

Model Development Phase

Project Name: COVID-19 Chest X-Ray Image Classification

Model Selection Report

In this project, multiple deep learning approaches were evaluated for classifying chest X-ray images into three categories: COVID-19, Bacterial Pneumonia, and Normal. Factors such as training accuracy, validation accuracy, confusion matrix, and loss curves were considered to select the most suitable model.

Models:

Model 1: VGG16 (Transfer Learning) :

- Pretrained CNN (VGG16) using ImageNet weights.
- Added custom dense layers (Flatten → Dense → Dropout → Softmax).
- Achieved strong performance and generalization due to transfer learning.
- Selected as the final model.

Model Development Steps :

Model steps	Description
Step 1: Dataset Loading & Preprocessing	Loaded chest X-ray dataset from train, validation, and test folders. Resized all

	<p>images to 64×64, normalized pixel values (rescale 0–1), and generated batches with ImageDataGenerator.</p> <pre> [1]: import os os.listdir("chest_xray_covid/Data") [1]: ['test', 'train'] [2]: Image_size = [64, 64] train_path = 'chest_xray_covid/Data/train' test_path = 'chest_xray_covid/Data/test' </pre>
Step 2: Splitting Dataset	<p>Used ImageDataGenerator with Validation_split = 0.2 to automatically split training data into 80% training and 20% validation. Separate test set used for final evaluation.</p> <pre> [3]: import tensorflow as tf from tensorflow import keras from tensorflow.keras.preprocessing.image import ImageDataGenerator # Rescale images train_datagen = ImageDataGenerator(rescale=1./255, validation_split=0.2 # <-- split 20% of train into validation) test_datagen = ImageDataGenerator(rescale=1./255) # Training set (80% of train data) training_set = train_datagen.flow_from_directory('chest_xray_covid/Data/train', target_size=(64, 64), batch_size=32, class_mode='categorical', subset='training', # <-- important seed=42) # Validation set (20% of train data) val_set = train_datagen.flow_from_directory('chest_xray_covid/Data/train', target_size=(64, 64), batch_size=32, class_mode='categorical', subset='validation', # <-- important seed=42) # Test set (uses separate test folder) test_set = test_datagen.flow_from_directory('chest_xray_covid/Data/test', target_size=(64, 64), batch_size=32, class_mode='categorical') </pre>
Step 3: Label Encoding	<p>Labels (COVID-19, Normal, Bacteria) were automatically one-hot encoded by flow_from_directory.</p>

