zip?GoogleAccessId=web-data@kaggle-161607.iam.gserviceacc ount.com&Expires=1619337466&Signature=nvdLwfDZFSNAFG21H0I7u4yFyejVgxt931FohrPfCHu%2FNeBum 1CoAFhBFIJDBReBEiVOYiRL17SvsYvMe8%2BybSkfdPM0YF3gbN9CRuVrD3eMiTr7swENvrUGZ3GuullkH5QxjlK%2FWiHGpwMaPJkOdU6Ma08BjXyHMRuZrj5u1B7iZbDz04jE97Z7RvonthVa15jCG1cWXnmSLrewc1pkc001S1BJ2hruBesVO7TLiRGQDrWthQxgW7fpmcADMVhxEmq94aSd686XM7URgD%2BwNXh8xyax4qcJp0M44hJmgbBI3Q81YJPJvvfuxxiqLk5FfFiRPvLmHGKojRGpsTntJw%3D%3D&response-content-disposition=attachment%3B+filename%3Dtrain.zip

Resolving storage.googleapis.com (storage.googleapis.com)... 108.177.97.128, 108.177.125. 128, 74.125.23.128, ...

Connecting to storage.googleapis.com (storage.googleapis.com) |108.177.97.128|:443... connected.

HTTP request sent, awaiting response... 200 OK Length: 18956138092 (18G) [application/zip]

Saving to: 'train.zip'

train.zip 100%[==========] 17.65G 12.6MB/s in 7m 32s

2021-04-22 08:05:38 (40.0 MB/s) - 'train.zip' saved [18956138092/18956138092]

### In [7]:

!unzip train.zip

!rm -rf train.zip

### In [5]:

Wget --header="Host: storage.googleapis.com" --header="User-Agent: Mozilla/5.0 (Windows NT 10.0; Win64; x64) AppleWebKit/537.36 (KHTML, like Gecko) Chrome/89.0.4389.128 Safari/5 37.36" --header="Accept: text/html, application/xhtml+xml, application/xml;q=0.9, image/avif, image/webp, image/apng, \*/\*;q=0.8, application/signed-exchange; v=b3;q=0.9" --header="Accept-Language: en-IN,en-GB;q=0.9,en-US;q=0.8,en;q=0.7" --header="Referer: https://www.kaggle.com/" "https://storage.googleapis.com/kaggle-competitions-data/kaggle-v2/13032/862545/compressed/train.csv.zip?GoogleAccessId=web-data@kaggle-161607.iam.gserviceaccount.com&Expires=1619337418&Signature=VXcCR4dr3rsROFQkXQxXxvs10162NSjKsWiNxGZ8%2FlJNhU6bmFfbN2ZAeyBcORWbT3pMJSE9Ef6e07kccZmoFVuCPwBcLb%2F%2BKZxSgCaVt0ifPS7tMHjb6ip89gUNcgb6CGThIAKiZnFOoKE8T%2FN0qkh5dwlZBgtKZIzs2xTziL0kM%2F1FXDmxQ%2BNYznaX0P4Ap428ZLTE99BQ5rcy%2FiOuazho5me3QjWSdIXeq6gtutZjKTtveoEd4cR%2BOEH5LHiI%2BBOWzu9XPK4ffQI5rMN%2B4LZGCOgsz9b2nvFiBiBwLS8wusOcn7TWlJ0BPU3WyUCsbacCWXltth4laPgnX7fEFg%3D%3D&response-content-disposition=attachment%3B+filename%3Dtrain.csv.zip" -c -0 'train.csv.zip'

 $--2021-04-22\ 07:57:13--\ https://storage.googleapis.com/kaggle-competitions-data/kaggle-v2/13032/862545/compressed/train.csv.zip?GoogleAccessId=web-data@kaggle-161607.iam.gserviceaccount.com&Expires=1619337418&Signature=VXcCR4dr3rsROFQkXQxXxvs10162NSjKsWiNxGZ8%2FlJNhU6bmFfbN2ZAeyBc0RWbT3pMJSE9Ef6e07kccZmoFVuCPwBcLb%2F%2BKZxSgCaVt0ifPS7tMHjb6ip89gUNcgb6CGThIAKiZnFOoKE8T%2FN0qkh5dw1ZBgtKZIzs2xTziL0kM%2F1FXDmxQ%2BNYznaX0P4Ap428ZLTE99BQ5rcy%2Fi0uazho5me3QjWSdIXeq6gtutZjKTtveoEd4cR%2BOEH5LHiI%2BBOWzu9XPK4ffQI5rMN%2B4LZGCOgsz9b2nvFiBiBwLS8wusOcn7TW1J0BPU3WyUCsbacCWXltth4laPgnX7fEFg%3D%3D&response-content-disposition=attachment%3B+filename%3Dtrain.csv.zip$ 

Resolving storage.googleapis.com (storage.googleapis.com)... 108.177.125.128, 74.125.23.1 28, 74.125.204.128, ...

Connecting to storage.googleapis.com (storage.googleapis.com)|108.177.125.128|:443... con nected.

HTTP request sent, awaiting response... 200 OK Length: 571573081 (545M) [application/zip]

Saving to: 'train.csv.zip'

train.csv.zip 100%[===========] 545.09M 53.3MB/s in 11s

2021-04-22 07:57:24 (50.3 MB/s) - 'train.csv.zip' saved [571573081/571573081]

# In [9]:

```
!unzip train.csv.zip
```

!rm -rf train.csv.zip

Archive: train.csv.zip inflating: train.csv

# Train\_test\_split

```
In [8]:
```

```
with open('/content/label_descriptions.json') as f:
    label_descriptions = json.load(f)

label_names = [x['name'] for x in label_descriptions['categories']]
print(len(label_names), label_names[:5])

46 ['shirt, blouse', 'top, t-shirt, sweatshirt', 'sweater', 'cardigan', 'jacket']

In [14]:

data = pd.read_csv('/content/train.csv')
data['Category'] = data['ClassId'].str.split('_').str[0]
data.head(3)
```

# Out[14]:

Imageld	EncodedPixels	Height	Width	Classid	Category
0 00000663ed1ff0c4e0132b9b9ac53f6e.jpg	6068157 7 6073371 20 6078584 34 6083797 48 608	5214	3676	6	6
1 00000663ed1ff0c4e0132b9b9ac53f6e.jpg	6323163 11 6328356 32 6333549 53 6338742 75 63	5214	3676	0	0
2 00000663ed1ff0c4e0132b9b9ac53f6e.jpg	8521389 10 8526585 30 8531789 42 8537002 46 85	5214	3676	28	28

## In [11]:

```
# total categories is 46
categories = 46
# the image size is set to 512, which is the same as the size of submission masks
img size = 512
# Cloning the mask rcnn model from git
git clone https://www.github.com/matterport/Mask_RCNN.git
# As we have to use the few functions with in mrcnn direction. appending path to Mask RCN
os.chdir('Mask RCNN')
sys.path.append('Mask RCNN')
# importing required .py files from mrcnn directory
from mrcnn.config import Config
from mrcnn import utils
import mrcnn.model as modellib
from mrcnn import visualize
from mrcnn.model import log
# Cloning coco weights to train the images.
!wget --quiet https://github.com/matterport/Mask RCNN/releases/download/v2.0/mask rcnn c
oco.h5
!ls -lh mask_rcnn_coco.h5
COCO WEIGHTS PATH = 'mask rcnn coco.h5'
Cloning into 'Mask RCNN' ...
warning: redirecting to https://github.com/matterport/Mask RCNN.git/
```

# **Set Config**

remote: Enumerating objects: 956, done.

Resolving deltas: 100% (562/562), done.

remote: Total 956 (delta 0), reused 0 (delta 0), pack-reused 956 Receiving objects: 100% (956/956), 125.23 MiB | 23.25 MiB/s, done.

-rw-r--r- 1 root root 246M Nov 26 2017 mask rcnn coco.h5

# Mask R-CNN has a load of hyperparameters. Here I am adjusting based on the GPU count in my Google Colab ( 1 GPU )

```
In [12]:
```

```
# https://github.com/matterport/Mask RCNN/blob/master/mrcnn/config.py
# Overwarign the existing config file with our requirements
class FashionConfig(Config):
         NAME = "Article localization" # Override in sub-classes
          # Number of classification classes (including background)
         NUM CLASSES = 46 + 1 # +1 for the background class
          # NUMBER OF GPUs to use. When using only a CPU, this needs to be set to 1.
         GPU COUNT = 1
         # Number of images to train with on each GPU. A 12GB GPU can typically
          # handle 2 images of 1024x1024px.
         # Adjust based on your GPU memory and image sizes. Use the highest
         # number that your GPU can handle for best performance.
         {\tt IMAGES\ PER\_GPU\ =\ 4\ \#\ a\ memory\ error\ occurs\ when\ IMAGES\_PER\_GPU\ is\ too\ high\ ,\ 4\ becaunded and a substitution of the property of the proper
se image size is 512x512
          # Backbone network architecture
          # Supported values are: resnet50, resnet101.
         BACKBONE = 'resnet50'
         # Image shape
         IMAGE MIN DIM = 512
         IMAGE MAX DIM = 512
         IMAGE RESIZE MODE = 'none'
          # Length of square anchor side in pixels
         RPN ANCHOR SCALES = (16, 32, 64, 128, 256)
          # Number of training steps per epoch
          # This doesn't need to match the size of the training set. Tensorboard
         STEPS PER EPOCH = 1000
         # Number of validation steps to run at the end of every training epoch.
          # A bigger number improves accuracy of validation stats, but slows
          # down the training.
         VALIDATION STEPS = 200
config = FashionConfig()
```

