



Module 07 Assignment 01: Programming Assignment 2

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GitHub: [rbadvaith/Wine_Cluster](https://github.com/rbadvaith/Wine_Cluster)

Docker: [advaith123/bucketcluster Tags | Docker Hub](https://hub.docker.com/r/advaith123/bucketcluster)

Short Summary

This assignment involves building a machine learning application for predicting wine quality using Apache Spark on the Amazon AWS cloud platform. The goal is to train a model in parallel across multiple EC2 instances and deploy it effectively. Using provided datasets, the application will first train a model on Spark's MLlib in parallel on four EC2 instances, validate its performance using a second dataset, and optimize parameters for the best accuracy. The trained model will then be used on a single EC2 instance for predictions, with its performance measured by the F1 score. Additionally, the prediction application must be containerized using Docker to enable efficient deployment in diverse environments. The implementation is to be completed in Java on an Ubuntu Linux setup, integrating skills in parallel computing, ML model development, and containerization.

Initial steps for AWS Credentials setup

The credentials created here will be used by our application for connecting to Elasticmapreduce service and S3.

Via Aws Learner(If you are a new user)

1. Create an AWS Account with NJIT email.
2. Go to *Academy Learner lab > Modules>Launch Learner Academy Lab*
3. Learner lab is being displayed here

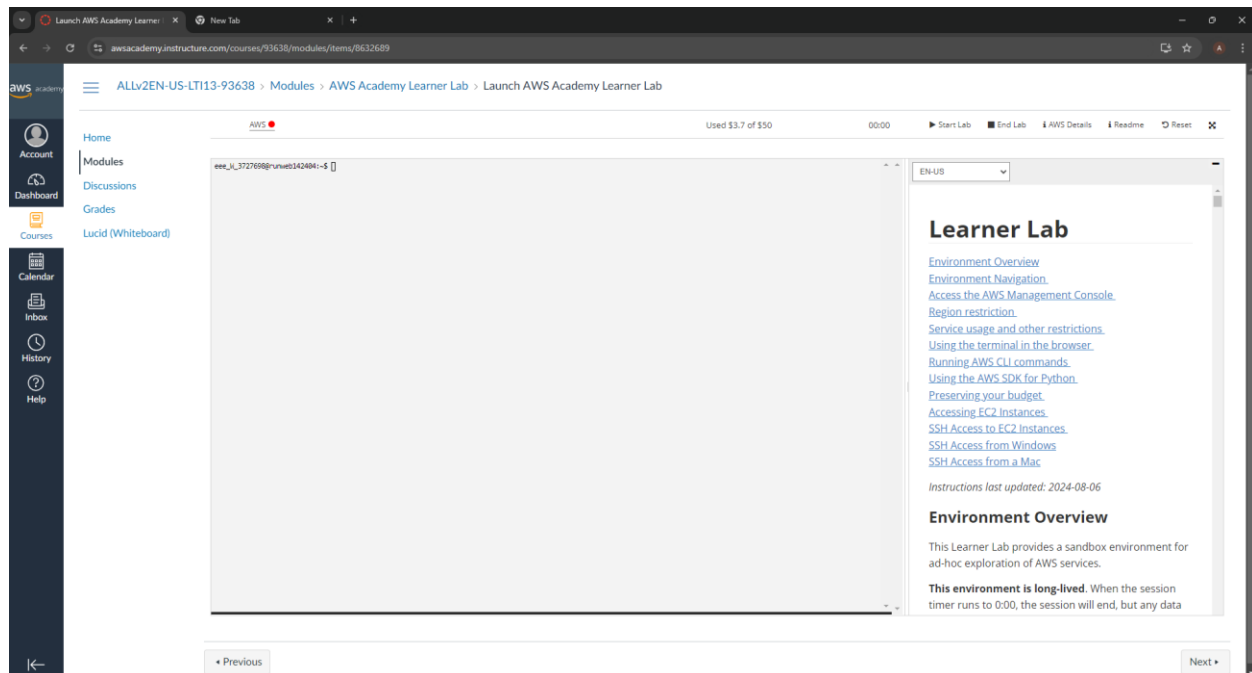


Fig 1. Learner Lab via AWS Academy

Via Vocareum(If you are an existing user | Use Microsoft Edge)

1. If you are an existing user, log in via NJIT email.
2. Select role as student, the search result will display a lab link. Click that to open .
3. Learner lab is being displayed here

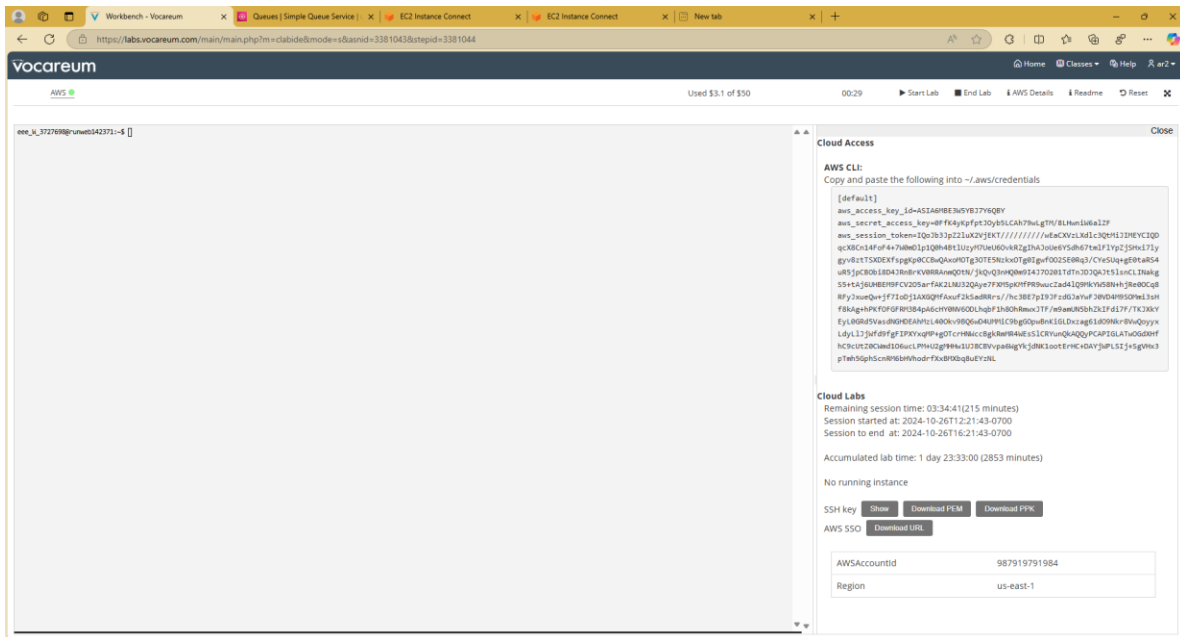


Fig 2. Learner Lab via AWS Academy

Launching AWS Management Console

1. Click Start Lab on the right-hand corner
2. Wait for one minute to see the AWS symbol turned from red to green
3. Click the AWS symbol once it turned green
4. AWS Management Console is being displayed. Please note that the session will last for 4 hrs. only

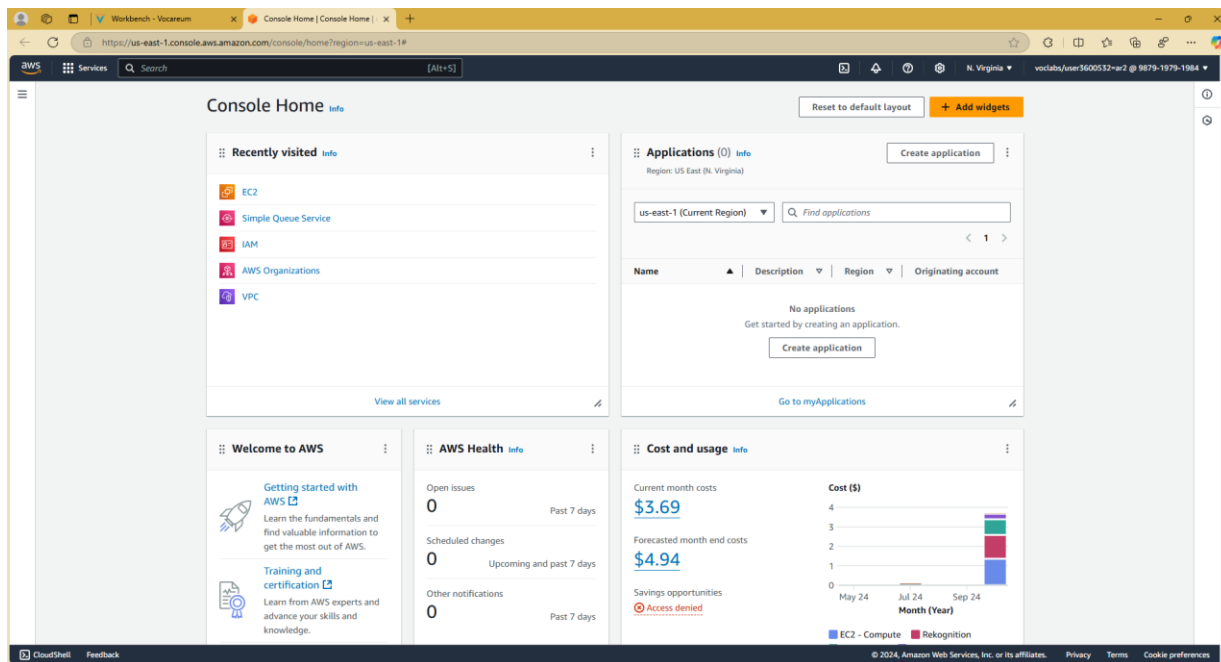


Fig 3. AWS Management Console

Creating EMR Cluster

EMR Cluster 1 core and 4 slaves will be created for the Elasticmapreduce service. These service will only run until the session end. After session finished, you cant able to access the cluster. But don't worry, you can clone the old terminated cluster and re-run it again.

