Real vs. Fake Faces - MDST Fall 2023

April 19, 2025

1 Basic Dataset Starter

This notebook contains very basic starter code for loading the real vs fake faces dataset from file and working with it. You can borrow from this to: - start training new models (for the transfer learning and custom architecture subteams) - analyze and look into the dataset plus implement data augmentation

1.1 Download the data from Kaggle

```
[1]: | rm -rf real_and_fake_face real_and_fake_face_detection processed
```

```
[3]: from google.colab import drive
     from subprocess import Popen, PIPE
     # makes files from your drive accessible
     drive.mount('/content/drive', force_remount=True)
     # TODO - specify path to your API key via google drive
     #api_key_filepath = "/content/drive/MyDrive/ColabNotebooks/kaqqle.json"
     api_key_filepath = "/content/drive/MyDrive/MDST/RvF/kaggle.json"
     # Kaggle API Key setup ----
     cmd = "mkdir /root/.kaggle"
     process = Popen(cmd.split(), stdout=PIPE, stderr=PIPE)
     stdout, stderr = process.communicate()
     print(stdout.decode("utf-8"), stderr.decode("utf-8"))
     cmd = f"cp -f {api_key_filepath} /root/.kaggle/"
     process = Popen(cmd.split(), stdout=PIPE, stderr=PIPE)
     stdout, stderr = process.communicate()
     print(stdout.decode("utf-8"), stderr.decode("utf-8"))
     cmd = f"chmod 600 /root/.kaggle/kaggle.json"
     process = Popen(cmd.split(), stdout=PIPE, stderr=PIPE)
     print(stdout.decode("utf-8"), stderr.decode("utf-8"))
     !kaggle datasets download -d ciplab/real-and-fake-face-detection
     !unzip -q real-and-fake-face-detection.zip
```

Mounted at /content/drive mkdir: cannot create directory '/root/.kaggle': File exists

```
Downloading real-and-fake-face-detection.zip to /content 100% 431M/431M [00:21<00:00, 22.7MB/s] 100% 431M/431M [00:21<00:00, 21.0MB/s]
```

2 Setup PyTorch Data Loading

The code in the next cell can be copied into your notebook to load the downloaded data correctly. It does two things: - processes the dataset into a train and test set - creates data loaders for the training and testing data

