MLOps Project Report

Project Name: Cryptographically Secured Healthcare Consortia for Federated Learning setup

Introduction

This project is based upon the concept of Federated Learning. Federated Learning is a technique that enables a large number of users to locally train a model on local datasets. The knowledge (trained weights) of these models is then shared on a network and it is aggregated into a bigger model. All of this is done without sharing any data. Though FL ensures that data remains anonymous to the silos part of the system, there is still a risk of various privacy attacks during the training process. The proposed solution in this project is an encryption algorithm as a measure for privacy preservation in a FL model. A horizontal cross silo Federated Learning model is developed that provides prediction for chest diseases in a healthcare setup. CNN model is used to train data on individual nodes.

This report gives an overview of the steps taken to automate the processes involved in this project. Various MLOps techniques have been applied to integrate and maintain machine learning models efficiently.

Data Version Control (DVC)

DVC has been used to version control project files. To implement federated learning weights are extracted from all the models from their respective clients. The weights are stored in .pth files. They are usually very large files and are updated in each iteration of federated learning. In this project three clients are taken for demonstration and therefore there are three .pth files. These are stores on google drive using dvc. The steps to add dvc files are as follows

dvc init dvc remote add mlops gdrive://1PkU39Mqsb_dB343iGaDefd4HSvm_AJmz dvc add model1.pth (model2.pth, model3.pth) dvc push -r mlops

To pull these file use the command dvc pull

Jenkins CI/CD Pipeline

Jenkins has collaborated with Github using Poll SCM. Jenkins after a set interval checks the Github repository. If any changes are made to the Github repository, a build is triggered in Jenkins. The pipeline for Jenkins is as follows:

```
pipeline {
  agent any
  stages {
     stage('Checkout') {
       steps {
          git branch: 'Malaika', url: 'https://github.com/Malaika01/MLOps-Project.git'
       }
     }
     stage('Build') {
       steps {
          script {
            // Execute the pip install command
            bat 'pip install tqdm numpy torch medmnist torchvision dataclasses pylint'
            // Run your Python script or commands here
              bat "pylint --disable=C,R,W0104 cryptogram final.py"
         }
       }
     stage('Test') {
       steps {
          script {
            // Execute the pip install command
            bat 'python unit_tests.py'
       }
    }
  }
```

Stage View

Average stage times:	Checkout	Build	Test 2min 1s
(Average <u>full</u> run time: ~1min 56s)	4s	21s	
#19 Jun 11 1 20:16 commit	5s	32s	1min 53s

<u>Docker Image</u>

Docker is used to containerize the files. An image of the cryptogram.py file which includes the code of CNN model training and encryption of the weights of CNN model is created. The image is used to create containers. The following are the commands for this

docker build -t mlops_project
docker run <id>

The dockerfile is as follows:

Use a base image with Python and necessary dependencies FROM python:3.9

Set the working directory inside the container WORKDIR /app

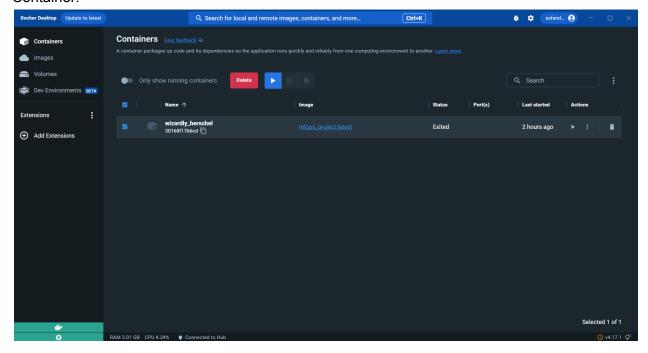
Copy the entire project directory into the container at /app COPY . /app

Install any dependencies required by your project RUN pip install -r requirements.txt

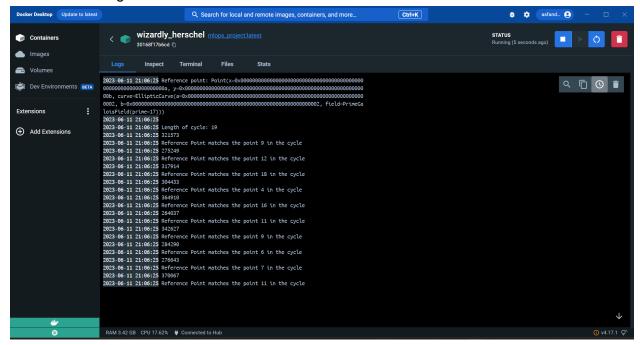
Specify the command to run your Python script CMD ["python", "cryptogram_final.py"]

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Container:



Container running:



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Mlflow

Mlflow is used to track the project. The parameters and metrics of individual and aggregated models are logged and compared.

Logs for model 1

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```
==> Evaluating ...
train auc: 0.584 acc:0.949
test auc: 0.580 acc:0.947
torch.Size([16, 1, 3, 3])
torch.Size([16])
torch.Size([16])
torch.Size([16])
torch.Size([16, 16, 3, 3])
torch.Size([16])
torch.Size([16])
torch.Size([16])
torch.Size([64, 16, 3, 3])
torch.Size([64])
torch.Size([64])
torch.Size([64])
torch.Size([64, 64, 3, 3])
torch.Size([64])
torch.Size([64])
torch.Size([64])
torch.Size([64, 64, 3, 3])
torch.Size([64])
torch.Size([64])
torch.Size([64])
torch.Size([128, 1024])
torch.Size([128])
torch.Size([128, 128])
torch.Size([128])
torch.Size([14, 128])
torch.Size([14])
```