1. In the search bar, type "EMR" and then select the first result.
2. Select "Create cluster" from the navigation menu on the right. If you want to clone the existing cluster, select your preferred cluster and select "clone"

Clusters (15) Info Filter clusters by status Find clusters Filter clusters by creation date-time View details Terminate Clone Create cluster

	Cluster ID	Cluster name	Status	Creation time (UTC-05:00)	Elapsed time	Normalized instance hours
<input type="checkbox"/>	j-3EW5RJK9IY1H4	Wine_Cluster	Waiting Ready to run steps	December 03, 2024, 00:12	1 hour, 4 minutes	0
<input type="checkbox"/>	j-3B6D3ZXR8TWYP	Wine_Cluster	Terminated User request	December 02, 2024, 23:43	27 minutes, 25 seconds	24
<input type="checkbox"/>	j-2HRX23V06GJ88	Wine_Cluster	Terminated User request	December 02, 2024, 20:41	2 hours, 53 minutes	72
<input type="checkbox"/>	j-3PB4M4HKVMX00	Wine_Cluster	Terminated with errors Instance failure	December 02, 2024, 16:30	3 hours, 59 minutes	96
<input type="checkbox"/>	j-170J13IT1M2	Wine_Cluster	Terminated User request	December 02, 2024, 16:10	17 minutes, 9 seconds	0
<input type="checkbox"/>	j-1FWYXMS807HMY	Wine_Cluster	Terminated Auto-terminate	December 02, 2024, 14:49	1 hour, 17 minutes	48
<input type="checkbox"/>	j-2WPDJHFS5NZCZ	Wine_Cluster	Terminated with errors Instance failure	December 02, 2024, 00:52	23 minutes, 58 seconds	24
<input type="checkbox"/>	j-3B270TDHEE3SH	Wine_Cluster	Terminated with errors Instance failure	December 01, 2024, 23:03	1 hour, 32 minutes	48
<input type="checkbox"/>	j-3CR71GASTZ2M6	Wine_Cluster_PPK	Terminated User request	December 01, 2024, 22:15	36 minutes, 58 seconds	0
<input type="checkbox"/>	j-3C5G6K0VK1LNN	Wine_Cluster	Terminated User request	December 01, 2024, 21:31	1 hour, 20 minutes	48
<input type="checkbox"/>	j-31026K51PEUT	Wine_Cluster	Terminated User request	December 01, 2024, 19:35	1 hour, 51 minutes	96
<input type="checkbox"/>	j-1C1HD704B7T4	Wine_Cluster	Terminated with errors Validation error	December 01, 2024, 19:01	11 seconds	0
<input type="checkbox"/>	j-14KXJ4I1K7K7P	Wine_Cluster	Terminated with errors	December 01, 2024, 18:45	11 seconds	0

Fig 4. Create Cluster

3. In *Name*: Type Wine_Cluster
4. Ensure that the application bundle should be the same as in Fig.5

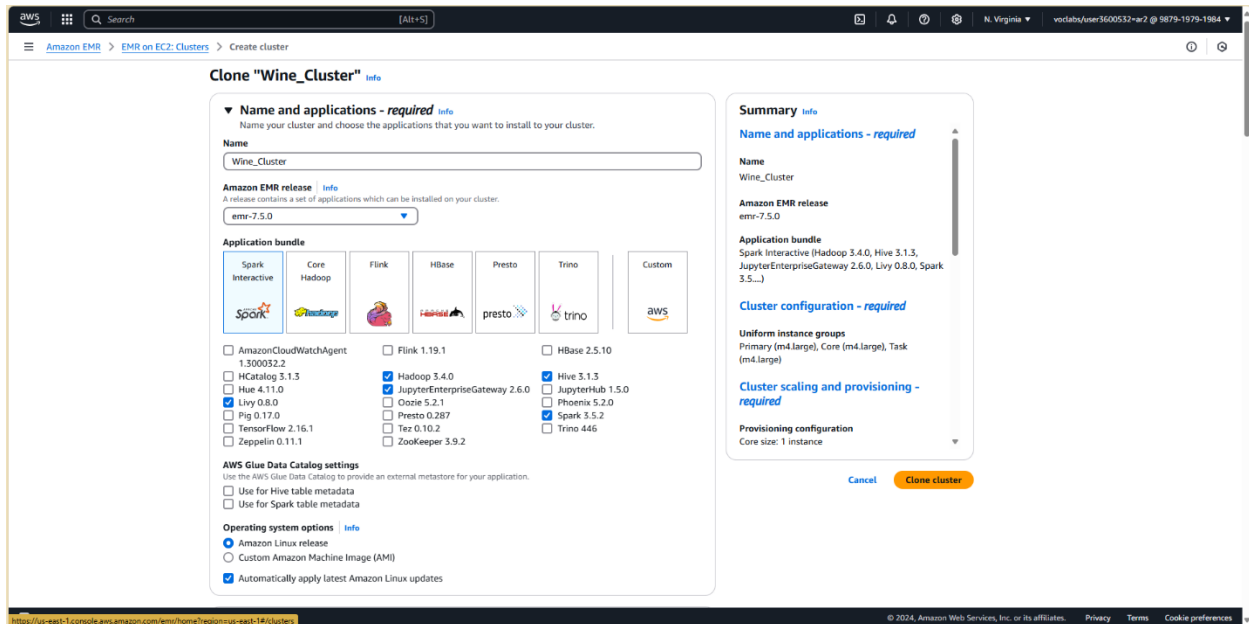


Fig 5. Clone or Create Cluster

5. Select instance type as m4large for all

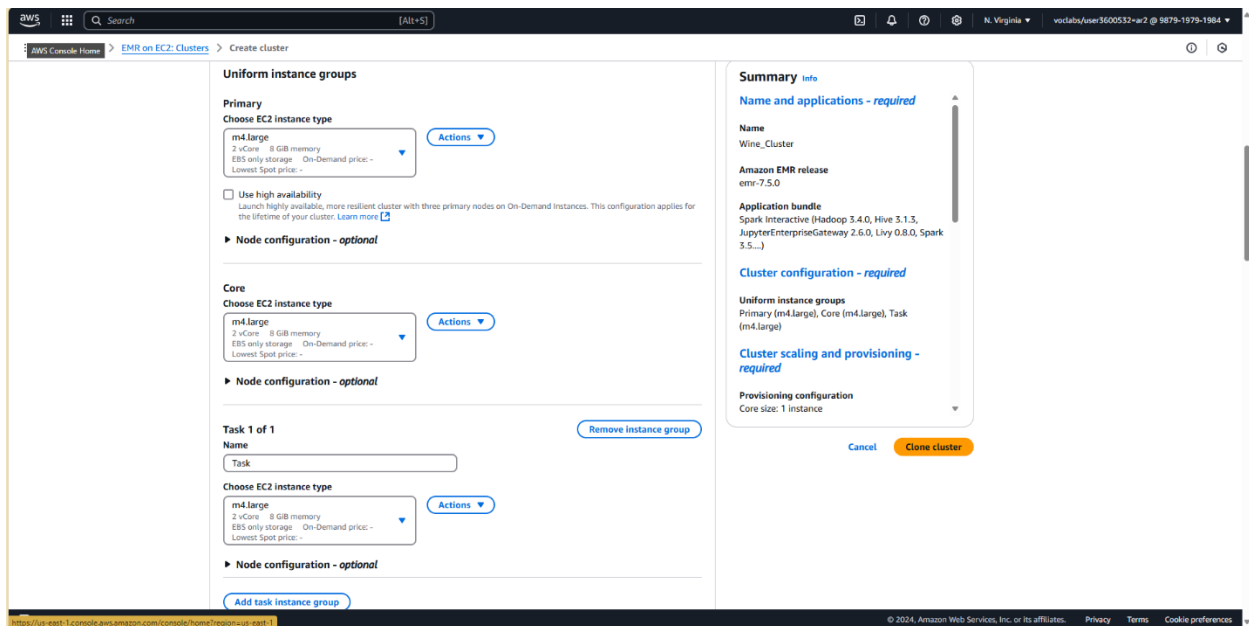


Fig 6. Instance Type

6. In Cluster Termination, set termination to manual from automatic

Cluster termination and node replacement [info](#)
Choose termination settings and protect your cluster from accidental shutdown.