Don't worry about the details, but if you're on the dataset team, you'll want to read carefully through this part to understand how the code works (since you'll be editing this to make your own version of the dataset!)

```
[64]: from imageio.v3 import imread
      import pandas as pd
      from pathlib import Path
      from random import random
      from shutil import copy
      import torch
      from torch.utils.data import Dataset, DataLoader
      from torchvision.transforms import functional
      from torchvision import transforms
      class RealAndFakeFaceProcessor:
          def __init__(self, directory, train_test_split = 0.7) -> None:
              self.train_test_split = train_test_split
              self.train_index = 0
              self.test_index = 0
              self.src_directory = Path(directory)
              self.directory = self.src_directory.parent / "processed"
              self.tgt train = self.directory / "train"
              self.tgt_train.mkdir(parents=True, exist_ok=True)
              self.tgt_test = self.directory / "test"
              self.tgt_test.mkdir(parents=True, exist_ok=True)
              self.index_by_type = {"index":[], "partition": [], "type": [], "label": []
       []}
              self._process("training_fake","easy")
              self.__process("training_fake","mid")
              self.__process("training_fake","hard")
```

```
self.__process("training_real","real")
        df = pd.DataFrame(self.index_by_type)
        df.to_csv(self.directory / "images.csv", index=False)
   def __add_image_to_record(self, index: int, partition: str, type: str,_u
 →label: int):
        """Real - label is 1, Fake - label is 0"""
        self.index_by_type["index"].append(index)
        self.index_by_type["partition"].append(partition)
        self.index_by_type["type"].append(type)
        self.index_by_type["label"].append(label)
   def __process(self, subdir: str, type: str) -> None:
       src = self.src_directory / subdir
       label = 1 if type == "real" else 0
       for image in src.iterdir():
            if image.name.startswith(type):
                random number = random()
                if random() > self.train_test_split:
                    copy(image.absolute(), self.tgt_test / f"{self.test_index}.
 →png")
                    self._add_image_to_record(self.test_index, "test", type,__
 →label)
                    self.test_index += 1
                else:
                    copy(image.absolute(), self.tgt_train / f"{self.
 →train_index}.png")
                    self.__add_image_to_record(self.train_index, "train", type,_
 →label)
                    self.train index += 1
class RealAndFakeFaceDataset(Dataset):
   def __init__(
        self,
       directory: str,
       partition: str ="train"
   ) -> 'RealAndFakeFaceDataset':
        self.partition = partition
        if partition not in ("train", "test"):
            raise ValueError(f"Invalid partition specified - {partition}")
       self.directory = Path(directory)
        self.img_directory = self.directory / partition
       metadata = pd.read_csv(self.directory / "images.csv")
```

```
self.metadata = metadata[metadata["partition"] == self.partition]
   def __len__(self) -> int:
        return len(self.metadata)
   def __getitem__(self, index: int) -> tuple[torch.tensor, int]:
        filename = self.img_directory / f"{index}.png"
        label = self.metadata.iloc[index]["label"]
        image = torch.from_numpy(imread(filename))
        image = image.to(torch.float32)
        image = image.permute((2,0,1))
        image = functional.resize(image, (224, 224), antialias=True)
        image /= 255.0
        image_mean = [.485, .456, .406]
        image_std = [.229, .224, .225]
       preprocess = transforms.Compose([
            transforms.Normalize(mean = image_mean, std = image_std),
            transforms.RandomCrop((200,200)),
            transforms.RandomRotation((-15,15), expand=False),
            transforms.ColorJitter(brightness=0.5, contrast=0.5, saturation=0.
 45, hue=0.5)
       1)
        image = preprocess(image)
       return image, label
   def get_type(self, index) -> str:
        return self.metadata.iloc[index]["type"]
processor = RealAndFakeFaceProcessor("real_and_fake_face") # Call this to_
 ⇔process the dataset into a train and test set
train = RealAndFakeFaceDataset("processed", "train")
test = RealAndFakeFaceDataset("processed", "test")
train_loader = DataLoader(train, batch_size = 32, shuffle=True)
test_loader = DataLoader(test, batch_size = 32)
```

3 Example Usage - Looking at Images

```
[53]: from matplotlib import pyplot as plt

# getting the first image in the training set index = 0
```

WARNING:matplotlib.image:Clipping input data to the valid range for imshow with RGB data ([0..1] for floats or [0..255] for integers).

Image 0 in the training set has type easy and is fake

[53]: <matplotlib.image.AxesImage at 0x79c2293656c0>

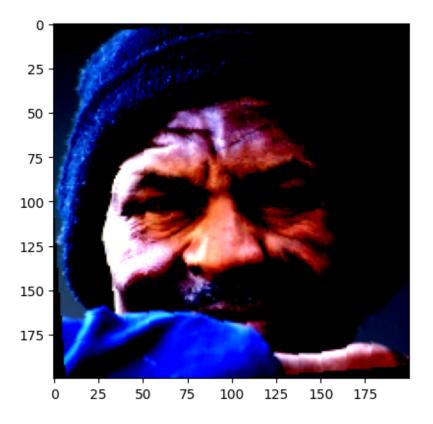
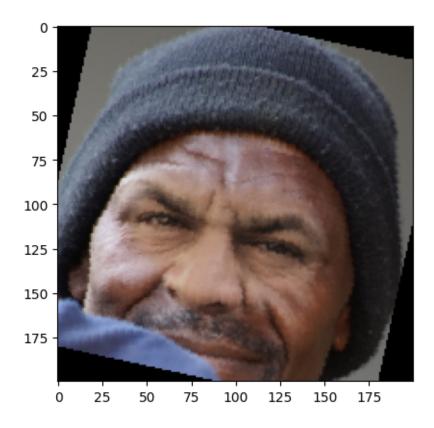


