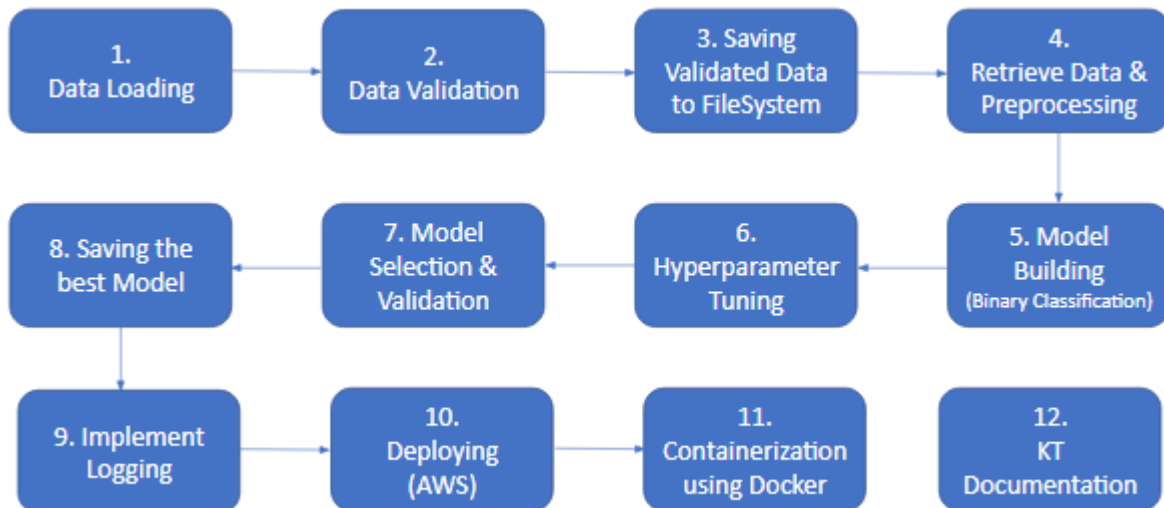


Problem Statement

To build a classification methodology to predict the chances of Epileptic Disorder based on the given training data.

The dataset contains a hashed patient ID column, 178 EEG readings over one second, and a Y output variable describing the status of the patient at that second. When a patient is having a seizure, Y is denoted as 1 while all other numbers are other statuses which means that the person is not having the disorder. So when we turn our Y variable into a binary variable, this problem becomes a binary classification problem.

Architecture



Data Description

The client will send data in multiple sets of files in batches at a given location. Data will contain “unnamed” column which is the patient id and 178 columns of 178 EEG readings over one second. The last column, Y is output variable describing the status of the patient at that second.

"Y" column will have five unique values 1, 2, 3, 4, 5.

5 - eyes open, means when they were recording the EEG signal of the brain the patient had their eyes open

4 - eyes closed, means when they were recording the EEG signal the patient had their eyes closed

-
- 3 - Yes they identify where the region of the tumor was in the brain and recording the EEG activity from the healthy brain area
 - 2 - They recorder the EEG from the area where the tumor was located
 - 1 - Recording of seizure activity

All patients falling in classes 2, 3, 4, and 5 are subjects who did not have epileptic seizure. Hence the '2,3,4,5' classes can be classified as 'With no disorder' and has been changed to class '0'.

Only subjects in class 1 have epileptic seizure.

So in summary,

"1" represents "Patient has the Epileptic disorder".

"0" represents "Patient does not hase the Epileptic disorder".

Number of Columns and their datatype to be described and adhered.

Data Validation

In this step, we perform different sets of validation on the given set of training files.

1. Number of Columns - We validate the number of columns present in the files, and if it doesn't match with the value given in the schema file, then the file is moved to "Bad_Data_Folder."
2. The datatype of columns - The datatype of columns is given in the schema file. This is validated when we insert the files into Database. If the datatype is wrong, then the file is moved to "Bad_Data_Folder".
3. Null values in columns - If any of the columns in a file have all the values as NULL or missing, we discard such a file and move it to "Bad_Data_Folder".

Model Training

1) Data Reading - The pre-processed data is read as a CSV file to be used for model training.

2) Data Preprocessing

a) Check for null values in the columns. If present, impute the null values using the KNN imputer. No null values present in the current data provided for training & testing. So this step is not needed.

b) Check for the duplicate columns. If present, remove the duplicate columns. No duplicate column present in the given dataset.

c) Check for distribution of data for Mean and Median values for columns. Data is distributed normally with respect to mean. But the data is skewed with respect to standard deviation.

d) Check for the duplicate columns. If present, remove the duplicate columns. No duplicate column present in the given dataset.

3) Outlier Detection – Large number of outliers for each feature are present. Removal of outliers will lead to significant data loss.

4) Train & Test Split – Perform 75:25 Train & Test split.

5) Standardization – Scale down the data using standard scalar to address the data skewness observed at median values.

6) Multi Collinearity – Check if the data has collinearity among the among the independent variables using the VIF function. It has been found out the all the features have high collinearity.

Feature having minimum VIF is X1 and VIF score is 77.54073101770086

Feature having maximum VIF is X162 and VIF score is 948.8775562775533

7) Principal Component Analysis – Since a strong co-linearity exists between all the features, perform

8) Class Imbalance – Class imbalance seen with 70% data belonging to class '0' and 30% data belonging to class '1'. Class Imbalance issue has been addressed 'Using Weights' as well as 'Applying SMOTE' on the train data. The method that gives better results will be taken.

9) Model Training & Selection – We are using two algorithms, "Random Forest Classifier" and "Support Vector Classifier". Both the algorithms are passed with the best parameters derived from RandomizedSearchCV. We calculate the AUC scores for both models and select the model with the best score. Model with the best score is saved for use in prediction.

Prediction Data Description

Client will send the data in form of csv files in batches at a given location OR will upload the data in the form of csv file at the UI. Data will contain 'Unnamed columns with Patient ID' and 178 columns of different EEG reading for each patient.

Number of Columns, Name of the Columns and their datatype.

Data Validation

In this step, we perform different sets of validation on the given set of training files.

1. Number of Columns - We validate the number of columns present in the files, and if it doesn't match with the value given in the schema file, then the file is moved to "Bad_Data_Folder."
2. The datatype of columns - The datatype of columns is given in the schema file. This is validated when we insert the files into Database. If the datatype is wrong, then the file is moved to "Bad_Data_Folder".
3. Null values in columns - If any of the columns in a file have all the values as NULL or missing, we discard such a file and move it to "Bad_Data_Folder".

Prediction

1) Data Reading - The pre-processed data is read as a CSV file to be used for prediction.

2) Data Preprocessing

a) Check for null values in the columns. If present, impute the null values using the KNN imputer. No null values present in the current data provided for training & testing.

b) Check for the duplicate columns. If present, remove the duplicate columns. No duplicate column present in the given dataset.

c) Check for distribution of data for Mean and Median values for columns. Data is distributed normally with respect to mean. But the data is skewed with respect to median.

d) Check for the duplicate columns. If present, remove the duplicate columns. No duplicate column present in the given dataset.

3) Prediction – The final selected model is loaded and is used to predict the data for that cluster.