Termination option

- ☒ Manually terminate cluster
- ☐ Automatically terminate cluster after last step ends
- ☐ Automatically terminate cluster after idle time (Recommended)

☐ Use termination protection
Protects your cluster from accidental termination, if on, you must first turn off protection to terminate the cluster. We recommend turning on termination protection for your long running clusters.

Unhealthy node replacement - new [info](#)

- ☒ Turn on
Amazon EMR gracefully stops processes on unhealthy nodes to minimize data loss and job interruptions. It quickly replaces unhealthy nodes with new EC2 instances to keep your jobs running smoothly.
- ☐ Turn off
Amazon EMR adds unhealthy nodes to a denylist while keeping them in the cluster, allowing you continued access for troubleshooting.

Bootstrap actions (0) [info](#) [Remove](#) [Edit](#) [Add](#)
Use bootstrap actions to install software or customize your instance configuration.

Cluster logs [info](#)
Choose where and how to store your log files.

Tags [info](#)
Use tags to search and filter for resources, and track AWS costs associated with your cluster.

Software settings [info](#)
Override the default configurations for specific applications on your cluster.

Security configuration and EC2 key pair [info](#)

Summary [info](#)

Name and applications - required

Name: Wine_Cluster

Amazon EMR release: emr-7.5.0

Application bundle: Spark Interactive (Hadoop 3.4.0, Hive 3.1.3, JupyterEnterpriseGateway 2.6.0, Livy 0.8.0, Spark 3.5...)

Cluster configuration - required

Uniform instance groups: Primary (m4.large), Core (m4.large), Task (m4.large)

Cluster scaling and provisioning - required

Provisioning configuration: Core size: 1 instance

[Cancel](#) [Create cluster](#)

Fig 7. Cluster Termination

7. Set EC2 Private key and name it as cluster.ppk

Security configuration and EC2 key pair [info](#)
Choose a security configuration or create a new one that you can reuse with other clusters.

Security configuration
Select your cluster encryption, authentication, authorization, and instance metadata service settings.

[Choose a security configuration](#) [Browse](#) [Create security configuration](#)

Amazon EC2 key pair for SSH to the cluster [info](#)

[Browse](#) [Create key pair](#)

Identity and Access Management (IAM) roles - required [info](#)
Choose or create a service role and instance profile for the EC2 instances in your cluster.

Amazon EMR service role [info](#)
The service role is an IAM role that Amazon EMR assumes to provision resources and perform service-level actions with other AWS services.

☒ Choose an existing service role
Select a default service role or a custom role with IAM policies attached so that your cluster can interact with other AWS services.

☐ Create a service role
Let Amazon EMR create a new service role so that you can grant and restrict access to resources in other AWS services.

Service role
EMR_DefaultRole

EC2 instance profile for Amazon EMR
The instance profile assigns a role to every EC2 instance in a cluster. The instance profile must specify a role that can access the resources for your steps and bootstrap actions.

☒ Choose an existing instance profile
Select a default role or a custom instance profile with IAM policies attached so that your cluster can interact with your resources in Amazon S3.

☐ Create an instance profile
Let Amazon EMR create a new instance profile so that you can specify a custom set of resources for it to access in Amazon S3.

Instance profile
EMR_EC2_DefaultRole

Summary [info](#)

Name and applications - required

Name: Wine_Cluster

Amazon EMR release: emr-7.5.0

Application bundle: Spark Interactive (Hadoop 3.4.0, Hive 3.1.3, JupyterEnterpriseGateway 2.6.0, Livy 0.8.0, Spark 3.5...)

Cluster configuration - required

Uniform instance groups: Primary (m4.large), Core (m4.large), Task (m4.large)

Cluster scaling and provisioning - required

Provisioning configuration: Core size: 1 instance

[Cancel](#) [Create cluster](#)

Fig 8. EC2 Key Pair

8. Select Create Cluster or Clone Cluster and wait for 5 minutes to load

Wine_Cluster

Updated less than a minute ago

TerminateClone in AWS CLIClone

▼ Summary

Cluster info

Cluster ID
j-3EW5RJK9IY1H4

Cluster configuration
Instance groups

Capacity
1 Primary | 1 Core | 4 Task

Applications

Amazon EMR version
emr-7.5.0

Installed applications
Hadoop 3.4.0, Hive 3.1.3,
JupyterEnterpriseGateway 2.6.0, Livy 0.8.0,
Spark 3.5.2

Cluster management

Log destination in Amazon S3
[aws-logs-987919791984-us-east-1/elasticmapreduce](#)

Primary node public DNS
[ec2-54-157-190-132.compute-1.amazonaws.com](#)

[Connect to the Primary node using SSH](#)

[Connect to the Primary node using SSM](#)

Status and time

Status
Starting

Creation time
December 03, 2024, 00:12 (UTC-05:00)

Elapsed time
7 minutes, 4 seconds

PropertiesBootstrap actionsInstances (Hardware)StepsApplicationsConfigurationsMonitoringEventsTags (0)

Operating system

Amazon Linux release
2023.6.20241031.0

Cluster logs

Archive log files to Amazon S3
Turned on

Amazon S3 location
[s3://aws-logs-987919791984-us-east-1/elasticmapreduce/](#)

Encryption for logs
Turned off

Cluster termination and node replacement

Termination option
Manually terminate cluster

Idle time
-

Termination protection
Off

Unhealthy node replacement
On

Fig 9. Wine_Cluster

PropertiesBootstrap actionsInstances (Hardware)StepsApplicationsConfigurationsMonitoringEventsTags (0)

Instance group settings

Cluster scaling option
Manually set cluster size

Core
Name and Maximum core nodes in the cluster
Core | 1 instances

Task
Name and Maximum task nodes in the cluster
Task | 4 instances

Instance groups (3)

With the instance groups configuration, each node type consists of the same instance type and the same purchasing option for instances: On-Demand or Spot.

Find instances by status

Find resources by ID or type; or search for text within loaded results

< 1 >

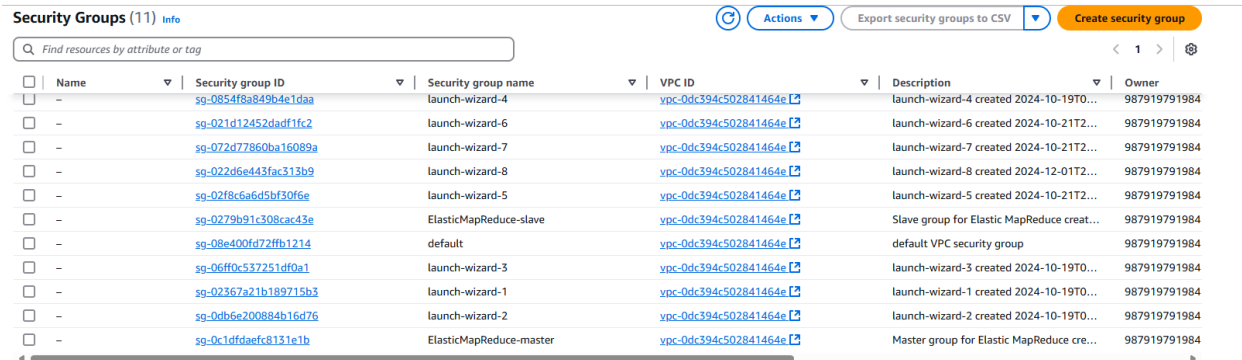
Type and name	ID	Status Last state change reason	Instances	Purchasing option and p...	EBS size (GiB)
Primary	ig-1IZU2D0OWFJNT	Bootstrapping	0 (1 requested)	On-Demand	-
Core	ig-2MXPM0J5CRR0F	Provisioning	0 (1 requested)	On-Demand	-
Task	ig-345W5CEIQ965F	Provisioning	0 (4 requested)	On-Demand	-

Fig 10. Number of Instances

Setting SSH for master(core) EC2 in the cluster[Only required to do this for first time]

We need to provide ssh access for the master instance which is not provided when initially created.

