

Final Project Report

Data Analytics Cloud - Design and Implementation

May 5, 2017

TEAM 2

Rushikesh Ghatpande (rsghatpa) - Lead Karan Chaudhri (krchaud) - Vice-lead Nithya Kumar (nkumar8) Payal Arun Chheda (pchheda) Ran Tan (rtan2)

COMPUTER SCIENCE DEPARTMENT NC STATE UNIVERSITY

ABSTRACT

s the world becomes increasingly digitized, data volumes are growing exponentially. Extracting information from data has the potential to revolutionize every sector of business. The focus on data analytics is therefore increasing day-by-day. Thus, there arises a need for a flexible data-analytics platform. To address this problem, we harness the power of cloud and virtualization in our project. Our project is focussed on developing a data analytics cloud platform that runs an analytics engine to perform re-structuring and analysis of vague, unstructured data. This report details our design and implementation of this platform. Our platform can be used as an Integrated Development Environment (IDE) to develop and test new algorithms for advanced analytical studies. The main functions of the analytics engine are gathering, filtering, annotating, restructuring and visualizing of data to the end-user. High-performance Intel blade server deployed in the Oscar laboratory of North Carolina State University's Centennial campus has been used as the base machine for cloud stack development. The cloud platform is built on Red Hat Enterprise Linux 7.3 (RHEL 7.3) with OpenStack Platform 10. The SaaS stack is integrated with Apache open source projects and in-house Django applications, each performing its own set of motivated tasks. Our validation results show that our cloud platform successfully gathers (by web crawling), filters, annotates, restructures the data and finally, displays the structured data to the end-user via a user-friendly dashboard thus facilitating him to make informed decisions.

TABLE OF CONTENTS

		P	age
Li	st of	Tables	iv
Li	st of	Figures	v
1	Intr	oduction	1
	1.1	Problem Statement	1
	1.2	Motivation	2
	1.3	Issues	3
	1.4	Environment	3
2	Req	uirements	5
	2.1	Functional Requirements	5
	2.2	Non-Functional Requirements	6
3	Sys	tem Environment	9
	3.1	Hardware Specifications	9
	3.2	Software Specifications	9
4	Des	ign, Implementation and Results	11
	4.1	Design	11
		4.1.1 Network Topology	13
		4.1.2 Software Stack Design	13
		4.1.3 Workflow	14
		4.1.4 Issues Addressed	16
	4.2	Implementation	17
	4.3	Results	18
5	Ver	fication and Validation	25
	5.1	Test Cases	25
		5.1.1 Functional Requirement 1 – Built on RHEL 7.3	25
		5.1.2 Functional Requirement 2 – Cloud built using OpenStack Platform 10	25

		5.1.3	Functional Requirement 3 – Database VM	26
		5.1.4	Functional Requirement 4 – Analytics VM	26
		5.1.5	Functional Requirement 5 – GPFS Distributed store	27
		5.1.6	Functional Requirement 6 – Database VM for storage of both structured	
			and unstructured data	27
		5.1.7	Functional Requirement 7 – Analytics VM for web crawling	27
		5.1.8	Functional Requirement 8 – Analytics VM for data indexing	29
		5.1.9	Functional Requirement 9 – Analytics VM for data filtering	29
		5.1.10	Functional Requirement 10 – Data import and export	31
		5.1.11	Functional Requirement 11 – Analytics VM for data visualization $\ \ldots \ \ldots$	31
		5.1.12	Functional Requirement 12 – Authentication and Authorization $\ldots \ldots$	31
6	Sch	edule a	and Personnel	33
	6.1	Schedu	ıle	33
	6.2	Task D	Distribution	34
Bi	ibliog	raphy		37
$\mathbf{A}_{]}$	ppeno	dix A		39
	1. In	stallati	on of OpenStack using PackStack	39
	2. Co	onfiguri	ng Glance Service to use GPFS for storing the images	40
	3. Ba	ase ima	ge creation	40
	4. In	stallati	on of Software Stack on customized images	41