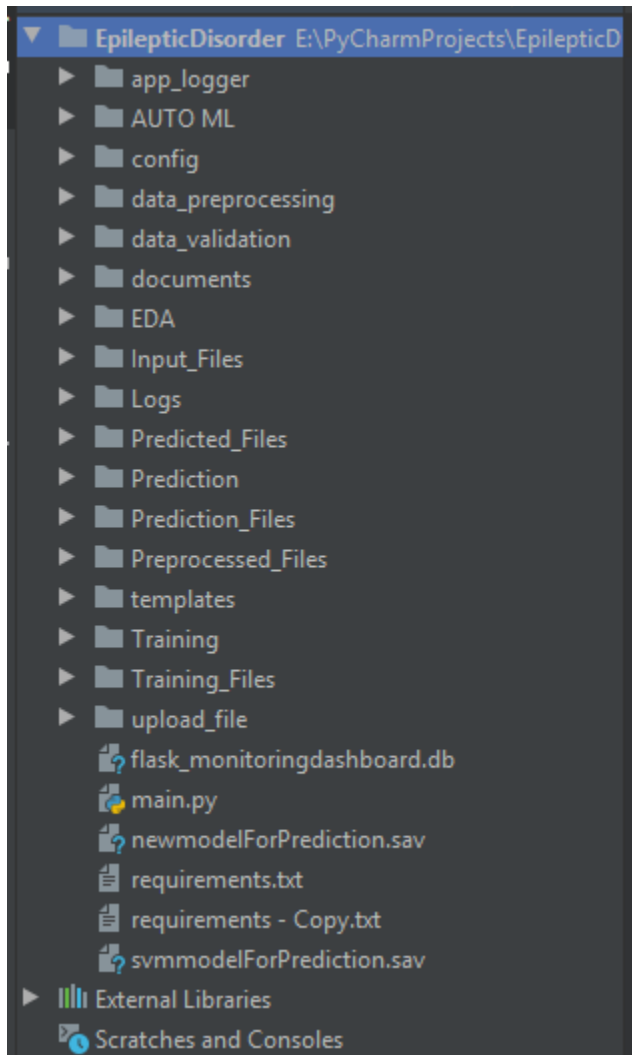
4) Once the prediction is made for all patients, the predictions are saved in a CSV file at a given location and the location is returned to the client.

Deployment Readiness

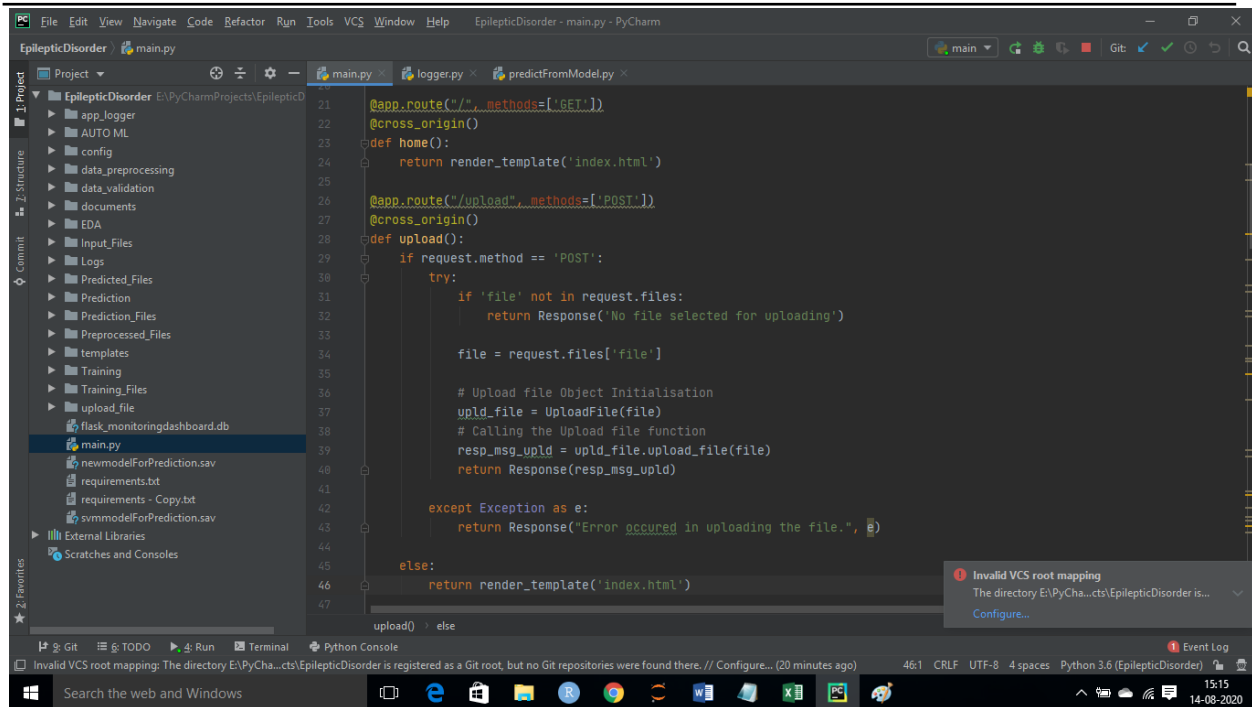
We will be deploying the model to the AWS platform.

This is a workflow diagram for the prediction of using the trained model.

Now let's see the Epileptic disorder project folder structure.



requirements.txt file consists of all the packages that you need to deploy the app in the cloud.

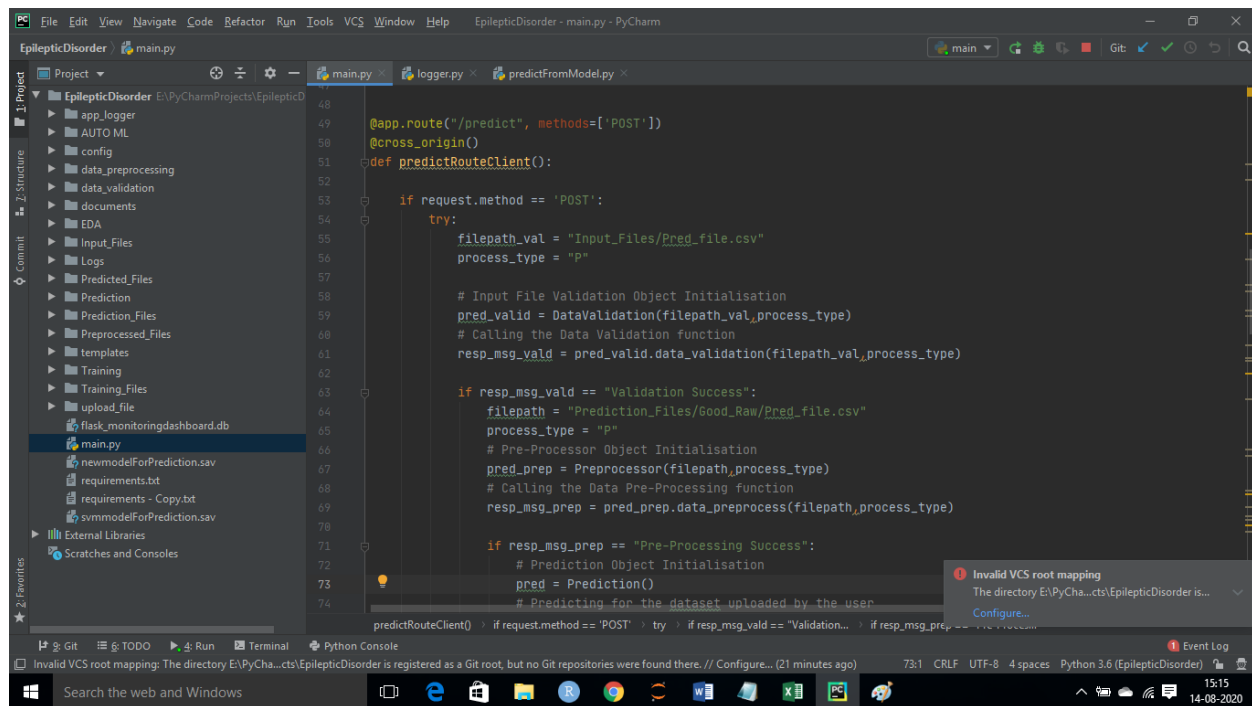


```

21 @app.route("/", methods=['GET'])
22 @cross_origin()
23 def home():
24     return render_template('index.html')
25
26 @app.route("/upload", methods=['POST'])
27 @cross_origin()
28 def upload():
29     if request.method == 'POST':
30         try:
31             if 'file' not in request.files:
32                 return Response('No file selected for uploading')
33
34             file = request.files['file']
35
36             # Upload file Object Initialisation
37             upld_file = UploadFile(file)
38             # Calling the Upload file function
39             resp_msg_upld = upld_file.upload_file(file)
40             return Response(resp_msg_upld)
41
42         except Exception as e:
43             return Response("Error occurred in uploading the file.", e)
44
45     else:
46         return render_template('index.html')
47
48 upload()