Image 0 in the testing set has type easy and is fake

[51]: <matplotlib.image.AxesImage at 0x79c2294fb9d0>



4 Example Usage - training a basic PyTorch model

```
[]: from tqdm import tqdm
     import torch
     class Net(torch.nn.Module):
         def __init__(self):
             super(Net, self).__init__()
             self.conv1 = torch.nn.Conv2d(3, 32, kernel_size = 3, padding = "same")
             self.conv2 = torch.nn.Conv2d(32, 64, kernel_size = 3, stride = 1,
      →padding = "same")
             self.conv3 = torch.nn.Conv2d(64, 128, kernel_size = 3, stride = 1,__
      →padding = "same")
             self.conv4 = torch.nn.Conv2d(128 ,128, kernel_size = 3, stride = 1,__
      →padding = "same")
             self.conv5 = torch.nn.Conv2d(128, 256, kernel_size = 3, stride = 1, __
      →padding = "same")
             self.conv6 = torch.nn.Conv2d(256, 256, kernel_size = 3, stride = 1,
      →padding = "same")
             self.dense1 = torch.nn.Linear(2304, 768)
```

```
self.dense2 = torch.nn.Linear(768, 384)
    self.dense3 = torch.nn.Linear(384, 2)
    self.norm_layer1 = nn.BatchNorm2d(32)
    self.norm_layer2 = nn.BatchNorm2d(64)
    self.norm_layer3 = nn.BatchNorm2d(128)
    self.norm_layer4 = nn.BatchNorm2d(128)
    self.norm layer5 = nn.BatchNorm2d(256)
    self.norm_layer6 = nn.BatchNorm2d(256)
    self.dropout1 = nn.Dropout(0.2)
    self.dropout2 = nn.Dropout(0.3)
    self.pool = torch.nn.MaxPool2d(2,2)
    self.activation = torch.nn.ReLU()
    self.flatten = torch.nn.Flatten()
    self.init_weight()
def init_weight(self):
   conv = [self.conv1, self.conv2, self.conv3, self.conv4, self.conv5]
    dense = [self.dense1, self.dense2]
    for layer in conv:
        torch.nn.init.kaiming_normal_(layer.weight, nonlinearity='relu')
        torch.nn.init.zeros_(layer.bias)
    for layer in dense:
        torch.nn.init.kaiming_normal_(layer.weight, nonlinearity='relu')
        torch.nn.init.zeros_(layer.bias)
def forward(self, x):
    x = self.pool(self.activation(self.norm layer1(self.conv1(x))))
   x = self.pool(self.activation(self.norm layer2(self.conv2(x))))
    x = self.pool(self.activation(self.norm_layer3(self.conv3(x))))
   x = self.pool(self.activation(self.norm layer4(self.conv4(x))))
   x = self.pool(self.activation(self.norm_layer5(self.conv5(x))))
    x = self.dropout1(x)
   x = self.pool(self.activation(self.norm_layer6(self.conv6(x))))
   x = self.dropout2(x)
   x = self.flatten(x)
    x = self.activation(self.dense1(x))
    x = self.activation(self.dense2(x))
   return self.dense3(x)
```

```
[65]: from tqdm import tqdm
import torch

class Net2(torch.nn.Module):
    def __init__(self):
        super(Net2, self).__init__()
        self.conv1 = torch.nn.Conv2d(3, 32, kernel_size = 3, padding = "same")
        self.conv2 = torch.nn.Conv2d(32, 64, kernel_size = 3, stride = 1,__
padding = "same")
```

```
self.conv3 = torch.nn.Conv2d(64, 128, kernel_size = 3, stride = 1,__
→padding = "same")
      self.conv4 = torch.nn.Conv2d(128 ,128, kernel_size = 3, stride = 1,
→padding = "same")
      self.conv5 = torch.nn.Conv2d(128, 256, kernel_size = 3, stride = 1, ___
→padding = "same")
      self.conv6 = torch.nn.Conv2d(256, 256, kernel_size = 3, stride = 1,
→padding = "same")