LIST OF TABLES

TAB	LE	Page
4.1	Software packages	. 14
5.1	Test case – Built on RHEL 7.3	. 25
5.2	Test case – Cloud built using OpenStack Platform 10	. 26
5.3	Test case – Database VM	. 26
5.4	Test case – Analytics VM	. 26
5.5	Test case – GPFS distributed store	. 27
5.6	$Test\ case-Database\ VM\ for\ storage\ of\ both\ structured\ and\ unstructured\ data.\ .\ .\ .$. 27
5.7	Test case – Analytics VM for web crawling	. 29
5.8	Test case – Analytics VM for data indexing	. 29
5.9	Test case – Analytics VM for data filtering	. 29
5.10	Test case – Data import and export	. 31
5.11	Test case – Analytics VM for data visualization	. 31
5.12	Test case – Authentication and Authorization	. 32
<i>C</i> 1	Schedules	2.4
6.1		
6.2	Task Distribution	. 35

LIST OF FIGURES

FIGURE		Page
1.1	Big Data Analytics Cloud infrastructure.	2
4.1	High Level Architecture	12
4.2	Network Topology of Analytics and Database Image	13
4.3	Platform Data-flow - Data Ingestion	15
4.4	Platform Data-flow - Data Culling	16
4.5	Platform Data-flow - Data Visualization	16
4.6	OpenStack services	19
4.7	Images are stored in /gpfs directory	20
4.8	Database VM and Analytics VM were successfully created for client team 2	20
4.9	Web pages are successfully crawled using nutch	21
4.10	Solr Query returns indexed data	22
4.11	Mortar service running	22
4.12	Data filtered by Mortar	23
4.13	Data Visualization Using Portrait	23
5.1	RHEL 7.3 base OS.	26
5.2	Cassandra and Postgresql services are running	28
5.3	Unstructured data collected by Nutch stored in Cassandra	28
5.4	Nutchcore entry in Solr.	30
5.5	Querying Solr	30
5.6	Client cannot SSH into Database VM	32
1	OpenStack install using PackStack	39
2	Configuring Glance to use GPFS	40
3	Adding the customized image	42

CHAPTER

Introduction

s data volumes grow exponentially, the demand for flexible data analysis platforms is also growing increasingly. The state-of-the-art solutions are not flexible or portable enough to satisfy the requirements of data scientists. Data Analytics has use-cases spread across myriad of industry domains viz., Health Care, Insurance Services, Financial Services, Character Recognition etc. To deal with this ever-growing need, we designed and implemented a flexible and customizable analytics cloud platform that offers both Platform as a Service (PaaS) and Software as a Service (SaaS) to an end-user. In the rest of this section, we highlight the high level aspects of the project, viz., the problem statement (Section 1.1), motivation (Section 1.2), the issues faced with regard to designing our platform (Section 1.3), and the environment upon which our platform is built (Section 1.4). The remainder of the document explains the low-level details of the project.

1.1 Problem Statement

The Institute for Next Generation IT Systems (ITng) is focused on the use of augmented intelligence, web development, and workflow design techniques to propel business forward. One of its key focus areas is on the intersection of moving 'Äúbig data'Äù infrastructure into cloud, and the development of novel algorithms to solve specific problems. Functionally, this requires a cognitive platform that transforms information to useful knowledge while optimizing the computing infrastructure.[13] Thus, our project aims to set-up a flexible and customizable base cloud platform with data restructuring and analytics capabilities. Figure 1.1 portrays the basic analytics process within the cloud analytics engine.

The project focuses on developing a **Data Analytics Cloud infrastructure** that will offer **Analytics as a Service**. The ultimate objective of our project is to deliver an analytics cloud

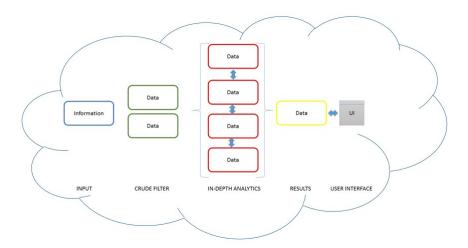


Figure 1.1: Big Data Analytics Cloud infrastructure.

platform built using OpenStack on Red Hat Enterprise Linux 7.3 (RHEL 7.3) and data analytics engine. The engine consists of two images - one is an analytics image and the other is a database image. The analytics image that does the entire data processing and analysis is built with Apache Nutch for web crawling, Solr (wrapped around Lucene) for indexing, UIMA for annotating the data, Mortar for filtering the data and Portrait for visualizing the data. The database image is built using Cassandra (NoSQL database) for storing unstructured data and PostgreSQL (relational database) for storing structured data.