```

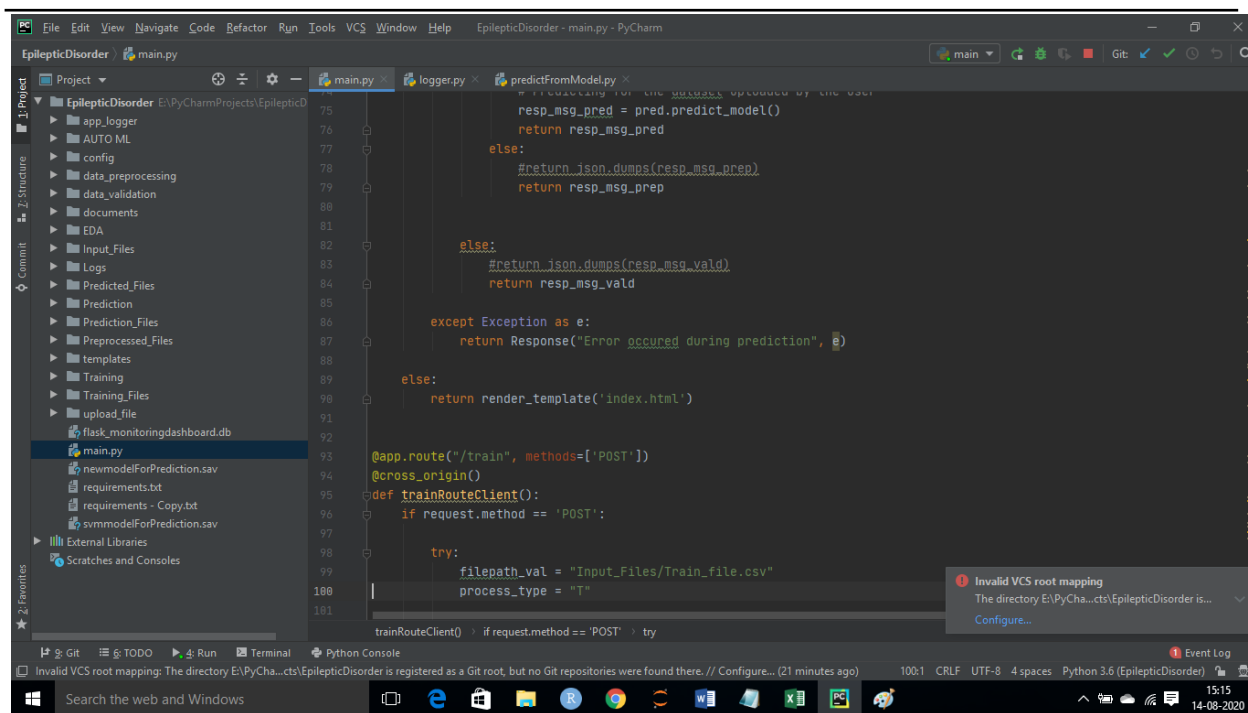
main.py is the entry point of our application, where the flask server starts. Here we will be decoding a base64 to an image, and then we will be making predictions.



```

48 @app.route("/predict", methods=['POST'])
49 @cross_origin()
50 def predictRouteClient():
51     if request.method == 'POST':
52         try:
53             filepath_val = "Input_Files/Pred_file.csv"
54             process_type = "P"
55
56             # Input File Validation Object Initialisation
57             pred_valid = DataValidation(filepath_val, process_type)
58             # Calling the Data Validation function
59             resp_msg_vald = pred_valid.data_validation(filepath_val, process_type)
60
61             if resp_msg_vald == "Validation Success":
62                 filepath = "Prediction_Files/Good_Raw/Pred_file.csv"
63                 process_type = "P"
64                 # Pre-Processor Object Initialisation
65                 pred_prep = Preprocessor(filepath, process_type)
66                 # Calling the Data Pre-Processing function
67                 resp_msg_prep = pred_prep.data_preprocess(filepath, process_type)
68
69                 if resp_msg_prep == "Pre-Processing Success":
70                     # Prediction Object Initialisation
71                     pred = Prediction()
72                     # Predicting for the dataset uploaded by the user
73                     pred.predict()
74
75 predictRouteClient()

```

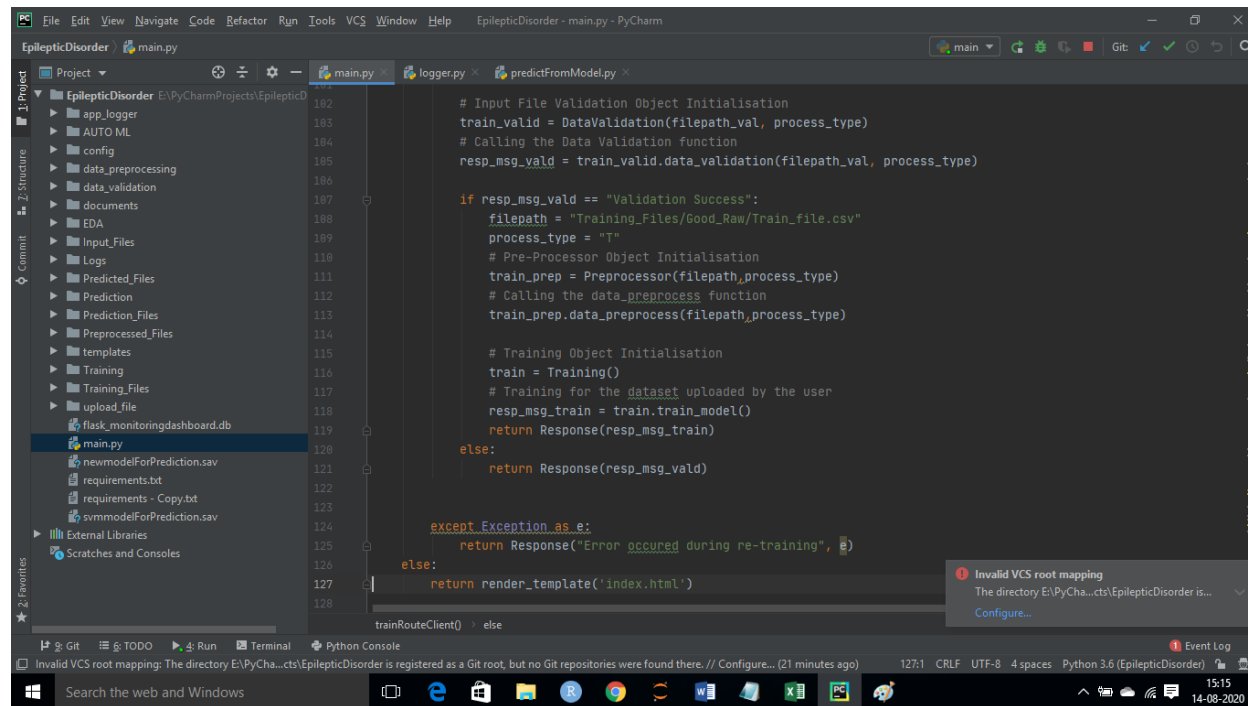


```

75     # Predicting for the dataset uploaded by the user
76     resp_msg_pred = pred.predict_model()
77     return resp_msg_pred
78
79     else:
80         #return json.dumps(resp_msg_pred)
81         return resp_msg_pred
82
83     else:
84         #return json.dumps(resp_msg_vald)
85         return resp_msg_vald
86
87     except Exception as e:
88         return Response("Error occured during prediction", e)
89
90     else:
91         return render_template('index.html')
92
93 @app.route("/train", methods=['POST'])
94 @cross_origin()
95 def trainRouteClient():
96     if request.method == 'POST':
97
98         try:
99             filepath_val = "Input_Files/Train_file.csv"
100             process_type = "T"
101
102     trainRouteClient() if request.method == 'POST' try

```

Invalid VCS root mapping
The directory E:\PyCharm\cts\EpilepticDisorder is...

