

CO515: Advances in Computer Networks: Selected Topics – Lab10

Big Data analysis with Hadoop: Extracting information from email records

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20/06/2024

Submission

1. Code Implementation.

Create a Java MapReduce program to extract useful information, such as the count of emails received by each sender.

```
import org.apache.hadoop.conf.Configuration;
import org.apache.hadoop.fs.Path;
import org.apache.hadoop.io.IntWritable;
import org.apache.hadoop.io.Text;
import org.apache.hadoop.mapreduce.Job;
import org.apache.hadoop.mapreduce.Mapper;
import org.apache.hadoop.mapreduce.Reducer;
import org.apache.hadoop.mapreduce.lib.input.FileInputFormat;
import org.apache.hadoop.mapreduce.lib.output.FileOutputFormat;

import java.io.IOException;
import java.util.regex.Matcher;
import java.util.regex.Pattern;

public class EmailLogAnalysis {

    // Mapper class that processes each line of the input file
    public static class EmailMapper extends Mapper<Object, Text, Text, IntWritable> {
        private final static IntWritable one = new IntWritable(1);
        private Text recipient = new Text();
        // Regular expression to extract the recipient email address
        private Pattern pattern = Pattern.compile("to=<(.*?)>");

        // The map method processes each line of the input file
        public void map(Object key, Text value, Context context) throws IOException,
            InterruptedException {
            Matcher matcher = pattern.matcher(value.toString());
            if (matcher.find()) {
                // Set the recipient email address as the key
                recipient.set(matcher.group(1));
                // Write the key-value pair to the context
                context.write(recipient, one);
            }
        }
    }
}
```

```

// Reducer class that aggregates the counts of emails for each recipient
public static class EmailReducer extends Reducer<Text, IntWritable, Text,
IntWritable> {
    private IntWritable result = new IntWritable();

    // The reduce method processes each group of values associated with a key
    public void reduce(Text key, Iterable<IntWritable> values, Context context)
throws IOException, InterruptedException {
        int sum = 0;
        // Sum up the counts for each recipient
        for (IntWritable val : values) {
            sum += val.get();
        }
        // Set the result and write the key-value pair to the context
        result.set(sum);
        context.write(key, result);
    }
}

// Main method to configure and run the MapReduce job
public static void main(String[] args) throws Exception {
    Configuration conf = new Configuration();
    // Create a new job instance
    Job job = Job.getInstance(conf, "email log analysis");
    // Set the jar file that contains the driver, mapper, and reducer classes
    job.setJarByClass(EmailLogAnalysis.class);
    // Set the mapper class
    job.setMapperClass(EmailMapper.class);
    // Set the combiner class, which is executed after the mapper but before the
reducer
    job.setCombinerClass(EmailReducer.class);
    // Set the reducer class
    job.setReducerClass(EmailReducer.class);
    // Set the output key and value types for the job
    job.setOutputKeyClass(Text.class);
    job.setOutputValueClass(IntWritable.class);
    // Set the input and output paths for the job
    FileInputFormat.addInputPath(job, new Path(args[0]));
    FileOutputFormat.setOutputPath(job, new Path(args[1]));
    // Exit the program based on the job result
    System.exit(job.waitForCompletion(true) ? 0 : 1);
}
}

```

Explanation of the MapReduce program written.

This program implements a Hadoop MapReduce job that processes email log files to count the number of emails received by each recipient. The “EmailMapper” class extracts recipient email addresses from each log entry and outputs a key-value pair (recipient, 1). The “EmailReducer” class then aggregates these counts for each recipient, providing the total number of emails received by each one.

The behavior of this program is further explained in the following flowchart.