1.2 Motivation

Our project is motivated to build a cloud analytics platform with the following properties:

1. Flexible, customizable and easy to use

Present data-analysis platforms have some limitations. Some are built to cater to specific data domains while others might be too generic. Our analytics cloud platform is aimed at creating a master base platform that is equipped with the right set of minimalistic but yet comprehensive data analysis tools. Thus, this platform will be easy to use and also give the end user the power of customization. The user will be able to build upon our platform by installing additional tools as desired.

2. Portable

Given our base analytics image, the end-user will be able to install additional tools as desired. The user will have the capability to download this image in a compatible format portable to many other platforms. The user will also have the capability to upload modified images.

3. Capable of restructuring data

The cloud analytics platform will have the capability to turn large quantities of vague unstructured data to explicit structured data thereby enabling the end-user to make informed decisions.

1.3 Issues

Given our problem statement, we have identified the following set of issues that must be addressed by our cloud platform[15]:

1. Security

Security is a prime concern for the cloud users due to the loss of control on data and applications. Moving data to the cloud can potentially compromise data security efforts and thus increase risk. Confidentiality, integrity, authentication and access control must be provided by the cloud service provider. In our project, we address some of these basic security concerns in Section 4.

2. Ease of use

Usability of any system is directly proportional to its ease of use. Clean and visually appealing Graphical User Interfaces (GUI) are key to a system's ease of use. We address this concern by providing cloud management dashboard and data visualization interface in our project. Further details are explained in Section 4.

3. Portability

To exploit the Pay-as-you-go cost model of cloud, any end-user would expect a cloud platform to support easy movement of images. This brings in the need for the cloud platforms to have compatible image formats. Section 4 details how this concern has been dealt with in our project.

4. Structuring of unstructured data

In past decades, most data was in structured formats. Today, storage and data requirements are expanding due the boom in the quantities of unstructured data. Our project tackles this problem of restructuring the unstructured data into usable format as discussed in Section 4.

1.4 Environment

High-performance Intel blade server from Oscar laboratory owned by Institute for Next Generation IT Systems (ITng) at NCSU has been used as the base physical machine for the cloud platform. Machine can be accessed via ssh using appropriate credentials. Further environment details, including both software and hardware are further explained in Section 3.

CHAPTER

REQUIREMENTS

his section elaborates the various functional and non-functional requirements that are identified as a part of our project[11]. In Section 5, each requirement is validated with a test case and we detail the one-to-one mapping between tasks done, test case validated and requirements satisfied.

2.1 Functional Requirements

The analytics cloud platform must provide the below mentioned functional requirements:

1. Built on RHEL 7.3

The base operating system for the physical machine must be Red Hat Enterprise Linux 7.3.

2. Cloud built using OpenStack Platform 10

OpenStack Platform 10 must be installed on top of the physical server using PackStack. The platform must use OpenStack to build and deploy VMs.

3. Database VM

The cloud platform must have database image with capabilities to store data.

4. Analytics VM

The cloud platform must have analytics image to provide data analytics capabilities.

5. GPFS distributed store

All images in the analytics cloud platform must be stored to the provided IBM,Äôs General Parallel File System (GPFS) distributed store

6. Database VM for storage of both structured and unstructured data

The database image must have installed on it - Apache Cassandra 2.2.8 (NoSQL database) for storing unstructured data and PostgreSQL 9.2.1 (relational database) for storing structured data.

7. Analytics VM for web crawling

The analytics image must have installed on it - Apache Nutch 2.2.1 for crawling the web based on input seed Uniform Resource Locators (URLs).

8. Analytics VM for data indexing

The analytics image must have installed on it - Apache Solr 6.3.0 for indexing the unstructured data crawled by Nutch.

9. Analytics VM for data filtering

The analytics image must have installed on it - Mortar (in-house Django application) for filtering the data indexed by Solr.

10. Data import and export

The database VM must allow import of structured data in a Comma Separated Values (CSV) format from the analytics VM. Similarly, the analytics VM must allow export of structured data in a CSV format from Solr to PostgreSQL.

