# Week 10 Data Centric AI

## November 11, 2024

```
[17]: # Standard Libraries
      import os
      import io
      import numpy as np
      import pandas as pd
      import matplotlib.pyplot as plt
      # Image Processing
      import cv2
      from PIL import Image
      from skimage.feature import graycomatrix, graycoprops
      from skimage.metrics import structural_similarity as ssim
      # File Handling
      import h5py
      # Deep Learning and PyTorch
      import torch
      import torch.nn as nn
      import torch.nn.functional as F
      import torch.optim as optim
      from torch.utils.data import Dataset, DataLoader
      from torchvision import models, transforms
      # Metrics and Evaluation
      from sklearn.metrics import classification_report, roc_auc_score, roc_curve, auc
      # Progress Visualization
      from tqdm import tqdm
```

# 0.1 Data improvements and enhancements

#### 0.1.1 Feature Extraction

```
[27]: # Feature extraction functions

def extract_color_histogram(image, bins=(8, 8, 8)):
    """Extracts a color histogram from an RGB image."""
```

```
try:
        # Convert image from BGR to RGB color space
        image_rgb = cv2.cvtColor(image, cv2.COLOR_BGR2RGB)
        # Calculate the color histogram for the RGB image
        hist = cv2.calcHist([image_rgb], [0, 1, 2], None, bins, [0, 256, 0, __
 4256, 0, 256
        # Normalize and flatten the histogram to create a feature vector
        hist = cv2.normalize(hist, hist).flatten()
        return hist
    except Exception as e:
        print(f"Error in extracting color histogram: {e}")
        return None
def extract_hu_moments(image):
    """Extracts Hu Moments from a grayscale image."""
    try:
        # Convert image to grayscale
        gray_image = cv2.cvtColor(image, cv2.COLOR_BGR2GRAY)
        # Compute image moments
        moments = cv2.moments(gray_image)
        # Calculate Hu Moments and flatten the array
        hu_moments = cv2.HuMoments(moments).flatten()
        return hu_moments
    except Exception as e:
        print(f"Error in extracting Hu moments: {e}")
        return None
def extract haralick texture(image):
    """Extracts Haralick texture features from a grayscale image."""
    try:
        # Convert image to grayscale
        gray_image = cv2.cvtColor(image, cv2.COLOR_BGR2GRAY)
        # Compute the gray-level co-occurrence matrix (GLCM)
        glcm = graycomatrix(gray_image, distances=[1], angles=[0], levels=256, u

¬symmetric=True, normed=True)

        # Extract Haralick texture properties and flatten them into a feature
 \rightarrowvector
        haralick_features = [graycoprops(glcm, prop).flatten()[0] for prop in__
 →['contrast', 'dissimilarity', 'homogeneity', 'energy', 'correlation', 'ASM']]
        return np.array(haralick_features)
    except Exception as e:
```

```
print(f"Error in extracting Haralick texture: {e}")
        return None
def extract image features from hdf5(filename, convert_to_grayscale=True):
    Extracts image features from an HDF5 file and pairs them with their
 ⇔corresponding keys.
    Parameters:
    - filename (str): Path to the HDF5 file containing image data.
    - convert_to_grayscale (bool): Whether to convert images to grayscale ⊔
 \hookrightarrow (default is True).
    Returns:
    - features_dict (dict): A dictionary where keys are image IDs and values_{\sqcup}
 ⇔are feature vectors.
    11 11 11
    features_dict = {}
    try:
        # Open the HDF5 file
        with h5py.File(filename, "r") as f:
            # List all keys in the HDF5 file (image IDs)
            keys = list(f.keys())
            print("Keys: %s" % keys)
            # Iterate over each key to extract image data and features
            for key in keys:
                try:
                    # Read binary image data from the HDF5 file
                    binary_data = f[key][()]
                     # Convert the binary data to an image using PIL, then to a
 →NumPy array for OpenCV
                    image = Image.open(io.BytesIO(binary data))
                    image_bgr = cv2.cvtColor(np.array(image), cv2.COLOR_RGB2BGR)
                    # Check for NaN or infinite values in the image array
                    if np.isnan(image_bgr).any() or np.isinf(image_bgr).any():
                        print(f"Warning: Image from key '{key}' contains NaN or⊔
 ⇔infinite values.")
                        continue
                    # Extract various features from the image
                    color_hist = extract_color_histogram(image_bgr)
                    hu_moments = extract_hu_moments(image_bgr)
                    haralick_texture = extract_haralick_texture(image_bgr)
```

```
# Ensure all extracted features are valid before combining
                   if color_hist is None or hu_moments is None or_
⇔haralick_texture is None:
                       print(f"Warning: One or more feature extractions failed⊔

¬for key '{key}'. Skipping.")

                       continue
                   # Combine all features into a single global feature vector
                   global_feature = np.hstack([color_hist, hu_moments,__
→haralick_texture])
                   # Store the feature vector in the dictionary, paired with
⇔the key
                   features_dict[key] = global_feature
               except Exception as e:
                   print(f"Error processing key '{key}': {e}")
                   continue
  except IOError as e:
      print(f"Error opening HDF5 file: {e}")
  except Exception as e:
      print(f"Unexpected error: {e}")
  print(f"Extracted features from {len(features_dict)} images.")
  return features_dict
```

## 0.1.2 Principle Component Analysis

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- tuple: Dictionaries containing PCA results and reconstructed images for \square
⇒training and optionally validation.
   11 11 11
  def load image dataset(filename):
       """Loads and preprocesses images from an HDF5 file and pairs them with \sqcup
⇔keys."""
      image_dataset = {} # Dictionary to store image data with keys
      try:
           with h5py.File(filename, "r") as f:
               # Get all keys (image IDs) in the HDF5 file
               keys = list(f.keys())
               print("Keys found:", keys)
               for key in keys:
                   # Load binary image data from the HDF5 file
                   binary_data = f[key][()]
                   # Convert binary data to a PIL image and then to grayscale
                   image = Image.open(io.BytesIO(binary_data)).convert('L')
                   # Resize the image to a consistent shape
                   image = image.resize(resize_shape)
                   # Flatten the image and convert to a NumPy array
                   image_array = np.array(image).astype(float).flatten()
                   # Check for NaN or infinite values and skip invalid images
                   if np.isnan(image_array).any() or np.isinf(image_array).
⇒any():
                       print(f"Warning: Image from key '{key}' contains NaN or⊔
⇔infinite values.")
                       continue
                   # Store the processed image in the dictionary
                   image_dataset[key] = image_array
      except Exception as e:
           print(f"Error loading HDF5 file {filename}: {e}")
           raise
      return image_dataset
  # Load and process the training dataset
  train_dataset = load_image_dataset(train_filename)
  if not train_dataset:
      raise ValueError("No valid images found in the training dataset.")
  print(f"Training dataset contains {len(train_dataset)} images.")
  pca_result_val, reconstructed_val = None, None
```

```
try:
      # Extract image keys and convert the dataset to a NumPy array for PCA
      train_keys = list(train_dataset.keys())
      train_images = np.array(list(train_dataset.values()))
      # Apply PCA to the training dataset, retaining 95% of the variance
      pca = PCA(n components=0.95)
      pca_result_train = pca.fit_transform(train_images)
      reconstructed_train = pca.inverse_transform(pca_result_train)
      # Pair PCA results and reconstructed images with their corresponding
⇔keys
      reconstructed_train_dict = {key: reconstructed for key, reconstructed_