1. Search EC2 in the search bar and click enter
2. In the Dashboard select security group
3. Over there Select the group id that have group name elasticmapreduce master in it



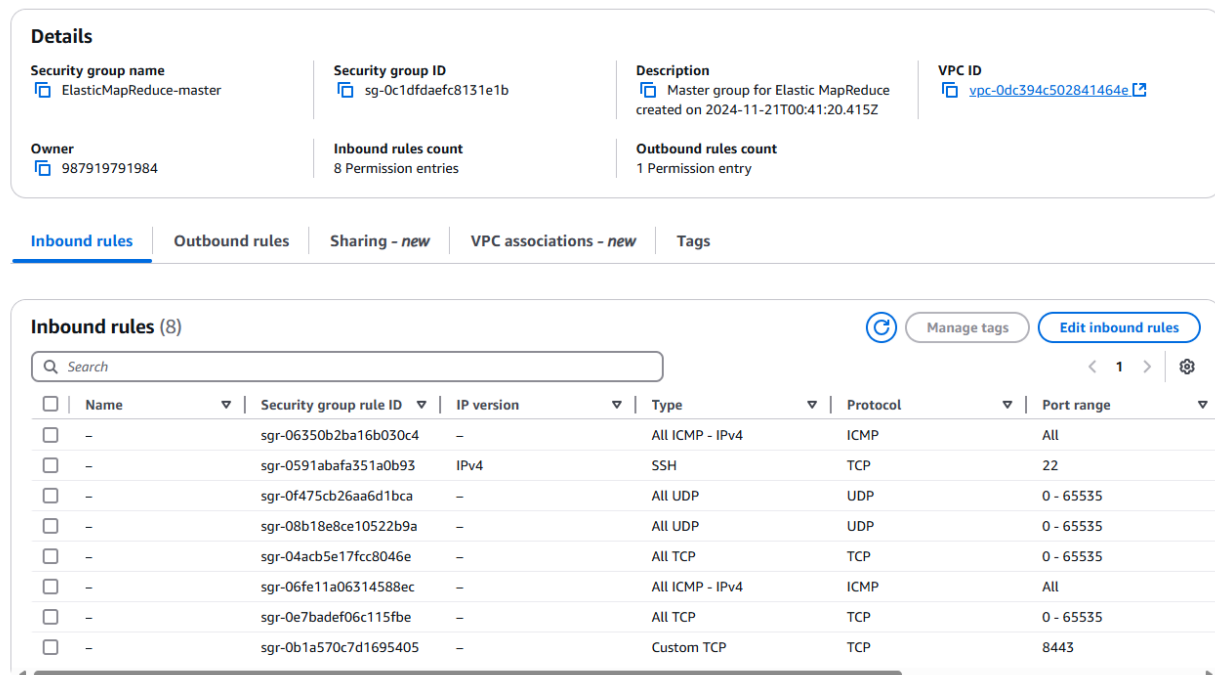
The screenshot shows the AWS Management Console 'Security Groups' page. It lists 11 security groups. The 'elasticmapreduce-master' group is highlighted at the bottom of the list.

Name	Security group ID	Security group name	VPC ID	Description	Owner
-	sg-0854f8a849b4e1daa	launch-wizard-4	vpc-0dc394c502841464e	launch-wizard-4 created 2024-10-19T0...	987919791984
-	sg-021d12452dadf1fc2	launch-wizard-6	vpc-0dc394c502841464e	launch-wizard-6 created 2024-10-21T2...	987919791984
-	sg-072d77860ba16089a	launch-wizard-7	vpc-0dc394c502841464e	launch-wizard-7 created 2024-10-21T2...	987919791984
-	sg-022d6e443fac313b9	launch-wizard-8	vpc-0dc394c502841464e	launch-wizard-8 created 2024-12-01T2...	987919791984
-	sg-02f8c6a6d5bf30f6e	launch-wizard-5	vpc-0dc394c502841464e	launch-wizard-5 created 2024-10-21T2...	987919791984
-	sg-0279b91c308cac43e	ElasticMapReduce-slave	vpc-0dc394c502841464e	Slave group for Elastic MapReduce creat...	987919791984
-	sg-08e400fd72fb1214	default	vpc-0dc394c502841464e	default VPC security group	987919791984
-	sg-06f0c537251dff0a1	launch-wizard-3	vpc-0dc394c502841464e	launch-wizard-3 created 2024-10-19T0...	987919791984
-	sg-02367a21b189715b3	launch-wizard-1	vpc-0dc394c502841464e	launch-wizard-1 created 2024-10-19T0...	987919791984
-	sg-0db6e200884b16d76	launch-wizard-2	vpc-0dc394c502841464e	launch-wizard-2 created 2024-10-19T0...	987919791984
-	sg-0c1dfdaefc8131e1b	ElasticMapReduce-master	vpc-0dc394c502841464e	Master group for Elastic MapReduce cre...	987919791984

Fig 11. Security Group Name

4. Select edit inbound rules in the middle right edge

sg-0c1dfdaefc8131e1b - ElasticMapReduce-master



The screenshot shows the details of the 'sg-0c1dfdaefc8131e1b - ElasticMapReduce-master' security group. It includes details, inbound rules, and outbound rules.

Details

Property	Value
Security group name	ElasticMapReduce-master
Security group ID	sg-0c1dfdaefc8131e1b
Description	Master group for Elastic MapReduce created on 2024-11-21T00:41:20.415Z
VPC ID	vpc-0dc394c502841464e
Owner	987919791984
Inbound rules count	8 Permission entries
Outbound rules count	1 Permission entry

Inbound rules (8)

Name	Security group rule ID	IP version	Type	Protocol	Port range
-	sgr-06350b2ba16b030c4	-	All ICMP - IPv4	ICMP	All
-	sgr-0591abafa351a0b93	IPv4	SSH	TCP	22
-	sgr-0f475cb26aa6d1bca	-	All UDP	UDP	0 - 65535
-	sgr-08b18e8ce10522b9a	-	All UDP	UDP	0 - 65535
-	sgr-04acb5e17fcc8046e	-	All TCP	TCP	0 - 65535
-	sgr-06fe11a06314588ec	-	All ICMP - IPv4	ICMP	All
-	sgr-0e7badef06c115fbc	-	All TCP	TCP	0 - 65535
-	sgr-0b1a570c7d1695405	-	Custom TCP	TCP	8443

Fig 12. ElasticMapReduce-master

5. Verify if ssh is present there else, create a new one

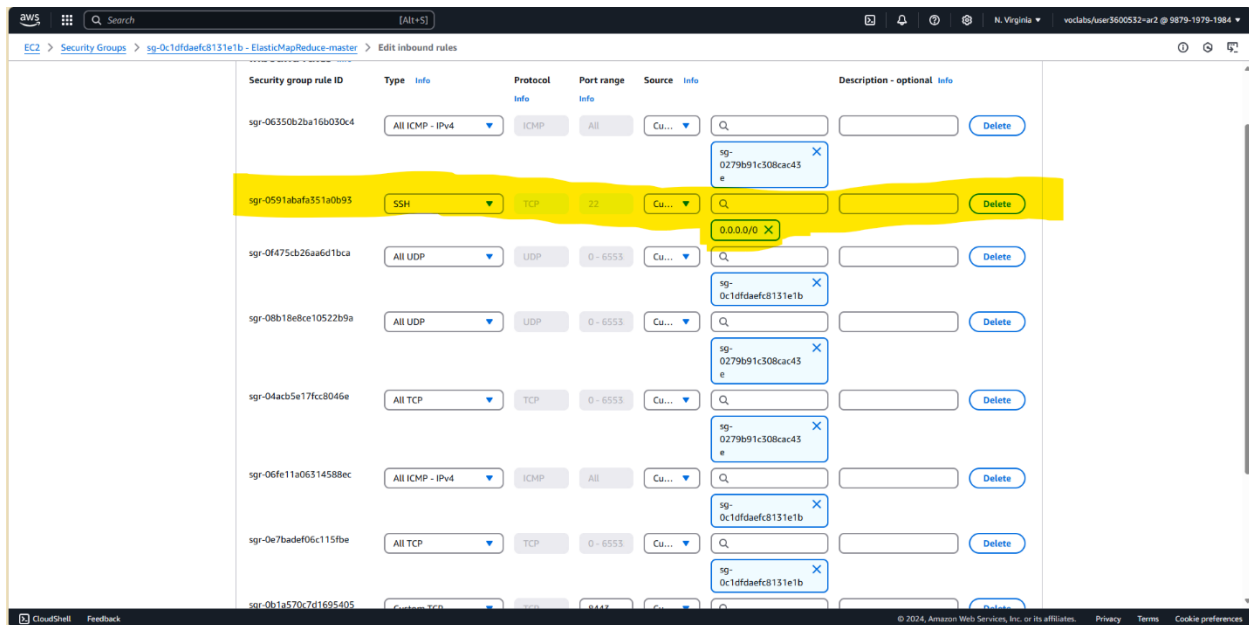


Fig 13. SSH in Inbound rules

6. Now you could able to access the master instance, now to EMR menu, select connect via ssm, go to EC2 connect tab and click connect

Connect to instance [Info](#)

Connect to your instance i-02374fbfb6127084 using any of these options

EC2 Instance Connect | Session Manager | SSH client | EC2 serial console

Instance ID
i-02374fbfb6127084

Connection Type

☒ **Connect using EC2 Instance Connect**
Connect using the EC2 Instance Connect browser-based client, with a public IPv4 or IPv6 address.