      self.norm_layer1 = torch.nn.BatchNorm2d(32)
      self.norm_layer2 = torch.nn.BatchNorm2d(64)
      self.norm_layer3 = torch.nn.BatchNorm2d(128)
      self.norm_layer4 = torch.nn.BatchNorm2d(128)
      self.norm_layer5 = torch.nn.BatchNorm2d(256)
      self.norm_layer6 = torch.nn.BatchNorm2d(256)
      self.dropout1 = torch.nn.Dropout(0.2)
      self.dropout2 = torch.nn.Dropout(0.3)
      self.pool = torch.nn.MaxPool2d(2,2)
      self.activation = torch.nn.ReLU()
      self.flatten = torch.nn.Flatten()
      self.dropout2d = torch.nn.Dropout2d(0.6)
      # linear layers
      self.dense1_v2 = torch.nn.Linear(2304, 200)
      self.dense2_v2 = torch.nn.Linear(200, 100)
      self.dense3_v2 = torch.nn.Linear(100, 2)
      self.dropout3_v2 = torch.nn.Dropout(0.5)
      self.init_weight()
  def init_weight(self):
      conv = [self.conv1, self.conv2, self.conv3, self.conv4, self.conv5]
      dense = [self.dense1_v2, self.dense2_v2, self.dense3_v2]#, self.
\hookrightarrow dense4_v2, self.dense5_v2]
      for layer in conv:
          torch.nn.init.kaiming_normal_(layer.weight, nonlinearity='relu')
          torch.nn.init.zeros_(layer.bias)
      for layer in dense:
          torch.nn.init.kaiming normal_(layer.weight, nonlinearity='relu')
          torch.nn.init.zeros_(layer.bias)
  def forward(self, x):
      x = self.pool(self.activation(self.norm_layer1(self.conv1(x))))
      x = self.dropout2d(x)
      x = self.pool(self.activation(self.norm_layer2(self.conv2(x))))
      x = self.dropout2d(x)
      x = self.pool(self.activation(self.norm_layer3(self.conv3(x))))
      x = self.dropout2d(x)
      x = self.pool(self.activation(self.norm_layer4(self.conv4(x))))
      x = self.dropout2d(x)
```

```
x = self.pool(self.activation(self.norm_layer5(self.conv5(x))))
              x = self.dropout1(x)
              x = self.pool(self.activation(self.norm_layer6(self.conv6(x))))
              x = self.dropout2(x)
              x = self.flatten(x)
              #self.dropout3_v2 = torch.nn.Dropout(0.5)
              x = self.activation(self.dense1_v2(x))
              x = self.dropout3_v2(x)
              x = self.activation(self.dense2_v2(x))
              x = self.dropout3_v2(x)
              return self.dense3_v2(x)
 []:
 [6]: from typing import Callable
      from torch import nn
      from torch.utils.data import DataLoader
      def evaluate(model: nn.Module, criterion: Callable, loader: DataLoader, u

device='cuda') → tuple[float]:

          with torch.no_grad():
              correct, total = 0.0
              loss = 0.0
              for i, (X, y) in enumerate(loader):
                  outputs = model(X.to(device)).to('cpu')
                  loss += criterion(outputs, y).item()
                  _, predicted = torch.max(outputs.data, 1) # get predicted class
                  total += len(y)
                  correct += (predicted == y).sum().item()
          return correct / total, loss / total
[66]: device = 'cuda' if torch.cuda.is_available() else 'cpu' # automatically use gpu_
       ⇔if available
      model = Net2().to(device)
      model.load_state_dict(torch.load("/content/epoch=8-checkpoint.pth"), strict = "
       →False)
      for name, parameter in model.named_parameters():
          if (name[0:4] == "conv"):
```