→in zip(train_keys, reconstructed_train)}
      pca_result_train_dict = {key: pca_result for key, pca_result in_
→zip(train_keys, pca_result_train)}
      # Display a few training images and their PCA-reconstructed versions
      for i, (key, original, reconstructed) in enumerate(zip(train_keys, u
→train_images, reconstructed_train)):
          if i >= num_images_to_display:
              break
          # Reshape the original and reconstructed images for display
          original_image = original.reshape(resize_shape)
          reconstructed_image = reconstructed.reshape(resize_shape)
          # Plot original and reconstructed images side by side
          fig, axes = plt.subplots(1, 2, figsize=(10, 5))
          axes[0].imshow(original_image, cmap='gray')
          axes[0].set_title('Original Image')
          axes[0].axis('off')
          axes[1].imshow(reconstructed_image, cmap='gray')
          axes[1].set title('PCA Transformed Image')
          axes[1].axis('off')
          plt.suptitle(f"Training Image {key}")
          plt.show()
          # Calculate and display mean squared error (MSE) and structural _{\sqcup}
⇔similarity index (SSIM)
          mse = np.mean((original_image - reconstructed_image) ** 2)
          similarity_index = ssim(original_image, reconstructed_image,__
→data_range=original_image.max() - original_image.min())
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print(f"Mean Squared Error (MSE) for training image {key}: {mse:.
<4f}")
          print(f"Structural Similarity Index (SSIM) for training image {key}:
# Process the validation dataset if provided
      if val_filename:
          val_dataset = load_image_dataset(val_filename)
          if not val_dataset:
              print("Warning: No valid images found in the validation dataset.
")
          else:
              print(f"Validation dataset contains {len(val_dataset)} images.")
              val_keys = list(val_dataset.keys())
              val_images = np.array(list(val_dataset.values()))
              # Apply the trained PCA to the validation dataset
              pca_result_val = pca.transform(val_images)
              reconstructed_val = pca.inverse_transform(pca_result_val)
              # Pair PCA results and reconstructed images with their
⇔corresponding keys
              reconstructed_val_dict = {key: reconstructed for key,__
Greconstructed in zip(val_keys, reconstructed_val)}
              pca_result_val_dict = {key: pca_result for key, pca_result in_
→zip(val_keys, pca_result_val)}
              # Display a few validation images and their PCA-reconstructed_
→versions
              for i, (key, original, reconstructed) in_
→enumerate(zip(val_keys, val_images, reconstructed_val)):
                  if i >= num_images_to_display:
                      break
                  original_image = original.reshape(resize_shape)
                  reconstructed_image = reconstructed.reshape(resize_shape)
                  fig, axes = plt.subplots(1, 2, figsize=(10, 5))
                  axes[0].imshow(original_image, cmap='gray')
                  axes[0].set_title('Original Validation Image')
                  axes[0].axis('off')
                  axes[1].imshow(reconstructed_image, cmap='gray')
                  axes[1].set_title('PCA Transformed Validation Image')
                  axes[1].axis('off')
```

## Combine Extracted Features and PCA Features to the Data Frame

```
[29]: # File paths for the training, validation, and test HDF5 image data
      train_filename = "../data/raw/train_images.hdf5"
      val_filename = "../data/raw/validation_image.hdf5"
      test_filename = "../data/raw/test_image.hdf5"
      # Perform PCA on the training and validation datasets, obtaining the PCAL
       \hookrightarrow features
      _, pca_features_train, (_, pca_features_val) =_
       perform_pca_on_image_dataset(train_filename, val_filename)
      # Perform PCA on the training and test datasets, obtaining the PCA features for
       \hookrightarrow testing
      _, _, (_, pca_features_test) = perform_pca_on_image_dataset(train_filename,__
       →test_filename)
      # Extract image features (e.g., color histograms, Hu moments, Haralick_{\sqcup}
       →textures) from the training dataset
      train_image_features = extract_image_features_from_hdf5(train_filename)
      # Extract image features from the validation dataset
      val_image_features = extract_image_features_from_hdf5(val_filename)
      # Extract image features from the test dataset
      test_image_features = extract_image_features_from_hdf5(test_filename)
```

```
# Load metadata CSV files for training, validation, and test data
train_df = pd.read_csv('../data/processed/processed-train-metadata1.csv')
val_df = pd.read_csv('.../data/processed/processed-validation-metadata1.csv')
test_df = pd.read_csv('.../data/processed/processed-test-metadata1.csv')
# Ensure that the 'isic_id' column in the dataframes is of type string to match_
 → the keys in the extracted features
train_df['isic_id'] = train_df['isic_id'].astype(str)
val_df['isic_id'] = val_df['isic_id'].astype(str)
test_df['isic_id'] = test_df['isic_id'].astype(str)
# Add a new column to the training DataFrame with extracted features by mapping_
 →'isic_id' to the corresponding feature vector
train_df['extracted_features'] = train_df['isic_id'].apply(lambda x:__
 strain_image_features.get(x, None))
# Add a new column to the validation DataFrame with extracted features
val_df['extracted_features'] = val_df['isic_id'].apply(lambda x:__
 →val_image_features.get(x, None))
# Add a new column to the test DataFrame with extracted features
test_df['extracted_features'] = test_df['isic_id'].apply(lambda x:_u
 →test_image_features.get(x, None))
# Add a new column to the training DataFrame with PCA features by mapping_
 →'isic_id' to the corresponding PCA feature vector
train df['pca features'] = train df['isic id'].apply(lambda x:__
 →pca_features_train.get(x, None))
# Add a new column to the validation DataFrame with PCA features
val_df['pca_features'] = val_df['isic_id'].apply(lambda x: pca_features_val.
 ⇒get(x, None))
# Add a new column to the test DataFrame with PCA features
test_df['pca_features'] = test_df['isic_id'].apply(lambda x: pca_features_test.
  ⇒get(x, None))
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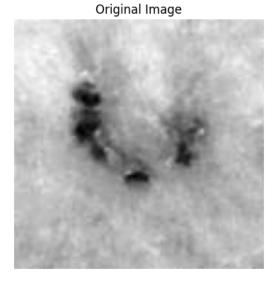
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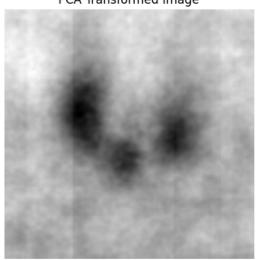
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Training Image ISIC\_0082829

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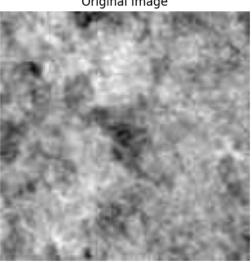




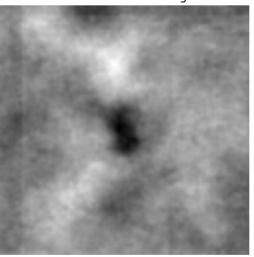
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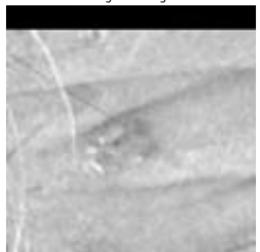
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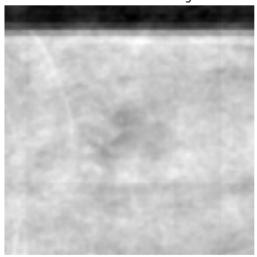
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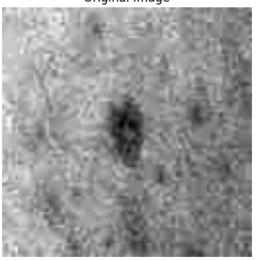
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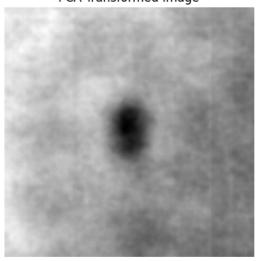
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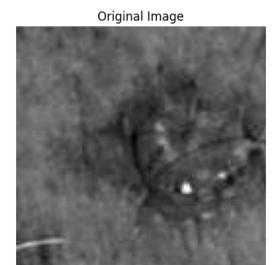


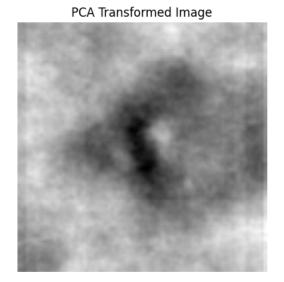
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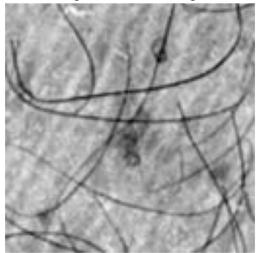
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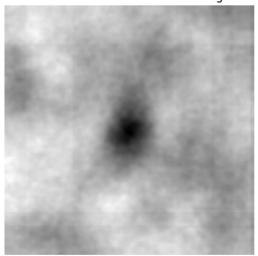
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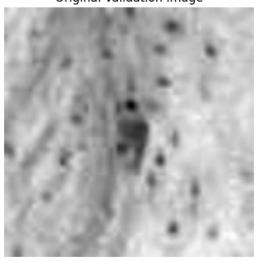
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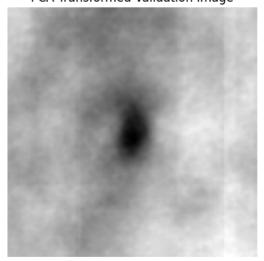
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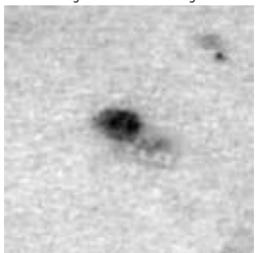
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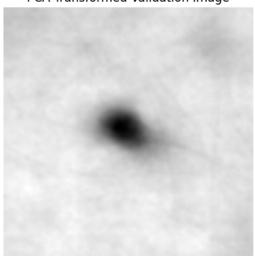
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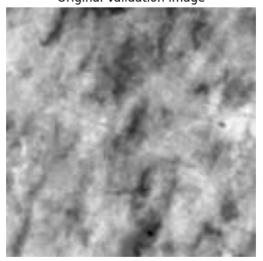
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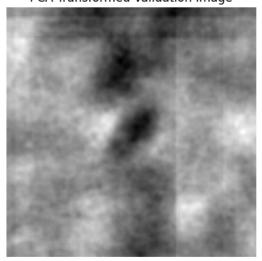
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Validation Image ISIC\_0102886

