

Image Steganography on Cryptographic text using Neural Networks

MSc Research Project
Cyber Security

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1 Introduction

This configuration manual gives a thorough report on the system configurations utilized and codes information for the following three modelling phases:

“Image Steganography on Cryptographic text using Neural Networks”

2 System Configurations

This section contains the Hardware and Software specifications required to perform this research.

2.1 Hardware needs

- **OS type:** Windows 10 Home Single Language
- **Internal storage:** 1TB HDD
- **Processor:** Intel(R) Core(TM) i5-9300H CPU @ 2.40GHz 2.40 GHz
- **Installed RAM:** 8.00GB (7.84 GB usable)
- **GPU:** NVIDIA GeForce GTX 1650 4.00 GB

2.2 Software Requirement

- **Anaconda Environment-Jupyter Notebook:** An open-source platform supplied by the firm Anaconda enables the installation and implementation of several applications such as the Jupyter Notebook and Python spyder, R-Studio R programming and so on. The Jupyter Notebook is used for this research study to carry out the Python programming and machine learning activities.
- **Virtual Studios:** Microsoft's source code editor for Windows, Linux and MacOS is Visual Studio Code. Features include debugging support, syntax highlighting, smart code completion, snippets, and embedded Git.
- **Python Programming Language:** Python is installed in the system and a Global Environment is created to perform Deep Learning tasks and other parts of the proposed research using the Jupyter Notebook. Python version in use is version 3.8.8.

3 Research Project Advancement

The proposed research project is implemented with the help of above-mentioned Design Requirements. This research is divided into four phases first is to perform AES encryption over a text message, second part was data pre-processing of image dataset to make it useful for further parts of experiment, third part is to hide the AES encrypted message inside an image, and the last part involves designing a neural network to perform multi-image steganography.

3.1 Data Pre-processing

The database used for the proposed research is an image dataset is a collection of google images of arts, culture, places and food images. All the images were scattered across many different folders. The Data pre-processing includes collecting all the images in one folder. Dividing the main dataset in two parts Cover and secret images. Creating train and validation datasets and also resizing and making all images in equal shapes. Below is the implementation of data pre-processing:

```
File Edit Selection View Go Run Terminal Help create_folder.py - Visual Studio Code
create_folder.py X dataset_create.py file_rename.py aes_enc.py
D: > Research_Project > final_programs > create_folder.py > ...
1 import os
2
3 path='D:\\Research_Project\\Programs'
4 os.chdir(path)
5 Newfolder='Image_dataset'
6 os.makedirs(Newfolder)
```

Python 3.9.6 64-bit 0 0 0 Ln 1, Col 1 Spaces: 4 UTF-8 CRLF Python

Figure 1 Creating new folder for dataset

```
File Edit Selection View Go Run Terminal Help dataset_create.py - Visual Studio Code
create_folder.py X dataset_create.py X file_rename.py aes_enc.py
D: > Research_Project > final_programs > dataset_create.py > ...
1 import os
2
3 source_folder= r'D:\\Research_Project\\Programs\\Google_Images_dataset'
4 target_folder= r'D:\\Research_Project\\Programs\\Image_dataset\\'
5
6 for path, dir, files in os.walk(source_folder):
7     if files:
8         for file in files:
9             if not os.path.isfile(target_folder + file):
10                os.rename(path + '\\' + file, target_folder + file)
11
12
```