11. Analytics VM for data visualization

The analytics image must have installed on it - Portrait (in-house Django application) for end-user visualization of data.

12. Authentication and Authorization

The analytics cloud platform must prevent unauthorized access to VMs.

2.2 Non-Functional Requirements

The analytics cloud platform must provide the below mentioned non-functional requirements:

1. Analytics cloud deployed on ITng physical server

The analytics cloud platform must be deployed on the Intel Blade Server (detailed specifications in Section 3.1) located in the Oscar Laboratory owned by NCSU's ITng.

2. Stability and on-demand availability

The analytics cloud platform must be stable and available on-demand to an end-user.

3. Extensibility

The analytics cloud platform must allow end-user the ability to customize the analytics image by adding new analytics package catering to his needs.

4. Testability

The analytics cloud platform must be easy to test and validate.

5. Installation of dependencies

All software package dependencies like Java 1.7, Apache Ant, Python libraries etc must be installed.

3

SYSTEM ENVIRONMENT

his section elaborates the specifications of our environment introduced in Section 1.4. Below is the list of hardware and software specifications for our project:

3.1 Hardware Specifications

High-performance Intel blade server from Oscar laboratory has been used as the base machine for cloud stack development. The 8 cores and 16 CPUs on it lead to a greater degree of parallelism.

The CPU architecture is Intel x86-64 and has caches of varying sizes. Each core has a 32 KB L1 instruction and data cache, and 256 KB L2 cache. L3 cache of size 12 MB is shared among all CPUs. The total physical memory of blade server is 24 GB.

3.2 Software Specifications

Below are the software specifications for our project:

- Redhat Enterprise Linux (RHEL), version 7.3 OS on the blade server
- Red Hat OpenStack Platform, version 10 installed on RHEL
- Kernel-based Virtual Machine (KVM) with Quick Emulator (QEMU) as the type-2 hypervisor IBM GPFS for image storage
- Ubuntu-16.04 LTS (Xenial Xerus) qcow2 image[14] as base image
- Two customized images one for DBs and another for analytics

• The analytics image is mainly customized with: Nutch, Solr, Mortar, UIMA and Portrait. The database image will be configured with: Cassandra and PostgreSQL

DESIGN, IMPLEMENTATION AND RESULTS

n this section, we go into low-level details about our design decisions and their pros and cons. We further explain the implementation details of our design and the end results. Finally, we discuss the limitations of our approach.

4.1 Design

This section describes our design decisions and their tradeoffs. Figure 4.1 shows the high level architecture of our analytics cloud platform built using the hardware and software specifications as described in Section 3.

At the bottom of the cloud platform stack is our Intel Blade Server owned by Oscar laboratory of ITng group at NCSU as described in Section 3.1. This machines serves as our host machine and comes with RHEL 7.3 installed on it. On this machine, we have KVM with QEMU as the type-2 hypervisor. The host machine and guest VMs hosted on this machine can be accessed by ssh. The guest VMs are deployed using OpenStack Packstack. 144 TB of IBM,Äôs General Parallel File System (GPFS) is available as high-performance distributed storage.

We now go into further details and list the OpenStack modules that are a crucial part of our design:

1. Nova

Nova provides compute capabilities and helps with creation, deployment, management, deletion etc of instances.

2. Neutron

Neutron provides networking capabilities for communication among deployed instances (internal) and to the outside world (external).

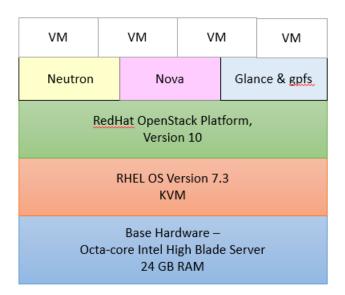


Figure 4.1: High Level Architecture

3. Glance

Glance provides imaging capabilities by allowing base image installed to be used as a template while deploying new virtual machine instances.

4. Cinder

Cinder provides block storage management capabilities.

5. Keystone

Keystone provides the authentication capabilities by providing client authentication API and service discovery.