Original Validation Image



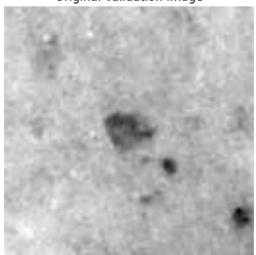
PCA Transformed Validation Image



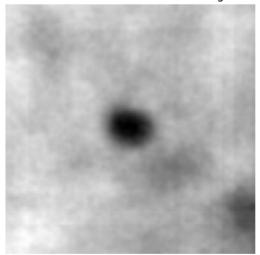
Mean Squared Error (MSE) for validation image ISIC\_0102886: 126.4901 Structural Similarity Index (SSIM) for validation image ISIC\_0102886: 0.3016

#### Validation Image ISIC 0108610

Original Validation Image



PCA Transformed Validation Image



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Mean Squared Error (MSE) for validation image ISIC 0108610: 29.1011
Structural Similarity Index (SSIM) for validation image ISIC_0108610: 0.4591
Shape of PCA-reconstructed training image array: (1649, 16384)
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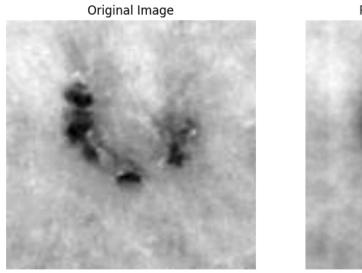
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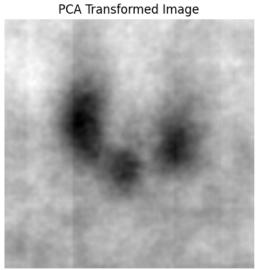
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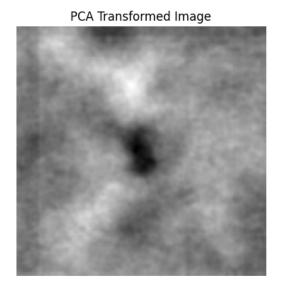




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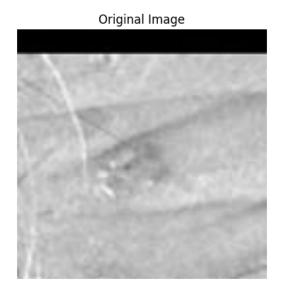
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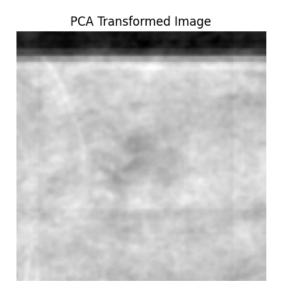
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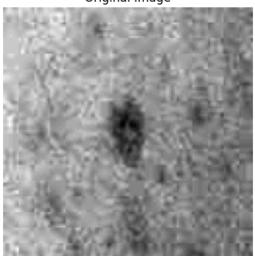




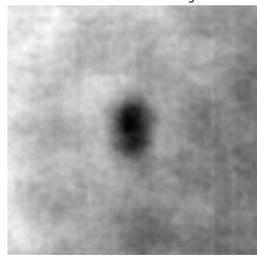
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PCA Transformed Image



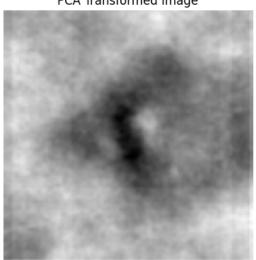
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Training Image ISIC\_0104229

Original Image



PCA Transformed Image



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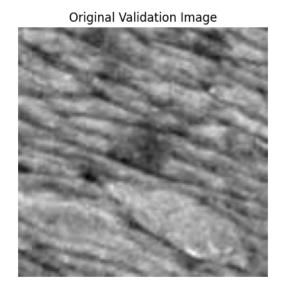
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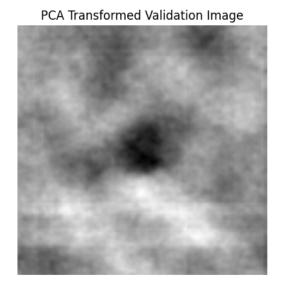
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Validation dataset shape: 1490 images

# Validation Image ISIC\_0051822

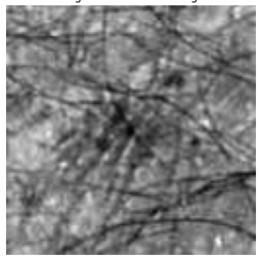




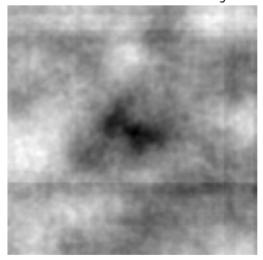
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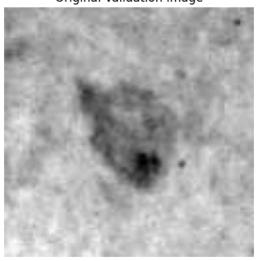
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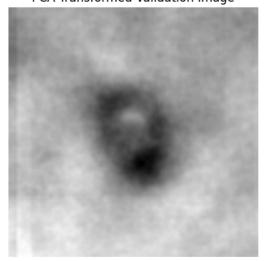
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Validation Image ISIC\_0076312

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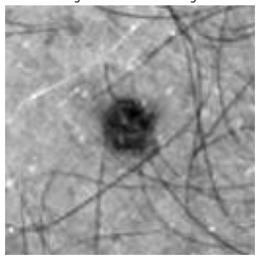
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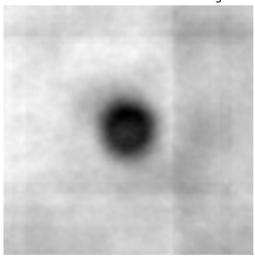
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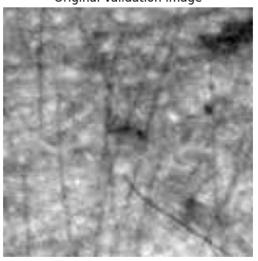
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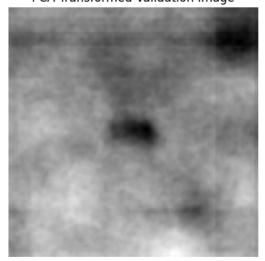
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Validation Image ISIC\_0086083

Original Validation Image



PCA Transformed Validation Image



Mean Squared Error (MSE) for validation image ISIC\_0086083: 40.0422 Structural Similarity Index (SSIM) for validation image ISIC\_0086083: 0.2346 Shape of PCA-reconstructed training image array: (1649, 16384) Shape of PCA-reconstructed validation image array: (1490, 16384)

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```
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'ISIC_9994183']
```

Extracted features from 1490 images.

#### 0.1.3 Image Data Augmentation

```
[30]: def get_train_transform(resize_size=(256, 256), crop_size=224,__
       -rotation degree=15, normalize means=(0.485, 0.456, 0.406), normalize stds=(0.
       →229, 0.224, 0.225)):
          11 11 11
          Returns the transformations for the training dataset, including data\sqcup
        \rightarrow augmentation for EfficientNet.
          Arqs:
               resize_size (tuple): The size to resize the image before cropping.
               crop_size (int): The size of the random crop.
               rotation_degree (int): Maximum degree for random rotation.
               normalize means (tuple): Means for normalization (default matches.)
        \hookrightarrow EfficientNet's training).
               normalize\_stds (tuple): Standard deviations for normalization (default_{\sqcup}
        \negmatches EfficientNet's training).
          Returns:
               transforms. Compose: The composed transformations for the training set.
          return transforms.Compose([
               transforms.Resize(resize_size), # Resize to a specified size
              transforms.RandomResizedCrop(crop_size, scale=(0.8, 1.0)), # Randomly_
        ⇔crop the resized image
               transforms.RandomHorizontalFlip(), # Random horizontal flipping for ____
        \rightarrow augmentation
```

```
transforms.RandomRotation(rotation_degree), # Random rotation
        transforms.ColorJitter(brightness=0.4, contrast=0.4, saturation=0.4,
 hue=0.1), # Optional: Add color jitter for more augmentation
        transforms.ToTensor(), # Convert image to PyTorch tensor
        transforms.Normalize(normalize_means, normalize_stds) # Normalize_
 →using EfficientNet's means and stds
    ])
def get_normal_transform(resize_size=(256, 256), normalize_means=(0.485, 0.456, u
 40.406), normalize_stds=(0.229, 0.224, 0.225)):
    Returns the transformations for the validation/test dataset without data\sqcup
 ⇒augmentation, tailored for EfficientNet.
    Arqs:
        resize_size (tuple): The size to resize the image.
        normalize\_means (tuple): Means for normalization (default matches_{\sqcup}
 \hookrightarrow EfficientNet's training).
        normalize\_stds (tuple): Standard deviations for normalization (default_{\sqcup}
 →matches EfficientNet's training).
    Returns:
        transforms. Compose: The composed transformations for the validation/
 \hookrightarrow test set.
    11 11 11
    return transforms.Compose([
        transforms.Resize(resize_size), # Resize to the specified size to_
 → maintain consistency
        transforms.CenterCrop(224), # Center crop to match EfficientNet's,
 →input size (224x224)
        transforms.ToTensor(), # Convert image to PyTorch tensor
        transforms.Normalize(normalize_means, normalize_stds) # Normalize_
 \hookrightarrowusing EfficientNet's means and stds
    ])
```

## 0.2 Dataset and Dataloader

```
[31]: class MultiInputDataset(Dataset):
    def __init__(self, hdf5_file, df, transform=None):
        """

        Multi-input dataset that includes images, extracted features, PCA
        →results, metadata, and labels.