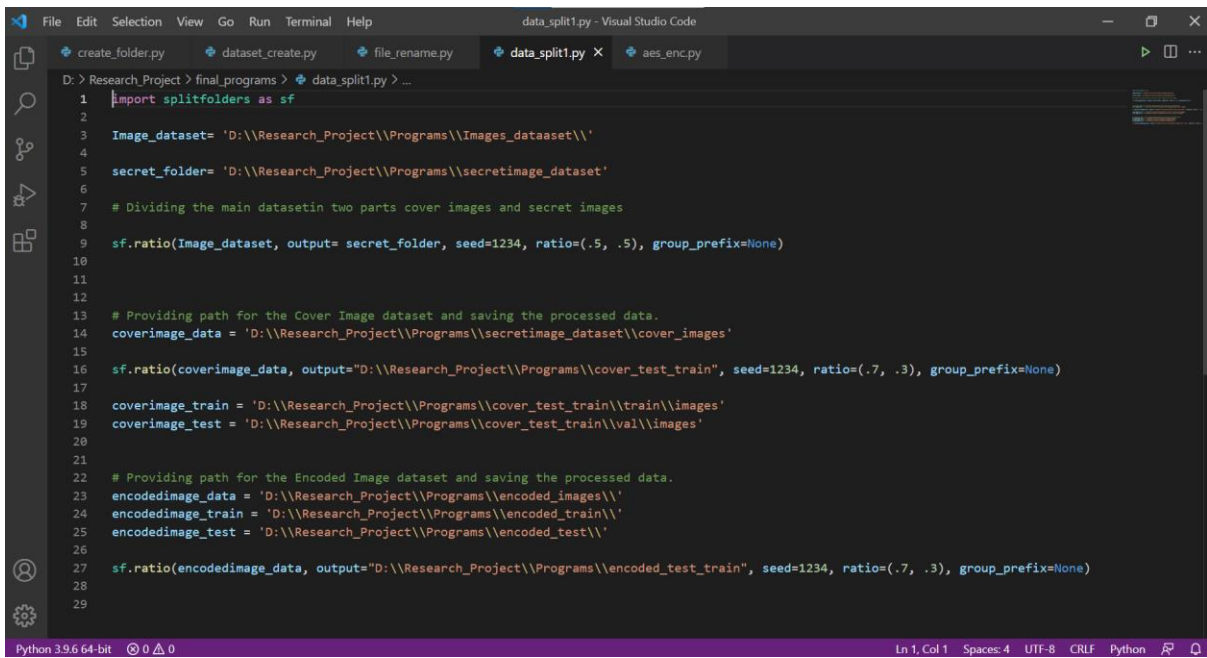
Python 3.9.6 64-bit 0 0 0 Ln 1, Col 10 Spaces: 4 UTF-8 CRLF Python

Figure 2 Collecting all the images in one folder.

```
File Edit Selection View Go Run Terminal Help file_rename.py - Visual Studio Code
create_folder.py dataset_create.py X file_rename.py X aes_enc.py
D: > Research_Project > final_programs > file_rename.py > ...
1 import os
2
3 target_folder= r'D:\\Research_Project\\Programs\\Image_dataset\\'
4 fileNumber = 00
5
6 for filename in os.listdir(target_folder):
7     os.rename(target_folder + '\\' + filename, target_folder + '\\' + "Image_" + str(fileNumber) + '.jpeg' )
8     fileNumber +=1
9
```