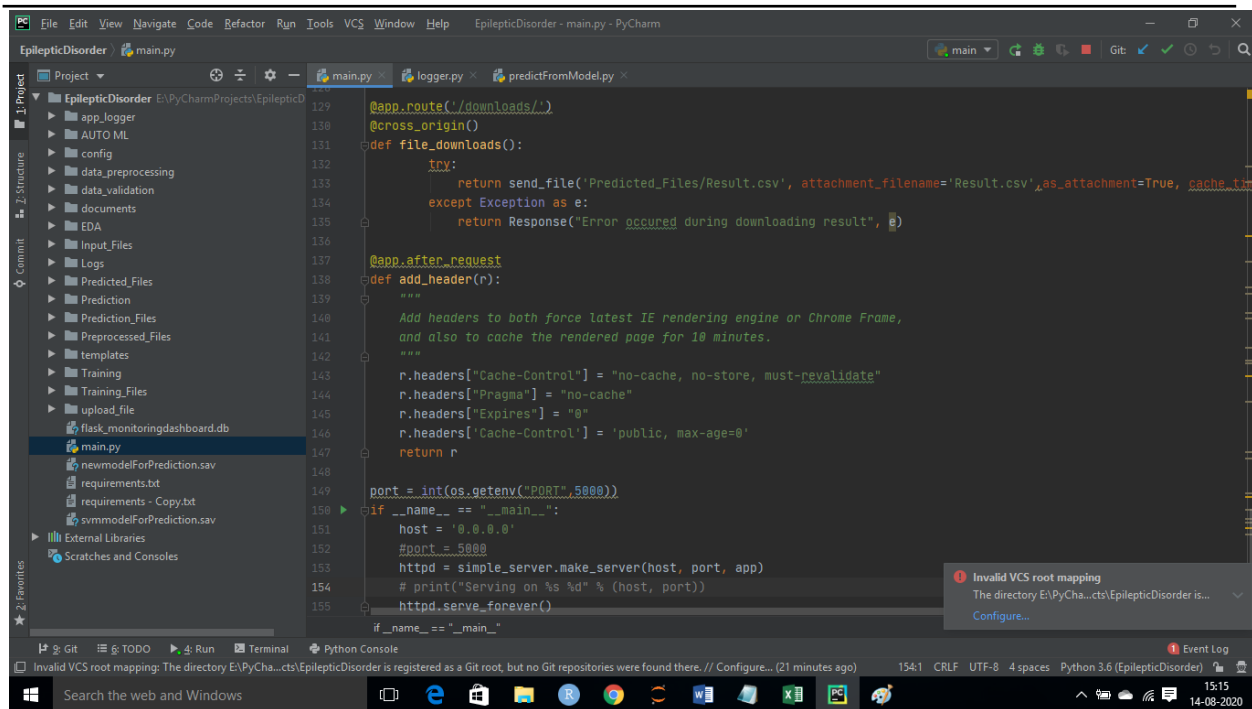


```

102     # Input File Validation Object Initialisation
103     train_vald = DataValidation(filepath_val, process_type)
104     # Calling the Data Validation Function
105     resp_msg_vald = train_vald.data_validation(filepath_val, process_type)
106
107     if resp_msg_vald == "Validation Success":
108         filepath = "Training_Files/Good_Raw/Train_file.csv"
109         process_type = "T"
110         # Pre-Processor Object Initialisation
111         train_prep = Preprocessor(filepath, process_type)
112         # Calling the data_preprocess function
113         train_prep.data_preprocess(filepath, process_type)
114
115         # Training Object Initialisation
116         train = Training()
117         # Training for the dataset uploaded by the user
118         resp_msg_train = train.train_model()
119         return Response(resp_msg_train)
120     else:
121         return Response(resp_msg_vald)
122
123     except Exception as e:
124         return Response("Error occured during re-training", e)
125
126     else:
127         return render_template('index.html')
128
129     trainRouteClient() else

```

Invalid VCS root mapping
The directory E:\PyCharm\cts\EpilepticDisorder is...



```

129 @app.route('/downloads/')
130 @cross_origin()
131 def file_downloads():
132     try:
133         return send_file('Predicted_Files/Result.csv', attachment_filename='Result.csv', as_attachment=True, cache_timeout=0)
134     except Exception as e:
135         return Response("Error occured during downloading result", 500)
136
137 @app.after_request
138 def add_header(r):
139     """
140     Add headers to both force latest IE rendering engine or Chrome Frame,
141     and also to cache the rendered page for 10 minutes.
142     """
143     r.headers["Cache-Control"] = "no-cache, no-store, must-revalidate"
144     r.headers["Pragma"] = "no-cache"
145     r.headers["Expires"] = "0"
146     r.headers['Cache-Control'] = 'public, max-age=0'
147     return r
148
149 port = int(os.getenv("PORT", 5000))
150 if __name__ == "__main__":
151     host = '0.0.0.0'
152     #port = 5000
153     httpd = simple_server.make_server(host, port, app)
154     # print("Serving on %s %d" % (host, port))
155     httpd.serve_forever()
156
157 if __name__ == "__main__":

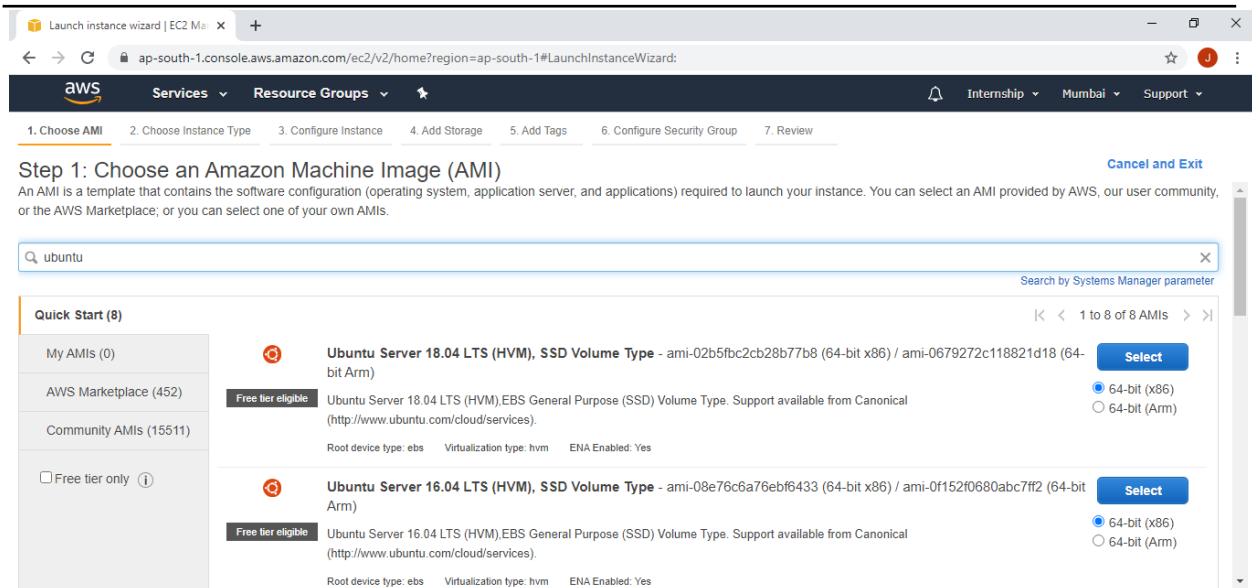
```

Deployment & Dockerization

We will be deploying the model to the AWS platform.