Parameters:
        - hdf5_file (str): Path to the HDF5 file containing image data.
```

```
- df (pd.DataFrame): DataFrame containing image IDs, labels, and
\hookrightarrow additional features.
       - transform (callable, optional): A function/transform to apply to the \Box
\hookrightarrow images.
      # Open the HDF5 file
      try:
           self.hdf5_file = h5py.File(hdf5_file, 'r')
      except Exception as e:
          raise IOError(f"Could not open HDF5 file: {hdf5_file}. Error: {e}")
      # Store the DataFrame
      self.df = df
      self.image_ids = df['isic_id'].values
      # Check that all image IDs are in the HDF5 file
      for image_id in self.image_ids:
           if str(image_id) not in self.hdf5_file.keys():
               raise ValueError(f"Image id {image_id} not found in HDF5 file.")
      self.transform = transform
  def __len__(self):
      return len(self.df)
  def __getitem__(self, idx):
      # Get the image ID and load the image from HDF5
      image_id = str(self.df.iloc[idx]['isic_id'])
      image_bytes = self.hdf5_file[image_id][()]
      image = Image.open(io.BytesIO(image_bytes)).convert('RGB')
      # Apply any transformations
      if self.transform:
           image_transformed = self.transform(image)
           image_transformed = np.array(image)
      # Extract the features and PCA result directly from the DataFrame
      extracted_features = self.df.iloc[idx]['extracted_features']
      pca_features = self.df.iloc[idx]['pca_features']
      # Convert features to tensors
      extracted_features_tensor = torch.tensor(extracted_features,__

dtype=torch.float32)

      pca_features_tensor = torch.tensor(pca_features, dtype=torch.float32)
      # Retrieve the label
```

```
[32]: train_dataset = MultiInputDataset('../data/raw/train_images.

_hdf5',train_df,transform=get_train_transform())

val_dataset = MultiInputDataset('../data/raw/validation_image.

_hdf5',val_df,transform=get_normal_transform())

test_dataset = MultiInputDataset('../data/raw/test_image.

_hdf5',test_df,transform=get_normal_transform())
```

```
[33]: # Create DataLoader objects for training, validation, and testing
effnet_train_dataloader = DataLoader(train_dataset, batch_size=16, shuffle=True)
effnet_val_dataloader = DataLoader(val_dataset, batch_size=16, shuffle=False) ___

# Usually, we don't shuffle validation data
effnet_test_dataloader = DataLoader(test_dataset, batch_size=16, shuffle=False)___
# Typically, test data is not shuffled
```

#### 0.3 Model Architecture

```
# Load a pretrained EfficientNet model and remove the final_
⇔classification layer
      try:
           efficientnet = models.efficientnet_b0(pretrained=pretrained)
           self.efficientnet = nn.Sequential(*list(efficientnet.children())[:
-1])
          print("EfficientNet loaded successfully.")
       except Exception as e:
          print(f"Error loading EfficientNet model: {e}")
           raise
       # Fully connected layers for image features
       self.fc_image = nn.Sequential(
          nn.Linear(1280, 1024),
          nn.ReLU(),
          nn.BatchNorm1d(1024),
          nn.Dropout(0.8),
          nn.Linear(1024, 512),
          nn.ReLU(),
          nn.BatchNorm1d(512)
       )
       # Fully connected layers for extracted features
       self.fc_extracted_features = nn.Sequential(
           nn.Linear(extracted_feature_size, 512),
          nn.ReLU(),
          nn.BatchNorm1d(512),
          nn.Dropout(0.8),
          nn.Linear(512, 256),
          nn.ReLU(),
          nn.BatchNorm1d(256)
      )
       # Fully connected layers for PCA features
       self.fc_pca_features = nn.Sequential(
           nn.Linear(pca_feature_size, 256),
          nn.ReLU(),
          nn.BatchNorm1d(256),
          nn.Dropout(0.8),
          nn.Linear(256, 128),
          nn.ReLU(),
          nn.BatchNorm1d(128)
       # Fully connected layers for metadata
      self.fc_metadata = nn.Sequential(
```

```
nn.Linear(metadata_size, 128),
          nn.ReLU(),
          nn.BatchNorm1d(128),
          nn.Dropout(0.8),
          nn.Linear(128, 64),
          nn.ReLU(),
          nn.BatchNorm1d(64)
      )
      # Final classification layer for the combined features
      self.fc combined = nn.Sequential(
          nn.Linear(512 + 256 + 128 + 64, 256), # Combined feature input size
          nn.ReLU(),
          nn.BatchNorm1d(256),
          nn.Dropout(0.8),
          nn.Linear(256, 64),
          nn.ReLU(),
          nn.Linear(64, 1) # Binary classification output
      )
  def forward(self, image, extracted_features, pca_features, metadata):
      Forward pass for the model, processing each input type and combining u
\hookrightarrow them.
      Arqs:
          image (torch.Tensor): The input image tensor.
          extracted_features (torch.Tensor): The extracted features tensor.
          pca_features (torch.Tensor): The PCA-transformed features tensor.
          metadata (torch. Tensor): The metadata tensor.
      Returns:
          torch. Tensor: The output prediction of the model.
      .....
      try:
          # Pass the image through EfficientNet and process its output
          x = self.efficientnet(image)
          x = x.view(x.size(0), -1) # Flatten the output
          image_features = self.fc_image(x)
          # Process extracted features
          extracted_features_processed = self.
# Process PCA features
          pca_features_processed = self.fc_pca_features(pca_features)
```

```
# Process metadata features
                  metadata_features_processed = self.fc_metadata(metadata)
                  # Concatenate all processed features
                  combined_features = torch.cat((image_features,__
       ⇔extracted_features_processed, pca_features_processed, □
       →metadata_features_processed), dim=1)
                  # Final classification
                  output = self.fc_combined(combined_features)
                  # Apply sigmoid for binary classification (optional, depending on \Box
       ⇔loss function)
                  output = torch.sigmoid(output)
                  return output
              except Exception as e:
                  print(f"Error during forward pass: {e}")
                  raise
[35]: # Function to compute partial AUC-above-TPR
      def score(solution: np.array, submission: np.array, min_tpr: float = 0.80) ->__
       ⇔float:
          Compute the partial AUC by focusing on a specific range of true positive \Box
       \hookrightarrow rates (TPR).
          Args:
              solution (np.array): Ground truth binary labels.
              submission (np.array): Model predictions.
              min_tpr (float): Minimum true positive rate to calculate partial AUC.
          Returns:
              float: The calculated partial AUC.
          Raises:
              ValueError: If the min_tpr is not within a valid range.
          # Rescale the target to handle sklearn limitations and flip the predictions
          v_gt = abs(solution - 1)
          v pred = -1.0 * submission
          max_fpr = abs(1 - min_tpr)
          # Compute ROC curve using sklearn
          fpr, tpr, _ = roc_curve(v_gt, v_pred)
```

if max\_fpr is None or max\_fpr == 1:

```
return auc(fpr, tpr)
    if max_fpr <= 0 or max_fpr > 1:
        raise ValueError(f"Expected min_tpr in range [0, 1), got: {min_tpr}")
    # Interpolate for partial AUC
    stop = np.searchsorted(fpr, max_fpr, "right")
    x_interp = [fpr[stop - 1], fpr[stop]]
    y_interp = [tpr[stop - 1], tpr[stop]]
    tpr = np.append(tpr[:stop], np.interp(max_fpr, x_interp, y_interp))
    fpr = np.append(fpr[:stop], max_fpr)
    partial_auc = auc(fpr, tpr)
    return partial_auc
# Training and validation loop function
def train_and_validate(
    model: nn.Module,
    train_dataloader: torch.utils.data.DataLoader,
    val_dataloader: torch.utils.data.DataLoader,
    criterion: nn.Module,
    optimizer: torch.optim.Optimizer,
    epochs: int,
    device: torch.device,
    best model path: str,
    early_stopping_patience: int = 5,
    min tpr: float = 0.80
) -> nn.Module:
    Train and validate a PyTorch model with early stopping, AUROC, partial AUC,
 \hookrightarrow and error handling.
    Args:
        model (nn.Module): The model to be trained and validated.
        train_dataloader (torch.utils.data.DataLoader): Dataloader for training_
 \hookrightarrow data.
        val\_dataloader (torch.utils.data.DataLoader): Dataloader for validation \sqcup
 \hookrightarrow data.
        criterion (nn.Module): Loss function.
        optimizer (torch.optim.Optimizer): Optimizer to update the model.
        epochs (int): Number of training epochs.
        device (torch.device): The device (CPU or GPU) to use.
        early_stopping_patience (int): Early stopping patience.
        min\_tpr (float): The minimum true positive rate for calculating partial \sqcup
 \hookrightarrow AUC.
    Returns:
```

```
nn. Module: The trained model.
   11 II II
   # Initialize tracking variables
  best_val_loss = float('inf')
  best_epoch = 0
  train_losses = []
  val losses = []
  train_accuracies = []
  val_accuracies = []
  early_stopping_counter = 0
  # Start the training and validation loop
  for epoch in range(epochs):
      print(f'Epoch {epoch + 1}/{epochs}')
       # Training phase
      model.train()
      running_train_loss = 0.0
      correct_train = 0
      total_train = 0
      all_train_labels = []
      all_train_probs = []
      progress_bar = tqdm(train_dataloader, desc=f'Training Epoch {epoch +
→1}')
       try:
           # Loop through the training batches
           for i, (image, extracted_features, pca_feature, metadata, labels)__
→in enumerate(progress_bar):
               image, extracted_features, pca_feature, metadata, labels =__
→image.to(device),extracted_features.to(device),pca_feature.to(device),
→metadata.to(device), labels.float().to(device)
               labels = labels.unsqueeze(1) # Adjust labels to have the right_{\square}
⇔shape for binary classification
               optimizer.zero_grad()
               # Forward pass
               probs = model(image, extracted_features, pca_feature, metadata)
               if probs.shape != labels.shape:
                   raise ValueError(f"Shape mismatch: Predictions shape {probs.
⇒shape} does not match labels shape {labels.shape}")
               # Calculate loss and backpropagate
               loss = criterion(probs, labels)
```

```
loss.backward()
               optimizer.step()
               # Update running loss
               running_train_loss += loss.item()
               # Store labels and predictions for accuracy calculations
               all_train_labels.extend(labels.cpu().detach().numpy())
               all_train_probs.extend(probs.cpu().detach().numpy())
               # Calculate binary predictions for training accuracy
               predicted_train = (probs >= 0.5).float()
               total train += labels.size(0)
               correct_train += (predicted_train == labels).sum().item()
               # Update progress bar
               progress_bar.set_postfix(train_loss=running_train_loss / (i +__
→1))
           # Calculate training accuracy and loss
           train accuracy = 100 * correct train / total train
           train_losses.append(running_train_loss / len(train_dataloader))
           train_accuracies.append(train_accuracy)
       except ValueError as ve:
          print(f"Error during training loop: {ve}")
           break
       # Validation phase
      model.eval()
      running_val_loss = 0.0
      correct = 0
      total = 0
      all labels = []
      all_probs = []
      progress_bar = tqdm(val_dataloader, desc=f'Validating Epoch {epoch +_\pu
→1}')
      with torch.no_grad():
           try:
               # Loop through the validation batches
               for i, (image, extracted_features, pca_feature, metadata,__
→labels) in enumerate(progress_bar):
                   image, extracted_features, pca_feature, metadata, labels =__
⇔image.to(device), extracted_features.to(device), pca_feature.to(device), ___

→metadata.to(device), labels.float().to(device)
```

```
labels = labels.unsqueeze(1)
                   probs = model(image, extracted_features, pca_feature,__
→metadata)
                   loss = criterion(probs, labels)
                   running_val_loss += loss.item()
                   all_labels.extend(labels.cpu().detach().numpy())
                   all_probs.extend(probs.cpu().detach().numpy())
                   # Calculate binary predictions for validation accuracy
                   predicted = (probs >= 0.5).float()
                   total += labels.size(0)
                   correct += (predicted == labels).sum().item()
                   progress_bar.set_postfix(val_loss=running_val_loss / (i +__
\hookrightarrow 1))
               val_accuracy = 100 * correct / total
               val_loss = running_val_loss / len(val_dataloader)
               val_accuracies.append(val_accuracy)
               val_losses.append(val_loss)
               # Calculate AUROC
               try:
                   valid_auroc = roc_auc_score(all_labels, all_probs)
               except ValueError as ve:
                   print(f"AUROC Calculation Error: {ve}")
                   valid_auroc = 0.0
               # Calculate partial AUC-above-TPR
               try:
                   partial_auroc = score(np.array(all_labels), np.
→array(all_probs), min_tpr=min_tpr)
               except ValueError as ve:
                   print(f"Partial AUC Calculation Error: {ve}")
                   partial_auroc = 0.0
               print(f'Epoch [{epoch}/{epochs}], Train Loss: {train_losses[-1]:
↔.4f}, Val Loss: {val_loss:.4f}, '
                     f'Train Accuracy: {train_accuracy:.2f}%, Val Accuracy:
-{val_accuracy:.2f}%, Val AUROC: {valid_auroc:.4f}, Partial AUROC:⊔

√{partial_auroc:.4f}')

               # Early stopping based on validation loss
               if val_loss < best_val_loss:</pre>
```

```
best_val_loss = val_loss
                  best_epoch = epoch + 1
                  early_stopping_counter = 0
                  torch.save(model.state_dict(), best_model_path)
              else:
                  early_stopping_counter += 1
              if early_stopping_counter >= early_stopping_patience:
                  print(f"Early stopping triggered at epoch {epoch}")
                  break
          except Exception as e:
              print(f"Error during validation loop: {e}")
              break
  print(f"Best Epoch: {best_epoch}, Best Validation Loss: {best_val_loss:.

4f}")

  print('Training Complete')
  # Plot training and validation loss
  plt.figure(figsize=(10, 5))
  plt.plot(train_losses, label='Train Loss')
  plt.plot(val_losses, label='Validation Loss')
  plt.xlabel('Epochs')
  plt.ylabel('Loss')
  plt.title('Training and Validation Loss')
  plt.legend()
  plt.show()
  # Plot training and validation accuracy
  plt.figure(figsize=(10, 5))
  plt.plot(train_accuracies, label='Train Accuracy')
  plt.plot(val_accuracies, label='Validation Accuracy')
  plt.xlabel('Epochs')
  plt.ylabel('Accuracy (%)')
  plt.title('Training and Validation Accuracy')
  plt.legend()
  plt.show()
  # Generate classification report
  try:
      print("Classification Report:")
      print(classification report(all_labels, (np.array(all_probs) >= 0.5).
→astype(int), target_names=['Class 0', 'Class 1']))
  except Exception as e:
      print(f"Error generating classification report: {e}")
```

## 0.4 Model training on training data and validation data

I opted to train a new model architecture to accommodate the integration of extracted features and PCA values as inputs for a multi-input model. This change in architecture is necessary to leverage these additional data inputs effectively and enhance the model's predictive capability.

```
[36]: device = "cuda" if torch.cuda.is_available() else "cpu"
      model = CustomImageFeatureEfficientNet(extracted feature size=525,
       ⇒pca_feature_size=70, metadata_size=9) # Assuming 9 features for metadata
      model.to(device)
      # Initialize optimizer
      optimizer = optim.Adam(model.parameters(), lr=0.001)
      # Define the loss function with the class weights
      criterion = nn.BCELoss() # Binary classification loss
      # Set the number of epochs
      epochs = 20
      best_model_path = "best_model.path"
     EfficientNet loaded successfully.
     /home/jupyter-sohka/.local/lib/python3.10/site-
     packages/torchvision/models/_utils.py:208: UserWarning: The parameter
     'pretrained' is deprecated since 0.13 and may be removed in the future, please
     use 'weights' instead.
       warnings.warn(
     /home/jupyter-sohka/.local/lib/python3.10/site-
     packages/torchvision/models/_utils.py:223: UserWarning: Arguments other than a
     weight enum or 'None' for 'weights' are deprecated since 0.13 and may be removed
     in the future. The current behavior is equivalent to passing
     `weights=EfficientNet_BO_Weights.IMAGENET1K_V1`. You can also use
     `weights=EfficientNet_BO_Weights.DEFAULT` to get the most up-to-date weights.
       warnings.warn(msg)
[37]: train_and_validate(model,effnet_train_dataloader, effnet_val_dataloader,_u
       Griterion, optimizer, epochs, device, best_model_path)
     Epoch 1/20
     Training Epoch 1: 100% | 131/131 [05:15<00:00, 2.41s/it,
     train_loss=0.613]
     Validating Epoch 1: 100% | 94/94 [00:49<00:00, 1.90it/s,
     val_loss=0.502]
     Epoch [0/20], Train Loss: 0.6134, Val Loss: 0.5015, Train Accuracy: 66.70%, Val
```

Accuracy: 85.64%, Val AUROC: 0.7202, Partial AUROC: 0.0439

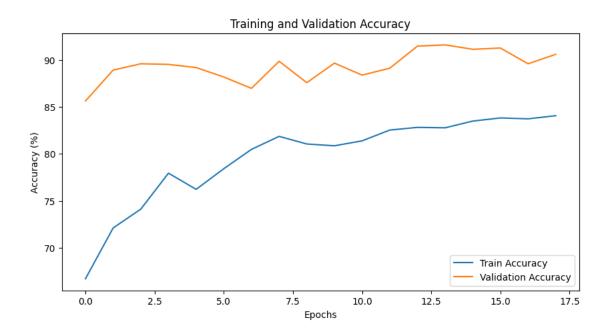
Epoch 2/20