Python 3.9.6 64-bit 0 0 0 Ln 1, Col 1 Spaces: 4 UTF-8 CRLF Python

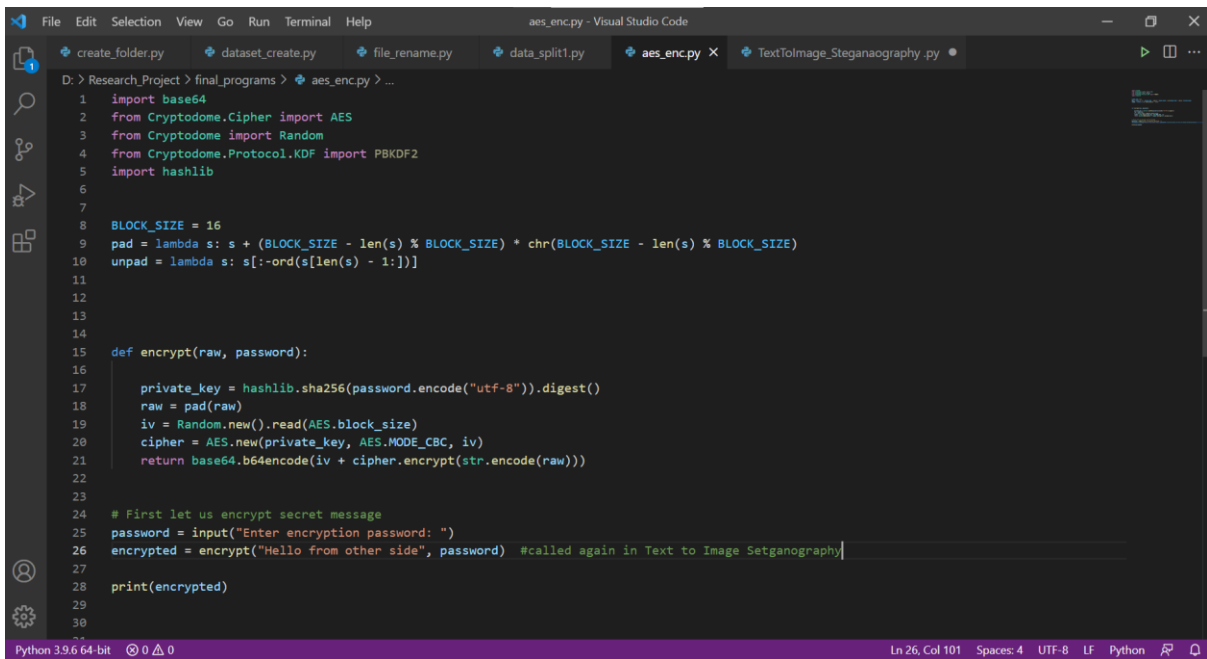
Figure 3 Renaming all images



```
File Edit Selection View Go Run Terminal Help
data_split1.py - Visual Studio Code
create_folder.py dataset_create.py file_rename.py data_split1.py aes_enc.py
D:\Research_Project > final_programs > data_split1.py > ...
1 import splitfolders as sf
2
3 Image_dataset= 'D:\\Research_Project\\Programs\\Images_dataset\\'
4
5 secret_folder= 'D:\\Research_Project\\Programs\\secretimage_dataset'
6
7 # Dividing the main dataset in two parts cover images and secret images
8
9 sf.ratio(Image_dataset, output= secret_folder, seed=1234, ratio=(.5, .5), group_prefix=None)
10
11
12
13 # Providing path for the Cover Image dataset and saving the processed data.
14 coverimage_data = 'D:\\Research_Project\\Programs\\secretimage_dataset\\cover_images'
15
16 sf.ratio(coverimage_data, output="D:\\Research_Project\\Programs\\cover_test_train", seed=1234, ratio=(.7, .3), group_prefix=None)
17
18 coverimage_train = 'D:\\Research_Project\\Programs\\cover_test_train\\train\\images'
19 coverimage_test = 'D:\\Research_Project\\Programs\\cover_test_train\\val\\images'
20
21
22 # Providing path for the Encoded Image dataset and saving the processed data.
23 encodedimage_data = 'D:\\Research_Project\\Programs\\encoded_images\\'
24 encodedimage_train = 'D:\\Research_Project\\Programs\\encoded_train\\'
25 encodedimage_test = 'D:\\Research_Project\\Programs\\encoded_test\\'
26
27 sf.ratio(encodedimage_data, output="D:\\Research_Project\\Programs\\encoded_test_train", seed=1234, ratio=(.7, .3), group_prefix=None)
28
29
Python 3.9.6 64-bit 0 0 0 Ln 1, Col 1 Spaces: 4 UTF-8 CRLF Python
```

Figure 4: Splitting dataset in Cover and Secret

This is the second step of execution of the proposed experiment.



```
File Edit Selection View Go Run Terminal Help
aes_enc.py - Visual Studio Code
create_folder.py dataset_create.py file_rename.py data_split1.py aes_enc.py TextToImageSteganography.py
D:\Research_Project > final_programs > aes_enc.py > ...
1 import base64
2 from Cryptodome.Cipher import AES
3 from Cryptodome import Random
4 from Cryptodome.Protocol.KDF import PBKDF2
5 import hashlib
6
7
8 BLOCK_SIZE = 16
9 pad = lambda s: s + (BLOCK_SIZE - len(s) % BLOCK_SIZE) * chr(BLOCK_SIZE - len(s) % BLOCK_SIZE)
10 unpad = lambda s: s[:-ord(s[len(s) - 1:])]
11
12
13
14
15 def encrypt(raw, password):
16
17     private_key = hashlib.sha256(password.encode("utf-8")).digest()
18     raw = pad(raw)
19     iv = Random.new().read(AES.block_size)
20     cipher = AES.new(private_key, AES.MODE_CBC, iv)
21     return base64.b64encode(iv + cipher.encrypt(str.encode(raw)))
22
23
24 # First let us encrypt secret message
25 password = input("Enter encryption password: ")
26 encrypted = encrypt("Hello from other side", password) #called again in Text to Image Setganography
27
28 print(encrypted)
29
30
Python 3.9.6 64-bit 0 0 0 Ln 26, Col 101 Spaces: 4 UTF-8 LF Python
```