# **Creating custome Dataset**

https://towardsdatascience.com/mask-rcnn-implementation-on-a-custom-dataset-fd9a878123d4

https://github.com/shreyas90999/buy me that look/blob/main/CS2 Module 2.ipynb

```
In [ ]:
```

```
def resize_image(image_path):
    image = cv2.imread(image_path)
    ## Changing Image from BLUE_Greenn_Red to Red_Green_Blue
    image = cv2.cvtColor(image, cv2.COLOR_BGR2RGB)
    ## Resizing Image
    image = cv2.resize(image, (512, 512), interpolation=cv2.INTER_AREA)
    return image

class FashionDataset(utils.Dataset):
    # Giving data as per the Maskrcnn git
    def __init__(self, fashion_data):
        super().__init__(self)
```

```
# Add classes
       for i, name in enumerate(label names):
            # self.add class("object", 3, "xyz") #likewise
            self.add class("Article localization", i+1, name)
        # Add images
        for i, row in fashion data.iterrows():
            self.add image("Article localization", image id=row.name, path=str('/content/
train/'+row.name), labels=row['Category'],annotations=row['EncodedPixels'], height=row['
Height'], width=row['Width'])
    def image reference(self, image id):
        info = self.image info[image id]
       return info['path'], [label names[int(x)] for x in info['labels']]
    def load image(self, image id):
        return resize image(self.image info[image id]['path'])
    def load mask(self, image id):
       info = self.image info[image id]
       mask = np.zeros((512, 512, len(info['annotations'])), dtype=np.uint8)
       labels = []
       for m, (annotation, label) in enumerate(zip(info['annotations'], info['labels'])
):
            sub mask = np.full(info['height']*info['width'], 0, dtype=np.uint8)
            annotation = [int(x) for x in annotation.split(' ')]
            for i, start pixel in enumerate(annotation[::2]):
                sub mask[start pixel: start pixel+annotation[2*i+1]] = 1
            sub_mask = sub_mask.reshape((info['height'], info['width']), order='F')
            sub_mask = cv2.resize(sub_mask, (512, 512), interpolation=cv2.INTER NEAREST)
            mask[:, :, m] = sub mask
            labels.append(int(label)+1)
       return mask, np.array(labels)
data s = FashionDataset(image df)
data s.prepare()
```

#### In [ ]:

```
# Spilting Train and test data
FOLD = 0
from sklearn.model_selection import StratifiedKFold, KFold
data_fold = KFold(n_splits=5, random_state=0, shuffle=True)
data_splits = data_fold.split(image_df)

def get_fold():
    for i, (train, validation) in enumerate(data_splits):
        if i == FOLD:
            return image_df.iloc[train], image_df.iloc[validation]

train, valid = get_fold()

train_data = FashionDataset(train)
train_data.prepare()

valid_data = FashionDataset(valid)
valid_data.prepare()
```

### In [ ]:

```
maskrcnn_model = modellib.MaskRCNN(mode='training', config=config, model_dir='content')
maskrcnn_model.set_log_dir(model_path='/content/Mask_RCNN/mrcnn')
maskrcnn_model.load_weights(COCO_WEIGHTS_PATH, by_name=True, exclude=['mrcnn_class_logit
s', 'mrcnn_bbox_fc', 'mrcnn_bbox', 'mrcnn_mask'])
```

```
from imgaug import augmenters as iaa
augmentation = iaa.Sequential([
    iaa.Fliplr(0.5) # only horizontal flip here
])
In [ ]:
import keras
checkpoint = keras.callbacks.ModelCheckpoint('/content/drive/MyDrive/Applied AI Course/As
signments/29. Self Case Study 2/Models/mask rcnn fashion {epoch:04d}-{val mrcnn mask loss
:.5f}.h5', save weights only=True, verbose=1)
maskrcnn model.train(train data, valid data,
            learning rate=1e-4,
            epochs=10,
            layers='all',
            augmentation=augmentation, custom callbacks=[checkpoint])
In [ ]:
maskrcnn_model = modellib.MaskRCNN(mode='training', config=config, model_dir='content')
maskrcnn model.set log dir(model path='/content/Mask RCNN/mrcnn')
maskrcnn model.load weights ('/content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion 0004-0.40588.h5', by name=True)
checkpoint = keras.callbacks.ModelCheckpoint('/content/drive/MyDrive/Applied AI Course/As
signments/29. Self Case Study 2/Models/mask rcnn fashion day 2 {epoch:04d}-{val mrcnn mas
k loss:.5f}.h5', save weights only=True, verbose=1)
maskrcnn model.train(train data, valid data,
            learning rate=1e-4,
            epochs=10,
            layers='all',
            augmentation=augmentation, custom callbacks=[checkpoint])
Starting at epoch 0. LR=0.0001
Checkpoint Path: content/fashion20210407T0317/mask rcnn fashion {epoch:04d}.h5
Selecting layers to train
conv1
                       (Conv2D)
bn conv1
                       (BatchNorm)
res2a branch2a
                       (Conv2D)
bn2a branch2a
                      (BatchNorm)
res2a branch2b
                      (Conv2D)
bn2a branch2b
                      (BatchNorm)
res2a_branch2c
                      (Conv2D)
res2a branch1
                      (Conv2D)
bn2a branch2c
                     (BatchNorm)
bn2a branch1
                     (BatchNorm)
res2b branch2a
                     (Conv2D)
bn2b branch2a
                     (BatchNorm)
res2b branch2b
                     (Conv2D)
bn2b branch2b
                      (BatchNorm)
res2b branch2c
                      (Conv2D)
bn2b branch2c
                      (BatchNorm)
res2c branch2a
                      (Conv2D)
bn2c branch2a
                       (BatchNorm)
res2c branch2b
                       (Conv2D)
bn2c branch2b
                       (BatchNorm)
res2c branch2c
                       (Conv2D)
bn2c branch2c
                      (BatchNorm)
                      (Conv2D)
res3a branch2a
                      (BatchNorm)
bn3a branch2a
res3a_branch2b
                      (Conv2D)
bn3a branch2b
                      (BatchNorm)
res3a branch2c
                      (Conv2D)
res3a branch1
                      (Conv2D)
bn3a branch2c
                      (BatchNorm)
bn3a branch1
                      (BatchNorm)
res3b branch2a
                     (Conv2D)
bn3b branch2a
                      (BatchNorm)
```

In [ ]:

res3b branch2b bn3b_branch2b cres3c branch2c cres3c_branch2c cres3c_branch2a cres3c_branch2a cres3c_branch2a cres3c_branch2b cres3c_branch2b cres3c_branch2b cres3c_branch2b cres3c_branch2b cres3c_branch2b cres3c_branch2c cres3c_branch2c cres3c_branch2c cres3c_branch2c cres3c_branch2c cres3d_branch2c cres3d_branch2c cres3d_branch2a cres3d_branch2a cres3d_branch2b cres3d_branch2b cres3d_branch2b cres3d_branch2c cres3d_branch2c cres3d_branch2c cres3d_branch2c cres3d_branch2c cres4a_branch2c cres4a_branch2c cres4a_branch2b cres4a_branch2b cres4a_branch2c cres4a_branch2c cres4a_branch2c cres4a_branch2c cres4a_branch2c cres4a_branch2c cres4a_branch1 cres4b_branch2c cres4b_branch2c cres4b_branch2c cres4b_branch2c cres4b_branch2c cres4c_branch2c cres4c_branch2c cres4c_branch2c cres4c_branch2c cres4c_branch2c cres4c_branch2c cres4c_branch2c cres4c_branch2c cres4d_branch2c cres5d_branch2c cr		
res3b_branch2c bn3b_branch2c res3c_branch2a conv2D) bn3c_branch2a res3c_branch2a res3c_branch2b bn3c_branch2b conv2D) bn3c_branch2b conv2D) bn3c_branch2c conv2D) bn3d_branch2a res3d_branch2b conv2D) bn3d_branch2b res3d_branch2b conv2D) bn3d_branch2c res3d_branch2c conv2D) bn3d_branch2c res3d_branch2c conv2D) bn3d_branch2c res4a_branch2c conv2D) bn3d_branch2c res4a_branch2b conv2D) bn4a_branch2b res4a_branch2c res4a_branch1 res4b_branch2c conv2D) bn4b_branch2a res4b_branch2a res4b_branch2c conv2D) bn4b_branch2b res4b_branch2c res4c_branch2c bn4c_branch2c conv2D) bn4c_branch2c bn4c_branch2c conv2D) bn4c_branch2c bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4c_branch2c bn4c_branch2c conv2D) bn4d_branch2c res4d_branch2c conv2D) bn4d_branch2c res4d_branch2c conv2D) bn4e_branch2c conv2D) bn5b_branch2c conv2D	res3b branch2b	(Conv2D)
bn3b_branch2c res3c_branch2a (Conv2D) bn3c_branch2a (BatchNorm) res3c_branch2b (Conv2D) bn3c_branch2b (Conv2D) bn3c_branch2c (Conv2D) bn3c_branch2c (Conv2D) bn3d_branch2c (BatchNorm) res3d_branch2a (Conv2D) bn3d_branch2a (Conv2D) bn3d_branch2b (BatchNorm) res3d_branch2b (BatchNorm) res3d_branch2c (Conv2D) bn3d_branch2c (BatchNorm) res3d_branch2c (Conv2D) bn3d_branch2c (BatchNorm) res4a_branch2c (Conv2D) bn4a_branch2a (BatchNorm) res4a_branch2b (BatchNorm) res4a_branch2b (BatchNorm) res4a_branch2c (Conv2D) bn4a_branch2c (BatchNorm) res4a_branch1 (Conv2D) bn4a_branch2c (BatchNorm) res4b_branch2c (BatchNorm) res4b_branch2c (BatchNorm) res4b_branch2c (BatchNorm) res4b_branch2c (Conv2D) bn4b_branch2c (BatchNorm) res4b_branch2c (Conv2D) bn4b_branch2c (BatchNorm) res4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4d_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4d_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4d_branch2c (Conv2D) bn4d_branch2c (BatchNorm) res4f_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5b_branch2c (BatchNorm) res5c_branch2c (BatchNorm)	bn3b branch2b	(BatchNorm)
bn3b_branch2c res3c_branch2a (Conv2D) bn3c_branch2a (BatchNorm) res3c_branch2b (Conv2D) bn3c_branch2b (Conv2D) bn3c_branch2c (Conv2D) bn3c_branch2c (Conv2D) bn3d_branch2c (BatchNorm) res3d_branch2a (Conv2D) bn3d_branch2a (Conv2D) bn3d_branch2b (BatchNorm) res3d_branch2b (BatchNorm) res3d_branch2c (Conv2D) bn3d_branch2c (BatchNorm) res3d_branch2c (Conv2D) bn3d_branch2c (BatchNorm) res4a_branch2c (Conv2D) bn4a_branch2a (BatchNorm) res4a_branch2b (BatchNorm) res4a_branch2b (BatchNorm) res4a_branch2c (Conv2D) bn4a_branch2c (BatchNorm) res4a_branch1 (Conv2D) bn4a_branch2c (BatchNorm) res4b_branch2c (BatchNorm) res4b_branch2c (BatchNorm) res4b_branch2c (BatchNorm) res4b_branch2c (Conv2D) bn4b_branch2c (BatchNorm) res4b_branch2c (Conv2D) bn4b_branch2c (BatchNorm) res4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4d_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4d_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4d_branch2c (Conv2D) bn4d_branch2c (BatchNorm) res4f_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5b_branch2c (BatchNorm) res5c_branch2c (BatchNorm)	res3h branch2c	•
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res4a_branch2a (Conv2D) bn4a_branch2b (Conv2D) bn4a_branch2b (Conv2D) bn4a_branch2b (Conv2D) res4a_branch2c (Conv2D) res4a_branch1 (Conv2D) bn4a_branch2c (BatchNorm) res4b_branch2a (Conv2D) bn4b_branch2b (Conv2D) bn4b_branch2b (Conv2D) bn4b_branch2c (BatchNorm) res4b_branch2c (Conv2D) bn4b_branch2b (Conv2D) bn4b_branch2c (Conv2D) bn4b_branch2c (Conv2D) bn4b_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4c_branch2b (Conv2D) bn4c_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4d_branch2c (BatchNorm) res4c_branch2c (Conv2D) bn4d_branch2c (BatchNorm) res4d_branch2c (BatchNorm) res4d_branch2c (BatchNorm) res4d_branch2c (Conv2D) bn4d_branch2c (BatchNorm) res4d_branch2c (Conv2D) bn4d_branch2c (BatchNorm) res4e_branch2c (Conv2D) bn4d_branch2c (BatchNorm) res4e_branch2c (Conv2D) bn4e_branch2c (Conv2D) bn4e_branch2c (Conv2D) bn4e_branch2c (Conv2D) bn4f_branch2c (Conv2D) bn5a_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D)	<del>_</del>	
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res4a_branch2b bn4a_branch2b res4a_branch2c res4a_branch1 bn4a_branch1c bn4a_branch1c bn4a_branch1c bn4a_branch1c bn4a_branch1c conv2D) bn4a_branch1c bn4a_branch1c bn4a_branch2c bn4b_branch2a res4b_branch2b res4b_branch2b res4b_branch2c res4c_branch2c bn4c_branch2c bn4c_branch2b res4c_branch2c bn4c_branch2c cres4d_branch2c bn4d_branch2c cres4d_branch2c bn4d_branch2c cres4d_branch2c bn4d_branch2c res4d_branch2c bn4d_branch2c res4d_branch2c bn4d_branch2c res4d_branch2c bn4d_branch2c cres4d_branch2c bn4d_branch2c cres4d_branch2c bn4d_branch2c cres4d_branch2c bn4d_branch2c cres4d_branch2c bn4d_branch2c cres4d_branch2c bn4d_branch2c bn4d_branch2c bn4d_branch2c bn4d_branch2c bn4e_branch2c bn5a_branch2c bn5a_branch2c bn5a_branch2c bn5a_branch2c bn5a_branch2c bn5a_branch2c bn5b_branch2c bn5b_branc	<del>_</del>	•
bn4a_branch2b res4a_branch2c res4a_branch1 (Conv2D) bn4a_branch2c bn4a_branch2c bn4a_branch2c bn4a_branch2c bn4b_branch2a res4b_branch2a res4b_branch2b bn4b_branch2b bn4b_branch2c conv2D) bn4b_branch2b bn4b_branch2c bn4b_branch2c conv2D) bn4b_branch2c bn4b_branch2c conv2D) bn4b_branch2c bn4b_branch2c bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4c_branch2a res4c_branch2b bn4c_branch2b bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2a res4d_branch2b bn4d_branch2b conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c bn4e_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5b_branch2c conv2D) bn5b_bra	bn4a_branch2a	(BatchNorm)
bn4a_branch2b res4a_branch2c res4a_branch1 (Conv2D) bn4a_branch2c bn4a_branch2c bn4a_branch2c bn4a_branch2c bn4b_branch2a res4b_branch2a res4b_branch2b bn4b_branch2b bn4b_branch2c conv2D) bn4b_branch2b bn4b_branch2c bn4b_branch2c conv2D) bn4b_branch2c bn4b_branch2c conv2D) bn4b_branch2c bn4b_branch2c bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4c_branch2a res4c_branch2b bn4c_branch2b bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2a res4d_branch2b bn4d_branch2b conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c bn4e_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5b_branch2c conv2D) bn5b_bra	res4a branch2b	(Conv2D)
res4a_branch2c res4a_branch1 (Conv2D) bn4a_branch1 (BatchNorm) res4b_branch2a (BatchNorm) res4b_branch2a (BatchNorm) res4b_branch2b (Conv2D) bn4b_branch2b (Conv2D) bn4b_branch2c (BatchNorm) res4b_branch2c (Conv2D) bn4b_branch2c (BatchNorm) res4b_branch2c (BatchNorm) res4b_branch2c (BatchNorm) res4c_branch2a (Conv2D) bn4c_branch2a (BatchNorm) res4c_branch2b (BatchNorm) res4c_branch2b (BatchNorm) res4c_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4c_branch2c (Conv2D) bn4d_branch2a (BatchNorm) res4d_branch2a (BatchNorm) res4d_branch2b (BatchNorm) res4d_branch2c (Conv2D) bn4d_branch2c (BatchNorm) res4d_branch2c (BatchNorm) res4e_branch2c (BatchNorm) res4e_branch2a (Conv2D) bn4e_branch2a (BatchNorm) res4e_branch2b (BatchNorm) res4e_branch2c (BatchNorm) res4e_branch2c (BatchNorm) res4e_branch2c (BatchNorm) res4e_branch2c (BatchNorm) res4e_branch2c (BatchNorm) res4f_branch2c (BatchNorm) res4f_branch2c (BatchNorm) res4f_branch2c (BatchNorm) res4f_branch2c (BatchNorm) res5a_branch2c (Conv2D) bn4f_branch2c (BatchNorm) res5a_branch2c (Conv2D) bn5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D)		(BatchNorm)
res4a_branch1 bn4a_branch2c bn4a_branch1 res4b_branch2a bn4b_branch2a bn4b_branch2a res4b_branch2b res4b_branch2b res4b_branch2b res4b_branch2c bn4b_branch2c bn4b_branch2c res4b_branch2c bn4b_branch2c res4c_branch2c res4c_branch2a res4c_branch2a res4c_branch2b res4c_branch2b res4c_branch2c res4c_branch2c res4c_branch2b res4c_branch2c res4c_branch2c bn4c_branch2c res4d_branch2c res4d_branch2c res4d_branch2a res4d_branch2a res4d_branch2b res4d_branch2c res4d_branch2c res4d_branch2c res4d_branch2c res4d_branch2c res4d_branch2c res4d_branch2c res4e_branch2c bn4d_branch2c res4e_branch2a res4e_branch2a res4e_branch2b res4e_branch2c res4e_branch2c res4e_branch2c res4f_branch2c res4f_branch2c res4f_branch2c res4f_branch2c res4f_branch2c res4f_branch2c res4f_branch2c res5a_branch2c res5b_branch2c res5b_branch2c res5b_branch2c res5b_branch2c res5b_branch2c res5c_branch2c re	ros42 branch2s	
bn4a_branch2c bn4a_branch1 res4b_branch2a bn4b_branch2a res4b_branch2b res4b_branch2b res4b_branch2b res4b_branch2b res4b_branch2b res4b_branch2c res4b_branch2c res4b_branch2c res4b_branch2c res4b_branch2c res4b_branch2c res4c_branch2c res4c_branch2a res4c_branch2b res4c_branch2b res4c_branch2c res4c_branch2c res4c_branch2c res4c_branch2c res4c_branch2c res4c_branch2c res4c_branch2c res4d_branch2c res4d_branch2a res4d_branch2a res4d_branch2b res4d_branch2b res4d_branch2c res4d_branch2c res4d_branch2c res4d_branch2c res4d_branch2c res4d_branch2c res4d_branch2c res4e_branch2c res4e_branch2c res4e_branch2c res4e_branch2c res4e_branch2c res4e_branch2c res4e_branch2c res4f_branch2c res5a_branch2c res5a_bran	res4a_branchize	
bn4a_branch1 res4b_branch2a branch2a ces4b_branch2b bn4b_branch2b bn4b_branch2b bn4b_branch2c bn4b_branch2c bn4b_branch2c bn4b_branch2c bn4b_branch2c bn4b_branch2c bn4b_branch2c ces4c_branch2a ces4c_branch2a ces4c_branch2b bn4c_branch2b bn4c_branch2c ces4c_branch2c ces4c_branch2c ces4c_branch2c ces4c_branch2c ces4c_branch2c ces4c_branch2c ces4d_branch2c ces4d_branch2c ces4d_branch2b ces4d_branch2b ces4d_branch2c ces6d_branch2c ces6d_bran	<del>_</del>	
res4b_branch2a bn4b_branch2a res4b_branch2b cres4b_branch2b bn4b_branch2b cres4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4c_branch2a conv2D) bn4c_branch2b conv2D) bn4c_branch2b conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2a conv2D) bn4d_branch2b conv2D) bn4d_branch2b conv2D) bn4d_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4f_branch2c conv2D) bn5a_branch2c conv2D) bn5b_branch2c conv2D) bn5b_branch2	_	(BatchNorm)
bn4b_branch2a res4b_branch2b cres4b_branch2b cres4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4c_branch2a conv2D) bn4c_branch2b conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4d_branch2a conv2D) bn4d_branch2a conv2D) bn4d_branch2b conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4e_branch2c conv2D) bn4f_branch2a conv2D) bn4f_branch2a conv2D) bn4f_branch2c conv2D) bn5a_branch2c conv2D) bn5b_branch2c conv2	bn4a_branch1	(BatchNorm)
bn4b_branch2a res4b_branch2b cres4b_branch2b cres4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4b_branch2c conv2D) bn4c_branch2a conv2D) bn4c_branch2b conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4c_branch2c conv2D) bn4d_branch2a conv2D) bn4d_branch2a conv2D) bn4d_branch2b conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4e_branch2c conv2D) bn4f_branch2a conv2D) bn4f_branch2a conv2D) bn4f_branch2c conv2D) bn5a_branch2c conv2D) bn5b_branch2c conv2	res4b branch2a	(Conv2D)