	<pre> # Training set (80% of train data) training_set = train_datagen.flow_from_directory('chest_xray_covid/Data/train', target_size=(64, 64), batch_size=32, class_mode='categorical', subset='training', # <-- important seed=42) # Validation set (20% of train data) val_set = train_datagen.flow_from_directory('chest_xray_covid/Data/train', target_size=(64, 64), batch_size=32, class_mode='categorical', subset='validation', # <-- important seed=42) # Test set (uses separate test folder) test_set = test_datagen.flow_from_directory('chest_xray_covid/Data/test', target_size=(64, 64), batch_size=32, class_mode='categorical' </pre>
Step 4: Training the model	<p>Custom CNN trained as baseline. VGG16 Transfer Learning fine-tuned with additional dense layers for classification.</p> <pre> 4]: from keras.applications import VGG16 from tensorflow.keras.models import Model from tensorflow.keras.layers import Dense, Flatten, Dropout, Input 5]: base_model = VGG16(input_shape = (64, 64, 3), include_top=False, weights="imagenet") 6]: inp = base_model.input x = base_model.output x = Flatten()(x) x = Dense(1024, activation = 'relu')(x) x = Dropout(0.5)(x) output = Dense(3, activation = 'softmax')(x) model = Model(inputs = inp, outputs = output) 7]: model.summary() </pre>
Step 5: Evaluation	<p>Compared models using training/validation accuracy, loss curves, and confusion matrix. VGG16 achieved higher accuracy and stability, making it the chosen model.</p> <pre>]: model.compile(loss = 'categorical_crossentropy', optimizer = 'adam', metrics = ['accuracy'])]: test_loss, test_acc = model.evaluate(test_set) 41/41 ----- 36s 85ms/step - accuracy: 0.8968 - loss: 0.4168]: history = model.fit(training_set, epochs = 2, validation_data = val_set) Epoch 1/2 ----- 611s 5s/step - accuracy: 0.6361 - loss: 1.0127 - val_accuracy: 0.6663 - val_loss: 0.7671 129/129 ----- Epoch 2/2 ----- 597s 5s/step - accuracy: 0.7711 - loss: 0.5981 - val_accuracy: 0.8638 - val_loss: 0.4536 129/129 ----- </pre>
Step 6: Prediction	<p>The final VGG16-based model was used to predict disease class on unseen test X-ray images.</p>

```

16]: from flask import Flask, request, render_template_string
    from werkzeug.utils import secure_filename
    import numpy as np
    from tensorflow.keras.preprocessing import image
    from tensorflow.keras.models import load_model
    import os

    # -----
    # Initialize Flask app
    # -----
    app = Flask(__name__)

    UPLOAD_FOLDER = "uploads"
    os.makedirs(UPLOAD_FOLDER, exist_ok=True)
    app.config['UPLOAD_FOLDER'] = UPLOAD_FOLDER

    # -----
    # Model and Class Labels
    # -----
    class_labels = ["COVID-19", "Normal", "Bacteria"]

    try:
        model = load_model("covid.h5") # replace with your model path
    except Exception as e:
        print(f"Error loading model: {e}")
        model = None

IMG_SIZE = (64, 64) # Change to match your model input size

# -----
# Home route
# -----
@app.route('/')
def home():
    return render_template_string("""
    <h2>Chest X-ray Classification</h2>
    <form action="/predict" method="post" enctype="multipart/form-data">
    <label>Select an X-ray image:</label>
    <input type="file" name="file" required>
    <button type="submit">Predict</button>
    </form>
    """)

# -----
# Prediction route
# -----
@app.route('/predict', methods=['POST'])
def predict():
    if model is None:
        return "Model is not loaded. Please check server logs."

    if 'file' not in request.files:
        return "No file uploaded."

    # Save the uploaded file
    filepath = os.path.join(app.config['UPLOAD_FOLDER'], secure_filename(file.filename))
    file.save(filepath)

    try:
        # Preprocess the image
        img = image.load_img(filepath, target_size=IMG_SIZE)
        img_array = image.img_to_array(img)
        img_array = np.expand_dims(img_array, axis=0) / 255.0 # normalize

        # Predict
        preds = model.predict(img_array)
        predicted_class_idx = np.argmax(preds, axis=1)[0]
        confidence = np.max(preds)
        predicted_label = class_labels[predicted_class_idx]

    except Exception as e:
        return f"Prediction failed: {e}"

    # Return the result
    return render_template_string("""
    <h2>Prediction Result</h2>
    <p><b>Predicted Class:</b> {{ label }}</p>
    <p><b>Confidence:</b> {{ conf | round(2) }}</p>
    <a href="/">Go Back</a>
    """, label=predicted_label, conf=float(confidence))

```

```
# Run app
# -----
if __name__ == "__main__":
    # In Jupyter, avoid signal issues
    app.run(debug=False, use_reloader=False)
```

WARNING:absl:Compiled the loaded model, but the compiled metrics have yet to be built. 'model.compile_metrics' will be empty until you train or evaluate the model.

- * 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

!): pip install flask pyngrok

Requirement already satisfied: flask in c:\users\lenovo\appdata\local\programs\python\python311\lib\site-packages (3.1.2)

Requirement already satisfied: pyngrok in c:\users\lenovo\appdata\local\programs\python\python311\lib\site-packages (7.1.12)

Requirement already satisfied: blinker>=1.9.0 in c:\users\lenovo\appdata\local\programs\python\python311\lib\site-packages (from flask) (1.9.0)

Requirement already satisfied: click>=8.1.3 in c:\users\lenovo\appdata\local\programs\python\python311\lib\site-packages (from flask) (8.1.8)

Requirement already satisfied: itsdangerous>=2.2.0 in c:\users\lenovo\appdata\local\programs\python\python311\lib\site-packages (from flask) (2.2.0)

Requirement already satisfied: Jinja2>=3.1.2 in c:\users\lenovo\appdata\local\programs\python\python311\lib\site-packages (from flask) (3.1.2)

```
import threading

ngrok.kill()

public_url = ngrok.connect(5000)
print(" * Ngrok tunnel URL:", public_url)

def run_app():
    app.run(port=5000)

thread = threading.Thread(target=run_app)
thread.start()
```

* Ngrok tunnel URL: NgrokTunnel: "https://nondilatable-evanescently-jeri.ngrok-free.dev" -> "http://localhost:5000"

- * 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.

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INFO:werkzeug:Press CTRL+C to quit

INFO:werkzeug:127.0.0.1 - - [02/Oct/2025 05:31:14] "GET / HTTP/1.1" 200 -

1/1 ----- 1s 884ms/step

INFO:werkzeug:127.0.0.1 - - [02/Oct/2025 05:31:27] "POST /predict HTTP/1.1" 200 -