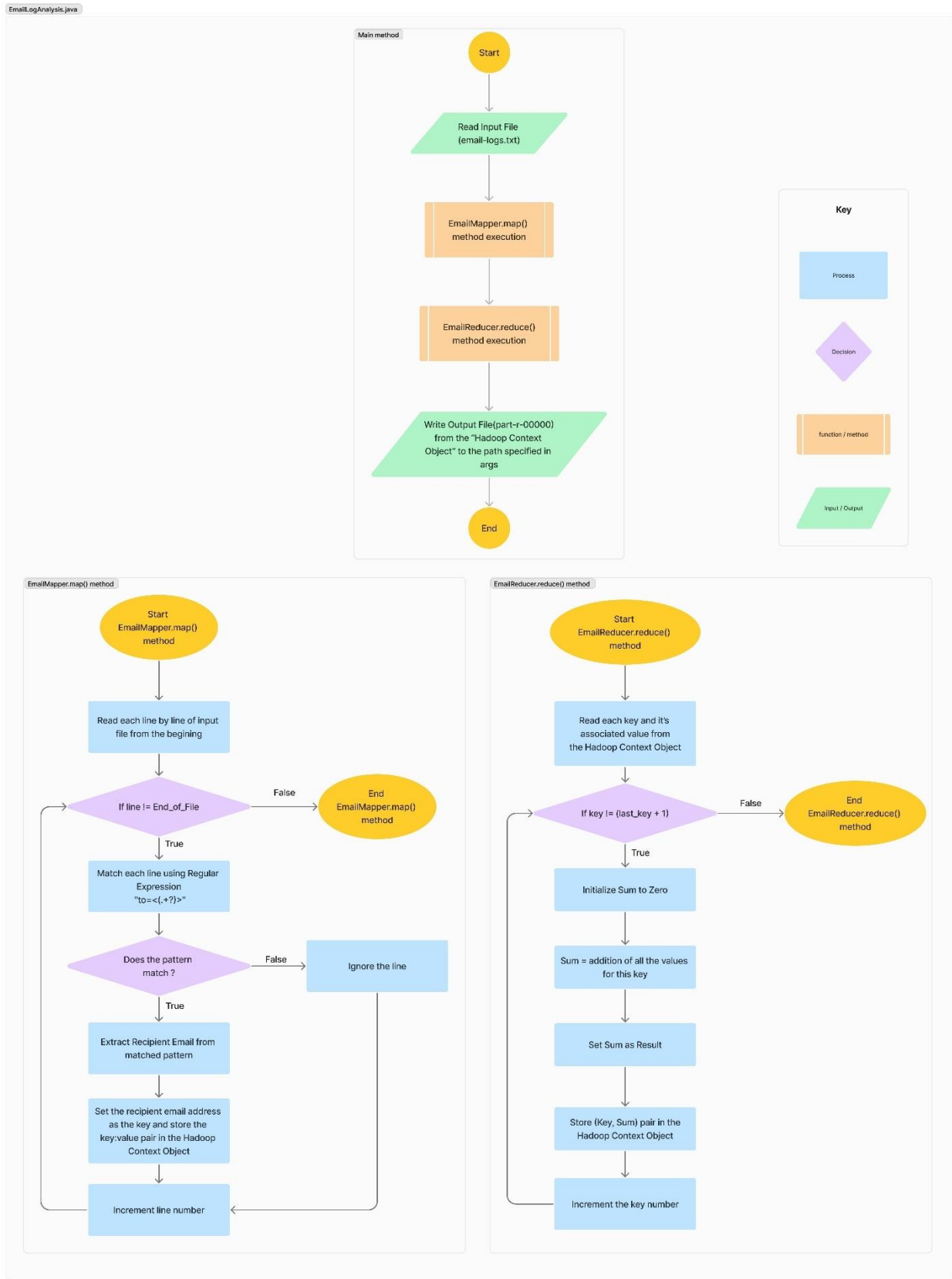
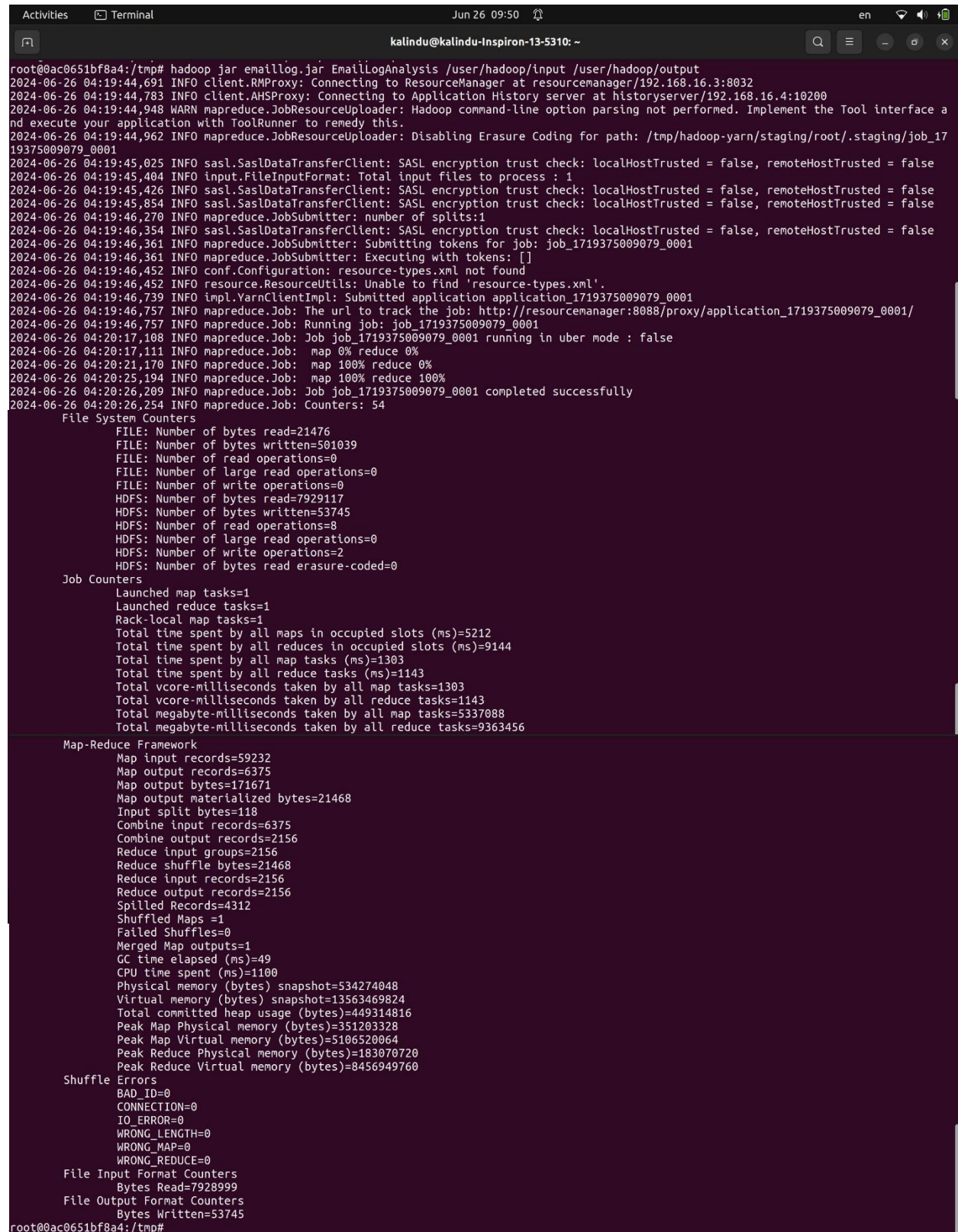