Figure 5: AES Encryption using PKDF2

After the encryption is completed, the encrypted text generated by AES is hidden inside images using Text to Image steganography.

```
File Edit Selection View Go Run Terminal Help TextToImage_Steganaography.py - Visual Studio Code
create_folder.py dataset_create.py file_rename.py data_split1.py aes_enc.py TextToImage_Steganaography.py x
D:\Research_Project > final_programs > TextToImage_Steganaography.py > encode
2 from PIL import Image
3 import pathlib
4 from aes_enc import encrypted
5 import os
6
7
8 # Convert encoding data into 8-bit binary
9 # form using ASCII value of characters
10 def genData(data):
11     # list of binary codes
12     # of given data
13     newd = []
14
15     for i in data:
16         newd.append(format(ord(i), '08b'))
17     return newd
18
19
20 # Pixels are modified according to the
21 # 8-bit binary data and finally returned
22 def modPix(pix, data):
23
24     datalist = genData(data)
25     lendata = len(datalist)
26     imdata = iter(pix)
27
28     for i in range(lendata):
29
30         # Extracting 3 pixels at a time
31         pix = [value for value in imdata.__next__():3] +
```

```
File Edit Selection View Go Run Terminal Help TextToImage_Steganaography.py - Visual Studio Code
create_folder.py dataset_create.py file_rename.py data_split1.py aes_enc.py TextToImage_Steganaography.py x
D:\Research_Project > final_programs > TextToImage_Steganaography.py > encode
28     for i in range(lendata):
29
30         # Extracting 3 pixels at a time
31         pix = [value for value in imdata.__next__():3] +
32               imdata.__next__():3] +
33               imdata.__next__():3]
34
35         # Pixel value should be made
36         # odd for 1 and even for 0
37         for j in range(0, 8):
38             if (datalist[i][j] == '0' and pix[j] % 2 != 0):
39                 pix[j] -= 1
40
41             elif (datalist[i][j] == '1' and pix[j] % 2 == 0):
42                 if (pix[j] != 0):
43                     pix[j] -= 1
44                 else:
45                     pix[j] += 1
46                 # pix[j] -= 1
47
48         # Eighth pixel of every set tells
49         # whether to stop or read further.
50         # 0 means keep reading; 1 means the
51         # message is over.
52         if (i == lendata - 1):
53             if (pix[-1] % 2 == 0):
54                 if (pix[-1] != 0):
55                     pix[-1] -= 1
56                 else:
57                     pix[-1] += 1
```

```
File Edit Selection View Go Run Terminal Help TextToImage_Steganaography.py - Visual Studio Code
create_folder.py dataset_create.py file_rename.py data_split1.py aes_enc.py TextToImage_Steganaography.py x
D:\Research_Project > final_programs > TextToImage_Steganaography.py > encode
68 def encode_enc(newimg, data):
69     w = newimg.size[0]
70     (x, y) = (0, 0)
71
72     for pixel in modPix(newimg.getdata(), data):
73
74         # Putting modified pixels in the new image
75         newimg.putpixel((x, y), pixel)
76         if (x == w - 1):
77             x = 0
78             y += 1
79         else:
80             x += 1
81
82     #files listing
83     files=[]
84     for filepath in pathlib.Path("D:\\Research_Project\\Programs\\Image_dataset").glob('**/*'):
85         files.append(filepath.absolute())
86
87
88 # Encode data into image
89 def encode():
90     for img in FileDescriptor:
91         image = Image.open(img, 'r')
92
93         data = input("encrypted") #output from AES
94         if (len(data) == 0):
95             raise ValueError("Data is empty")
96
97         newimg = image.copy()
```

```

File Edit Selection View Go Run Terminal Help TextToImage_Steganaography.py - Visual Studio Code
create_folder.py dataset_create.py file_rename.py data_split1.py aes_enc.py TextToImage_Steganaography.py x
D:\Research_Project>final_programs>TextToImage_Steganaography.py>encode
98 encode_enc(newimg, data)
99
100 #file path into basedir & filename
101 basename = os.path.basename(img)
102 filename = os.path.filename(img)
103 absolute_filename = basename+filename
104 newbasename = "D:\\Research_Project\\Programs\\Secret_Image_dataset"
105 newfilename = newbasename + filename
106 #new_img_name = input("Enter the name of new image(with extension) : ") #change name to secretimage_**
107 newimg.save(newfilename, str(newbasename.split(".")[1].upper()))
108
109
110
111 # Main Function
112 def main():
113     a = int(input(":: Welcome to Steganography ::\n" #change message
114                 "1. Encode\n2. Decode\n"))
115     if (a == 1):
116         encode()
117     else:
118         raise Exception("Enter correct input")
119
120 # Driver Code
121 if __name__ == '__main__':
122
123     # Calling main function
124     main()