☐ **Connect using EC2 Instance Connect Endpoint**
Connect using the EC2 Instance Connect browser-based client, with a private IPv4 address and a VPC endpoint.

Public IPv4 address
☒ 54.157.190.132

IPv6 address
☐ -

Username
Enter the username defined in the AMI used to launch the instance. If you didn't define a custom username, use the default username, root.

Note: In most cases, the default username, root, is correct. However, read your AMI usage instructions to check if the AMI owner has changed the default AMI username.

[Cancel](#)

[Connect](#)

Fig 14. Connect to EC2

S3 Bucket

We are going to store the code and csv file in S3 bucket to sync them and use it in EMR Cluster

1. In the search bar, type S3 and select create bucket.
2. Give name *bucketcluster* to it
3. After creating it, *upload training.py, TrainingDataset.csv, prediction.py* and *ValidationDataset.csv* to this bucket
4. Check whether is these file present as given in below figure. Pls note that *trainedmodel* folder is also present in the bucket which is created only after *training.py* have finished execution in the EMR Cluster

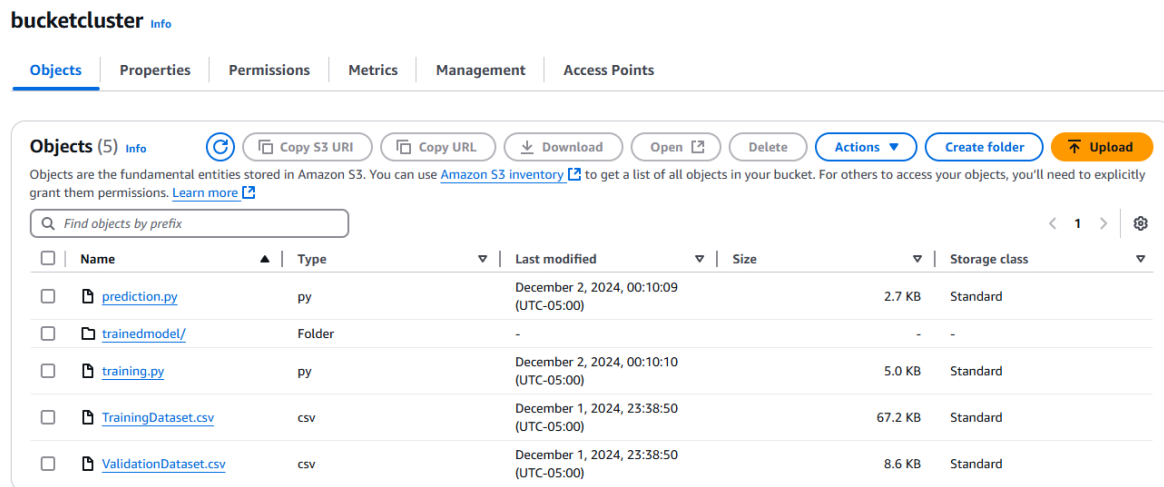


Fig 15. Bucketcluster

Execution without Docker

We are going to execute both *training.py* and *prediction.py* without docker

1. Go to EC2 Instance
2. Install numpy via cmd ***“pip install numpy”***

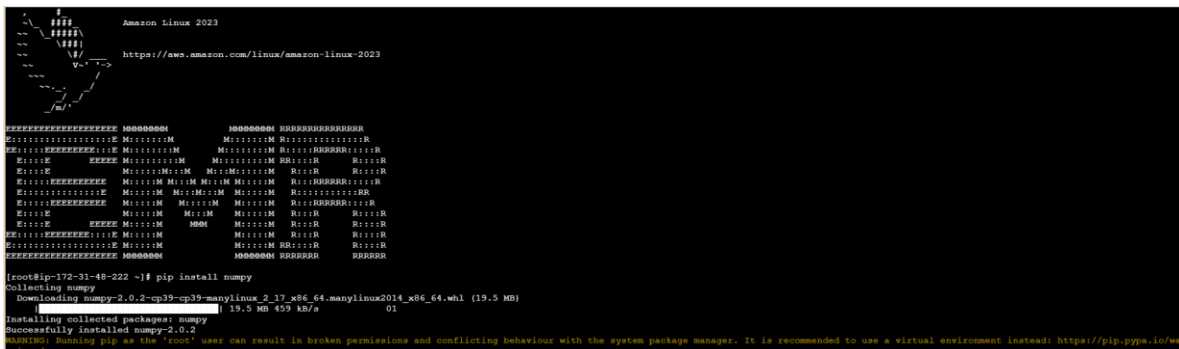


Fig 16. Install numpy

3. Now Run training.py via command “**spark-submit s3://bucketcluster/training.py**” and wait until execution get finished

```
[root@ip-172-31-48-222 ~]# spark-submit s3://bucketcluster/training.py
Starting Spark Application on EMR Cluster: Wine Cluster
Initializing Spark Session for WineQualityPrediction
24/12/03 05:27:54 INFO EMRParamSideChannel: Setting FGAC mode to false
24/12/03 05:27:54 INFO SparkContext: Running Spark version 3.5.2-amzn-1
24/12/03 05:27:54 INFO SparkContext: On Info Linux, 6.1.112-124.190.amzn2023.x86_64, amd64
24/12/03 05:27:54 INFO SparkContext: Java version 17.0.13
24/12/03 05:27:54 INFO ResourceUtils:
24/12/03 05:27:54 INFO ResourceUtils: No custom resources configured for spark.driver.
24/12/03 05:27:54 INFO ResourceUtils:
24/12/03 05:27:54 INFO SparkContext: Submitted application: WineQualityPrediction
24/12/03 05:27:54 INFO ResourceProfile: Default ResourceProfile created, executor resources: Map(executorType -> name: executorType, amount: 1, script: , vendor: , cores -> name: cores, amount: 4, script: , vendor: , memory -> name: memory, amount: 4269, script: , vendor: , offHeap -> name: offHeap, amount: 0, script: , vendor: ), task resources: Map(cpu -> name: cpu, amount: 1.0)
24/12/03 05:27:54 INFO ResourceProfile: Limiting resource is cpu at 4 tasks per executor
24/12/03 05:27:54 INFO ResourceProfileManager: Added ResourceProfile id: 0
24/12/03 05:27:54 INFO ResourceProfile: User executor ResourceProfile created, executor resources: Map(executorType -> name: executorType, amount: 1, script: , vendor: , cores -> name: cores, amount: 4, script: , vendor: , memory -> name: memory, amount: 4269, script: , vendor: , offHeap -> name: offHeap, amount: 0, script: , vendor: ), task resources: Map(cpu -> name: cpu, amount: 1.0)
24/12/03 05:27:54 INFO ResourceProfile: Limiting resource is cpu at 4 tasks per executor
24/12/03 05:27:54 INFO ResourceProfileManager: Added ResourceProfile id: 1
24/12/03 05:27:54 INFO SecurityManager: Changing view acls to: root
24/12/03 05:27:54 INFO SecurityManager: Changing modify acls to: root
24/12/03 05:27:54 INFO SecurityManager: Changing view acls groups to:
24/12/03 05:27:54 INFO SecurityManager: Changing modify acls groups to:
24/12/03 05:27:54 INFO SecurityManager: SecurityManager: authentication disabled; ui acls disabled; users with view permissions: root; groups with view permissions: EMPTY; users with modify permissions: root; groups with modify permissions: EMPTY
24/12/03 05:27:55 INFO Utils: Successfully started service 'sparkDriver' on port 35939.
24/12/03 05:27:55 INFO SparkEnv: Registering MapOutputTracker
24/12/03 05:27:55 INFO SparkEnv: Registering BlockManagerMaster
24/12/03 05:27:55 INFO BlockManagerMasterEndpoint: Using org.apache.spark.storage.DefaultTopologyMapper for getting topology information
24/12/03 05:27:55 INFO BlockManagerMasterEndpoint: BlockManagerMasterEndpoint up
24/12/03 05:27:55 INFO SparkEnv: Registering BlockManagerMasterHeartbeat
24/12/03 05:27:55 INFO DiskBlockManager: Created local directory at /tmp/imp/blockmgr-5072bf10-4d57-4468-b546-181018fa23ee
24/12/03 05:27:55 INFO MemoryStore: MemoryStore started with capacity 1048.8 MiB
24/12/03 05:27:56 INFO SparkEnv: Registering OutputCommitCoordinator
24/12/03 05:27:56 INFO SecurityManager: SecurityManager: audit is disabled.
24/12/03 05:27:56 INFO JettyUtils: Start Jetty 0.0.0.0:4040 for SparkUI
24/12/03 05:27:56 INFO Utils: Successfully started service 'SparkUI' on port 4040.
24/12/03 05:27:56 INFO SparkContext: Set spark.dynamicAllocation.preallocateExecutors to 'false' disable executor preallocation.
24/12/03 05:27:56 INFO DefaultHadoopMapReduceV2ProxyProvider: Connecting to ResourceManager at ip-172-31-48-222.ec2.internal/172.31.48.222:8032
24/12/03 05:27:57 INFO Configuration: resource-types.xml not found
24/12/03 05:27:57 INFO ResourceUtils: Unable to find 'resource-types.xml'.
24/12/03 05:27:57 INFO Client: Verifying our application has not requested more than the maximum memory capability of the cluster (6144 MB per container)

i-02374fbfb6127084
PublicDns: 54.157.190.132 PrivateDns: 172.31.48.222
```