Figure 1: Flow chart explanation of the Map Reduce Job

2. Results: Output from the MapReduce job. Any observations or insights from the email log analysis

A terminal window titled 'kalindu@kalindu-Inspiron-13-5310: ~' showing the output of a Hadoop MapReduce job. The command executed is 'hadoop jar emaillog.jar EmailLogAnalysis /user/hadoop/input /user/hadoop/output'. The output consists of a series of log messages from 2024-06-26 04:19:44 to 04:20:26, followed by a summary of File System Counters, Job Counters, and Map-Reduce Framework statistics. The job completed successfully at 04:20:26.254.

```
root@0ac0651bf8a4:/tmp# hadoop jar emaillog.jar EmailLogAnalysis /user/hadoop/input /user/hadoop/output
2024-06-26 04:19:44,691 INFO client.RMProxy: Connecting to ResourceManager at resourcemanager/192.168.16.3:8032
2024-06-26 04:19:44,783 INFO client.AHSProxy: Connecting to Application History server at historyserver/192.168.16.4:10200
2024-06-26 04:19:44,948 WARN mapreduce.JobResourceUploader: Hadoop command-line option parsing not performed. Implement the Tool interface a
nd execute your application with ToolRunner to remedy this.
2024-06-26 04:19:44,962 INFO mapreduce.JobResourceUploader: Disabling Erasure Coding for path: /tmp/hadoop-yarn/staging/root/.staging/job_17
19375009079_0001
2024-06-26 04:19:45,025 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localHostTrusted = false, remoteHostTrusted = false
2024-06-26 04:19:45,404 INFO input.FileInputFormat: Total input files to process : 1
2024-06-26 04:19:45,426 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localHostTrusted = false, remoteHostTrusted = false
2024-06-26 04:19:45,854 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localHostTrusted = false, remoteHostTrusted = false
2024-06-26 04:19:46,270 INFO mapreduce.JobSubmitter: number of splits:1
2024-06-26 04:19:46,354 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localHostTrusted = false, remoteHostTrusted = false
2024-06-26 04:19:46,361 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1719375009079_0001
2024-06-26 04:19:46,361 INFO mapreduce.JobSubmitter: Executing with tokens: []
2024-06-26 04:19:46,452 INFO conf.Configuration: resource-types.xml not found
2024-06-26 04:19:46,452 INFO resource.ResourceUtils: Unable to find 'resource-types.xml'.
2024-06-26 04:19:46,739 INFO impl.YarnClientImpl: Submitted application application_1719375009079_0001
2024-06-26 04:19:46,757 INFO mapreduce.Job: The url to track the job: http://resourcemanager:8088/proxy/application_1719375009079_0001/
2024-06-26 04:19:46,757 INFO mapreduce.Job: Running job: job_1719375009079_0001
2024-06-26 04:20:17,108 INFO mapreduce.Job: Job job_1719375009079_0001 running in uber mode : false
2024-06-26 04:20:17,111 INFO mapreduce.Job: map 0% reduce 0%
2024-06-26 04:20:21,170 INFO mapreduce.Job: map 100% reduce 0%
2024-06-26 04:20:25,194 INFO mapreduce.Job: map 100% reduce 100%
2024-06-26 04:20:26,209 INFO mapreduce.Job: Job job_1719375009079_0001 completed successfully
2024-06-26 04:20:26,254 INFO mapreduce.Job: Counters: 54
  File System Counters
    FILE: Number of bytes read=21476
    FILE: Number of bytes written=501039
    FILE: Number of read operations=0
    FILE: Number of large read operations=0
    FILE: Number of write operations=0
    HDFS: Number of bytes read=7929117
    HDFS: Number of bytes written=53745
    HDFS: Number of read operations=8
    HDFS: Number of large read operations=0
    HDFS: Number of write operations=2
    HDFS: Number of bytes read erasure-coded=0
  Job Counters
    Launched map tasks=1
    Launched reduce tasks=1
    Rack-local map tasks=1
    Total time spent by all maps in occupied slots (ms)=5212
    Total time spent by all reduces in occupied slots (ms)=9144
    Total time spent by all map tasks (ms)=1303
    Total time spent by all reduce tasks (ms)=1143
    Total vcore-milliseconds taken by all map tasks=1303
    Total vcore-milliseconds taken by all reduce tasks=1143
    Total megabyte-milliseconds taken by all map tasks=5337088
    Total megabyte-milliseconds taken by all reduce tasks=9363456
  Map-Reduce Framework
    Map input records=59232
    Map output records=6375
    Map output bytes=171671
    Map output materialized bytes=21468
    Input split bytes=118
    Combine input records=6375
    Combine output records=2156
    Reduce input groups=2156
    Reduce shuffle bytes=21468
    Reduce input records=2156
    Reduce output records=2156
    Spilled Records=4312
    Shuffled Maps =1
    Failed Shuffles=0
    Merged Map outputs=1
    GC time elapsed (ms)=49
    CPU time spent (ms)=1100
    Physical memory (bytes) snapshot=534274048
    Virtual memory (bytes) snapshot=13563469824
    Total committed heap usage (bytes)=449314816
    Peak Map Physical memory (bytes)=351203328
    Peak Map Virtual memory (bytes)=5106520064
    Peak Reduce Physical memory (bytes)=183070720
    Peak Reduce Virtual memory (bytes)=8456949760
  Shuffle Errors
    BAD_ID=0
    CONNECTION=0
    IO_ERROR=0
    WRONG_LENGTH=0
    WRONG_MAP=0
    WRONG_REDUCE=0
  File Input Format Counters
    Bytes Read=7928999
  File Output Format Counters
    Bytes Written=53745
root@0ac0651bf8a4:/tmp#
```