6. Horizon

Horizon provides provides a web based user interface serving as a dashboard to OpenStack services including Nova, Swift, Keystone etc. Although not essential, this component adds value to our project by facilitating our goal of ease-of-use.

The base image for providing Platform as a Service is Ubuntu-16.04 LTS (Xenial Xerus) qcow2 image as it takes full advantage of computers based on the AMD64 architecture. AMD64 is recommended for general computing use in Cloud. The base Ubuntu-16.04 LTS image is used to create two customized images - one for DBs (database image) and another for analytics (analytics image).

The further sub-sections 4.1.1, 4.1.2, 4.1.3 detail the network topology, software stack design and the sample workflow of our project respectively. Section 4.1.4 addresses the issues that we previously identified in Section 1.3.

4.1.1 Network Topology

Let us now consider the design of our network topology. Our design must ensure that the analytics and database VM are able to communicate with each other and with the outside world. Figure 4.2 illustrates the network topology as described below. We designed our topology to consist of two networks:

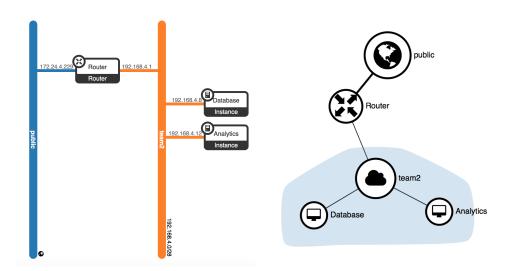


Figure 4.2: Network Topology of Analytics and Database Image.

1. Private network

The two instances i.e. Analytics and Database image instances are connected to each other in this private network. They fall in the same subnet and hence shall be able to communicate directly to one another.

2. External/Public network

In order for our instances to have connectivity to and from the external world, we have a router such that one of the interfaces is connected to the public network for external connectivity and the other interface is connected to private network.

We place our instances behind NAT to prevent any unauthorized access to our instances from the outside network. We assign floating ip only to our Analytics VM so that it can be accessed on public network and database VM is only accessible through private network via database client on the analytics VM.

4.1.2 Software Stack Design

The analytics image is mainly configured with: Nutch, Solr, Mortar, UIMA and Portrait [3–6]. The database image is mainly configured with: Cassandra [2] and PostgreSQL [10]. Thus, the software

Projects/Applications	Purpose/Description
Apache Nutch 2.2.1	Nutch is an open source web crawler. It uses Cassandra as a
[6]	storage backend, as well as Solr as its indexer
Apache Ant 1.9.6 [1]	Ant is a Java build tool that allows easy configuration of large
	Java projects and their dependencies with a simple xml file. It is
	used to build both Nutch and Solr from source
Apache Cassandra	Cassandra is an open source database system that supports high
2.2.8 [2]	availability and easy scalability. We chose Cassandra over other
	Nutch backends, such as Apache HBase or straight SQL, to avoid
	installing the entire Hadoop system
Apache UIMA 2.9.0	UIMA (Unstructured Information Management Applications) is
and Eclipse UIMA	an open source project for analyzing data and pulling out relevant
Workbench [4]	entities as a basic Natural Language Processing toolkit. This is a
	user side installation
Apache Solr 6.3.0 [3]	Apache Solr is an open source search platform, wrapped around
	Lucene. Nutch is able to use Solr to index web page crawl results,
	and users can query Solr to see results without digging through
	Cassandra database
Mortar	Mortar is an in-house Django [5] web application built to create
	and manage PESTLE trees and mind maps. Mortar performs the
	first round of filtering on our dataset by allowing users to create
	custom queries based on their trees
Portrait	Portrait is an in-house Django [5] web application that leverages
	Django SQL Explorer to analyze and combine data into useful
	insights and visualizations
PostGreSQL 9.2.1	PostgreSQL is an open source object-relational database system
[10]	

Table 4.1: Software packages.

stack is comprised of several Apache open source projects[12] and a few in house applications as shown in Table 4.1.