Fig 17. Running training.py

```
24/12/03 05:28:22 INFO SingleEventLogFileWriter: Logging events to hdfa/var/log/spark/apps/application_1733203398859_0001/imprograss
24/12/03 05:28:22 INFO Utils: Using 50 preallocated executors (minExecutors: 0). Set spark.dynamicAllocation.preallocateExecutors to 'false' disable executor preallocation.
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /jobs: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /jobs/job: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /jobs/job/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /stages: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /stages/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /stages/stage: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /stages/stage/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /stages/pool: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /stages/pool/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /storage: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /storage/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /storage/rdd: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /storage/rdd/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /environment: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /environment/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /executors: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /executors/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /executors/threadDump: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /executors/heapHistogram: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /executors/heapHistogram/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /api: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /jobs/job/kill: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /stages/stage/kill: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:22 INFO ServerInfo: Adding filter to /matrices/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmFilter
24/12/03 05:28:23 INFO YarnClientBackend: SchedulerBackend is ready for scheduling beginning after reached minRegisteredResourceRatio: 0.0
24/12/03 05:28:23 INFO YarnClientBackend: SchedulerBackend: ApplicationMaster registered as NettyRpcEndpointRef(spark-client//YarnAM)
Reading training data from s3://bucketcluster/trainingDataset.csv
Cleaning data
Setting up Feature assembler and label indexer
Caching training data
Building RandomForestClassifier
Creating training pipeline
Setting up parameter grid for CrossValidator
Configuring CrossValidator
Fitting model with CrossValidator
Saving the trained model to s3://bucketcluster/trainedmodel
Stopping Spark Session
[root@ip-172-31-48-222 ~]#
```

Fig 18. Completed executing training.py

4. Now Run prediction.py via command “**spark-submit s3://bucketcluster/prediction.py s3://bucketcluster/ValidationDataset.csv**” and wait until execution get finished

```
[root@ip-172-31-48-222 ~]# spark-submit s3://bucketcluster/prediction.py s3://bucketcluster/ValidationDataset.csv
Launching Spark Application on EMR Cluster: Wine Cluster
24/12/03 05:32:40 INFO EMRFileSystemChannel: Setting EMRFS mode to false
24/12/03 05:32:40 INFO SparkContext: Running Spark version 3.5.2-amsn-1
24/12/03 05:32:40 INFO SparkContext: OS info Linux, 6.1.112-124.190.amsn2023.x86_64, amd64
24/12/03 05:32:40 INFO SparkContext: Java version 17.0.13
24/12/03 05:32:40 INFO ResourceUtils: 
24/12/03 05:32:40 INFO ResourceUtils: No custom resources configured for spark.driver.
24/12/03 05:32:40 INFO ResourceUtils: 
24/12/03 05:32:40 INFO SparkContext: Submitted application: WineQualityEvaluation
24/12/03 05:32:40 INFO ResourceProfile: Default ResourceProfile created, executor resources: Map(executorType -> name: executorType, amount: 1, script: , vendor: , cores -> name: cores, amount: 4, script: , ven
dor: , memory -> name: memory, amount: 4269, script: , vendor: , offheap -> name: offheap, amount: 0, script: , vendor: ), task resources: Map(cpu -> name: cpus, amount: 1.0)
24/12/03 05:32:40 INFO ResourceProfile: Limiting resource is cpus at 4 tasks per executor
24/12/03 05:32:40 INFO ResourceProfileManager: Added ResourceProfile id: 0
24/12/03 05:32:40 INFO ResourceProfile: User executor ResourceProfile created, executor resources: Map(executorType -> name: executorType, amount: 1, script: , vendor: , cores -> name: cores, amount: 4, script:
, vendor: , memory -> name: memory, amount: 4269, script: , vendor: , offheap -> name: offheap, amount: 0, script: , vendor: ), task resources: Map(cpu -> name: cpus, amount: 1.0)
24/12/03 05:32:40 INFO ResourceProfile: Limiting resource is cpus at 4 tasks per executor
24/12/03 05:32:40 INFO ResourceProfileManager: Added ResourceProfile id: 1
24/12/03 05:32:40 INFO SecurityManager: Changing view acls to: root
24/12/03 05:32:40 INFO SecurityManager: Changing modify acls to: root
24/12/03 05:32:40 INFO SecurityManager: Changing view acls groups to:
24/12/03 05:32:40 INFO SecurityManager: Changing modify acls groups to:
24/12/03 05:32:40 INFO SecurityManager: Authentication disabled; ui acls disabled; users with view permissions: root; groups with view permissions: EMPT; users with modify permissions: root; g
roups with modify permissions: EMPT
24/12/03 05:32:40 INFO Utils: Successfully started service 'sparkDriver' on port 38703.
24/12/03 05:32:40 INFO SparkEnv: Registering MapOutputTracker
24/12/03 05:32:40 INFO SparkEnv: Registering BlockManagerMaster
24/12/03 05:32:40 INFO BlockManagerMasterEndpoint: Using org.apache.spark.storage.DefaultTopologyMapper for getting topology information
24/12/03 05:32:40 INFO BlockManagerMasterEndpoint: BlockManagerMasterEndpoint up
24/12/03 05:32:40 INFO SparkEnv: Registering BlockManagerMasterHeartbeat
24/12/03 05:32:40 INFO DiskBlockManager: Created local directory at /mnt/tmp/blockmgr-66e3a6ea-90b0-4fc2-bb8c-291fe8010698
24/12/03 05:32:40 INFO MemoryStore: MemoryStore started with capacity 1048.8 MiB
24/12/03 05:32:41 INFO SparkEnv: Registering OutputCommitCoordinator
24/12/03 05:32:41 INFO SubResultCacheManager: Sub-result caches are disabled.
24/12/03 05:32:41 INFO JettyUtil: Start Jetty 9.0.0.v201608-0 for SparkUI
24/12/03 05:32:41 INFO Utils: Successfully started service 'SparkUI' on port 4040.
24/12/03 05:32:41 INFO Utils: Using 50 preallocated executors (minExecutors: 0). Set spark.dynamicAllocation.preallocateExecutors to 'false' to disable executor preallocation.
24/12/03 05:32:41 INFO DefaultHadoopMapperProxyProvider: Connecting to ResourceManager at ip-172-31-48-222.ec2.internal/172.31.48.222:8032
24/12/03 05:32:42 INFO Configuration: resource-types.xml not found
24/12/03 05:32:42 INFO ResourceUtils: Unable to find 'resource-types.xml'.
24/12/03 05:32:42 INFO Client: Verifying our application has not requested more than the maximum memory capability of the cluster (6144 MB per container)
24/12/03 05:32:42 INFO Client: Will allocate 4M container, with 196 MB memory including 384 MB overhead
24/12/03 05:32:42 INFO Client: Setting up container launch context for our AM
```

Fig 19. Running prediction.py

```
24/12/03 05:33:02 WARN YarnSchedulerBackend$YarnSchedulerEndpoint: Attempted to request executors before the AM has registered!
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /jobs: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /jobs/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /jobs/job: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /jobs/job/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /stages: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /stages/stage: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /stages/stage/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /stages/pool: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /stages/pool/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /storage: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /storage/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /storage/rdd: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /storage/rdd/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /environment: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /environment/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /executors: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /executors/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /executors/threadDump: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /executors/threadDump/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /executors/heapHistogram: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /executors/heapHistogram/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /api: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /jobs/job/kill: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /stages/stage/kill: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO ServerInfo: Adding filter to /metrics/json: org.apache.hadoop.yarn.server.webproxy.amfilter.AmipFilter
24/12/03 05:33:02 INFO YarnSchedulerBackend$SchedulerBackend: SchedulerBackend is ready for scheduling beginning after reached minRegisteredResourceRatio: 0.0
24/12/03 05:33:02 INFO YarnSchedulerBackend$YarnSchedulerEndpoint: ApplicationMaster registered as NettyRpcEndpointRef(spark-client://YarnAM)
Loading validation data from: s3://bucketcluster/ValidationDataset.csv
Processing the validation dataset
Preprocessing data: casting columns to double
Loading pre-trained model from: s3://bucketcluster/trainedmodel
Running predictions on the validation data
Evaluating predictions
Accuracy of the wine quality prediction model = 0.96875
Calculating F1 Score
/usr/lib/spark/python/lib/pyspark.zip/pyspark/sql/context.py:158: FutureWarning: Deprecated in 3.0.0. Use SparkSession.builder.getOrCreate() instead.
Weighted F1 Score of the model = 0.9547916666666667
Shutting down Spark Application
[root@ip-172-31-48-222 ~]#
```