[24]:

parameter.requires_grad = False

```
[24]: _IncompatibleKeys(missing_keys=['dense1_v2.weight', 'dense1_v2.bias',
      'dense2_v2.weight', 'dense2_v2.bias', 'dense3_v2.weight', 'dense3_v2.bias'],
      unexpected_keys=['dense1.weight', 'dense1.bias', 'dense2.weight', 'dense2.bias',
      'dense3.weight', 'dense3.bias'])
[25]:
[68]: from tqdm import tqdm
      # run for 20 epoch, remove aumentation step, run for 10 more epochs
      device = 'cuda' if torch.cuda.is available() else 'cpu' # automatically use qpu
      \rightarrow if available
      epochs = 3 # Change Number of epochs
      train_losses, train_accuracies = [], []
      test_losses, test_accuracies = [], []
      \#model = Net().to(device)
      criterion = torch.nn.CrossEntropyLoss()
      optimizer = torch.optim.Adam(params=model.parameters(), lr=1e-3, weight_decay=__
       90.001
      for epoch in range(epochs):
          for i, (X, y) in enumerate(tqdm(train_loader)):
              X, y = X.to(device), y.to(device)
              optimizer.zero_grad()
              outputs = model(X)
              loss = criterion(outputs, y)
              loss.backward()
              optimizer.step()
          train_accuracy, train_loss = evaluate(model, criterion, train_loader,_
       →device)
          train_losses.append(train_loss)
          train_accuracies.append(train_accuracy)
          test_accuracy, test_loss = evaluate(model, criterion, test_loader, device)
          test_losses.append(test_loss)
          test_accuracies.append(test_accuracy)
          print(
              f"Epoch {epoch + 1}: Loss - (Train {train_loss:.5f}/Test {test_loss:.
       ⇔2f}, "
              f"Accuracy - (Train {train_accuracy:.5f}/Test {test_accuracy:.2f})"
          )
     100%|
                | 44/44 [00:35<00:00,
                                      1.23it/s]
```

```
Epoch 1: Loss - (Train 0.02208/Test 0.02, Accuracy - (Train 0.52996/Test 0.52)
                | 44/44 [00:37<00:00, 1.17it/s]
     Epoch 2: Loss - (Train 0.02169/Test 0.02, Accuracy - (Train 0.52996/Test 0.52)
                | 44/44 [00:40<00:00, 1.08it/s]
     Epoch 3: Loss - (Train 0.02209/Test 0.02, Accuracy - (Train 0.49929/Test 0.51)
[75]: \#result = model(test[42])
      for i, (X, y) in enumerate(test loader):
        x_single = X[0]
        y_single = y[0]
        outputs = model(X.to(device)).to('cpu')
        loss = criterion(outputs, y).item()
        _, predicted = torch.max(outputs.data, 1) # get predicted class
        break
      print(x_single)
      print("label:","real" if y_single == 1 else "fake")
      print("predicted:","real" if predicted[0] == 1 else "fake")
     tensor([[[0., 0., 0., ..., 0., 0., 0.],
              [0., 0., 0., ..., 0., 0., 0.]
              [0., 0., 0., ..., 0., 0., 0.]
              [0., 0., 0., ..., 0., 0., 0.],
              [0., 0., 0., ..., 0., 0., 0.]
              [0., 0., 0., ..., 0., 0., 0.]],
              [[0., 0., 0., ..., 0., 0., 0.],
              [0., 0., 0., ..., 0., 0., 0.],
              [0., 0., 0., ..., 0., 0., 0.]
              [0., 0., 0., ..., 0., 0., 0.]
              [0., 0., 0., ..., 0., 0., 0.],
              [0., 0., 0., ..., 0., 0., 0.]],
              [[0., 0., 0., ..., 0., 0., 0.],
              [0., 0., 0., ..., 0., 0., 0.]
              [0., 0., 0., ..., 0., 0., 0.]
               [0., 0., 0., ..., 0., 0., 0.],
              [0., 0., 0., ..., 0., 0., 0.],
               [0., 0., 0., ..., 0., 0., 0.]]])
     label: fake
     predicted: real
```

```
[]: !pip install flask flask-ngrok
     !pip install Pillow
     from PIL import Image
     import numpy as np
     from flask import Flask, request, send_file
     from flask_ngrok import run_with_ngrok
     import os
     def display_image(filename):
         # Open and display the image in the notebook
         img = Image.open(filename)
         plt.imshow(img)
         plt.axis('off')
        plt.show()
     app = Flask(__name__)
     run_with_ngrok(app) # Start
     #ngrok
     @app.route("/upload", methods=['POST'])
     def upload_file():
         if request.method == 'POST':
             # file or nah
             if 'file' not in request.files:
                 return "No file part in the request"
             file = request.files['file']
                                           # empty
             if file.filename == '':
                 return "No selected file"
             if file:
                 # Save the file temporarily
                 filename = "received_file.jpg"
                 file.save(filename)
                 # Display the image in the notebook
                 display_image(filename)
                 img = Image.open(filename)
                 output = model(img)
                 pred = torch.argmax(output, dim=1)
                 return "real" if pred==torch.tensor(1) else "fake"
                 # Process and return the file as before
                 #return send_file(filename, as_attachment=True)
     if __name__ == '__main__':
       app.run()
```