Steps for Deployment

1. Log in to AWS management console by clicking on 'Sign in to the console'.
2. Search for EC2, click on 'launch Instance'.
3. Search for Ubuntu free tier and then select that option



Step 1: Choose an Amazon Machine Image (AMI)

An AMI is a template that contains the software configuration (operating system, application server, and applications) required to launch your instance. You can select an AMI provided by AWS, our user community, or the AWS Marketplace, or you can select one of your own AMIs.

Search by Systems Manager parameter

Quick Start (8) 1 to 8 of 8 AMIs

My AMIs (0)

AWS Marketplace (452)

Community AMIs (15511)

☐ Free tier only ⓘ

Ubuntu Server 18.04 LTS (HVM), SSD Volume Type - ami-02b5fbc2cb28b77b8 (64-bit x86) / ami-0679272c118821d18 (64-bit Arm) **Select**

Free tier eligible Ubuntu Server 18.04 LTS (HVM), EBS General Purpose (SSD) Volume Type. Support available from Canonical (<http://www.ubuntu.com/cloud/services>).
Root device type: ebs Virtualization type: hvm ENA Enabled: Yes

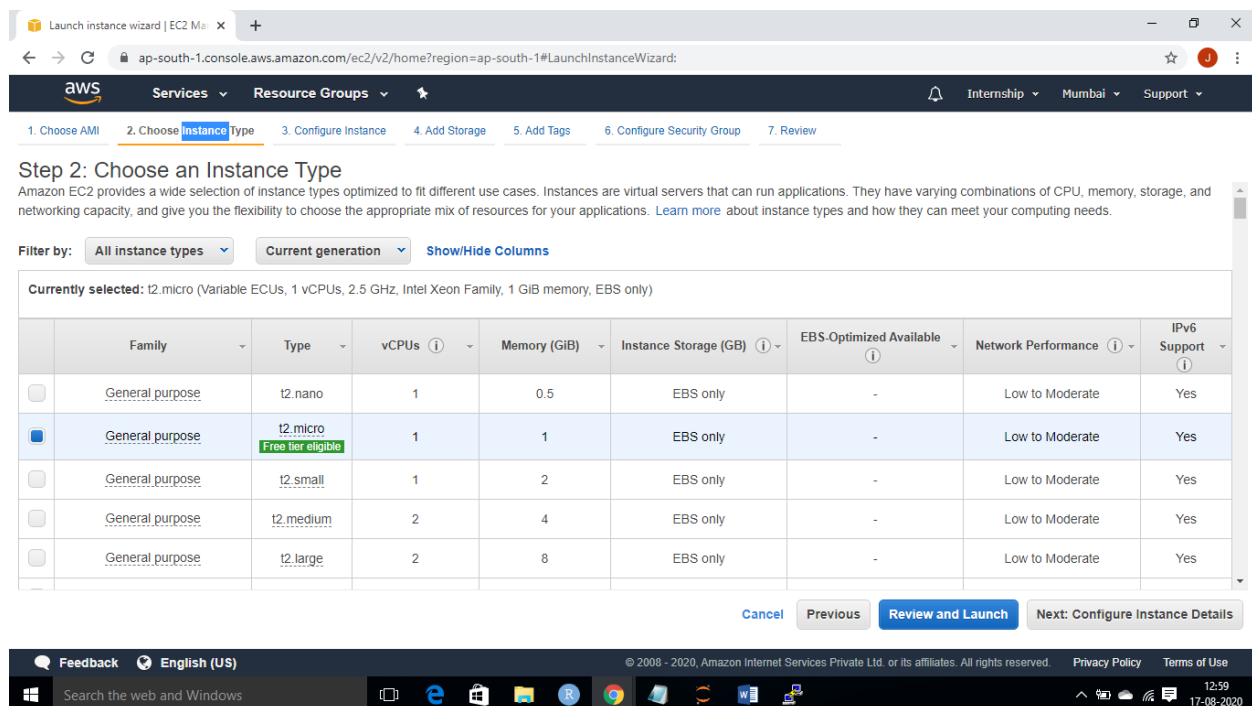
☒ 64-bit (x86)
☐ 64-bit (Arm)

Ubuntu Server 16.04 LTS (HVM), SSD Volume Type - ami-08e76c6a76ebf6433 (64-bit x86) / ami-0f152f0680abc7ff2 (64-bit Arm) **Select**

Free tier eligible Ubuntu Server 16.04 LTS (HVM), EBS General Purpose (SSD) Volume Type. Support available from Canonical (<http://www.ubuntu.com/cloud/services>).
Root device type: ebs Virtualization type: hvm ENA Enabled: Yes

☒ 64-bit (x86)
☐ 64-bit (Arm)

4. Choose instance type (t2.micro)
5. Click on launch



Step 2: Choose an Instance Type

Amazon EC2 provides a wide selection of instance types optimized to fit different use cases. Instances are virtual servers that can run applications. They have varying combinations of CPU, memory, storage, and networking capacity, and give you the flexibility to choose the appropriate mix of resources for your applications. [Learn more](#) about instance types and how they can meet your computing needs.

Filter by: All instance types Current generation Show/Hide Columns

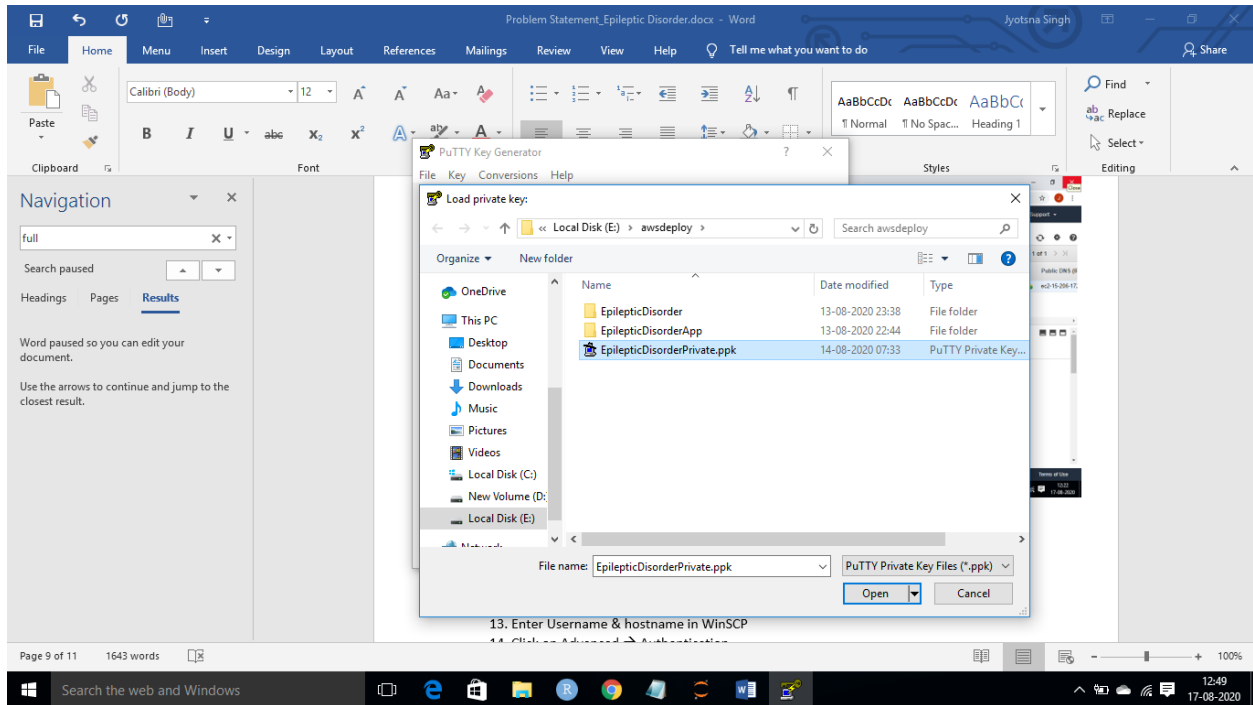
Currently selected: t2.micro (Variable ECUs, 1 vCPUs, 2.5 GHz, Intel Xeon Family, 1 GiB memory, EBS only)