res4b_branch2b bn4b_branch2b res4b_branch2c bn4b_branch2c bn4b_branch2c bn4b_branch2c cres4c_branch2a bn4c_branch2a bn4c_branch2b cres4c_branch2b bn4c_branch2b cres4c_branch2b bn4c_branch2b cres4c_branch2b bn4c_branch2c cres4c_branch2c bn4c_branch2c cres4d_branch2c bn4d_branch2a cres4d_branch2a cres4d_branch2b bn4d_branch2b cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4e_branch2a bn4e_branch2c cres4e_branch2b cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4f_branch2c cres4f_branch2a cres4f_branch2a cres4f_branch2a cres4f_branch2a cres4f_branch2b cres4f_branch2c cres4f_branch2c cres4f_branch2c cres4f_branch2c cres4f_branch2c cres5a_branch2c cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5c_branch2c cres5c_bra		(BatchNorm)
bn4b_branch2b res4b_branch2c bn4b_branch2c bn4b_branch2c res4c_branch2a cres4c_branch2a bn4c_branch2b cres4c_branch2b bn4c_branch2b cres4c_branch2b cres4c_branch2b cres4c_branch2b cres4c_branch2b cres4c_branch2c cres4c_branch2c cres4c_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2a cres4d_branch2b cres4d_branch2b cres4d_branch2b cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4e_branch2a cres4e_branch2a cres4e_branch2a cres4e_branch2b cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4f_branch2c cres4f_branch2c cres4f_branch2c cres4f_branch2c cres4f_branch2c cres4f_branch2c cres5a_branch2c cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2b cres5c_bra	_	
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bn4b_branch2c res4c_branch2a bn4c_branch2a ces4c_branch2a ces4c_branch2b ces4c_branch2b ces4c_branch2b ces4c_branch2b ces4c_branch2b ces4c_branch2c ces4c_branch2c ces4c_branch2c ces4c_branch2c ces4c_branch2c ces4c_branch2c ces4d_branch2c ces4d_branch2a ces4d_branch2a ces4d_branch2a ces4d_branch2b ces4d_branch2b ces4d_branch2c ces4d_branch2a ces4d_branch2a ces4d_branch2a ces4d_branch2a ces4d_branch2b ces4d_branch2c ces4d_br	<del>-</del>	
res4c_branch2a (Conv2D) bn4c_branch2a (BatchNorm) res4c_branch2b (Conv2D) bn4c_branch2b (BatchNorm) res4c_branch2c (Conv2D) bn4c_branch2c (BatchNorm) res4d_branch2c (BatchNorm) res4d_branch2a (Conv2D) bn4d_branch2a (BatchNorm) res4d_branch2b (Conv2D) bn4d_branch2b (Conv2D) bn4d_branch2c (BatchNorm) res4d_branch2c (BatchNorm) res4d_branch2c (BatchNorm) res4d_branch2c (BatchNorm) res4e_branch2a (Conv2D) bn4e_branch2b (Conv2D) bn4e_branch2b (Conv2D) bn4e_branch2c (BatchNorm) res4f_branch2c (BatchNorm) res4f_branch2a (BatchNorm) res4f_branch2b (Conv2D) bn4f_branch2b (BatchNorm) res4f_branch2c (BatchNorm) res4f_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2b (Conv2D) bn5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5a_branch2c (BatchNorm) res5b_branch2c (BatchNorm) res5c_branch2c (BatchNorm)	<del>_</del>	
bn4c_branch2a res4c_branch2b bn4c_branch2b bn4c_branch2b ces4c_branch2c bn4c_branch2c bn4c_branch2c bn4c_branch2c bn4c_branch2c bn4c_branch2c bn4c_branch2c ces4d_branch2c ces4d_branch2a bn4d_branch2a ces4d_branch2b bn4d_branch2b ces4d_branch2b ces4d_branch2c ces5d_branch2c cestactNorm) ces5d_branch2c cestactNorm) ces5d_branch2c cestactNorm) ces5d_branch2c cestactNorm) ces	bn4b_branch2c	(BatchNorm)
bn4c_branch2a res4c_branch2b bn4c_branch2b bn4c_branch2b ces4c_branch2c bn4c_branch2c bn4c_branch2c bn4c_branch2c bn4c_branch2c bn4c_branch2c bn4c_branch2c ces4d_branch2c ces4d_branch2a bn4d_branch2a ces4d_branch2b bn4d_branch2b ces4d_branch2b ces4d_branch2c ces5d_branch2c cestactNorm) ces5d_branch2c cestactNorm) ces5d_branch2c cestactNorm) ces5d_branch2c cestactNorm) ces	res4c branch2a	(Conv2D)
res4c_branch2b bn4c_branch2b res4c_branch2c conv2D) bn4c_branch2c bn4c_branch2c bn4c_branch2c cres4d_branch2c cres4d_branch2a bn4d_branch2a res4d_branch2b bn4d_branch2b cres4d_branch2b bn4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4e_branch2a bn4e_branch2a cres4e_branch2b bn4e_branch2b cres4e_branch2b cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4f_branch2c cres4f_branch2a cres4f_branch2a cres4f_branch2b cres4f_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch1 cres5b_branch2c cres5c_branch2c cres5c_branc		(BatchNorm)
bn4c_branch2b res4c_branch2c bn4c_branch2c bn4c_branch2c cres4d_branch2a bn4d_branch2a cres4d_branch2b bn4d_branch2b cres4d_branch2b bn4d_branch2b cres4d_branch2b bn4d_branch2b cres4d_branch2c bn4d_branch2c bn4d_branch2c bn4d_branch2c bn4d_branch2c cres4e_branch2a cres4e_branch2a cres4e_branch2b bn4e_branch2b cres4e_branch2c bn4e_branch2c cres4f_branch2c bn4f_branch2a cres4f_branch2a cres4f_branch2b bn4f_branch2b cres4f_branch2c bn4f_branch2c cres5a_branch2c bn5a_branch2b cres5a_branch2c bn5a_branch2c bn5a_branch2c bn5a_branch2c bn5a_branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c cres5b_branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c cres5b_branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c cres5b_branch2c bn5b_branch2c cres5b_branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c cres5c_branch2a cres5c_branch2a cres5c_branch2a bn5c_branch2c bn5c_branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c bn5c_branch2a cres5c_branch2b bn5c_branch2c bn5c_branch	res4c branch2h	
res4c_branch2c bn4c_branch2c res4d_branch2a cres4d_branch2a bn4d_branch2a res4d_branch2b bn4d_branch2b cres4d_branch2b bn4d_branch2b cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4d_branch2c cres4e_branch2a cres4e_branch2a cres4e_branch2b cres4e_branch2b cres4e_branch2c cres4e_branch2c cres4f_branch2c cres4f_branch2c cres4f_branch2a cres4f_branch2a cres4f_branch2b cres4f_branch2b cres4f_branch2c cres5a_branch2c cres5b_branch2c cres5c_branch2c cres5c_br	hn/a hrangh?h	
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res4d_branch2a bn4d_branch2a res4d_branch2b res4d_branch2b bn4d_branch2b bn4d_branch2b bn4d_branch2b res4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4e_branch2a conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4f_branch2a conv2D) bn4f_branch2b conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn5a_branch2a conv2D) bn5a_branch2b conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch1 conv2D) bn5a_branch1 conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5b_branch2c conv2D) bn5c_branch2a conv2D) bn5c_branch2c conv2D)	<del>_</del>	
bn4d_branch2a res4d_branch2b bn4d_branch2b bn4d_branch2b ces4d_branch2c bn4d_branch2c bn4d_branch2c bn4d_branch2c ces4d_branch2c bn4d_branch2c ces4e_branch2a bn4e_branch2a ces4e_branch2b bn4e_branch2b bn4e_branch2c ces4e_branch2c ces4e_branch2c ces4e_branch2b bn4e_branch2c ces4e_branch2c ces4e_branch2a ces4e_branch2a ces4e_branch2a ces4e_branch2a ces4e_branch2a ces4e_branch2a ces4e_branch2b ces4e_branch2b ces4e_branch2c ces5a_branch2c ces5a_branch2a ces5a_branch2c ces5b_branch2c ces5b_branch2c ces5b_branch2c ces5b_branch2c ces5c_branch2c cessc_branch2c ces5c_branch2c ces5c_branch2c ces6c ces6cc ces6cc ces4cc cenv2D) ces6cc		
res4d_branch2b bn4d_branch2b res4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4d_branch2c conv2D) bn4e_branch2a conv2D) bn4e_branch2b conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4f_branch2a conv2D) bn4f_branch2b conv2D) bn4f_branch2b conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn5a_branch2a conv2D) bn5a_branch2a conv2D) bn5a_branch2b conv2D) bn5a_branch2c conv2D) bn5b_branch2a conv2D) bn5b_branch2c conv2D) bn5c_branch2a conv2D) bn5c_branch2b conv2D)	res4d_branch2a	(Conv2D)
bn4d_branch2b res4d_branch2c bn4d_branch2c bn4d_branch2c cres4e_branch2a bn4e_branch2a cres4e_branch2a cres4e_branch2a cres4e_branch2b bn4e_branch2b cres4e_branch2b cres4e_branch2b cres4e_branch2b cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4f_branch2c cres4f_branch2a cres4f_branch2b cres4f_branch2b cres4f_branch2b cres4f_branch2c cres5a_branch2c cres5a_branch2a cres5a_branch2a cres5a_branch2b cres5a_branch2b cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch1 cres5b_branch2c cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2b cres5c_bra	bn4d branch2a	(BatchNorm)
bn4d_branch2b res4d_branch2c bn4d_branch2c bn4d_branch2c cres4e_branch2a bn4e_branch2a cres4e_branch2a cres4e_branch2a cres4e_branch2b bn4e_branch2b cres4e_branch2b cres4e_branch2b cres4e_branch2b cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4e_branch2c cres4f_branch2c cres4f_branch2a cres4f_branch2b cres4f_branch2b cres4f_branch2b cres4f_branch2c cres5a_branch2c cres5a_branch2a cres5a_branch2a cres5a_branch2b cres5a_branch2b cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch1 cres5b_branch2c cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2b cres5c_bra	res4d branch2b	(Conv2D)
res4d_branch2c bn4d_branch2c res4e_branch2a bn4e_branch2a res4e_branch2a res4e_branch2b conv2D) bn4e_branch2b conv2D) bn4e_branch2b conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4f_branch2a conv2D) bn4f_branch2b conv2D) bn4f_branch2b conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn5a_branch2a conv2D) bn5a_branch2b conv2D) bn5a_branch2b conv2D) bn5a_branch2c conv2D) bn5b_branch2c conv2D) bn5c_branch2a conv2D)	<del>_</del>	•
bn4d_branch2c res4e_branch2a bn4e_branch2a ces4e_branch2a ces4e_branch2a ces4e_branch2b ces4e_branch2b ces4e_branch2b ces4e_branch2b ces4e_branch2b ces4e_branch2c ces4e_branch2c ces4e_branch2c ces4e_branch2c ces4f_branch2c ces4f_branch2a ces4f_branch2a ces4f_branch2b ces4f_branch2b ces4f_branch2b ces4f_branch2c ces4f_branch2c ces5a_branch2c ces5a_branch2a ces5a_branch2b ces5a_branch2b ces5a_branch2c ces5a_branch2c ces5a_branch1 ces5b_branch2c ces5b_branch2b ces5b_branch2c ces5c_branch2a ces5c_branch2a ces5c_branch2b cenv2D) ces5c_branch2a ces5c_branch2b cenv2D) ces5c_branch2c cenv2D) ces5c_branch2a cenv2D) ces5c_branch2a cenv2D) ces5c_branch2a cenv2D) ces5c_branch2a cenv2D) ces5c_branch2a cenv2D) cenv2	<del>_</del>	•
res4e_branch2a (Conv2D) bn4e_branch2b (Conv2D) bn4e_branch2b (BatchNorm) res4e_branch2b (BatchNorm) res4e_branch2c (Conv2D) bn4e_branch2c (Conv2D) bn4e_branch2c (BatchNorm) res4f_branch2a (Conv2D) bn4f_branch2b (Conv2D) bn4f_branch2b (Conv2D) bn4f_branch2b (BatchNorm) res4f_branch2c (Conv2D) bn4f_branch2c (Conv2D) bn4f_branch2c (Conv2D) bn5a_branch2a (Conv2D) bn5a_branch2b (Conv2D) bn5a_branch2b (BatchNorm) res5a_branch2b (BatchNorm) res5a_branch2c (Conv2D) bn5a_branch2c (Conv2D) bn5a_branch2c (Conv2D) bn5a_branch1 (Conv2D) bn5a_branch2c (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2c (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2b (Conv2D)	<del>_</del>	
bn4e_branch2b res4e_branch2b bn4e_branch2b bn4e_branch2b cres4e_branch2c cres4e_branch2c cres4e_branch2c bn4e_branch2c cres4f_branch2c cres4f_branch2a cres4f_branch2a cres4f_branch2b cres4f_branch2b cres4f_branch2b cres4f_branch2c cres4f_branch2c cres5a_branch2c cres5a_branch2a cres5a_branch2b cres5a_branch2b cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch1 cres5b_branch2c cres5c_branch2c cres5c_b	<del>-</del>	•
res4e_branch2b bn4e_branch2b res4e_branch2c conv2D) bn4e_branch2c bn4e_branch2c conv2D) bn4e_branch2c conv2D) bn4f_branch2a res4f_branch2b conv2D) bn4f_branch2b conv2D) bn4f_branch2b conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn4f_branch2c conv2D) bn5a_branch2a conv2D) bn5a_branch2b conv2D) bn5a_branch2b conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch1 conv2D) bn5a_branch1 conv2D) bn5a_branch2c conv2D) bn5b_branch2a conv2D) bn5b_branch2b conv2D) bn5b_branch2c conv2D) bn5c_branch2a conv2D) bn5c_branch2a conv2D) bn5c_branch2a conv2D) bn5c_branch2b conv2D) bn5c_branch2c conv2D)		