```

The last part of the code is to design Convolution Neural network with three networks Prep network, hiding network and Reveal network. This neural network focuses on encrypting the image output received after the text to image steganography. Neural network was designed in Jupyter Notebook.

```

jupyter Neural_network Last Checkpoint: 2 minutes ago (autosaved)
File Edit View Insert Cell Kernel Widgets Help Not Trusted Python 3
In [ ]: import splitfolders as sf
import tensorflow as tf
from tensorflow import keras
from tensorflow.keras.callbacks import ModelCheckpoint, LearningRateScheduler, TensorBoard
#from keras.engine.topology import Container
# from tensorflow.keras.engine.network import Network
from tensorflow.keras.layers import *
from tensorflow.keras import backend
from tensorflow.keras.models import Model
from tensorflow.keras.preprocessing import image
import tensorflow.keras.backend as K

import matplotlib.pyplot as plt

import numpy as np
import os
import random
import scipy.misc
from tqdm import tqdm

In [ ]: #Data Pre-Processing for Neural Network

# Providing path for the Cover Image dataset and saving the processed data.
coverimage_data = 'D:\\Research_Project\\Programs\\secretimage_dataset\\cover_images'

sf.ratio(coverimage_data, output="D:\\Research_Project\\Programs\\cover_test_train", seed=1234, ratio=(.7, .3), group_prefix=None)

coverimage_train = 'D:\\Research_Project\\Programs\\cover_test_train\\train\\images'
coverimage_test = 'D:\\Research_Project\\Programs\\cover_test_train\\val\\images'

# Providing path for the Encoded Image dataset and saving the processed data

```

Figure 6: import all libraries

```

In [ ]: #Data Pre-Processing for Neural Network

# Providing path for the Cover Image dataset and saving the processed data.
coverimage_data = 'D:\\Research_Project\\Programs\\secretimage_dataset\\cover_images'

sf.ratio(coverimage_data, output="D:\\Research_Project\\Programs\\cover_test_train", seed=1234, ratio=(.7, .3), group_prefix=None)

coverimage_train = 'D:\\Research_Project\\Programs\\cover_test_train\\train\\images'
coverimage_test = 'D:\\Research_Project\\Programs\\cover_test_train\\val\\images'

# Providing path for the Encoded Image dataset and saving the processed data.
encodedimage_data = 'D:\\Research_Project\\Programs\\encoded_images\\'
encodedimage_train = 'D:\\Research_Project\\Programs\\encoded_train\\'
encodedimage_test = 'D:\\Research_Project\\Programs\\encoded_test\\'

sf.ratio(encodedimage_data, output="D:\\Research_Project\\Programs\\encoded_test_train", seed=1234, ratio=(.7, .3), group_prefix=None)

DATA_DIR = "D:\\Research_Project\\Programs\\Image_dataset\\"
TRAIN_DIR = os.path.join(DATA_DIR, "train")
TEST_DIR = os.path.join(DATA_DIR, "test")

IMG_SHAPE = (64, 64)

In [ ]: #Part of Pre-processing

In [ ]: def load_dataset_small(num_images_per_class_train=10, num_images_test=500):
    """Loads training and test datasets, from Tiny ImageNet Visual Recognition Challenge.

    Arguments:

```

Figure 7: Data Pre-processing (part1)

```

In [ ]: #Part of Pre-processing

In [ ]: def load_dataset_small(num_images_per_class_train=10, num_images_test=500):
    """Loads training and test datasets, from Tiny ImageNet Visual Recognition Challenge.

    Arguments:
        num_images_per_class_train: number of images per class to load into training dataset.
        num_images_test: total number of images to load into training dataset.
    """
    X_train = []
    X_test = []

    # Create training set.
    for c in os.listdir(TRAIN_DIR):
        c_dir = os.path.join(TRAIN_DIR, c, 'images')
        c_imgs = os.listdir(c_dir)
        random.shuffle(c_imgs)
        for img_name_i in c_imgs[0:num_images_per_class_train]:
            img_i = image.load_img(os.path.join(c_dir, img_name_i))
            x = image.img_to_array(img_i)
            X_train.append(x)
        random.shuffle(X_train)

    # Create test set.
    test_dir = os.path.join(TEST_DIR, 'images')
    test_imgs = os.listdir(test_dir)
    random.shuffle(test_imgs)
    for img_name_i in test_imgs[0:num_images_test]:
        img_i = image.load_img(os.path.join(test_dir, img_name_i))
        x = image.img_to_array(img_i)
        X_test.append(x)

    # Return train and test data as numpy arrays.
    return np.array(X_train), np.array(X_test)

```

Figure 8: Data Pre-processing part 2

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```

# Loss for the full model, used for preparation and hiding networks
def full_loss(y_true, y_pred):
    # Loss for the full model is: |C-C'| + beta * |S-S'|
    s_true, c_true = y_true[...,0:3], y_true[...,3:6]
    s_pred, c_pred = y_pred[...,0:3], y_pred[...,3:6]

    s_loss = rev_loss(s_true, s_pred)
    c_loss = K.sum(K.square(c_true - c_pred))

    return s_loss + c_loss

def make_encoder(input_size):
    input_S = Input(shape=(input_size))
    input_C = Input(shape=(input_size))

    # Preparation Network
    x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_prep0_3x3')(input_S)
    x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_prep0_4x4')(input_S)
    x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_prep0_5x5')(input_S)
    x = concatenate([x3, x4, x5])

    x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_prep1_3x3')(x)
    x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_prep1_4x4')(x)
    x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_prep1_5x5')(x)
    x = concatenate([x3, x4, x5])

    x = concatenate([input_C, x])

    # Hiding network
    x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_hid0_3x3')(x)
    x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_hid0_4x4')(x)
    x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_hid0_5x5')(x)
    x = concatenate([x3, x4, x5])

```

Figure 9: Initialize losses and Prep network

Jupyter Neural_network Last Checkpoint: 9 minutes ago (autosaved)

```

# Hiding network
x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_hid0_3x3')(x)
x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_hid0_4x4')(x)
x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_hid0_5x5')(x)
x = concatenate([x3, x4, x5])

x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_hid1_3x3')(x)
x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_hid1_4x4')(x)
x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_hid1_5x5')(x)
x = concatenate([x3, x4, x5])

x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_hid2_3x3')(x)
x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_hid2_4x4')(x)
x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_hid2_5x5')(x)
x = concatenate([x3, x4, x5])

x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_hid3_3x3')(x)
x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_hid3_4x4')(x)
x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_hid3_5x5')(x)
x = concatenate([x3, x4, x5])

x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_hid4_3x3')(x)
x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_hid4_4x4')(x)
x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_hid5_5x5')(x)
x = concatenate([x3, x4, x5])

output_Cprime = Conv2D(3, (3, 3), strides = (1, 1), padding='same', activation='relu', name='output_C')(x)

return Model(inputs=[input_S, input_C],
              outputs=output_Cprime,
              name = 'Encoder')