I-02374fbfbf6127084

PublicIPs: 54.157.190.132 PrivateIPs: 172.31.48.222

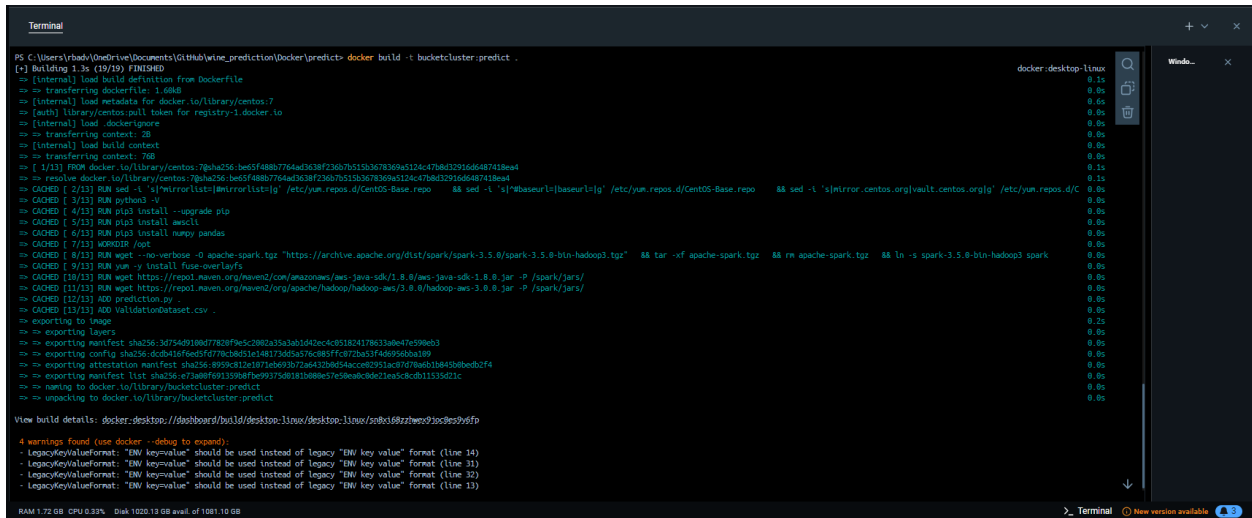
Fig 20. Completed executing prediction.py

5. We could able to conclude that after running prediction.py, we could able to find accuracy score is 96% and F1 score is 0.954791

Execution with Docker

We are going to execute prediction.py with docker

1. Go to docker desktop, login there
2. Build, tag and push the compiled prediction.py images into docker so that it could be accessed by EC2. We need to do this step only if there any changes in the code or if you are pushing it for the first time.



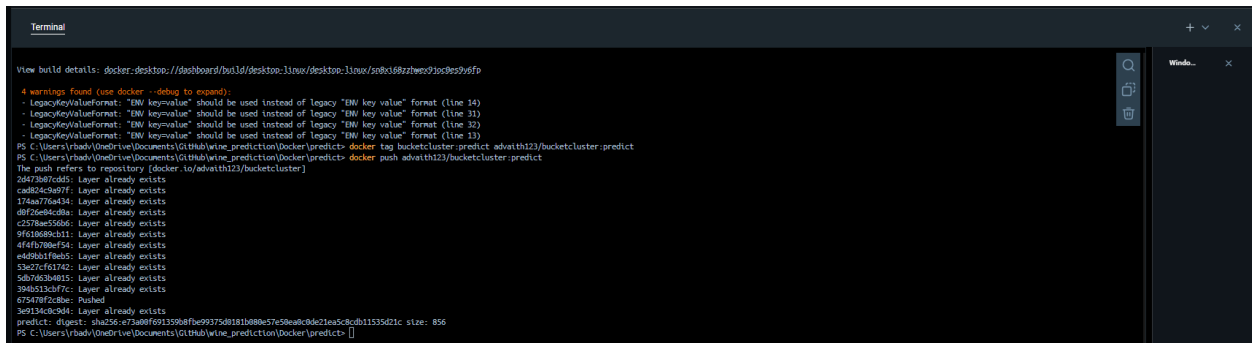
```
PS C:\Users\rbadv\OneDrive\Documents\GitHub\wine_prediction[Docker|predict] docker build -t bucketcluster:predict .
[+] Building 1.3s (19/19) FINISHED
=> [internal] load build definition from Dockerfile
=> [internal] load metadata for docker.io/library/centos:7
=> [auth] library/centos:pull token for registry-1.docker.io
=> [internal] load dockerignore
=> [internal] load build context
=> [internal] transferring context: 20
=> [internal] transferring context: 700
=> [1/13] FROM docker.io/library/centos:7@sha256:b65f488b7764d336f236b761593678369a5124c47b6d12916d64687428ea4
=> resolve docker.io/library/centos:7@sha256:b65f488b7764d336f236b761593678369a5124c47b6d12916d64687428ea4
=> CACHED [ 2/13] RUN sed -i 's|\"mirrorlist\"|\"mirrorlist=http://mirror.centos.org|' /etc/yum.repos.d/CentOS-Base.repo
=> CACHED [ 3/13] RUN yum install -y
=> CACHED [ 4/13] RUN pip3 install --upgrade pip
=> CACHED [ 5/13] RUN pip3 install awscli
=> CACHED [ 6/13] RUN pip3 install numpy pandas
=> CACHED [ 7/13] ADD dataset root
=> CACHED [ 8/13] RUN wget --no-verbose -O apache-spark.tgz "https://archive.apache.org/dist/spark/spark-3.5.0/spark-3.5.0-bin-hadoop3.tgz"
=> CACHED [ 9/13] RUN tar -xzf apache-spark.tgz
=> CACHED [10/13] RUN wget https://repo.maven.org/maven2/org/apache/hadoop/hadoop-aws/3.8.0/hadoop-aws-3.8.0.jar -P /spark/jars/
=> CACHED [11/13] RUN wget https://repo.maven.org/maven2/org/apache/hadoop/hadoop-aws/3.8.0/hadoop-aws-3.8.0.jar -P /spark/jars/
=> CACHED [12/13] ADD prediction.py
=> CACHED [13/13] ADD validationdataset.csv
=> exporting to image
=> exporting manifest sha256:3d75a9186477828f9ec2980a25a2b1d33c4c491824178632a6e1e599eb3
=> exporting config sha256:dcb1d16fed5d778c8d51e48173d5a57ac885ffc872ba53f4d6956ba109
=> exporting attestation manifest sha256:8959c812e1871e693072a6432b6d54acce02951ac9747a6b1b645b8ed2b2f4
=> exporting manifest blob sha256:d72a0f69135908f6e9937508131688e57e58eac0e21e5c8db11535d21c
=> naming to docker.io/library/bucketcluster:predict
=> unpacking to docker.io/library/bucketcluster:predict

View build details: docker-desktop://dashboard/build/desktop:linux/desktop:linux/z8k168zztwc93oc9es9v6fp

4 warnings found (use docker --debug to expand):
- LegacyKeyValueFormat: "BW key=value" should be used instead of legacy "BW key value" format (line 14)
- LegacyKeyValueFormat: "BW key=value" should be used instead of legacy "BW key value" format (line 11)
- LegacyKeyValueFormat: "BW key=value" should be used instead of legacy "BW key value" format (line 32)
- LegacyKeyValueFormat: "BW key=value" should be used instead of legacy "BW key value" format (line 13)

RAM 1.72 GB CPU 0.33% Disk 1020.13 GB avail. of 1081.10 GB
```

Fig 21. Building Image of prediction.py in docker



```
PS C:\Users\rbadv\OneDrive\Documents\GitHub\wine_prediction[Docker|predict] docker tag bucketcluster:predict adwith123/bucketcluster:predict
The push refers to repository [docker.io/adwith123/bucketcluster]
2d473b87d55: Layer already exists
c08b4cd697f: Layer already exists
174a0776a34: Layer already exists
d0f20e84c08a: Layer already exists
c257bae5d06: Layer already exists
9f0160d9311: Layer already exists
4f4f700ef54: Layer already exists
e408b1f0e5: Layer already exists
5a2c7c617d2: Layer already exists
5b7d63b0415: Layer already exists
39405133f7c: Layer already exists
675470f288e: Pushed
3e9134cd304: Layer already exists
predict: digest: sha256:e73a0ff69135908f6e9937508131688e57e58eac0e21e5c8db11535d21c size: 856
PS C:\Users\rbadv\OneDrive\Documents\GitHub\wine_prediction[Docker|predict] docker push adwith123/bucketcluster:predict
```