	Family	Type	vCPUs ⓘ	Memory (GiB)	Instance Storage (GB) ⓘ	EBS-Optimized Available ⓘ	Network Performance ⓘ	IPv6 Support ⓘ
<input type="checkbox"/>	General purpose	t2.nano	1	0.5	EBS only	-	Low to Moderate	Yes
<input checked="" type="checkbox"/>	General purpose	t2.micro Free tier eligible	1	1	EBS only	-	Low to Moderate	Yes
<input type="checkbox"/>	General purpose	t2.small	1	2	EBS only	-	Low to Moderate	Yes
<input type="checkbox"/>	General purpose	t2.medium	2	4	EBS only	-	Low to Moderate	Yes
<input type="checkbox"/>	General purpose	t2.large	2	8	EBS only	-	Low to Moderate	Yes

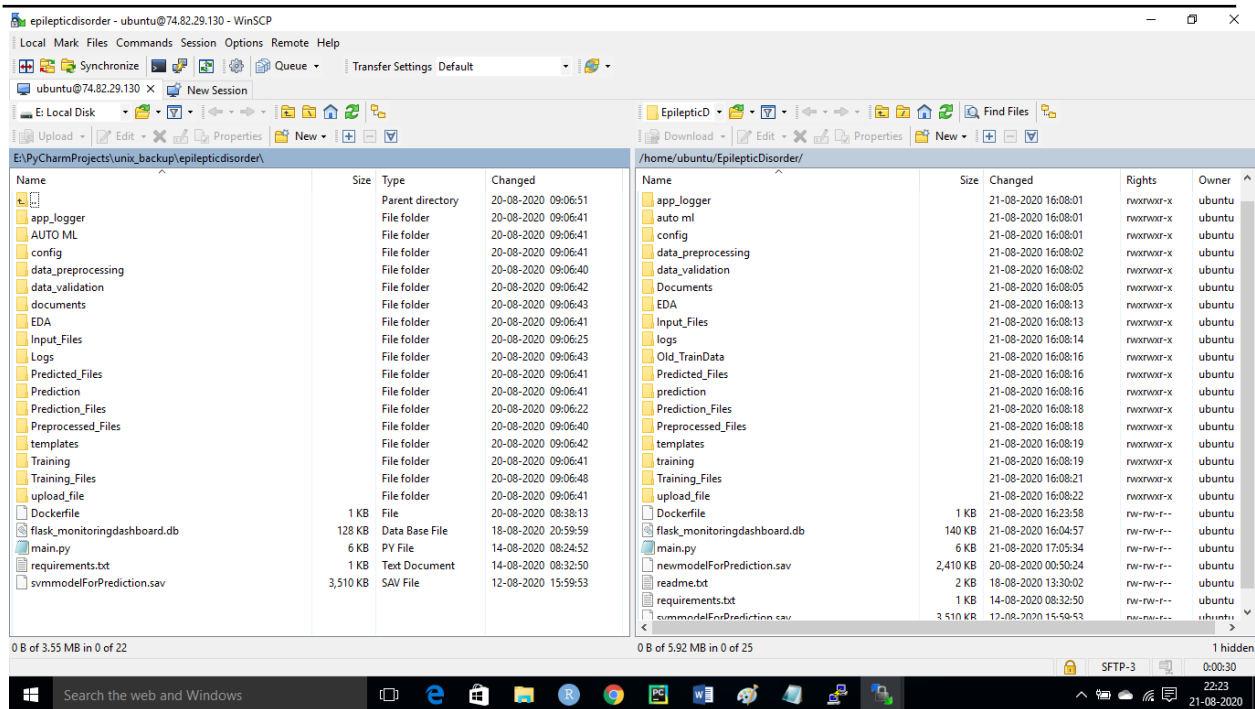
Cancel Previous **Review and Launch** Next: Configure Instance Details

6. Create a new key pair and insert name. Download and save the (.pem file)
7. Click on launch instance and give it a name.

8. Download 'Putty' for widows and 'Puttygen'.
9. Go to Puttygen, load the .pem file and click on OK



10. Save the Private key(.ppk) file
11. Download WinSCP & open it (it is needed to deploy code in AWS EC2 instance)
12. Go to AWS console, click on actions → Connect (You will get host name)
13. Enter Username & hostname in WinSCP
14. Click on Advanced → Authentication
15. Upload the (.ppk) file & click on Open & then click on OK
16. Click on Login. Select the option Yes



17. Save the entire code along with main.py , requirements.txt, model.pkl file into the Ubuntu server

18. Install all dependencies & libraries

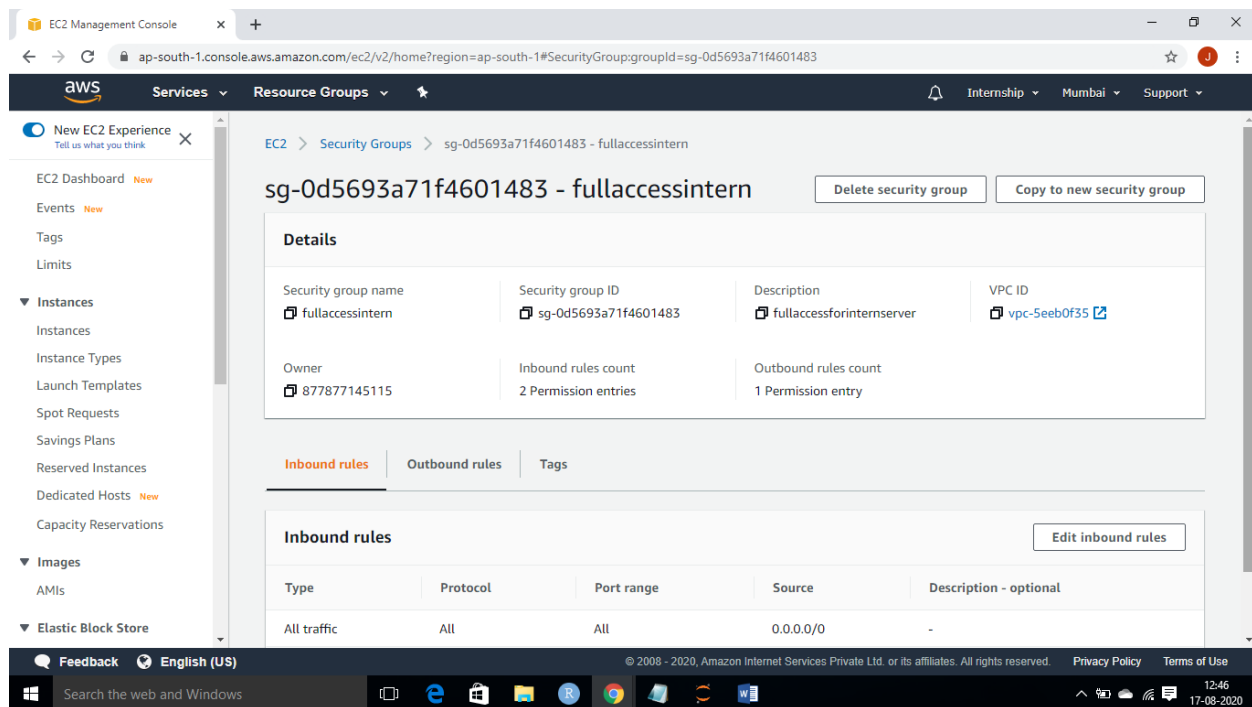
- Open Putty & insert host name
- Name and Saved session
- Click on SSH → Authentication
- Put private key (.ppk file) and save
- Select and click on open (Select saved session name)