```
Training Epoch 2: 100% | 131/131 [05:02<00:00, 2.31s/it,
train_loss=0.571]
Validating Epoch 2: 100% | 94/94 [00:44<00:00, 2.12it/s,
val_loss=0.427]
Epoch [1/20], Train Loss: 0.5706, Val Loss: 0.4269, Train Accuracy: 72.11%, Val
Accuracy: 88.93%, Val AUROC: 0.7845, Partial AUROC: 0.0645
Epoch 3/20
Training Epoch 3: 100% | 131/131 [05:51<00:00, 2.69s/it,
train_loss=0.525]
Validating Epoch 3: 100% | 94/94 [01:06<00:00, 1.42it/s,
val_loss=0.41]
Epoch [2/20], Train Loss: 0.5250, Val Loss: 0.4097, Train Accuracy: 74.11%, Val
Accuracy: 89.60%, Val AUROC: 0.7987, Partial AUROC: 0.0714
Epoch 4/20
Training Epoch 4: 100% | 131/131 [05:19<00:00, 2.44s/it,
train_loss=0.484]
Validating Epoch 4: 100% | 94/94 [00:44<00:00, 2.13it/s,
val loss=0.324]
Epoch [3/20], Train Loss: 0.4841, Val Loss: 0.3245, Train Accuracy: 77.94%, Val
Accuracy: 89.53%, Val AUROC: 0.8253, Partial AUROC: 0.0859
Epoch 5/20
Training Epoch 5: 100% | 131/131 [05:15<00:00, 2.41s/it,
train_loss=0.489]
Validating Epoch 5: 100% | 94/94 [00:44<00:00, 2.11it/s,
val_loss=0.305]
Epoch [4/20], Train Loss: 0.4892, Val Loss: 0.3052, Train Accuracy: 76.22%, Val
Accuracy: 89.19%, Val AUROC: 0.8441, Partial AUROC: 0.1042
Epoch 6/20
Training Epoch 6: 100% | 131/131 [05:40<00:00, 2.60s/it,
train loss=0.447]
Validating Epoch 6: 100% | 94/94 [00:43<00:00, 2.14it/s,
val loss=0.304]
Epoch [5/20], Train Loss: 0.4469, Val Loss: 0.3045, Train Accuracy: 78.42%, Val
Accuracy: 88.19%, Val AUROC: 0.8289, Partial AUROC: 0.0956
Epoch 7/20
Training Epoch 7: 100% | 131/131 [05:14<00:00, 2.40s/it,
train_loss=0.42]
Validating Epoch 7: 100% | 94/94 [00:50<00:00, 1.86it/s,
val_loss=0.349]
Epoch [6/20], Train Loss: 0.4203, Val Loss: 0.3491, Train Accuracy: 80.48%, Val
Accuracy: 86.98%, Val AUROC: 0.8373, Partial AUROC: 0.0920
Epoch 8/20
```

```
Training Epoch 8: 100% | 131/131 [05:10<00:00, 2.37s/it,
train_loss=0.43]
Validating Epoch 8: 100% | 94/94 [00:43<00:00, 2.14it/s,
val_loss=0.312]
Epoch [7/20], Train Loss: 0.4297, Val Loss: 0.3118, Train Accuracy: 81.87%, Val
Accuracy: 89.87%, Val AUROC: 0.8523, Partial AUROC: 0.1042
Epoch 9/20
Training Epoch 9: 100% | 131/131 [05:18<00:00, 2.43s/it,
train_loss=0.425]
Validating Epoch 9: 100% | 94/94 [00:46<00:00, 2.01it/s,
val_loss=0.299]
Epoch [8/20], Train Loss: 0.4247, Val Loss: 0.2988, Train Accuracy: 81.05%, Val
Accuracy: 87.58%, Val AUROC: 0.8513, Partial AUROC: 0.1092
Epoch 10/20
Training Epoch 10: 100% | 131/131 [05:25<00:00, 2.49s/it,
train_loss=0.431]
Validating Epoch 10: 100% | 94/94 [00:45<00:00, 2.08it/s,
val loss=0.279]
Epoch [9/20], Train Loss: 0.4310, Val Loss: 0.2791, Train Accuracy: 80.86%, Val
Accuracy: 89.66%, Val AUROC: 0.8521, Partial AUROC: 0.1027
Epoch 11/20
Training Epoch 11: 100% | 131/131 [05:18<00:00, 2.43s/it,
train_loss=0.416]
Validating Epoch 11: 100% | 94/94 [00:43<00:00, 2.14it/s,
val_loss=0.277]
Epoch [10/20], Train Loss: 0.4158, Val Loss: 0.2772, Train Accuracy: 81.39%,
Val Accuracy: 88.39%, Val AUROC: 0.8581, Partial AUROC: 0.1050
Epoch 12/20
Training Epoch 12: 100% | 131/131 [05:13<00:00, 2.39s/it,
train loss=0.407]
Validating Epoch 12: 100% | 94/94 [00:52<00:00, 1.79it/s,
val loss=0.266]
Epoch [11/20], Train Loss: 0.4066, Val Loss: 0.2660, Train Accuracy: 82.54%,
Val Accuracy: 89.13%, Val AUROC: 0.8576, Partial AUROC: 0.1023
Epoch 13/20
Training Epoch 13: 100% | 131/131 [05:18<00:00, 2.43s/it,
train_loss=0.388]
Validating Epoch 13: 100% | 94/94 [00:44<00:00, 2.13it/s,
val loss=0.219]
Epoch [12/20], Train Loss: 0.3880, Val Loss: 0.2191, Train Accuracy: 82.82%,
Val Accuracy: 91.48%, Val AUROC: 0.8625, Partial AUROC: 0.0991
Epoch 14/20
```

```
Training Epoch 14: 100% | 131/131 [06:10<00:00, 2.83s/it,
train_loss=0.398]
Validating Epoch 14: 100% | 94/94 [00:46<00:00, 2.03it/s,
val_loss=0.226]
Epoch [13/20], Train Loss: 0.3977, Val Loss: 0.2260, Train Accuracy: 82.78%,
Val Accuracy: 91.61%, Val AUROC: 0.8746, Partial AUROC: 0.1091
Epoch 15/20
Training Epoch 15: 100% | 131/131 [05:09<00:00, 2.36s/it,
train_loss=0.378]
Validating Epoch 15: 100% | 94/94 [00:47<00:00, 1.98it/s,
val_loss=0.233]
Epoch [14/20], Train Loss: 0.3779, Val Loss: 0.2329, Train Accuracy: 83.49%,
Val Accuracy: 91.14%, Val AUROC: 0.8660, Partial AUROC: 0.1090
Epoch 16/20
Training Epoch 16: 100% | 131/131 [05:25<00:00, 2.48s/it,
train_loss=0.37]
Validating Epoch 16: 100% | 94/94 [00:43<00:00, 2.16it/s,
val loss=0.242]
Epoch [15/20], Train Loss: 0.3698, Val Loss: 0.2419, Train Accuracy: 83.83%,
Val Accuracy: 91.28%, Val AUROC: 0.8614, Partial AUROC: 0.1006
Epoch 17/20
Training Epoch 17: 100% | 131/131 [05:33<00:00, 2.55s/it,
train_loss=0.355]
Validating Epoch 17: 100% | 94/94 [00:43<00:00, 2.17it/s,
val_loss=0.258]
Epoch [16/20], Train Loss: 0.3550, Val Loss: 0.2578, Train Accuracy: 83.73%,
Val Accuracy: 89.60%, Val AUROC: 0.8662, Partial AUROC: 0.1025
Epoch 18/20
Training Epoch 18: 100% | 131/131 [05:12<00:00, 2.39s/it,
train loss=0.336]
Validating Epoch 18: 100% | 94/94 [00:45<00:00, 2.06it/s,
val loss=0.245]
Epoch [17/20], Train Loss: 0.3360, Val Loss: 0.2455, Train Accuracy: 84.07%,
Val Accuracy: 90.60%, Val AUROC: 0.8636, Partial AUROC: 0.1007
Early stopping triggered at epoch 17
Best Epoch: 13, Best Validation Loss: 0.2191
Training Complete
```





Classification	on Report:			
	precision	recall	f1-score	support
	-			
Class 0	0.98	0.92	0.95	1431
Class 1	0.24	0.64	0.35	59
accuracy			0.91	1490