4.1.3 Workflow

The design workflow of the data analytics process followed by an end-user on our cloud platform can be explained with the following steps:

1. Login & Input

- a) User logs into the host machine via ssh
- b) User provides seed URLs as input for crawling the Analytics instance

2. Data Ingestion

a) User logs into the analytics VM via ssh

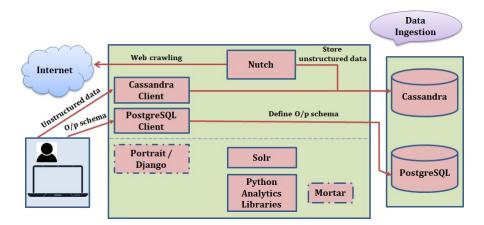


Figure 4.3: Platform Data-flow - Data Ingestion.

- b) Using the Command Line Interface (CLI), user injects seed URLs into Cassandra
- c) Using CLI, user prepares a batch file of the inputted seed URLS
- d) Using CLI, user issues command to Nutch to crawl the web with batch file as input.
- e) Using CLI, user sends the collected unstructured data to Cassandra for storage

Figure 4.3 above illustrates the flow of data during the data ingestion process.

3. Data Culling & Restructuring

- a) Using CLI, user issues command to Solr to index the unstructured data collected by Nutch
- b) User logs into Mortar web interface with appropriate credentials and applies filters to the indexed data in Solr
- c) User develops annotations and applies these annotations to the data in Solr using UIMA
- d) Using CLI, user exports the structured data in a CSV format file from Solr
- e) Using CLI, user imports the above exported CSV format file to PostgreSQL
- f) The user imports the structured data from Solr to the PostgreSQL

Figure 4.4 below illustrates the flow of data during the data culling and restructuring process.

4. Visualization

- a) Using Portrait, user visualizes and queries the structured data stored in PostgreSQL
- b) User makes informed decisions using the visualized data

Figure 4.5 below illustrates the data visualization process.

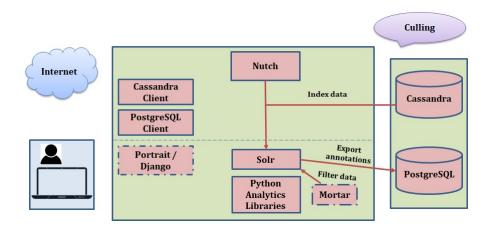


Figure 4.4: Platform Data-flow - Data Culling.

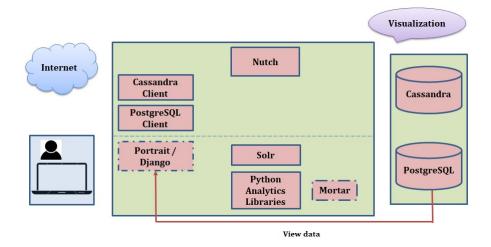


Figure 4.5: Platform Data-flow - Data Visualization.

4.1.4 Issues Addressed

In Section 1.3 we discussed the major issues concerning the design and implementation of the cloud analytics platform. In this section, we discuss measures taken in our design to address these issues.

1. Security

Security is one of the major concerns in building a cloud platform. Although not extensive, we use the following measures to ensure basic security of our analytics cloud platform:

a) Keystone authentication

OpenStack Keystone provides identity service as the first level of user authentication by the mechanism of username and password authentication.

b) Database access control

In our design, we have two levels of access control for the database VM instance. One is, we assign floating IP only to the analytics VM instance and restrict direct user access to the database VM instance. The only way, an user can access the content of the database is through the database client installed on the analytics VM instance. A client can communicate with the database VM on only 2 ports: Cassandra Thrift Client port 9160 and the PostgreSQL service can be accessed on port 5432. Second is, database access is restricted using username password authentication mechanism.

c) Firewalls

We modify the firewall rules of our network to ensure there is no unauthorized access to database VM instance.

d) SSH Configuration

On the analytics VM, changes are made to ssh configuration files to ensure that clients can log into the machine. The associated private IP address and floating IP address is added as a ListenAddress and password based authentication has been set up through the /etc/ssh/sshd_config file. Client is authorized to setup Key-based authentication after he logs into his virtual machine.

2. Ease of use

Clean and visually appealing Graphical User Interfaces (GUI) are key to a system, Aôs ease of use. Our design allows users to deploy and manage VMs using Horizon dashboard. Solr also has a web interface for indexing data. Mortar and Portrait provide GUIs to filter and visualize the data. CLI interaction is minimal as far as possible.