Fig 22. Tagging and Pushing Image of prediction.py in docker

3. Now go to EC2 instance and login into docker there. Also type cmd “**sudo systemctl start docker**” and “**sudo systemctl enable docker**” as well

```
[root@ip-172-31-48-222 ~]# docker login
Authenticating with existing credentials...
WARNING! Your password will be stored unencrypted in /root/.docker/config.json.
Configure a credential helper to remove this warning. See
https://docs.docker.com/engine/reference/commandline/login/#credentials-store

Login Succeeded
[root@ip-172-31-48-222 ~]# sudo systemctl start docker
[root@ip-172-31-48-222 ~]# sudo systemctl enable docker
Created symlink /etc/systemd/system/multi-user.target.wants/docker.service → /usr/lib/systemd/system/docker.service.
```

Fig 23. Starting Docker in EC2

4. Pull prediction.py image from docker using command “***sudo docker pull advaith123/bucketcluster:predict*** “. The below Figure states that the images have already been pulled

```
[root@ip-172-31-48-222 ~]# sudo docker pull advaith123/bucketcluster:predict
predict: Pulling from advaith123/bucketcluster
Digest: sha256:b65a3609d143687b7226dafb8f1e117c619ef3a51eb8d46bcf0275977275f0f5
Status: Image is up to date for advaith123/bucketcluster:predict
docker.io/advaith123/bucketcluster:predict
```

Fig 24. Pulling images to EC2

5. Use command “***docker images***” to check whether is image uploaded or not

```
[root@ip-172-31-48-222 ~]# docker images
```

REPOSITORY	TAG	IMAGE ID	CREATED	SIZE
advaith123/bucketcluster	predict	dcd416f6ed5	2 hours ago	1.56GB

Fig 25. Checking whether if images exists in EC2

6. Now Run prediction.py via command “***sudo docker run -v /home/ec2-user/./job advaith123/bucketcluster:predict***” and wait until execution get finished

```
[root@ip-172-31-48-222 ~]# sudo docker run -v /home/ec2-user/./job advaith123/bucketcluster:predict
:: loading settings :: url = jar:file:/opt/spark-3.0.0-bin-hadoop3/jars/ivy-2.5.1.jar!/org/apache/ivy/core/settings/ivysettings.xml
ivy Default Cache set to: /root/.ivy2/cache
The jars for the packages stored in: /root/.ivy2/jars
org.apache.hadoop#hadoop-aws added as a dependency
com.amazonaws#aws-java-sdk added as a dependency
:: resolving dependencies :: org.apache.spark#spark-submit-parent-852f7b7-2caa-417d-8f2e-ea38d915ee8f;1.0
conf:: (default)
found org.apache.hadoop#hadoop-aws;2.7.3 in central
found org.apache.hadoop#hadoop-common;2.7.3 in central
found org.apache.hadoop#hadoop-annotations;2.7.3 in central
found com.google.guava#guava;11.0.2 in central
found com.google.code.findbugs#jsr305;3.0.0 in central
found commons-logging#commons-logging;1.2 in central
found org.apache.commons#commons-math3;3.1.1 in central
found xalan#xalan;0.52 in central
found commons-httpclient#commons-httpclient;3.1 in central
found commons-io#commons-io;1.3 in central
found commons-codec#commons-codec;1.4 in central
found commons-lang#commons-lang;2.4 in central
found commons-net#commons-net;3.1 in central
found commons-collections#commons-collections;3.2.2 in central
found javax.servlet#servlet-api;2.5 in central
found org.mortbay.jetty#jetty;6.1.26 in central
found org.mortbay.jetty#jetty-util;6.1.26 in central
found com.sun.jersey#jersey-core;1.9 in central
found com.sun.jersey#jersey-json;1.9 in central
found org.codehaus.jackson#jackson;1.1 in central
found com.sun.xml.bind#jaxb-impl;2.2.3-1 in central
found javax.xml.bind#jaxb-api;2.2.2 in central
found javax.xml.stream#jax-stream;1.0-2 in central
found javax.activation#activation;1.1 in central
found org.codehaus.jackson#jackson-core-asl;1.9.13 in central
found org.codehaus.jackson#jackson-mapper-asl;1.9.13 in central
found org.codehaus.jackson#jackson-jaxrs;1.9.13 in central
found com.sun.jersey#jersey-server;1.9 in central
found aopalliance#api;1.0 in central
found log4j#log4j;1.2.17 in central
found net.java.dev.jets3t#jets3t;0.9.0 in central
found org.apache.hadoop#hadoop-client;1.2.3 in central
```

Fig 26. Running Docker Prediction Image in EC2

Fig 27. Completed executing Docker Prediction Image in EC2

7. We could able to conclude that after running prediction image from docker, we could able to find accuracy score is 96% and F1 score is 0.954791

Containers

Images

Volumes

Builds

Docker Scout

Extensions

Images / advath123/bucketcluster-predict

advath123/bucketcluster-predict

2 hours ago

2.48 GB

Recommended Files

Push

Layers (20)

0	ADD file:3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53 in /	225.2 MB
1	LABEL org.label.schema.version=1.0 org.label.schema.name=CentOS Base Image org.label.schema.vendor...	0 B
2	CMD ["bin/bash"]	0 B
3	RUN bin/sh -c sed -i 's/mirrorlist=/mirrorlist-ig /etc/yum.repos.d/CentOS-Base.repo && sed -i 's/Baseurl=/Base...	668.32 MB
4	RUN bin/sh -c python3 -V # buildkit	4.1 KB
5	ENV PYSPARK_DRIVER_PYTHON=python3	0 B
6	ENV PYSPARK_PYTHON=python3	0 B
7	RUN bin/sh -c pip3 install --upgrade pip # buildkit	13.71 MB
8	RUN bin/sh -c pip3 install awscli # buildkit	124.69 MB
9	RUN bin/sh -c pip3 install numpy pandas # buildkit	137.08 MB
10	WORKDIR /opt	4.1 KB
11	RUN bin/sh -c wget --no-verbose -O apache-spark.tar.gz https://archive.apache.org/dist/spark/spark-3.5.0/spark-3.5...	448.46 MB
12	RUN bin/sh -c yum -y install fuse-overlayfs # buildkit	25.35 MB
13	ENV SPARK_HOME=/opt/spark	0 B
14	ENV PATH=/opt/spark/bin:/usr/local/bin:/usr/local/bin:/usr/bin:/usr/bin:/sbin:/bin	0 B

Vulnerabilities Packages Command

Analyzed by

scout

scout

ADD file:3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53 in /

Terminal

```

#618080d11: Layer already exists
#6f5799e94: Layer already exists
#e49501f6a5: Layer already exists
3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53: Pushed
5d8363b4e15: Layer already exists
39d01132f7c: Layer already exists
67527c7258c: Pushed
3a9734c8c9d: Layer already exists
#618080d11: Layer already exists
#6f5799e94: Layer already exists
#e49501f6a5: Layer already exists
3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53: Pushed
5d8363b4e15: Layer already exists
39d01132f7c: Layer already exists
67527c7258c: Pushed
3a9734c8c9d: Layer already exists
#618080d11: Layer already exists
#6f5799e94: Layer already exists
#e49501f6a5: Layer already exists
3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53: Pushed
5d8363b4e15: Layer already exists
39d01132f7c: Layer already exists
67527c7258c: Pushed
3a9734c8c9d: Layer already exists
#618080d11: Layer already exists
#6f5799e94: Layer already exists
#e49501f6a5: Layer already exists
3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53: Pushed
5d8363b4e15: Layer already exists
39d01132f7c: Layer already exists
67527c7258c: Pushed
3a9734c8c9d: Layer already exists
#618080d11: Layer already exists
#6f5799e94: Layer already exists
#e49501f6a5: Layer already exists
3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53: Pushed
5d8363b4e15: Layer already exists
39d01132f7c: Layer already exists
67527c7258c: Pushed
3a9734c8c9d: Layer already exists
#618080d11: Layer already exists
#6f5799e94: Layer already exists
#e49501f6a5: Layer already exists
3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53: Pushed
5d8363b4e15: Layer already exists
39d01132f7c: Layer already exists
67527c7258c: Pushed
3a9734c8c9d: Layer already exists
#618080d11: Layer already exists
#6f5799e94: Layer already exists
#e49501f6a5: Layer already exists
3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a9293983a306c1d4fa53: Pushed
5d8363b4e15: Layer already exists
39d01132f7c: Layer already exists
67527c7258c: Pushed
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#618080d11: Layer already exists
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3be0eb8b304723d43b7b44a6d990cd57b63d93d6a2a
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Fig 28. Docker Image