```
0.95
                                   0.91
                                             0.93
     weighted avg
                                                       1490
[37]: CustomImageFeatureEfficientNet(
        (efficientnet): Sequential(
          (0): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(3, 32, kernel_size=(3, 3), stride=(2, 2), padding=(1, 1),
      bias=False)
              (1): BatchNorm2d(32, eps=1e-05, momentum=0.1, affine=True,
      track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Sequential(
              (0): MBConv(
                (block): Sequential(
                  (0): Conv2dNormActivation(
                    (0): Conv2d(32, 32, kernel_size=(3, 3), stride=(1, 1), padding=(1,
      1), groups=32, bias=False)
                    (1): BatchNorm2d(32, eps=1e-05, momentum=0.1, affine=True,
      track_running_stats=True)
                    (2): SiLU(inplace=True)
                  (1): SqueezeExcitation(
                    (avgpool): AdaptiveAvgPool2d(output_size=1)
                    (fc1): Conv2d(32, 8, kernel_size=(1, 1), stride=(1, 1))
                    (fc2): Conv2d(8, 32, kernel size=(1, 1), stride=(1, 1))
                    (activation): SiLU(inplace=True)
                    (scale activation): Sigmoid()
                  (2): Conv2dNormActivation(
                    (0): Conv2d(32, 16, kernel size=(1, 1), stride=(1, 1), bias=False)
                    (1): BatchNorm2d(16, eps=1e-05, momentum=0.1, affine=True,
      track_running_stats=True)
                )
                (stochastic_depth): StochasticDepth(p=0.0, mode=row)
              )
            (2): Sequential(
              (0): MBConv(
                (block): Sequential(
                  (0): Conv2dNormActivation(
                    (0): Conv2d(16, 96, kernel_size=(1, 1), stride=(1, 1), bias=False)
                    (1): BatchNorm2d(96, eps=1e-05, momentum=0.1, affine=True,
      track_running_stats=True)
```

0.61

macro avg

0.78

0.65

1490

```
(2): SiLU(inplace=True)
            )
            (1): Conv2dNormActivation(
              (0): Conv2d(96, 96, kernel_size=(3, 3), stride=(2, 2), padding=(1,
1), groups=96, bias=False)
              (1): BatchNorm2d(96, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output size=1)
              (fc1): Conv2d(96, 4, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(4, 96, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(96, 24, kernel_size=(1, 1), stride=(1, 1), bias=False)
              (1): BatchNorm2d(24, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic_depth): StochasticDepth(p=0.0125, mode=row)
        )
        (1): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(24, 144, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(144, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(144, 144, kernel_size=(3, 3), stride=(1, 1),
padding=(1, 1), groups=144, bias=False)
              (1): BatchNorm2d(144, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(144, 6, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(6, 144, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
```

```
(3): Conv2dNormActivation(
              (0): Conv2d(144, 24, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(24, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
            )
          )
          (stochastic_depth): StochasticDepth(p=0.025, mode=row)
        )
      )
      (3): Sequential(
        (0): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(24, 144, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(144, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(144, 144, kernel_size=(5, 5), stride=(2, 2),
padding=(2, 2), groups=144, bias=False)
              (1): BatchNorm2d(144, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(144, 6, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(6, 144, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(144, 40, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(40, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic_depth): StochasticDepth(p=0.037500000000000006, mode=row)
        (1): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(40, 240, kernel_size=(1, 1), stride=(1, 1),
```

```
bias=False)
              (1): BatchNorm2d(240, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(240, 240, kernel_size=(5, 5), stride=(1, 1),
padding=(2, 2), groups=240, bias=False)
              (1): BatchNorm2d(240, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(240, 10, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(10, 240, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(240, 40, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(40, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
          (stochastic_depth): StochasticDepth(p=0.05, mode=row)
        )
      (4): Sequential(
        (0): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(40, 240, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(240, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(240, 240, kernel_size=(3, 3), stride=(2, 2),
padding=(1, 1), groups=240, bias=False)
              (1): BatchNorm2d(240, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
```

```
(avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(240, 10, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(10, 240, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(240, 80, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(80, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic_depth): StochasticDepth(p=0.0625, mode=row)
        )
        (1): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(80, 480, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(480, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(480, 480, kernel size=(3, 3), stride=(1, 1),
padding=(1, 1), groups=480, bias=False)
              (1): BatchNorm2d(480, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(480, 20, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(20, 480, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(480, 80, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(80, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic_depth): StochasticDepth(p=0.07500000000000001, mode=row)
```

```
(2): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(80, 480, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(480, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(480, 480, kernel size=(3, 3), stride=(1, 1),
padding=(1, 1), groups=480, bias=False)
              (1): BatchNorm2d(480, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(480, 20, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(20, 480, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(480, 80, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(80, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic depth): StochasticDepth(p=0.0875000000000001, mode=row)
        )
      (5): Sequential(
        (0): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(80, 480, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(480, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(480, 480, kernel_size=(5, 5), stride=(1, 1),
padding=(2, 2), groups=480, bias=False)
              (1): BatchNorm2d(480, eps=1e-05, momentum=0.1, affine=True,
```

```
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(480, 20, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(20, 480, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(480, 112, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(112, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic_depth): StochasticDepth(p=0.1, mode=row)
        (1): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(112, 672, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(672, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(672, 672, kernel_size=(5, 5), stride=(1, 1),
padding=(2, 2), groups=672, bias=False)
              (1): BatchNorm2d(672, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(672, 28, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(28, 672, kernel size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(672, 112, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(112, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
```

```
)
          )
          (stochastic_depth): StochasticDepth(p=0.1125, mode=row)
        (2): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(112, 672, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(672, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(672, 672, kernel_size=(5, 5), stride=(1, 1),
padding=(2, 2), groups=672, bias=False)
              (1): BatchNorm2d(672, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(672, 28, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(28, 672, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(672, 112, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(112, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          (stochastic_depth): StochasticDepth(p=0.125, mode=row)
        )
      (6): Sequential(
        (0): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(112, 672, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(672, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
```

```
(1): Conv2dNormActivation(
              (0): Conv2d(672, 672, kernel_size=(5, 5), stride=(2, 2),
padding=(2, 2), groups=672, bias=False)
              (1): BatchNorm2d(672, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(672, 28, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(28, 672, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale activation): Sigmoid()
            )
            (3): Conv2dNormActivation(
              (0): Conv2d(672, 192, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(192, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic_depth): StochasticDepth(p=0.1375, mode=row)
        (1): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(192, 1152, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(1152, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(1152, 1152, kernel_size=(5, 5), stride=(1, 1),
padding=(2, 2), groups=1152, bias=False)
              (1): BatchNorm2d(1152, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(1152, 48, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(48, 1152, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
```

```
(0): Conv2d(1152, 192, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(192, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic_depth): StochasticDepth(p=0.15000000000000000, mode=row)
        )
        (2): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(192, 1152, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(1152, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(1152, 1152, kernel_size=(5, 5), stride=(1, 1),
padding=(2, 2), groups=1152, bias=False)
              (1): BatchNorm2d(1152, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output size=1)
              (fc1): Conv2d(1152, 48, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(48, 1152, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            )
            (3): Conv2dNormActivation(
              (0): Conv2d(1152, 192, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(192, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic depth): StochasticDepth(p=0.1625, mode=row)
        )
        (3): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(192, 1152, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(1152, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
```

```
(2): SiLU(inplace=True)
            )
            (1): Conv2dNormActivation(
              (0): Conv2d(1152, 1152, kernel_size=(5, 5), stride=(1, 1),
padding=(2, 2), groups=1152, bias=False)
              (1): BatchNorm2d(1152, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(1152, 48, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(48, 1152, kernel_size=(1, 1), stride=(1, 1))
              (activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(1152, 192, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(192, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
            )
          (stochastic_depth): StochasticDepth(p=0.17500000000000000, mode=row)
        )
      (7): Sequential(
        (0): MBConv(
          (block): Sequential(
            (0): Conv2dNormActivation(
              (0): Conv2d(192, 1152, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(1152, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
              (2): SiLU(inplace=True)
            (1): Conv2dNormActivation(
              (0): Conv2d(1152, 1152, kernel_size=(3, 3), stride=(1, 1),
padding=(1, 1), groups=1152, bias=False)
              (1): BatchNorm2d(1152, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
              (2): SiLU(inplace=True)
            (2): SqueezeExcitation(
              (avgpool): AdaptiveAvgPool2d(output_size=1)
              (fc1): Conv2d(1152, 48, kernel_size=(1, 1), stride=(1, 1))
              (fc2): Conv2d(48, 1152, kernel_size=(1, 1), stride=(1, 1))
```