Requirement already satisfied: flask in /usr/local/lib/python3.10/dist-packages (2.2.5)
Requirement already satisfied: flask-ngrok in /usr/local/lib/python3.10/dist-packages (0.0.25)

```
Requirement already satisfied: Werkzeug>=2.2.2 in
/usr/local/lib/python3.10/dist-packages (from flask) (3.0.1)
Requirement already satisfied: Jinja2>=3.0 in /usr/local/lib/python3.10/dist-
packages (from flask) (3.1.2)
Requirement already satisfied: itsdangerous>=2.0 in
/usr/local/lib/python3.10/dist-packages (from flask) (2.1.2)
Requirement already satisfied: click>=8.0 in /usr/local/lib/python3.10/dist-
packages (from flask) (8.1.7)
Requirement already satisfied: requests in /usr/local/lib/python3.10/dist-
packages (from flask-ngrok) (2.31.0)
Requirement already satisfied: MarkupSafe>=2.0 in
/usr/local/lib/python3.10/dist-packages (from Jinja2>=3.0->flask) (2.1.3)
Requirement already satisfied: charset-normalizer<4,>=2 in
/usr/local/lib/python3.10/dist-packages (from requests->flask-ngrok) (3.3.2)
Requirement already satisfied: idna<4,>=2.5 in /usr/local/lib/python3.10/dist-
packages (from requests->flask-ngrok) (3.4)
Requirement already satisfied: urllib3<3,>=1.21.1 in
/usr/local/lib/python3.10/dist-packages (from requests->flask-ngrok) (2.0.7)
Requirement already satisfied: certifi>=2017.4.17 in
/usr/local/lib/python3.10/dist-packages (from requests->flask-ngrok) (2023.7.22)
Requirement already satisfied: Pillow in /usr/local/lib/python3.10/dist-packages
(9.4.0)
 * Serving Flask app '__main__'
 * Debug mode: off
INFO: werkzeug: WARNING: This is a development server. Do not use it in a
production deployment. Use a production WSGI server instead.
 * Running on http://127.0.0.1:5000
INFO:werkzeug:Press CTRL+C to quit
 * Running on http://9800-34-124-157-154.ngrok.io
 * Traffic stats available on http://127.0.0.1:4040
```



```
Traceback (most recent call last):
 File "/usr/local/lib/python3.10/dist-packages/flask/app.py", line 2529, in
wsgi_app
   response = self.full_dispatch_request()
 File "/usr/local/lib/python3.10/dist-packages/flask/app.py", line 1825, in
full_dispatch_request
   rv = self.handle_user_exception(e)
 File "/usr/local/lib/python3.10/dist-packages/flask/app.py", line 1823, in
full_dispatch_request
   rv = self.dispatch_request()
 File "/usr/local/lib/python3.10/dist-packages/flask/app.py", line 1799, in
dispatch_request
   return self.ensure sync(self.view_functions[rule.endpoint])(**view_args)
 File "<ipython-input-90-607485fe6092>", line 36, in upload_file
    output = model(img)
 File "/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py",
line 1518, in _wrapped_call_impl
   return self._call_impl(*args, **kwargs)
 File "/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py",
line 1527, in _call_impl
   return forward_call(*args, **kwargs)
 File "<ipython-input-65-033a7765db8f>", line 43, in forward
   x = self.pool(self.activation(self.norm_layer1(self.conv1(x))))
```