Figure 2: Results from running the Map Reduce Job

1. *Job Execution Summary:*

- *The job ran successfully.*
- *It involved both map and reduce tasks.*
- *The total time spent by maps and reduces is provided.*
 - *Map tasks: 1100 milliseconds*
 - *Reduce tasks: 1143 milliseconds*
- *Physical memory and virtual memory usage are reported.*
 - *Peak physical memory used by the entire job: approx.351 MB*
 - *Peak virtual memory used by the entire job: approx. 8,456 MB*

2. *MapReduce Counters:*

- *Input records: 59,232*
- *Output records: 6,375*
- *Bytes read: 7,928,999*
- *Bytes written: 53,745*

3. *File Input and Output Format Counters:*

- *Bytes read from input files: 7,928,999*
- *Bytes written to output files: 53,745*

Conclusions and Observations form the email log analysis:

To further analyze the results, I've used python to plot the output results.

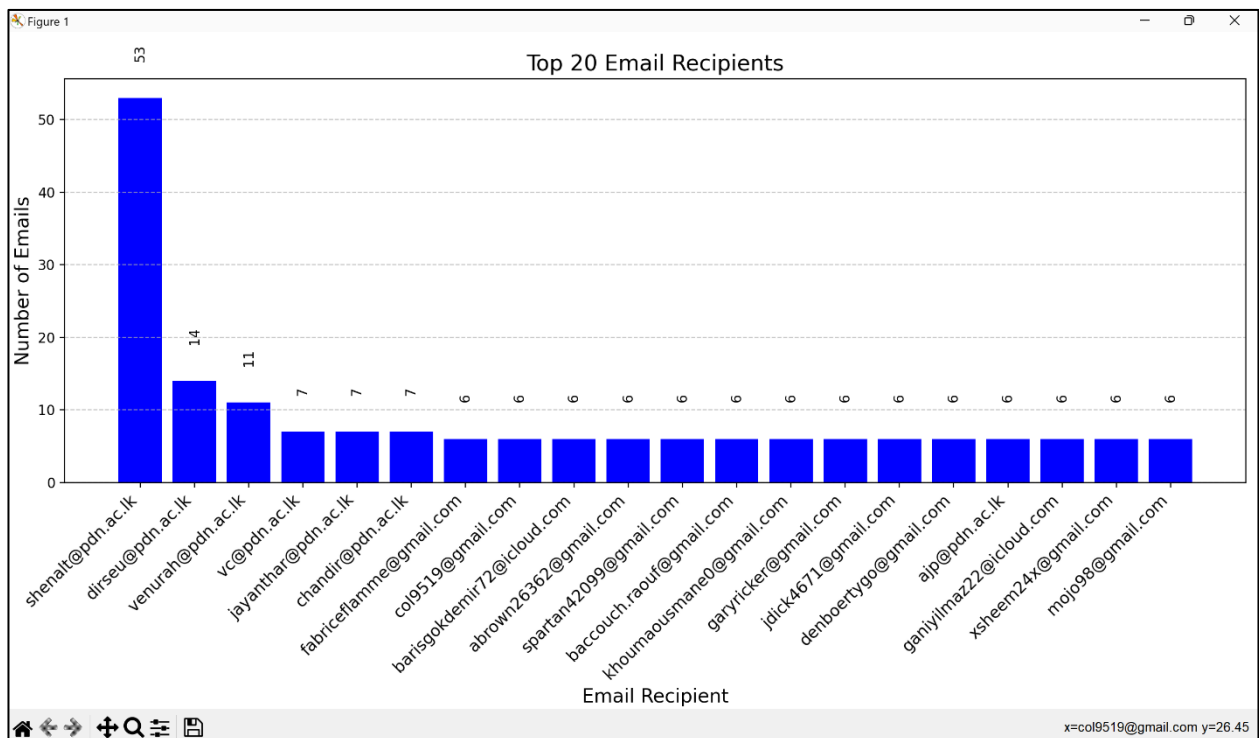


Figure 3: Top 20 Email Recipients

Lab Activities

Activity 1: Setting up Hadoop Environment

For this lab I used a docker compose environment using the official Hadoop docker images for namenode, datanode, resourcemanager, nodemanager, and historyserver.