```
(activation): SiLU(inplace=True)
              (scale_activation): Sigmoid()
            (3): Conv2dNormActivation(
              (0): Conv2d(1152, 320, kernel_size=(1, 1), stride=(1, 1),
bias=False)
              (1): BatchNorm2d(320, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
          )
          (stochastic depth): StochasticDepth(p=0.1875, mode=row)
        )
      (8): Conv2dNormActivation(
        (0): Conv2d(320, 1280, kernel_size=(1, 1), stride=(1, 1), bias=False)
        (1): BatchNorm2d(1280, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
        (2): SiLU(inplace=True)
      )
    (1): AdaptiveAvgPool2d(output_size=1)
  (fc_image): Sequential(
    (0): Linear(in features=1280, out features=1024, bias=True)
    (1): ReLU()
    (2): BatchNorm1d(1024, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
    (3): Dropout(p=0.8, inplace=False)
    (4): Linear(in_features=1024, out_features=512, bias=True)
    (5): ReLU()
    (6): BatchNorm1d(512, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
  )
  (fc_extracted_features): Sequential(
    (0): Linear(in_features=525, out_features=512, bias=True)
    (1): ReLU()
    (2): BatchNorm1d(512, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
    (3): Dropout(p=0.8, inplace=False)
    (4): Linear(in_features=512, out_features=256, bias=True)
    (5): ReLU()
    (6): BatchNorm1d(256, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
  (fc_pca_features): Sequential(
    (0): Linear(in_features=70, out_features=256, bias=True)
    (1): ReLU()
```

```
(2): BatchNorm1d(256, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
    (3): Dropout(p=0.8, inplace=False)
    (4): Linear(in_features=256, out_features=128, bias=True)
    (5): ReLU()
    (6): BatchNorm1d(128, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
  (fc metadata): Sequential(
    (0): Linear(in_features=9, out_features=128, bias=True)
    (1): ReLU()
    (2): BatchNorm1d(128, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
    (3): Dropout(p=0.8, inplace=False)
    (4): Linear(in_features=128, out_features=64, bias=True)
    (5): ReLU()
    (6): BatchNorm1d(64, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
  )
  (fc_combined): Sequential(
    (0): Linear(in_features=960, out_features=256, bias=True)
    (1): ReLU()
    (2): BatchNorm1d(256, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
    (3): Dropout(p=0.8, inplace=False)
    (4): Linear(in features=256, out features=64, bias=True)
    (5): ReLU()
    (6): Linear(in features=64, out features=1, bias=True)
 )
)
```

## 0.5 Model performance on test data

```
except Exception as e:
   print(f"Error loading model: {e}")
   raise
# Set the model to evaluation mode
final_model.eval()
# Initialize lists to store true labels and predicted probabilities
all labels, all probs = [], []
misclassified_images = []
# Disable gradient calculation for evaluation to save memory and computation
with torch.no grad():
   try:
        for i, (image, extracted features, pca features, metadata, labels) inu
 ⇔enumerate(effnet_test_dataloader):
            # Move data to the specified device
            image, extracted_features, pca_features, metadata, labels = (
                image.to(device),
                extracted_features.to(device),
                pca features.to(device),
                metadata.to(device),
                labels.float().to(device).unsqueeze(1) # Ensure labels have
 ⇔the correct shape
            )
            # Get the model's predictions
            probs = final_model(image, extracted_features, pca_features,_
 →metadata)
            # Store true labels and predicted probabilities for analysis
            all_labels.extend(labels.cpu().numpy())
            all_probs.extend(probs.cpu().numpy())
            # Calculate binary predictions (0 or 1)
            predicted = (probs > 0.5).float()
            misclassified_indices = (predicted != labels).squeeze().cpu().
 →numpy()
            # Identify misclassified images and store them
            for j, is_misclassified in enumerate(misclassified_indices):
                if is_misclassified and labels[j].cpu().item() == 1:
                    misclassified_images.append((image[j].cpu(), labels[j].
 ocpu(), probs[j].item())) # .item() converts the tensor to a float
        # Calculate partial AUROC for the predictions
        partial_auroc = score(np.array(all_labels), np.array(all_probs))
```

```
print(f'The partial AUROC of the final model on the test image is \Box

√{partial_auroc:.4f}')

       # Print a classification report
      print(classification_report(all_labels, (np.array(all_probs) >= 0.5).
→astype(int), target names=["Class 0", "Class 1"]))
       # Display a few misclassified images if any
       # Display a few misclassified images if any
       if misclassified_images:
           print(f"Total misclassified images with true label 1: __
→{len(misclassified images)}")
           for i, (img, true_label, pred_prob) in_
→enumerate(misclassified_images[:5]):
               img = img.permute(1, 2, 0).numpy() # Convert from PyTorch

∪
→tensor format to NumPy array
               # Ensure the image is within the range [0, 1] for floats
               if img.dtype == np.float32 or img.dtype == np.float64:
                   img = np.clip((img - img.min()) / (img.max() - img.min()),__
\hookrightarrow 0, 1)
               # Ensure the image is within the range [0, 255] for integers
               elif img.dtype == np.int32 or img.dtype == np.int64:
                   img = np.clip(img, 0, 255).astype(np.uint8)
               plt.imshow(img, cmap="gray" if img.shape[-1] == 1 else None) #__
⇔Display as grayscale if needed
               plt.title(f'True Label: {true_label}, Predicted Prob:⊔
→{pred_prob:.4f}')
               plt.axis('off')
               plt.show()
  except Exception as e:
      print(f"Error during model evaluation: {e}")
```

```
/home/jupyter-sohka/.local/lib/python3.10/site-
packages/torchvision/models/_utils.py:208: UserWarning: The parameter
'pretrained' is deprecated since 0.13 and may be removed in the future, please
use 'weights' instead.
   warnings.warn(
/home/jupyter-sohka/.local/lib/python3.10/site-
packages/torchvision/models/_utils.py:223: UserWarning: Arguments other than a
weight enum or `None` for 'weights' are deprecated since 0.13 and may be removed
```

in the future. The current behavior is equivalent to passing
`weights=EfficientNet\_BO\_Weights.IMAGENET1K\_V1`. You can also use
`weights=EfficientNet\_BO\_Weights.DEFAULT` to get the most up-to-date weights.
 warnings.warn(msg)

/tmp/ipykernel\_1621439/2933086743.py:7: FutureWarning: You are using `torch.load` with `weights\_only=False` (the current default value), which uses the default pickle module implicitly. It is possible to construct malicious pickle data which will execute arbitrary code during unpickling (See https://github.com/pytorch/pytorch/blob/main/SECURITY.md#untrusted-models for more details). In a future release, the default value for `weights\_only` will be flipped to `True`. This limits the functions that could be executed during unpickling. Arbitrary objects will no longer be allowed to be loaded via this mode unless they are explicitly allowlisted by the user via `torch.serialization.add\_safe\_globals`. We recommend you start setting `weights\_only=True` for any use case where you don't have full control of the loaded file. Please open an issue on GitHub for any issues related to this experimental feature.

final\_model.load\_state\_dict(torch.load(final\_model\_path,
map\_location=torch.device("cpu")))

EfficientNet loaded successfully.

Model loaded successfully.

The partial AUROC of the final model on the test image is 0.1226 precision recall f1-score support

Class 0	0.98	0.92	0.95	1431
Class 1	0.23	0.56	0.33	59
accuracy			0.91	1490
macro avg	0.61	0.74	0.64	1490
weighted avg	0.95	0.91	0.93	1490

Total misclassified images with true label 1: 26

True Label: tensor([1.]), Predicted Prob: 0.3641



True Label: tensor([1.]), Predicted Prob: 0.4236



True Label: tensor([1.]), Predicted Prob: 0.0758



True Label: tensor([1.]), Predicted Prob: 0.2860



True Label: tensor([1.]), Predicted Prob: 0.2469



By analyzing the training and validation loss at the best epoch, as well as the test data performance metrics (with a key metric value partial AUROC of 0.124 and a recall for Class 1 at 0.64), I conclude that the newly added features and augmentations did not significantly improve the predictive results. Compared to the previous week's winning model using the original training data, which had a recall for Class 1 of 0.61 and a partial AUROC of 0.136, there was only a slight decrease in key metric.

[]:	
[]:	