bn4e_branch2b res4e_branch2c bn4e_branch2c bn4e_branch2c cres4f_branch2a bn4f_branch2a res4f_branch2b bn4f_branch2b bn4f_branch2b cres4f_branch2b bn4f_branch2c cres4f_branch2c bn4f_branch2c cres4f_branch2c bn4f_branch2c cres5a_branch2a bn5a_branch2a cres5a_branch2b bn5a_branch2b cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch1 cres5a_branch1 cres5b_branch2c cres5b_branch2a cres5b_branch2b cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5c_branch2a cres5c_branch2b cres5c_branch2a cres5c_branch2b cres5c_b	bn4e_branch2a	(BatchNorm)
bn4e_branch2b res4e_branch2c bn4e_branch2c bn4e_branch2c cres4f_branch2a bn4f_branch2a res4f_branch2b bn4f_branch2b bn4f_branch2b cres4f_branch2b bn4f_branch2c cres4f_branch2c bn4f_branch2c cres4f_branch2c bn4f_branch2c cres5a_branch2a bn5a_branch2a cres5a_branch2b bn5a_branch2b cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch1 cres5a_branch1 cres5b_branch2c cres5b_branch2a cres5b_branch2b cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5c_branch2a cres5c_branch2b cres5c_branch2a cres5c_branch2b cres5c_b	res4e branch2b	(Conv2D)
res4e_branch2c bn4e_branch2c cres4f_branch2a bn4f_branch2a cres4f_branch2a cres4f_branch2b bn4f_branch2b cres4f_branch2b cres4f_branch2c cres4f_branch2c cres4f_branch2c cres4f_branch2c cres5a_branch2c cres5a_branch2a cres5a_branch2b cres5a_branch2b cres5a_branch2b cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch2c cres5a_branch1 cres5a_branch1 cres5a_branch1 cres5b_branch2c cres5b_branch2a cres5b_branch2b cres5b_branch2c cres5b_branch2c cres5b_branch2c cres5c_branch2a cres5c_branch2a cres5c_branch2a cres5c_branch2b cres5c_branch2b cres5c_branch2b cres5c_branch2c cres5c_branch2b cres5c_b		(BatchNorm)
bn4e_branch2c res4f_branch2a bn4f_branch2a bn4f_branch2a res4f_branch2b conv2D) bn4f_branch2b bn4f_branch2b conv2D) bn4f_branch2c bn4f_branch2c bn4f_branch2c bn4f_branch2c conv2D) bn5a_branch2a conv2D) bn5a_branch2b conv2D) bn5a_branch2b conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch1 conv2D) bn5a_branch1 conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5a_branch2c conv2D) bn5b_branch2a conv2D) bn5b_branch2b conv2D) bn5b_branch2c conv2D) bn5c_branch2a conv2D) bn5c_branch2a conv2D) bn5c_branch2b conv2D) bn5c_branch2b conv2D) bn5c_branch2b conv2D) bn5c_branch2b conv2D) bn5c_branch2b conv2D) bn5c_branch2b conv2D)	<del>_</del>	
res4f_branch2a (Conv2D) bn4f_branch2b (Conv2D) bn4f_branch2b (Conv2D) bn4f_branch2b (BatchNorm) res4f_branch2c (Conv2D) bn4f_branch2c (BatchNorm) res5a_branch2a (Conv2D) bn5a_branch2b (Conv2D) bn5a_branch2b (Conv2D) bn5a_branch2c (Conv2D) res5a_branch2c (Conv2D) bn5a_branch2c (Conv2D) bn5a_branch2c (Conv2D) bn5a_branch1 (Conv2D) bn5a_branch1 (BatchNorm) res5b_branch2a (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2c (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D)		
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res4f_branch2b bn4f_branch2b res4f_branch2c conv2D) bn4f_branch2c bn4f_branch2c bn4f_branch2c cres5a_branch2a cres5a_branch2b bn5a_branch2b cres5a_branch2c cres5a_branch1 bn5a_branch2c bn5a_branch2c cres5b_branch2c bn5b_branch2a cres5b_branch2b bn5b_branch2b cres5b_branch2c cres5c_branch2a cres5c_branch2c cres5c_branch2b cres5c_branch2c cres5c_branch2b cres5c_branch2c cres5c_bran		
bn4f_branch2b res4f_branch2c bn4f_branch2c bn4f_branch2c cres5a_branch2a res5a_branch2a res5a_branch2b bn5a_branch2b res5a_branch2c res5a_branch1 bn5a_branch2c bn5a_branch2c bn5a_branch2c cres5a_branch1 bn5a_branch2c bn5a_branch2c bn5a_branch2c bn5a_branch2c bn5b_branch2a cres5b_branch2a res5b_branch2b branch2b branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c bn5b_branch2c cres5b_branch2c bn5b_branch2c bn5c_branch2c bn5c_branch2c bn5c_branch2b branch2c bn5c_branch2b cconv2D) bn5c_branch2c branch2b cconv2D) bn5c_branch2c branch2b cconv2D) bn5c_branch2c branch2b cconv2D) bn5c_branch2c branch2b cconv2D) bn5c_branch2c branch2c branch2c cconv2D) bn5c_branch2c branch2c branch2c branch2c cconv2D) bn5c_branch2c branch2c bra		(BatchNorm)
res4f_branch2c (Conv2D) bn4f_branch2c (BatchNorm) res5a_branch2a (Conv2D) bn5a_branch2b (Conv2D) bn5a_branch2b (BatchNorm) res5a_branch2c (Conv2D) th5a_branch2c (Conv2D) bn5a_branch1 (Conv2D) bn5a_branch1 (BatchNorm) tres5b_branch2a (BatchNorm) res5b_branch2a (BatchNorm) res5b_branch2b (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2c (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D)	res4f branch2b	(Conv2D)
res4f_branch2c (Conv2D) bn4f_branch2c (BatchNorm) res5a_branch2a (Conv2D) bn5a_branch2b (Conv2D) bn5a_branch2b (BatchNorm) res5a_branch2c (Conv2D) th5a_branch2c (Conv2D) bn5a_branch1 (Conv2D) bn5a_branch1 (BatchNorm) tres5b_branch2a (BatchNorm) res5b_branch2a (BatchNorm) res5b_branch2b (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2c (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D) bn5c_branch2c (Conv2D)	bn4f branch2b	(BatchNorm)
bn4f_branch2c res5a_branch2a bn5a_branch2a ces5a_branch2b ces5a_branch2b ces5a_branch2b ces5a_branch2b ces5a_branch2c ces5a_branch2c ces5a_branch1 ces5a_branch2c ces5a_branch2c ces5a_branch1 ces5a_branch1 ces5b_branch2c ces5b_branch2a ces5b_branch2a ces5b_branch2b ces5b_branch2c ces5b_branch2c ces5b_branch2c ces5b_branch2c ces5b_branch2c ces5b_branch2c ces5c_branch2a ces5c_branch2a ces5c_branch2b ces5c_branc	_	
res5a_branch2a (Conv2D) bn5a_branch2b (Conv2D) bn5a_branch2b (Conv2D) bn5a_branch2b (BatchNorm) res5a_branch2c (Conv2D) res5a_branch1 (Conv2D) bn5a_branch2c (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2c (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)	<del>_</del>	
bn5a_branch2a (BatchNorm) res5a_branch2b (Conv2D) bn5a_branch2b (BatchNorm) res5a_branch2c (Conv2D) res5a_branch1 (Conv2D) bn5a_branch2c (BatchNorm) bn5a_branch1 (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2a (BatchNorm) res5b_branch2b (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2b (Conv2D) bn5c_branch2b (Conv2D)	<del>_</del>	
res5a_branch2b (Conv2D) bn5a_branch2b (BatchNorm) res5a_branch2c (Conv2D) res5a_branch1 (Conv2D) bn5a_branch2c (BatchNorm) bn5a_branch1 (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2a (BatchNorm) res5b_branch2b (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2b (Conv2D)	<del>_</del>	
bn5a_branch2b (BatchNorm) res5a_branch2c (Conv2D) res5a_branch1 (Conv2D) bn5a_branch2c (BatchNorm) bn5a_branch1 (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2b (Conv2D)	<del>_</del>	(BatchNorm)
res5a_branch2c (Conv2D) res5a_branch1 (Conv2D) bn5a_branch2c (BatchNorm) bn5a_branch1 (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) conv2D) bn5c_branch2b (Conv2D)	res5a_branch2b	(Conv2D)
res5a_branch2c (Conv2D) res5a_branch1 (Conv2D) bn5a_branch2c (BatchNorm) bn5a_branch1 (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) conv2D) bn5c_branch2b (Conv2D)	bn5a branch2b	(BatchNorm)
res5a_branch1 (Conv2D) bn5a_branch2c (BatchNorm) bn5a_branch1 (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) bn5c_branch2a (Conv2D) conv2D) bn5c_branch2b (Conv2D)		
bn5a_branch2c (BatchNorm) bn5a_branch1 (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2a (Conv2D) conv2D)		
bn5a_branch1 (BatchNorm) res5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)		
res5b_branch2a (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2b (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)	<del>_</del>	
bn5b_branch2a (BatchNorm) res5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)		
res5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)		(Conv2D)
res5b_branch2b (Conv2D) bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)	bn5b_branch2a	(BatchNorm)
bn5b_branch2b (BatchNorm) res5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)	res5b branch2b	(Conv2D)
res5b_branch2c (Conv2D) bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)	<del>_</del>	•
bn5b_branch2c (BatchNorm) res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)	<del>-</del>	
res5c_branch2a (Conv2D) bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)	<del>_</del>	
bn5c_branch2a (BatchNorm) res5c_branch2b (Conv2D)	_	•
res5c_branch2b (Conv2D)		
		(BatchNorm)
	res5c branch2b	(Conv2D)
		<u>-</u>

```
fpn c5p5
fpn c4p4
                         (Conv2D)
fpn c3p3
                         (Conv2D)
fpn c2p2
                         (Conv2D)
                        (Conv2D)
fpn p5
fpn p2
                         (Conv2D)
fpn p3
                         (Conv2D)
fpn p4
                         (Conv2D)
In model: rpn model
    rpn conv_shared
                            (Conv2D)
    rpn class raw
                            (Conv2D)
    rpn bbox pred
                            (Conv2D)
mrcnn_mask_conv1
                       (TimeDistributed)
mrcnn_mask_bn1 (TimeDistributed)
mrcnn_mask_conv2 (TimeDistributed)
mrcnn_mask_bn2 (TimeDistributed)
mrcnn_class_conv1 (TimeDistributed)
mrcnn_class_bn1 (TimeDistributed)
mrcnn_mask_conv3 (TimeDistributed)
mrcnn_mask_bn3 (TimeDistributed)
mrcnn_class_conv2 (TimeDistributed)
mrcnn_class_bn2 (TimeDistributed)
mrcnn_mask_bn4 (TimeDistributed)
mrcnn_mask_bn4 (TimeDistributed)
mrcnn_mask_deconv (TimeDistributed)
mrcnn_mask_deconv (TimeDistributed)
mrcnn_class_logits (TimeDistributed)
mrcnn_class_logits (TimeDistributed)
mrcnn_mask (TimeDistributed)
mrcnn_mask (TimeDistributed)
mrcnn mask bn1
                        (TimeDistributed)
mrcnn mask
                        (TimeDistributed)
/usr/local/lib/python3.7/dist-packages/tensorflow core/python/framework/indexed slices.py
:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. Th
is may consume a large amount of memory.
   "Converting sparse IndexedSlices to a dense Tensor of unknown shape. "
/usr/local/lib/python3.7/dist-packages/tensorflow core/python/framework/indexed slices.py
:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. Th
is may consume a large amount of memory.
   "Converting sparse IndexedSlices to a dense Tensor of unknown shape. "
/usr/local/lib/python3.7/dist-packages/tensorflow core/python/framework/indexed slices.py
:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. Th
is may consume a large amount of memory.
   "Converting sparse IndexedSlices to a dense Tensor of unknown shape. "
/usr/local/lib/python3.7/dist-packages/keras/engine/training.py:2087: UserWarning: Using
a generator with `use multiprocessing=True` and multiple workers may duplicate your data.
Please consider using the `keras.utils.Sequence class.
  UserWarning('Using a generator with `use multiprocessing=True`'
Epoch 1/10
 741 - rpn bbox loss: 0.9583 - mrcnn class loss: 0.4237 - mrcnn bbox loss: 0.3532 - mrcnn
mask loss: 0.3947
/usr/local/lib/python3.7/dist-packages/keras/engine/training.py:2330: UserWarning: Using
a generator with `use multiprocessing=True` and multiple workers may duplicate your data.
Please consider using the `keras.utils.Sequence class.
  UserWarning('Using a generator with `use multiprocessing=True`'
s: 0.0740 - rpn_bbox_loss: 0.9581 - mrcnn_class_loss: 0.4237 - mrcnn_bbox_loss: 0.3532 -
mrcnn_mask_loss: 0.3947 - val_loss: 2.0781 - val_rpn_class_loss: 0.0690 - val_rpn_bbox_lo
ss: 0.8829 - val mrcnn class loss: 0.4060 - val mrcnn bbox loss: 0.3446 - val mrcnn mask
loss: 0.3755
WARNING:tensorflow:From /usr/local/lib/python3.7/dist-packages/keras/callbacks.py:860: Th
e name tf.Summary is deprecated. Please use tf.compat.v1.Summary instead.
Epoch 00001: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 0001-0.37551.h5
s: 0.0695 - rpn bbox loss: 0.9136 - mrcnn class loss: 0.4067 - mrcnn bbox loss: 0.3384 -
```