(<https://hub.docker.com/r/apache/hadoop>)

My Hadoop Docker cluster setup:

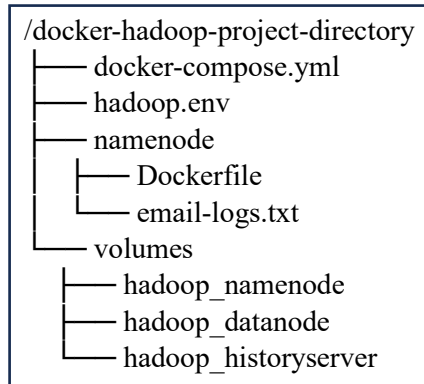


Figure 5: Hadoop docker cluster file structure

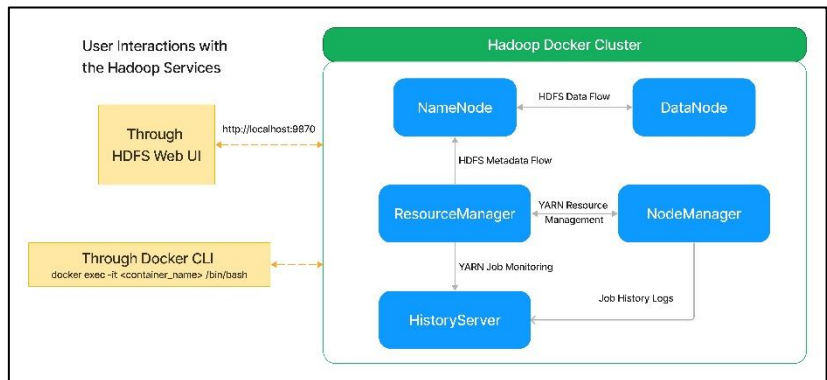


Figure 6: Hadoop docker cluster setup

The docker-compose.yml file, hadoop.env file and ./namenode/Dockerfile are attached in the appendix.

Starting the Hadoop services:

```
kalindu@kalindu-Inspiron-13-5310: ~/SEM-6/C0515/Lab10/myhadoop/docker-hadoop$ docker compose up --build -d
[+] Running 5/6
  ⌈ Network docker-hadoop_default Created
  ⌈ Container namenode Started
  ⌈ Container nodemanager Started
  ⌈ Container datanode Started
  ⌈ Container resourcemanager Started
  ⌈ Container historyserver Started
kalindu@kalindu-Inspiron-13-5310: ~/SEM-6/C0515/Lab10/myhadoop/docker-hadoop$
```

Figure 7: Starting Hadoop cluster using docker compose

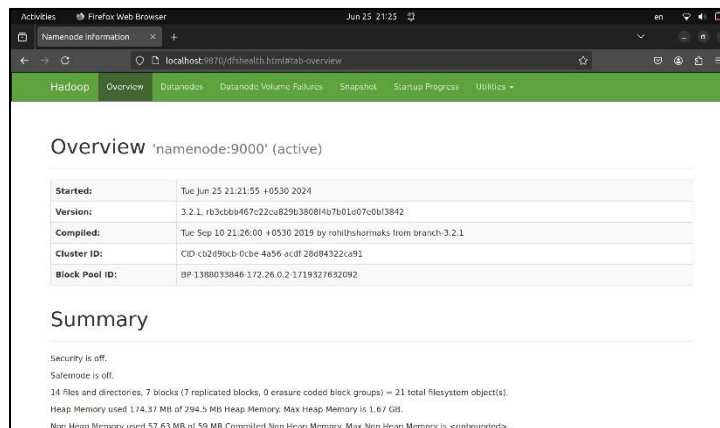


Figure 8: HDFS Web UI started

Activity 2: Loading Email Logs into HDFS

In the execution of Dockerfile for namenode container, I have already copied the provided email-logs.txt into /tmp/ folder of the namenode container. The following is the command implementation for uploading email-logs.txt from /tmp/ into the HDFS directory.

```
kalindu@kalindu-Inspiron-13-5310:~/SEM-6/COS15/Lab10/myhadoop/docker-hadoop/namenode$ docker exec -it namenode /bin/bash
root@0ac0651bf8a4:~# hdfs dfs -put /tmp/email-logs.txt /user/hadoop/input
2024-06-25 16:19:46,883 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localhostTrusted = false, remoteHostTrusted = false
root@0ac0651bf8a4:~#
```

Figure 9: Uploading email logs into HDFS

Data successfully uploaded, and visible from the HDFS web UI:

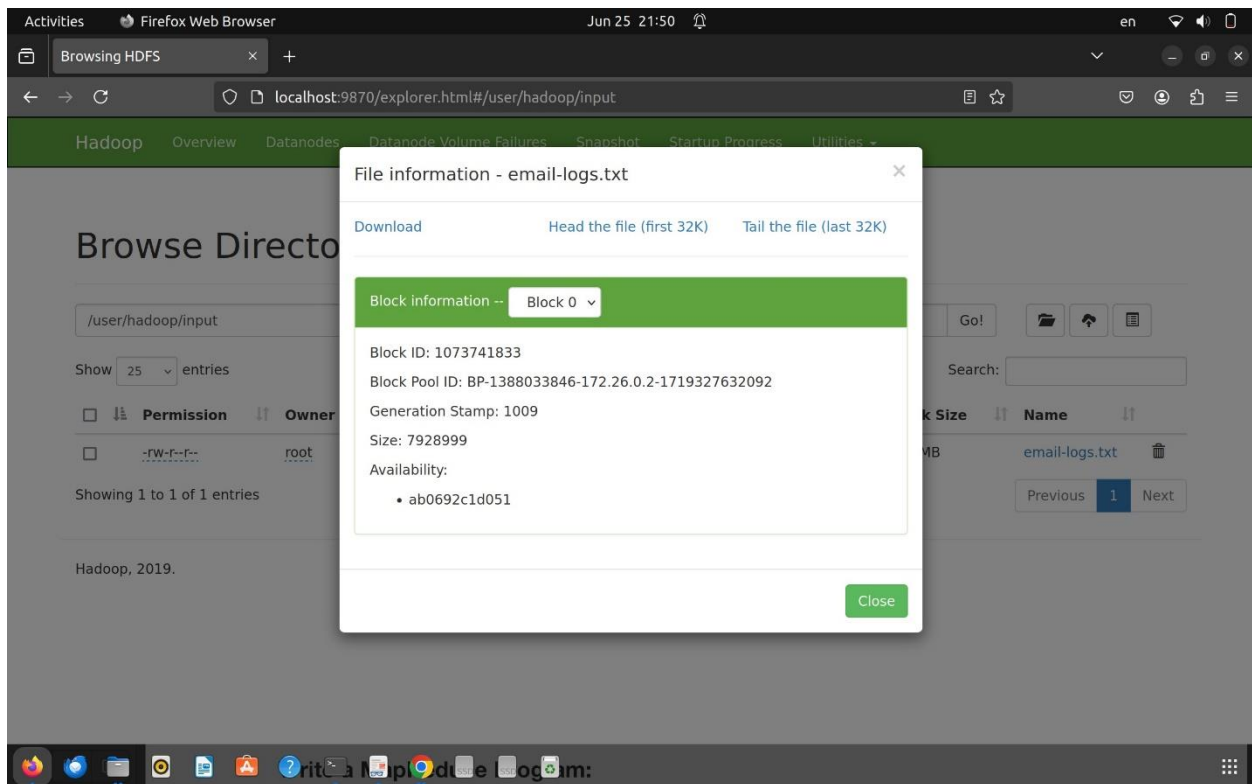


Figure 10: email-logs.txt is visible in the HDFS directory

Activity 3: Running a MapReduce Job to Extract Information

```
kalindu@kalindu-Inspiron-13-5310:~/SEM-6/COS15/Lab10/myhadoop/docker-hadoop/namenode$ docker cp ./EmailLogAnalysis.java namenode:/tmp/EmailLogAnalysis.java
Successfully copied 4.1kB to namenode:/tmp/EmailLogAnalysis.java
kalindu@kalindu-Inspiron-13-5310:~/SEM-6/COS15/Lab10/myhadoop/docker-hadoop/namenode$ docker exec -it namenode /bin/bash
root@0ac0651bf8a4:/# cd tmp
root@0ac0651bf8a4:/tmp# # Create a directory for compiled classes
root@0ac0651bf8a4:/tmp# mkdir -p emaillog_classes
root@0ac0651bf8a4:/tmp# javac -classpath `hadoop classpath` -d emaillog_classes EmailLogAnalysis.java
root@0ac0651bf8a4:/tmp# jar -cvf emaillog.jar -C emaillog_classes/ .
added manifest
adding: EmailLogAnalysis$EmailReducer.class(in = 1758) (out= 746)(deflated 57%)
adding: EmailLogAnalysis$EmailMapper.class(in = 2006) (out= 868)(deflated 56%)
adding: EmailLogAnalysis.class(in = 1517) (out= 815)(deflated 46%)
root@0ac0651bf8a4:/tmp#
```

Figure 11: Copying the java code into the namenode container and creating the jar file

```
Activities Terminal Jun 26 09:50 en
kalindu@kalindu-Inspiron-13-5310: ~
root@0ac0651bf8a4:/tmp# hadoop jar emaillog.jar EmailLogAnalysis /user/hadoop/input /user/hadoop/output
2024-06-26 04:19:44,691 INFO client.RMProxy: Connecting to ResourceManager at resourcemanager/192.168.16.3:8032
2024-06-26 04:19:44,783 INFO client.AHSProxy: Connecting to Application History server at historyserver/192.168.16.4:10200
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2024-06-26 04:19:44,962 INFO mapreduce.JobResourceUploader: Disabling Erasure Coding for path: /tmp/hadoop-yarn/staging/root/.staging/job_1719375009079_0001
2024-06-26 04:19:45,025 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localhostTrusted = false, remoteHostTrusted = false
2024-06-26 04:19:45,404 INFO input.FileInputFormat: Total input files to process : 1
2024-06-26 04:19:45,426 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localhostTrusted = false, remoteHostTrusted = false
2024-06-26 04:19:45,854 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localhostTrusted = false, remoteHostTrusted = false
2024-06-26 04:19:46,270 INFO mapreduce.JobSubmitter: number of splits:1
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2024-06-26 04:19:46,361 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1719375009079_0001
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2024-06-26 04:19:46,452 INFO conf.Configuration: resource-types.xml not found
2024-06-26 04:19:46,452 INFO resource.ResourceUtils: Unable to find 'resource-types.xml'.
2024-06-26 04:19:46,739 INFO impl.YarnClientImpl: Submitted application application_1719375009079_0001
2024-06-26 04:19:46,757 INFO mapreduce.Job: The url to track the job: http://resourcemanager:8088/proxy/application_1719375009079_0001/
2024-06-26 04:19:46,757 INFO mapreduce.Job: Running job: job_1719375009079_0001
2024-06-26 04:20:17,108 INFO mapreduce.Job: Job job_1719375009079_0001 running in uber mode : false
2024-06-26 04:20:17,111 INFO mapreduce.Job: map 0% reduce 0%
2024-06-26 04:20:21,170 INFO mapreduce.Job: map 100% reduce 0%
2024-06-26 04:20:25,194 INFO mapreduce.Job: map 100% reduce 100%
2024-06-26 04:20:26,209 INFO mapreduce.Job: Job job_1719375009079_0001 completed successfully
2024-06-26 04:20:26,254 INFO mapreduce.Job: Counters: 54
```