ERROR: __main__:Exception on /upload [POST]

```
line 1518, in _wrapped_call_impl
        return self._call_impl(*args, **kwargs)
      File "/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py",
    line 1527, in call impl
        return forward_call(*args, **kwargs)
      File "/usr/local/lib/python3.10/dist-packages/torch/nn/modules/conv.py", line
    460, in forward
        return self._conv_forward(input, self.weight, self.bias)
      File "/usr/local/lib/python3.10/dist-packages/torch/nn/modules/conv.py", line
    456, in _conv_forward
        return F.conv2d(input, weight, bias, self.stride,
    TypeError: conv2d() received an invalid combination of arguments - got
    (JpegImageFile, Parameter, Parameter, tuple, str, tuple, int), but expected one
     * (Tensor input, Tensor weight, Tensor bias, tuple of ints stride, tuple of
    ints padding, tuple of ints dilation, int groups)
          didn't match because some of the arguments have invalid types:
    (!JpegImageFile!, !Parameter!, !Parameter!, !tuple of (int, int)!, !str!, !tuple
    of (int, int)!, int)
     * (Tensor input, Tensor weight, Tensor bias, tuple of ints stride, str padding,
    tuple of ints dilation, int groups)
          didn't match because some of the arguments have invalid types:
    (!JpegImageFile!, !Parameter!, !Parameter!, !tuple of (int, int)!, str, !tuple
    of (int, int)!, int)
    INFO:werkzeug:127.0.0.1 - - [12/Nov/2023 20:11:16] "POST /upload
    HTTP/1.1" 500 -
[]: from imageio.v3 import imread
     import pandas as pd
     from pathlib import Path
     from random import random
     from shutil import copy
     import torch
     from torch.utils.data import Dataset, DataLoader
     from torchvision.transforms import functional
     from torchvision.transforms import functional
     from torchvision import transforms
     class RealAndFakeFaceProcessor:
         def __init__(self, directory, train_test_split = 0.7) -> None:
             self.train_test_split = train_test_split
            self.train index = 0
             self.test_index = 0
```

File "/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py",

```
self.src_directory = Path(directory)
       self.directory = self.src_directory.parent / "processed"
      self.tgt_train = self.directory / "train"
      self.tgt_train.mkdir(parents=True, exist_ok=True)
      self.tgt_test = self.directory / "test"
      self.tgt_test.mkdir(parents=True, exist_ok=True)
      self.index_by_type = {"index":[], "partition": [], "type": [], "label":__
- [] }
      self.__process("training_fake","easy")
      self.__process("training_fake","mid")
      self._process("training_fake","hard")
      self._process("training_real", "real")
      df = pd.DataFrame(self.index_by_type)
      df.to_csv(self.directory / "images.csv", index=False)
  def __add_image_to_record(self, index: int, partition: str, type: str,_u
→label: int):
       """Real - label is 1, Fake - label is 0"""
      self.index_by_type["index"].append(index)
      self.index_by_type["partition"].append(partition)
      self.index_by_type["type"].append(type)
      self.index by type["label"].append(label)
  def __process(self, subdir: str, type: str) -> None:
      src = self.src_directory / subdir
      label = 1 if type == "real" else 0
      for image in src.iterdir():
           if image.name.startswith(type):
              random_number = random()
               if random() > self.train_test_split:
                   copy(image.absolute(), self.tgt_test / f"{self.test_index}.

¬png")
                   self.__add_image_to_record(self.test_index, "test", type,__
→label)
                   self.test_index += 1
               else:
                   copy(image.absolute(), self.tgt_train / f"{self.
self.__add_image_to_record(self.train_index, "train", type,_
→label)
```

```
self.train_index += 1
class RealAndFakeFaceDataset(Dataset):
   def __init__(
       self,
       directory: str,
        partition: str ="train"
   ) -> 'RealAndFakeFaceDataset':
        self.partition = partition
        if partition not in ("train", "test"):
            raise ValueError(f"Invalid partition specified - {partition}")
        self.directory = Path(directory)
        self.img_directory = self.directory / partition
        metadata = pd.read_csv(self.directory / "images.csv")
        self.metadata = metadata[metadata["partition"] == self.partition]
   def __len__(self) -> int:
        return len(self.metadata)
   def __getitem__(self, index: int) -> tuple[torch.tensor, int]:
        filename = self.img_directory / f"{index}.png"
       label = self.metadata.iloc[index]["label"]
        image = torch.from numpy(imread(filename))
        image = image.to(torch.float32)
        image = image.permute((2,0,1))
        image = functional.resize(image, (224, 224), antialias=True)
        image /= 255.0
        image_mean = [.485, .456, .406]
        image_std = [.229, .224, .225]
       preprocess = transforms.Compose([
            transforms.Normalize(mean = image_mean, std = image_std),
            transforms.RandomCrop((200,200)),
            transforms.RandomRotation((-15,15), expand=False),
            transforms.ColorJitter(brightness=0.5, contrast=0.5, saturation=0.
 45, hue=0.5)
       ])
        image = preprocess(image)
       return image, label
   def get_type(self, index) -> str:
       return self.metadata.iloc[index]["type"]
```