mrcnn\_mask\_loss: 0.3760 - val\_loss: 2.1006 - val\_rpn\_class\_loss: 0.0735 - val\_rpn\_bbox\_lo

res5c branch2c

bn5c branch2c

(Conv2D)

(Conv2D)

(BatchNorm)

```
ss: 0.9303 - val_mrcnn_class_loss: 0.3923 - val_mrcnn_bbox_loss: 0.3360 - val_mrcnn_mask_
loss: 0.3686
Epoch 00002: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 0002-0.36857.h5
Epoch 3/10
638/1000 [==========>.....] - ETA: 15:16 - loss: 2.0694 - rpn class loss:
0.0679 - rpn bbox loss: 0.8954 - mrcnn class loss: 0.4073 - mrcnn bbox loss: 0.3313 - mrc
nn mask loss: 0.3675
In [ ]:
maskrcnn model = modellib.MaskRCNN(mode='training', config=config, model dir='content')
maskrcnn model.set log dir(model path='/content/Mask RCNN/mrcnn')
maskrcnn model.load weights ('/content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 0002-0.36857.h5', by name=True)
checkpoint = keras.callbacks.ModelCheckpoint('/content/drive/MyDrive/Applied AI Course/As
signments/29. Self Case Study 2/Models/mask rcnn fashion day 2 1 {epoch:04d}-{val mrcnn m
ask loss:.5f}.h5', save weights only=True, verbose=1)
maskrcnn model.train(train data, valid data,
           learning_rate=1e-4,
            epochs=7,
            layers='all',
            augmentation=augmentation, custom callbacks=[checkpoint])
Starting at epoch 0. LR=0.0001
Checkpoint Path: content/fashion20210407T0638/mask rcnn fashion {epoch:04d}.h5
Selecting layers to train
                      (Conv2D)
conv1
bn conv1
                      (BatchNorm)
res2a branch2a
                      (Conv2D)
bn2a branch2a
                      (BatchNorm)
res2a branch2b
                      (Conv2D)
bn2a branch2b
                     (BatchNorm)
res2a branch2c
                     (Conv2D)
res2a branch1
                     (Conv2D)
                     (BatchNorm)
bn2a_branch2c
bn2a branch1
                     (BatchNorm)
                     (Conv2D)
res2b branch2a
bn2b branch2a
                     (BatchNorm)
res2b branch2b
                     (Conv2D)
bn2b branch2b
                     (BatchNorm)
res2b branch2c
                     (Conv2D)
bn2b branch2c
                     (BatchNorm)
res2c branch2a
                     (Conv2D)
bn2c branch2a
                     (BatchNorm)
res2c branch2b
                     (Conv2D)
bn2c branch2b
                      (BatchNorm)
res2c branch2c
                      (Conv2D)
bn2c branch2c
                      (BatchNorm)
res3a branch2a
                      (Conv2D)
bn3a branch2a
                      (BatchNorm)
res3a branch2b
                     (Conv2D)
bn3a branch2b
                      (BatchNorm)
                     (Conv2D)
res3a_branch2c
res3a branch1
                     (Conv2D)
bn3a branch2c
                     (BatchNorm)
bn3a branch1
                     (BatchNorm)
res3b branch2a
                     (Conv2D)
bn3b branch2a
                     (BatchNorm)
res3b branch2b
                     (Conv2D)
bn3b branch2b
                     (BatchNorm)
res3b branch2c
                     (Conv2D)
bn3b branch2c
                     (BatchNorm)
res3c branch2a
                     (Conv2D)
bn3c branch2a
                      (BatchNorm)
res3c branch2b
                      (Conv2D)
bn3c branch2b
                      (BatchNorm)
res3c branch2c
                      (Conv2D)
bn3c branch2c
                      (BatchNorm)
```