Figure 12: Running the Job

Full output from running the job is as provided in the Figure 2. (page No.4)

Activity 4: Analyzing Results

Output file from the job:

```
Activities Terminal Jun 26 09:52 en
kalindu@kalindu-Inspiron-13-5310: ~
root@0ac0651bf8a4:/# hdfs dfs -cat /user/hadoop/output/part-r-000000
2024-06-26 04:22:01,212 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localhostTrusted = false, remoteHostTrusted = false
015736582906ceco@gmail.com 3
07lehwald12@web.de 3
10pelopez10@gmail.com 3
1op1kledinggoedkoop@gmail.com 3
1ronnieleeallen1982@gmail.com 3
1uniquebird@gmail.com 3
2218.meis@gmail.com 3
23thomas.williams@gmail.com 3
2m1oe2@gmail.com 3
3akash2002@gmail.com 3
4kbuitzyb94@gmail.com 6
63tate.d@gmail.com 3
7134lola@gmail.com 3
75gast@gmail.com 3
8647237707ms.ms3171@gmail.com 3
912braden@gmail.com 3
A8kXgdkK0Tr61ADh71QRpQ==_1114652663026_0r9n/LBCEeytQ/oWPSAWSg==@in.constantcontact.com 1
ALUMIHARE@PDN.AC.LK 1
KMW@PDN.AC.LK 2
a.kaufmann54@gmx.net 3
a.lyleevans@gmail.com 3
a.ondijkshoorn@gmail.com 3
aap@pdn.ac.lk 4
aangforghost2@gmail.com 3
aarularas1@pdn.ac.lk 2
abbasesteban@gmail.com 3
abd746447@gmail.com 3
abdulhalimrushdi3131@gmail.com 3
abergleif404@gmail.com 3
abirferdous443@gmail.com 3
abrahamsniyaazi@gmail.com 3
```