19. Login to Ubuntu

- Insert cmd pwd → to check the directory
- Insert cmd ls → to check files in the directory
- Sudo apt-get update &&sudo apt-get install python 3-pip
- Enter Y

20. Go to AWS dashboard console

- Click on Security Group
- Create Security group
- Insert Security Group name: fullaccessintern , Description: fullaccessinternserver , VPX: default
- Click on Add Rule
- Select type – ‘All traffic’, Source – ‘anywhere’
- Click on create
- Check and verify the created security group



21. Click on Network & Security

- Click on Security groups
- Check group ID in network Interface
- Select matched instance ID in network interfaces & group ID with Security groups
- Left click on above selected matched row and click on change security groups
- Selected the 'Full Access' created in *
- Click on save

Network interfaces | EC2 Manage

ap-south-1.console.aws.amazon.com/ec2/v2/home?region=ap-south-1#NIC:sort=networkInterfaceId

Services Resource Groups

Create Network Interface Attach Detach Delete Actions

Filter by tags and attributes or search by keyword

Name	Network interface ID	Subnet ID	VPC ID	Zone	Security groups
	eni-06421bc1441afeded	subnet-905e53f8	vpc-5eeb0f35	ap-south-1a	fullaccessintern, launch-wizard-1

Network interface: eni-06421bc1441afeded

Details Flow Logs Tags

Network interface ID	eni-06421bc1441afeded	Subnet ID	subnet-905e53f8
VPC ID	vpc-5eeb0f35	Availability Zone	ap-south-1a
MAC address	02:83:96:b7:ea:de	Description	-
Security groups	fullaccessintern, launch-wizard-1. view inbound rules. view outbound rules	Network interface owner	877877145115
Status	in-use	Primary private IPv4 IP	172.31.45.103
Private DNS (IPv4)	ip-172-31-45-103.ap-south-1.compute.internal	IPv4 Public IP	15.206.172.209*
Secondary private IPv4 IPs	-	IPv6 IPs	-
Elastic Fabric Adapter	Disabled	Source/dest. check	true
Attachment ID	eni-attach-038f9c51b164ad8ac	Instance ID	i-073f6ace0f0140cf3
Attachment owner	877877145115	Device index	0

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Search the web and Windows

22. Click on instance and see if your instance state is running

Dockerize Your Flask Application Instances | EC2 Management Console

ap-south-1.console.aws.amazon.com/ec2/v2/home?region=ap-south-1#Instances:sort=instanceId

Services Resource Groups

Launch Instance Connect Actions

Filter by tags and attributes or search by keyword

Name	Instance ID	Instance Type	Availability Zone	Instance State	Status Checks	Alarm Status	Public DNS (IPv4)
EpilepticDisorderDetection	i-073f6ace0f0140cf3	t2.micro	ap-south-1a	terminated	2/2 checks ...	None	ec2-13-232-114-74.ap-south-1.compute.amazonaws.com
epilepticdiorderdetectionser...	i-086849606ad3f793e	t2.micro	ap-south-1a	running	2/2 checks ...	None	ec2-13-232-114-74.ap-south-1.compute.amazonaws.com

Instance: i-086849606ad3f793e (epilepticdiorderdetectionservice) Public DNS: ec2-13-232-114-74.ap-south-1.compute.amazonaws.com

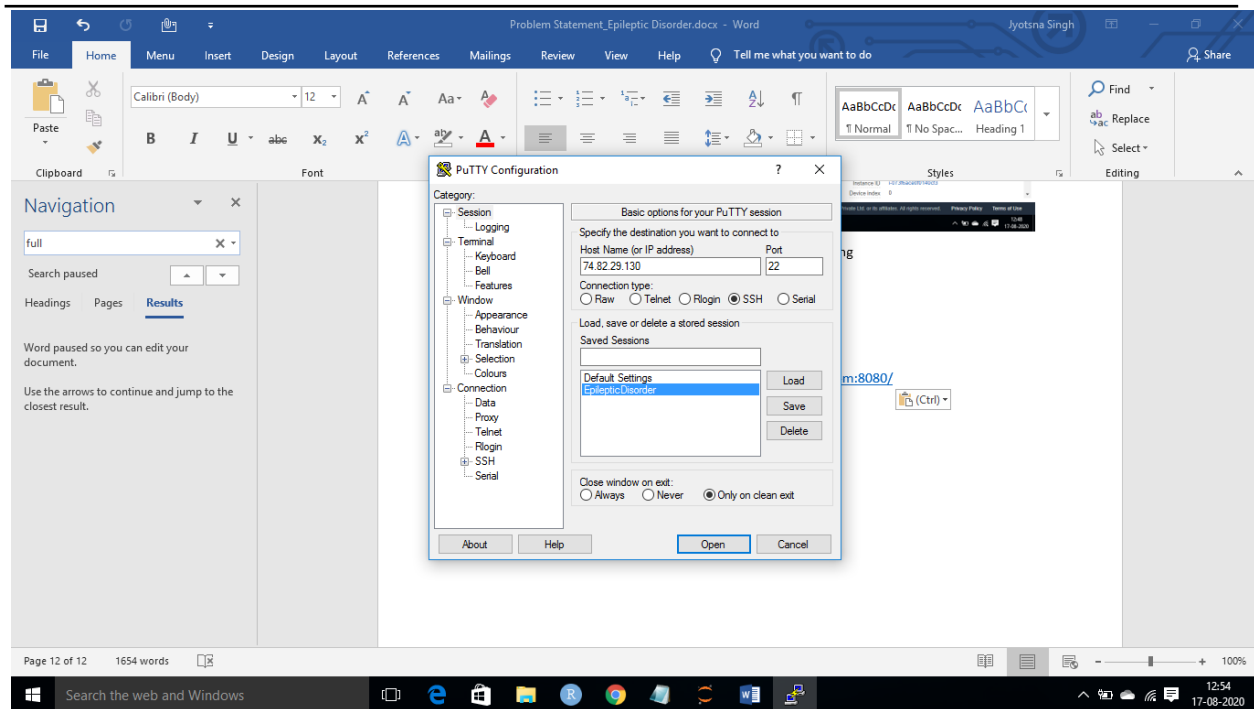
Description Status Checks Monitoring Tags

Instance ID	i-086849606ad3f793e	Public DNS (IPv4)	ec2-13-232-114-74.ap-south-1.compute.amazonaws.com
Instance state	running	IPv4 Public IP	13.232.114.74
Instance type	t2.micro	IPv6 IPs	-
Finding	Opt-in to AWS Compute Optimizer for recommendations. Learn more	Elastic IPs	-
Private DNS	ip-172-31-41-74.ap-south-1.compute.internal	Availability zone	ap-south-1a
Private IPs	172.31.41.74	Security groups	launch-wizard-2. view inbound rules. view outbound rules
Secondary private IPs	-	Scheduled events	No scheduled events