res3d branch2a	(Conv2D)
bn3d branch2a	(BatchNorm)
res3d branch2b	(Conv2D)
<del>_</del>	
bn3d_branch2b	(BatchNorm)
res3d_branch2c	(Conv2D)
bn3d branch2c	(BatchNorm)
res4a branch2a	(Conv2D)
bn4a branch2a	(BatchNorm)
res4a_branch2b	(Conv2D)
bn4a_branch2b	(BatchNorm)
res4a branch2c	(Conv2D)
res4a branch1	(Conv2D)
bn4a branch2c	(BatchNorm)
bn4a_branch1	(BatchNorm)
res4b_branch2a	(Conv2D)
bn4b branch2a	(BatchNorm)
res4b branch2b	(Conv2D)
bn4b branch2b	(BatchNorm)
<del>_</del>	
res4b_branch2c	(Conv2D)
bn4b_branch2c	(BatchNorm)
res4c branch2a	(Conv2D)
bn4c branch2a	(BatchNorm)
res4c branch2b	(Conv2D)
bn4c_branch2b	(BatchNorm)
res4c_branch2c	(Conv2D)
bn4c branch2c	(BatchNorm)
res4d branch2a	(Conv2D)
bn4d branch2a	(BatchNorm)
res4d branch2b	
<del>_</del>	(Conv2D)
bn4d_branch2b	(BatchNorm)
res4d branch2c	(Conv2D)
bn4d branch2c	(BatchNorm)
res4e branch2a	(Conv2D)
bn4e branch2a	
	(BatchNorm)
res4e_branch2b	(Conv2D)
bn4e_branch2b	(BatchNorm)
res4e branch2c	(Conv2D)
bn4e branch2c	(BatchNorm)
res4f branch2a	(Conv2D)
bn4f_branch2a	(BatchNorm)
res4f_branch2b	(Conv2D)
bn4f branch2b	(BatchNorm)
res4f branch2c	(Conv2D)
bn4f branch2c	(BatchNorm)
res5a_branch2a	(Conv2D)
bn5a_branch2a	(BatchNorm)
res5a_branch2b	(Conv2D)
bn5a branch2b	(BatchNorm)
res5a branch2c	(Conv2D)
res5a branch1	(Conv2D)
<del>_</del>	
bn5a_branch2c	(BatchNorm)
bn5a_branch1	(BatchNorm)
res5b_branch2a	(Conv2D)
bn5b branch2a	(BatchNorm)
res5b branch2b	(Conv2D)
bn5b branch2b	(BatchNorm)
<del>_</del>	
res5b_branch2c	(Conv2D)
bn5b_branch2c	(BatchNorm)
res5c branch2a	(Conv2D)
bn5c branch2a	(BatchNorm)
res5c_branch2b	(Conv2D)
bn5c_branch2b	(BatchNorm)
res5c_branch2c	(Conv2D)
bn5c_branch2c	(BatchNorm)
 fpn c5p5	(Conv2D)
fpn c4p4	(Conv2D)
fpn c3p3	(Conv2D)
1. 5.7.1 5 7.5.7	(COTIA CD)
	(ConOD)
fpn_c2p2	(Conv2D)
fpn_c2p2 fpn_p5	(Conv2D)
fpn_c2p2	
fpn_c2p2 fpn_p5 fpn_p2	(Conv2D)
fpn_c2p2 fpn_p5 fpn_p2 fpn_p3	(Conv2D) (Conv2D) (Conv2D)
fpn_c2p2 fpn_p5 fpn_p2	(Conv2D) (Conv2D)

WARNING:tensorflow:From /usr/local/lib/python3.7/dist-packages/keras/optimizers.py:757: The name tf.train.Optimizer is deprecated. Please use tf.compat.v1.train.Optimizer instead

/usr/local/lib/python3.7/dist-packages/tensorflow\_core/python/framework/indexed\_slices.py:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. This may consume a large amount of memory.

"Converting sparse IndexedSlices to a dense Tensor of unknown shape."

/usr/local/lib/python3.7/dist-packages/tensorflow\_core/python/framework/indexed\_slices.py:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. This may consume a large amount of memory.

"Converting sparse IndexedSlices to a dense Tensor of unknown shape."
/usr/local/lib/python3.7/dist-packages/tensorflow\_core/python/framework/indexed\_slices.py
:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. Th
is may consume a large amount of memory.

"Converting sparse IndexedSlices to a dense Tensor of unknown shape. "

WARNING:tensorflow:From /usr/local/lib/python3.7/dist-packages/keras/backend/tensorflow\_b ackend.py:976: The name tf.assign\_add is deprecated. Please use tf.compat.v1.assign\_add i nstead.

WARNING:tensorflow:From /usr/local/lib/python3.7/dist-packages/keras/backend/tensorflow\_b ackend.py:963: The name tf.assign is deprecated. Please use tf.compat.v1.assign instead.

/usr/local/lib/python3.7/dist-packages/keras/engine/training.py:2087: UserWarning: Using a generator with `use\_multiprocessing=True` and multiple workers may duplicate your data. Please consider using the keras.utils.Sequence class.

UserWarning('Using a generator with `use\_multiprocessing=True`'

WARNING:tensorflow:From /usr/local/lib/python3.7/dist-packages/keras/callbacks.py:774: The name tf.summary.merge\_all is deprecated. Please use tf.compat.v1.summary.merge\_all instead.

WARNING:tensorflow:From /usr/local/lib/python3.7/dist-packages/keras/callbacks.py:777: The name tf.summary.FileWriter is deprecated. Please use tf.compat.v1.summary.FileWriter in stead.

/usr/local/lib/python3.7/dist-packages/keras/engine/training.py:2330: UserWarning: Using a generator with `use\_multiprocessing=True` and multiple workers may duplicate your data. Please consider using the keras.utils.Sequence class.

UserWarning('Using a generator with `use multiprocessing=True`'

```
loss: 0.3582
WARNING:tensorflow:From /usr/local/lib/python3.7/dist-packages/keras/callbacks.py:860: Th
e name tf.Summary is deprecated. Please use tf.compat.v1.Summary instead.
Epoch 00001: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 1 0001-0.35817.h5
Epoch 2/7
s: 0.0673 - rpn_bbox_loss: 0.9145 - mrcnn_class_loss: 0.3878 - mrcnn_bbox_loss: 0.3203 -
mrcnn mask loss: 0.3543 - val loss: 2.0896 - val rpn class loss: 0.0694 - val rpn bbox lo
ss: 0.9898 - val mrcnn class loss: 0.3647 - val mrcnn bbox_loss: 0.3185 - val_mrcnn_mask_
loss: 0.3472
Epoch 00002: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 1 0002-0.34716.h5
s: 0.0673 - rpn bbox loss: 0.9113 - mrcnn class loss: 0.3954 - mrcnn bbox loss: 0.3172 -
mrcnn mask loss: 0.3522 - val loss: 2.0431 - val rpn class loss: 0.0700 - val rpn bbox lo
ss: 0.9296 - val mrcnn class loss: 0.3920 - val mrcnn bbox loss: 0.3097 - val mrcnn mask
loss: 0.3418
Epoch 00003: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask_rcnn_fashion_day_2_1_0003-0.34180.h5
Epoch 4/7
803/1000 [===========>.....] - ETA: 8:57 - loss: 1.9634 - rpn_class_loss: 0
.0655 - rpn_bbox_loss: 0.8659 - mrcnn_class_loss: 0.3818 - mrcnn_bbox_loss: 0.3067 - mrcn
n mask loss: 0.3435
In [ ]:
maskrcnn model = modellib.MaskRCNN(mode='training', config=config, model dir='content')
maskrcnn model.set log dir(model path='/content/Mask RCNN/mrcnn')
maskrcnn model.load weights ('/content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 1 0003-0.34180.h5', by name=True)
checkpoint = keras.callbacks.ModelCheckpoint('/content/drive/MyDrive/Applied AI Course/As
signments/29. Self Case Study 2/Models/mask_rcnn_fashion_day_2_2_{epoch:04d}-{val_mrcnn_m
ask loss:.5f}.h5', save weights only=True, verbose=1)
maskrcnn model.train(train data, valid data,
           learning rate=1e-4,
           epochs=4,
           layers='all',
           augmentation=augmentation, custom callbacks=[checkpoint])
Starting at epoch 0. LR=0.0001
Checkpoint Path: content/fashion20210407T1039/mask rcnn fashion {epoch:04d}.h5
Selecting layers to train
conv1
                    (Conv2D)
bn conv1
                    (BatchNorm)
res2a branch2a
                    (Conv2D)
bn2a branch2a
                    (BatchNorm)
res2a branch2b
                    (Conv2D)
bn2a branch2b
                    (BatchNorm)
res2a branch2c
                    (Conv2D)
res2a branch1
                    (Conv2D)
bn2a_branch2c
                     (BatchNorm)
bn2a branch1
                     (BatchNorm)
                    (Conv2D)
res2b branch2a
                    (BatchNorm)
bn2b branch2a
                    (Conv2D)
res2b branch2b
                    (BatchNorm)
bn2b branch2b
```

(Conv2D)

(Conv2D)

(Conv2D)

(Conv2D)

(BatchNorm)

(BatchNorm)

(BatchNorm)

(BatchNorm)