Figure 13: content in output/part-r-00000 file

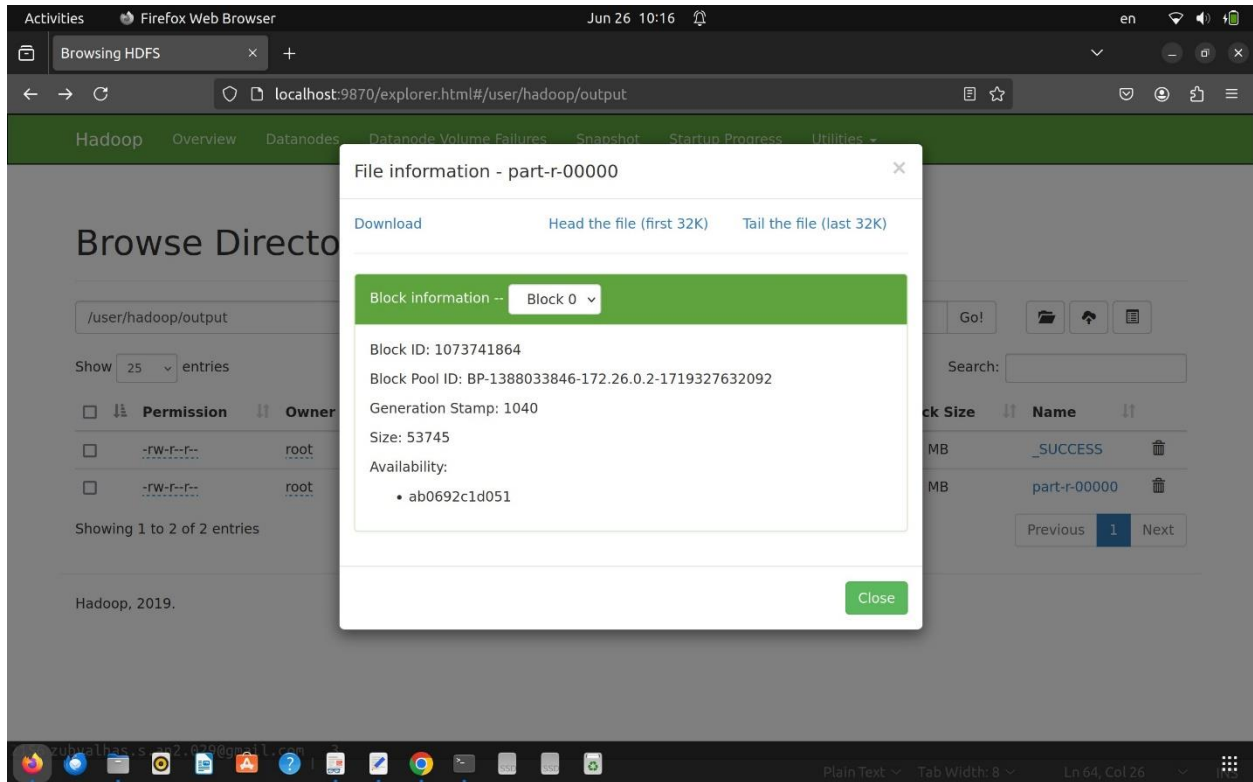


Figure 14: Output file is visible in the web UI as well

Appendix

docker-compose.yml

```
version: "3"

services:
  namenode:
    build:
      context: ./namenode/
      dockerfile: Dockerfile
    container_name: namenode
    restart: always
    ports:
      - 9870:9870
      - 9000:9000
    volumes:
      - hadoop_namenode:/hadoop/dfs/name
    environment:
      - CLUSTER_NAME=test
    env_file:
      - ./hadoop.env

  datanode:
    image: bde2020/hadoop-datanode:2.0.0-hadoop3.2.1-java8
    container_name: datanode
    restart: always
    volumes:
      - hadoop_datanode:/hadoop/dfs/data
    environment:
      SERVICE_PRECONDITION: "namenode:9870"
    env_file:
      - ./hadoop.env

  resourcemanager:
    image: bde2020/hadoop-resourcemanager:2.0.0-hadoop3.2.1-java8
    container_name: resourcemanager
    restart: always
    environment:
      SERVICE_PRECONDITION: "namenode:9000 namenode:9870 datanode:9864"
    env_file:
      - ./hadoop.env

  nodemanager1:
    image: bde2020/hadoop-nodemanager:2.0.0-hadoop3.2.1-java8
    container_name: nodemanager
    restart: always
    environment:
      SERVICE_PRECONDITION: "namenode:9000 namenode:9870 datanode:9864
resourcemanager:8088"
    env_file:
```

```

- ./hadoop.env

historyserver:
  image: bde2020/hadoop-historyserver:2.0.0-hadoop3.2.1-java8
  container_name: historyserver
  restart: always
  environment:
    SERVICE_PRECONDITION: "namenode:9000 namenode:9870 datanode:9864
resourcemanager:8088"
  volumes:
    - hadoop_historyserver:/hadoop/yarn/timeline
  env_file:
    - ./hadoop.env

volumes:
  hadoop_namenode:
  hadoop_datanode:
  hadoop_historyserver:

```

./namenode/Dockerfile

```

FROM bde2020/hadoop-base:2.0.0-hadoop3.2.1-java8

MAINTAINER Ivan Ermilov <ivan.s.ermilov@gmail.com>

HEALTHCHECK CMD curl -f http://localhost:9870/ || exit 1

ENV HDFS_CONF_dfs_namenode_name_dir=file:///hadoop/dfs/name
RUN mkdir -p /hadoop/dfs/name
VOLUME /hadoop/dfs/name

# Copy the email-logs.txt file to the container
COPY email-logs.txt /tmp/email-logs.txt

ADD run.sh /run.sh
RUN chmod a+x /run.sh

EXPOSE 9870

CMD ["/run.sh"]

```

Codes that I used to plot the output results received from the MapReduce job

convertToCSV.py

```
with open('./part-r-00000.txt', 'r') as infile, open('./part-r-00000.csv', 'w') as outfile:
    for line in infile:
        parts = line.strip().split('\t') # tab-separated data
        outfile.write(f'{parts[0]},{parts[1]}\n')
```

analyzeByRecepoint.py

```
import pandas as pd
import matplotlib.pyplot as plt

# Read the output file into a pandas DataFrame
df = pd.read_csv('./part-r-00000.csv', sep=',', header=None, names=['Recipient', 'Count'])

# Sort the DataFrame by the 'Count' column in descending order
df_sorted = df.sort_values(by='Count', ascending=False)

# Select the top ten email recipients
df_top_ten = df_sorted.head(20)

# Plot the data
plt.figure(figsize=(15, 10))
bars = plt.bar(df_top_ten['Recipient'], df_top_ten['Count'], color='blue')

# Add labels and title
plt.xlabel('Email Recipient', fontsize=14)
plt.ylabel('Number of Emails', fontsize=14)
plt.title('Top 20 Email Recipients', fontsize=16)

# Rotate x-axis labels for better readability
plt.xticks(rotation=45, fontsize=12, ha='right')

# Add text annotations on top of each bar (vertically)
for bar in bars:
    yval = bar.get_height()
    plt.text(bar.get_x() + bar.get_width()/2, yval + 5, int(yval), ha='center', va='bottom', fontsize=10, rotation=90)

# Add gridlines
plt.grid(axis='y', linestyle='--', alpha=0.7)
```

```
# Display the plot
plt.tight_layout()
plt.show()
```

groupByDomain.py

```
import pandas as pd
import matplotlib.pyplot as plt

# Function to extract domain from email
def extract_domain(email):
    return email.split('@')[-1]

# Read the output file into a pandas DataFrame
df = pd.read_csv('part-r-00000.csv', sep=',', header=None, names=['Recipient',
'Count'])

# Extract domain from each email recipient
df['Domain'] = df['Recipient'].apply(extract_domain)

# Group by domain and sum the counts
domain_counts = df.groupby('Domain')['Count'].sum().reset_index()

# Sort the DataFrame by the 'Count' column in descending order
domain_counts_sorted = domain_counts.sort_values(by='Count', ascending=False)

# Plot the data
plt.figure(figsize=(15, 10))
bars = plt.bar(domain_counts_sorted['Domain'], domain_counts_sorted['Count'],
color='skyblue')

# Add labels and title
plt.xlabel('Email Domain', fontsize=12)
plt.ylabel('Number of Emails', fontsize=12)
plt.title('Number of Emails per Domain', fontsize=14)

# Rotate x-axis labels for better readability
plt.xticks(rotation=90, fontsize=10)

# Set y-axis range from 0 to 5000
plt.ylim(0, 5000)

# Add gridlines
plt.grid(axis='y', linestyle='--', alpha=0.7)
```



```
# Add text annotations on top of each bar (vertically)
for bar in bars:
    yval = bar.get_height()
    plt.text(bar.get_x() + bar.get_width()/2, yval + 20, int(yval), ha='center',
va='bottom', fontsize=10, rotation=90)

# Display the plot
plt.tight_layout()
plt.show()
```