# Returns the decoder as a Keras model, composed by the Reveal Network
def make_decoder(input_size, fixed=False):
    # Reveal network

```

Figure 10: Initializing Hiding network

jupyter Neural_network Last Checkpoint: 9 minutes ago (autosaved) Logout

File Edit View Insert Cell Kernel Widgets Help Not Trusted Python 3

```

# Returns the decoder as a Keras model, composed by the Reveal Network
def make_decoder(input_size, fixed=False):

    # Reveal network
    reveal_input = Input(shape=(input_size))

    # Adding Gaussian noise with 0.01 standard deviation.
    input_with_noise = GaussianNoise(0.01, name='output_C_noise')(reveal_input)

    x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_rev0_3x3')(input_with_noise)
    x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_rev0_4x4')(input_with_noise)
    x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_rev0_5x5')(input_with_noise)
    x = concatenate([x3, x4, x5])

    x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_rev1_3x3')(x)
    x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_rev1_4x4')(x)
    x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_rev1_5x5')(x)
    x = concatenate([x3, x4, x5])

    x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_rev2_3x3')(x)
    x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_rev2_4x4')(x)
    x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_rev2_5x5')(x)
    x = concatenate([x3, x4, x5])

    x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_rev3_3x3')(x)
    x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_rev3_4x4')(x)
    x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_rev3_5x5')(x)
    x = concatenate([x3, x4, x5])

    x3 = Conv2D(50, (3, 3), strides = (1, 1), padding='same', activation='relu', name='conv_rev4_3x3')(x)
    x4 = Conv2D(10, (4, 4), strides = (1, 1), padding='same', activation='relu', name='conv_rev4_4x4')(x)
    x5 = Conv2D(5, (5, 5), strides = (1, 1), padding='same', activation='relu', name='conv_rev5_5x5')(x)
    x = concatenate([x3, x4, x5])

    output_Sprime = Conv2D(3, (3, 3), strides = (1, 1), padding='same', activation='relu', name='output_S')(x)

```

Figure 11: Reveal network initialized

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```

decoder = make_decoder(input_size)
decoder.compile(optimizer='adam', loss=rev_loss)
decoder.trainable = False

output_Cprime = encoder([input_S, input_C])
output_Sprime = decoder(output_Cprime)

autoencoder = Model(inputs=[input_S, input_C],
                    outputs=concatenate([output_Sprime, output_Cprime]))
autoencoder.compile(optimizer='adam', loss=full_loss)

return encoder, decoder, autoencoder

```

```

In [ ]: import wandb
wandb.init(project='stenography')
sweep_config = {
    'method': 'random', #grid, random
    'metric': {
        'name': 'rev_loss',
        'goal': 'minimize'
    },
    'parameters': {
        'lr':{
            'values':[0.001]
        },
        'activation':{
            'values':['relu']
        }
    }
}

sweep_id = wandb.sweep(sweep_config)

```

Figure 12: Initializing hyper-parameters

```

if SHOW_DIFF:
    diff_c = np.multiply(diff_C[idx], ENHANCE)
    show_image(diff_c, n, n_col, i * n_col + 5, gray=SHOW_GRAY, first_row=i==0, title='Diff Cover')
    diff_cc.append(diff_c)
    #wandb.log({"Diff Cover":wandb.Image(diff_c[idx])})

    diff_s = np.multiply(diff_S[idx], ENHANCE)
    show_image(diff_s, n, n_col, i * n_col + 6, gray=SHOW_GRAY, first_row=i==0, title='Diff Secret')
    diff_ss.append(diff_s)
    #wandb.log({"Diff Secret":wandb.Image(diff_S[idx])})

# Now we can save it to a numpy array.
plt.savefig('output.png')

plt.show()
wandb.log({"Output":wandb.Image('output.png')})

plt.plot(loss_history)
plt.title('Model loss')
plt.ylabel('Loss')
plt.xlabel('Epoch')
plt.show()

```

Figure 13: Making final plots