res2b branch2c

bn2b\_branch2c res2c branch2a

bn2c branch2a

bn2c branch2b

bn2c branch2c

res2c branch2c

res2c branch2b

res3a branch2a	(Conv2D)
bn3a branch2a	(BatchNorm)
res3a branch2b	(Conv2D)
bn3a branch2b	(BatchNorm)
<del>_</del>	
res3a_branch2c	(Conv2D)
res3a_branch1	(Conv2D)
bn3a branch2c	(BatchNorm)
bn3a branch1	(BatchNorm)
res3b branch2a	(Conv2D)
<del>_</del>	
bn3b_branch2a	(BatchNorm)
res3b_branch2b	(Conv2D)
bn3b branch2b	(BatchNorm)
res3b branch2c	(Conv2D)
bn3b branch2c	(BatchNorm)
res3c branch2a	(Conv2D)
<del>_</del>	
bn3c_branch2a	(BatchNorm)
res3c_branch2b	(Conv2D)
bn3c branch2b	(BatchNorm)
res3c branch2c	(Conv2D)
bn3c branch2c	(BatchNorm)
res3d_branch2a	(Conv2D)
bn3d_branch2a	(BatchNorm)
res3d branch2b	(Conv2D)
bn3d branch2b	(BatchNorm)
res3d branch2c	(Conv2D)
_	,
bn3d_branch2c	(BatchNorm)
res4a_branch2a	(Conv2D)
bn4a branch2a	(BatchNorm)
res4a branch2b	(Conv2D)
bn4a branch2b	(BatchNorm)
res4a branch2c	(Conv2D)
<del>_</del>	
res4a_branch1	(Conv2D)
bn4a_branch2c	(BatchNorm)
bn4a branch1	(BatchNorm)
res4b branch2a	(Conv2D)
bn4b branch2a	(BatchNorm)
res4b branch2b	(Conv2D)
_	
bn4b_branch2b	(BatchNorm)
res4b_branch2c	(Conv2D)
bn4b branch2c	(BatchNorm)
res4c branch2a	(Conv2D)
bn4c branch2a	(BatchNorm)
res4c_branch2b	(Conv2D)
bn4c_branch2b	(BatchNorm)
res4c branch2c	(Conv2D)
bn4c branch2c	(BatchNorm)
res4d branch2a	(Conv2D)
bn4d branch2a	(BatchNorm)
_	•
res4d_branch2b	(Conv2D)
bn4d_branch2b	(BatchNorm)
res4d_branch2c	(Conv2D)
bn4d branch2c	(BatchNorm)
res4e branch2a	(Conv2D)
bn4e branch2a	(BatchNorm)
<del>_</del>	
res4e_branch2b	(Conv2D)
bn4e_branch2b	(BatchNorm)
res4e branch2c	(Conv2D)
bn4e branch2c	(BatchNorm)
res4f_branch2a	(Conv2D)
bn4f branch2a	(BatchNorm)
res4f_branch2b	(Conv2D)
bn4f_branch2b	(BatchNorm)
res4f branch2c	(Conv2D)
bn4f branch2c	(BatchNorm)
res5a branch2a	(Conv2D)
bn5a branch2a	(BatchNorm)
<del>_</del>	
res5a_branch2b	(Conv2D)
bn5a_branch2b	(BatchNorm)
res5a_branch2c	(Conv2D)
res5a branch1	(Conv2D)
bn5a_branch2c	(BatchNorm)
	, — ~ ~ ~ · · · · · · · · · · /
	(BatchNorm)
bn5a_branch1	(BatchNorm)

```
(BatchNorm)
(Conv2D)
(Conv2D)
bn5b branch2b
res5b_branch2c
bn5b branch2c
res5c_branch2a
bn5c branch2a
res5c_branch2b
bn5c branch2b
res5c_branch2c
bn5c_branch2c
fpn c5p5
fpn c4p4
                           (Conv2D)
fpn c3p3
                           (Conv2D)
                           (Conv2D)
fpn c2p2
fpn p5
                           (Conv2D)
fpn p2
                            (Conv2D)
fpn p3
                            (Conv2D)
fpn p4
                             (Conv2D)
In model: rpn model
     rpn_conv_shared
                                 (Conv2D)
     rpn_class_raw
                                 (Conv2D)
rpn_bbox_pred (Conv2D)

mrcnn_mask_conv1 (TimeDistributed)

mrcnn_mask_bn1 (TimeDistributed)

mrcnn_mask_bn2 (TimeDistributed)

mrcnn_class_conv1 (TimeDistributed)

mrcnn_class_bn1 (TimeDistributed)

mrcnn_class_bn1 (TimeDistributed)

mrcnn_mask_conv3 (TimeDistributed)

mrcnn_mask_bn3 (TimeDistributed)
                              (Conv2D)
mrcnn_mask_bn3 (TimeDistributed)
mrcnn_class_conv2 (TimeDistributed)
mrcnn_class_bn2 (TimeDistributed)
mrcnn_mask_conv4 (TimeDistributed)
mrcnn_mask_bn4 (TimeDistributed)
mrcnn_bbox_fc
mrcnn_mask_bn4
mrcnn_bbox_fc
                           (TimeDistributed)
mrcnn_mask_deconv
                           (TimeDistributed)
mrcnn_class_logits (TimeDistributed)
mrcnn_mask (TimeDistributed)
mrcnn mask
                            (TimeDistributed)
/usr/local/lib/python3.7/dist-packages/tensorflow core/python/framework/indexed slices.py
:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. Th
is may consume a large amount of memory.
   "Converting sparse IndexedSlices to a dense Tensor of unknown shape. "
/usr/local/lib/python3.7/dist-packages/tensorflow core/python/framework/indexed slices.py
:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. Th
is may consume a large amount of memory.
  "Converting sparse IndexedSlices to a dense Tensor of unknown shape. "
/usr/local/lib/python3.7/dist-packages/tensorflow core/python/framework/indexed slices.py
:424: UserWarning: Converting sparse IndexedSlices to a dense Tensor of unknown shape. Th
is may consume a large amount of memory.
   "Converting sparse IndexedSlices to a dense Tensor of unknown shape. "
/usr/local/lib/python3.7/dist-packages/keras/engine/training.py:2087: UserWarning: Using
a generator with `use multiprocessing=True` and multiple workers may duplicate your data.
Please consider using the `keras.utils.Sequence class.
  UserWarning('Using a generator with `use multiprocessing=True`'
Epoch 1/4
 629 - rpn bbox loss: 0.8659 - mrcnn class loss: 0.3819 - mrcnn bbox loss: 0.3067 - mrcnn
mask loss: 0.3418
```

/usr/local/lib/python3.7/dist-packages/keras/engine/training.py:2330: UserWarning: Using a generator with `use multiprocessing=True` and multiple workers may duplicate your data.

s: 0.0629 - rpn bbox loss: 0.8654 - mrcnn class loss: 0.3820 - mrcnn bbox loss: 0.3067 mrcnn\_mask\_loss: 0.3418 - val\_loss: 1.9717 - val\_rpn\_class\_loss: 0.0684 - val\_rpn bbox lo ss: 0.8952 - val mrcnn class loss: 0.3637 - val mrcnn bbox loss: 0.3059 - val mrcnn mask

Please consider using the `keras.utils.Sequence class.

loss: 0.3386

UserWarning('Using a generator with `use multiprocessing=True`'

res5b branch2a

res5b\_branch2b

bn5b branch2a

(Conv2D)

(BatchNorm)

```
Epoch 00001: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 2 0001-0.33859.h5
Epoch 2/4
s: 0.0642 - rpn bbox loss: 0.8859 - mrcnn class loss: 0.3788 - mrcnn bbox loss: 0.3024 -
mrcnn mask loss: 0.3387 - val loss: 1.9602 - val rpn class loss: 0.0644 - val rpn bbox lo
ss: 0.8935 - val mrcnn class loss: 0.3633 - val mrcnn bbox loss: 0.3021 - val mrcnn mask
loss: 0.3369
Epoch 00002: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 2 0002-0.33691.h5
Epoch 3/4
s: 0.0619 - rpn_bbox_loss: 0.8641 - mrcnn_class_loss: 0.3651 - mrcnn_bbox_loss: 0.2976 -
mrcnn_mask_loss: 0.3336 - val_loss: 1.9179 - val_rpn_class_loss: 0.0617 - val_rpn_bbox_lo
ss: 0.8716 - val mrcnn class loss: 0.3550 - val mrcnn bbox loss: 0.2983 - val mrcnn mask
loss: 0.3313
Epoch 00003: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel
f Case Study 2/Models/mask rcnn fashion day 2 2 0003-0.33129.h5
s: 0.0619 - rpn bbox loss: 0.9024 - mrcnn class loss: 0.3690 - mrcnn bbox loss: 0.2977 -
mrcnn mask loss: 0.3300 - val loss: 1.8629 - val rpn class loss: 0.0607 - val rpn bbox lo
ss: 0.8406 - val mrcnn class loss: 0.3460 - val mrcnn bbox loss: 0.2905 - val mrcnn mask
loss: 0.3252
```

As there is power cuts in my village area I run the code multiple times with different weights. So, final plot is just for 4 epochs but the output of the maskronn model very good.

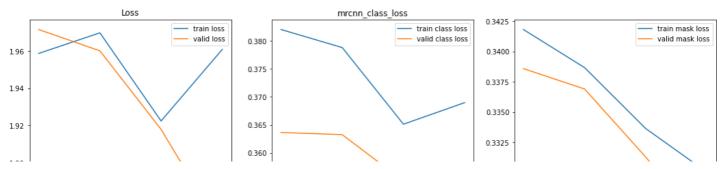
Epoch 00004: saving model to /content/drive/MyDrive/Applied AI Course/Assignments/29. Sel

f Case Study 2/Models/mask rcnn fashion day 2 2 0004-0.32516.h5

### Model neither overfit nor under.

```
In [ ]:
```

```
epochs = range(4)
plt.figure(figsize=(18, 6))
plt.subplot(131)
plt.plot(epochs, history['loss'], label="train loss")
plt.plot(epochs, history['val loss'], label="valid loss")
plt.title("Loss")
plt.legend()
plt.subplot(132)
plt.plot(epochs, history['mrcnn_class_loss'], label="train class loss")
plt.plot(epochs, history['val_mrcnn_class_loss'], label="valid class loss")
plt.title('mrcnn class loss')
plt.legend()
plt.subplot(133)
plt.plot(epochs, history['mrcnn_mask_loss'], label="train mask loss")
plt.plot(epochs, history['val mrcnn mask loss'], label="valid mask loss")
plt.legend()
plt.show()
```



```
1.90
                                                                                                                                      0.3300
                                                                  0.355
1.88
                                                                                                                                      0.3275
                                                                   0.350
                                                                                                                                      0.3250
1.86
                                                                  0.345
                                         2.0
                                                  25
                                                                                                    1.5
                                                                                                             20
                        10
                                                          3.0
                                                                                            10
                                                                                                                      25
                                                                                                                                                                                                  3.0
                                                                           0.0
                                                                                                                              3.0
```

### In [17]:

```
from google.colab import drive
drive.mount('/content/drive')
```

Mounted at /content/drive

### In [ ]:

### In [ ]:

```
for image in image list :
   img = cv2.imread(image)
   img = cv2.cvtColor(img, cv2.COLOR BGR2RGB)
   result = maskrcnn model.detect([resize image(image path)])
   roi = result[0]
   if roi['masks'].size > 0:
       masks = np.zeros((img.shape[0], img.shape[1], roi['masks'].shape[-1]), dtype=np.
uint8)
       for m in range(roi['masks'].shape[-1]):
           masks[:, :, m] = cv2.resize(roi['masks'][:, :, m].astype('uint8'),
                                        (img.shape[1], img.shape[0]), interpolation=cv2.
INTER NEAREST)
       y scale = img.shape[0]/512
       x scale = img.shape[1]/512
       rois = (roi['rois'] * [y scale, x scale, y scale, x scale]).astype(int)
   else:
       masks, rois = roi['masks'], roi['rois']
   visualize.display instances(img, rois, masks, roi['class ids'],
                                ['bg']+label names, roi['scores'],
                                title=image, figsize=(12, 12))
    # Img , region of interest, mask , roi class, roi label name, confidence score of lab
el , title and dispaly figure size
```

Output hidden; open in https://colab.research.google.com to view.