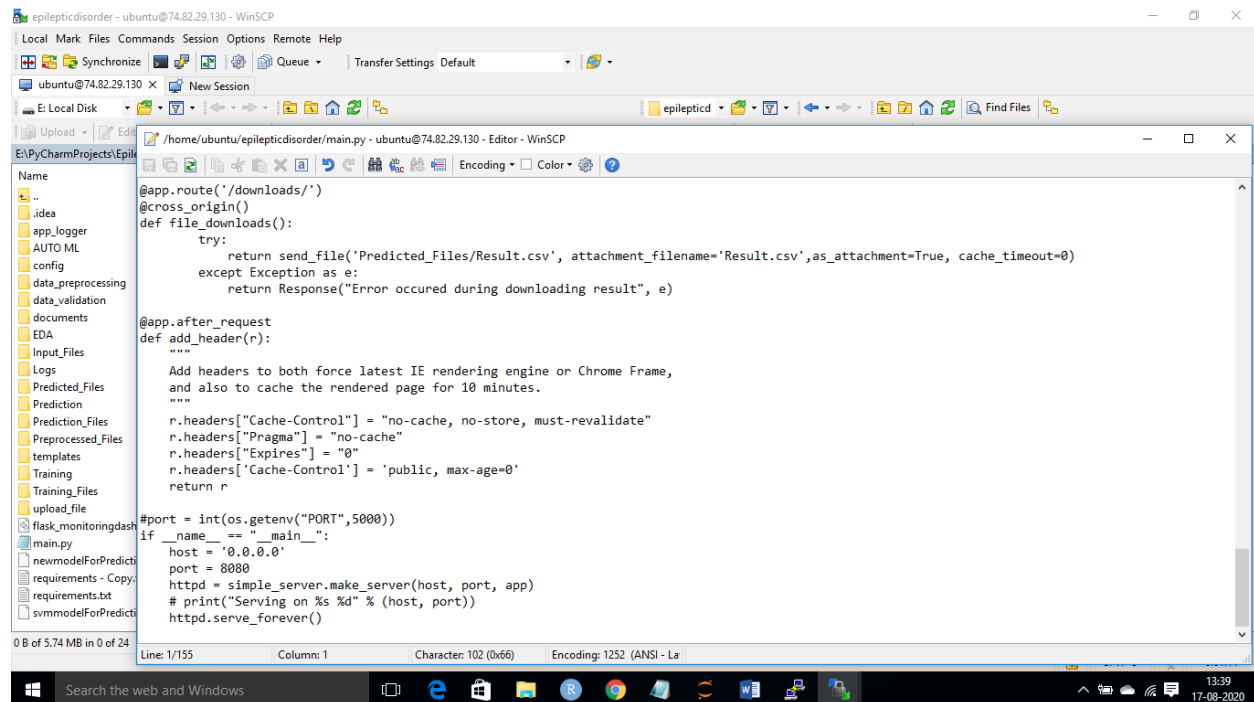
Feedback English (US) © 2008 - 2020, Amazon Internet Services Private Ltd. or its affiliates. All rights reserved. Privacy Policy Terms of Use

Search the web and Windows

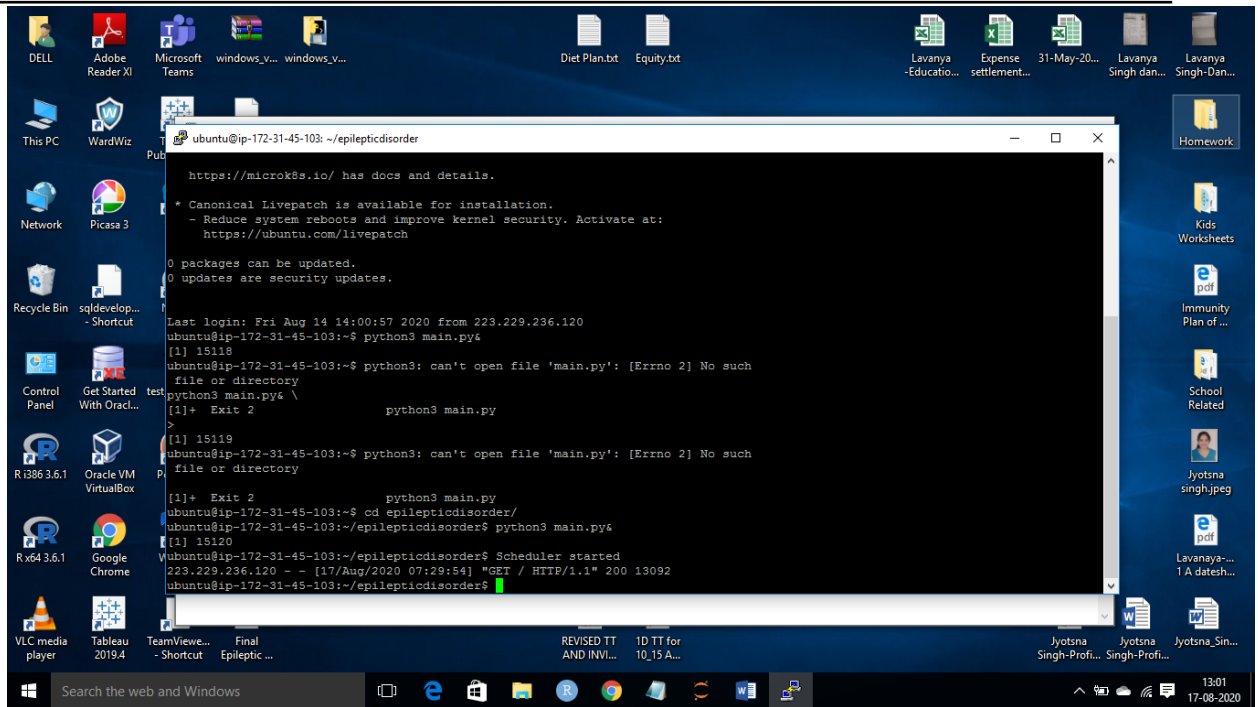
23. Go back to cmd prompt of putty



24. Check code in 'main.py' file to have host and port name as given below



25. Login to Ubuntu server using Putty and go to the code and run the application using cmd: python3 main.py&. It says 'Scheduler started'.



Deployment & Running App using Docker Container

26. Install Python

Step1: sudo apt-get install software-properties-common

Step2: sudo apt-add-repository universe

Step3: sudo apt-get update

Step4: sudo apt-get install python3-pip

27. Install Docker in AWS EC2 instance

Step1: sudo apt-get remove docker docker-engine docker.io containerd runc

Step2: sudo apt-get update

Step3: sudo apt-get install apt-transport-https ca-certificates curl gnupg-agent software-properties-common

Step4: curl -fsSL https://download.docker.com/linux/ubuntu/gpg | sudo apt-key add -

Step5: sudo apt-key fingerprint 0EBFCD88

Step6: uname -a

Step7: sudo add-apt-repository "deb [arch=amd64] https://download.docker.com/linux/ubuntu \$(lsb_release -cs) stable test"

Step8: sudo apt-get update

Step9: sudo apt-get install docker-ce docker-ce-cli containerd.io

Step10: uname -a

Step11: apt-cache madison docker-ce

Step12:uname -a

Step13:sudo apt-get install docker-ce=5:19.03.12~3-0~ubuntu-bionic docker-ce-cli=5:19.03.12~3-0~ubuntu-bionic containerd.io

28. Testing Docker installation

Step1:sudo docker run hello-world

Step2:sudo docker images

29. Create Dockerfile. Below is the spinet of the docker file.

FROM python:3.6

RUN sudo apt-get update -y

RUN sudo apt-get install python3-pip

WORKDIR /home/ubuntu/epilepticdisorder

RUN pip3 install -r requirements.txt

RUN pip3 install Flask==1.1.2

RUN pip3 install Flask-Cors==3.0.8

RUN pip3 install Flask-MonitoringDashboard==3.0.6

RUN pip3 install pandas==1.1.0

RUN pip3 install scipy==1.5.2

RUN pip3 install sklearn==0.0

RUN pip3 install imbalanced-learn==0.7.0

RUN pip3 install imblearn==0.0

RUN pip3 uninstall scikit-learn==0.23.2

RUN pip3 install scikit-learn==0.22.1

EXPOSE 8080

CMD python3 main.py

30. Create Docker Image using below command

sudo docker image build -t epilepticaldisorder:1.0 .

31. Validate the image is present and get the image ID.

ubuntu@ip-172-31-41-74:~/EpilepticDisorder\$ sudo docker images

REPOSITORY	TAG	IMAGE ID	CREATED	SIZE
epilepticaldisorder	1.0	12a0552a19de	24 seconds ago	1.86GB
python	3.6	46ff56815c7c	3 days ago	874MB

32. Run the docker image

sudo docker run -p 8080:8080 12a0552a19de33.

The Epileptic Disorder App is available at the below URL: <http://ec2-13-232-114-74.ap-south-1.compute.amazonaws.com:8080/>