3. Portability

Since our images are in popular format QCOW2, there is a lot of support available in the market for this format of images. This addresses our issue of portability.

4. Structuring of unstructured data

This issue is addressed as explained in Section 4.1.3 subpoint 3. Data is indexed by Solr and structured using regex filters by Mortar and annotations by UIMA. Structure data is further stored in the PostgreSQL database in the database VM.

4.2 Implementation

This section describes the implementation steps for the design as explained in Section 4.1. We explain the exact configuration steps for certain processes in the Appendix.

1. Installation of RedHat OpenStack Platform 10

To implement the big-data analytics cloud, as our first step, we installed RedHat OpenStack

platform 10 using Packstack [9]. Packstack helps in installing all the mentioned components in a single node rather than distributed installation on several nodes as in production environment. Section A.1 of the Appendix details steps needed to install OpenStack using PackStack. It also outlines the errors faced in the process and the steps take to resolve these errors.

2. Base image setup

Next, we set up our base image - Ubuntu 16.04.02 LTS (Xenial Xerus) qcow2. This image provides a robust platform for installation of our software packages. Further, we modified Glance to store images to /gpfs directory. For further details on the exact steps involved in installation, refer Appendix Section A.3.

3. Customized image setup with software stack installation

The next step was to create two customized images - one for database VM and another for analytics VM through installation of specified software packages (work in progress). As mentioned in the software specifications, the analytics image is mainly customized with: Nutch, Solr, Mortar and Portrait. The database image is configured with: Cassandra and PostgreSQL. For further details on the exact steps involved in installation, refer Appendix Section A.4.

4. Network, firewalls and ssh configuration

Once we set up our customized images, we implemented the network topology as designed in Section 4.1.1. We set up firewalls and ssh configuration as explained in Section 4.1.4 where we address the issue of security through the measures of firewalls and ssh.

5. Validation of workflow

We validated the workflow and verified that all the test cases corresponding to our requirements are satisfied. Refer Section 5.1 for detailed understanding of our testing and validation. The results of our validation workflow are elaborated in Section 4.3

4.3 Results

The design and implementation details of our analytics cloud platform were explained in Sections 4.1 and 4.2. The following are the actual results of each step involved in the process of providing the deliverables of our project.

1. OpenStack installation on physical server using PackStack

Redhat OpenStack Platform 10 is successfully deployed on top of RHEL OS 7.3. KVM is used as the hypervisor for virtualization. Nova, Neutron, Glance, Cinder, Keystone and Horizon are running on Blade Server. Figure 4.6 displays the list of running services on OpenStack.

```
[[team2@csc-kvm-20 ~]$ openstack-status
== Nova services ==
openstack-nova-api:
                                         active
openstack-nova-compute:
                                        active
                                        inactive (disabled on boot)
openstack-nova-network:
openstack-nova-scheduler:
                                        active
openstack-nova-cert:
                                        active
                                        active
openstack-nova-conductor:
openstack-nova-console:
                                        inactive (disabled on boot)
openstack-nova-consoleauth:
                                        active
openstack-nova-xvpvncproxy:
                                        inactive (disabled on boot)
== Glance services ==
openstack-glance-api:
                                        active
openstack-glance-registry:
                                        active
== Keystone service ==
                                        inactive (disabled on boot)
openstack-keystone:
== Horizon service ==
openstack-dashboard:
                                        active
== neutron services ==
neutron-server:
                                        active
neutron-dhcp-agent:
                                        active
neutron-13-agent:
                                        active
neutron-metadata-agent:
                                        active
neutron-openvswitch-agent:
                                        active
neutron-metering-agent:
                                        active
== Cinder services ==
                                        active
openstack-cinder-api:
openstack-cinder-scheduler:
                                        active
openstack-cinder-volume:
                                        active
                                        active
openstack-cinder-backup:
== Ceilometer services ==
                                        inactive (disabled on boot)
openstack-ceilometer-api:
openstack-ceilometer-central:
                                        active
openstack-ceilometer-compute:
                                        active
openstack-ceilometer-collector:
                                        active
openstack-ceilometer-notification:
                                        active
== Support services ==
libvirtd:
                                         active
openvswitch:
                                        active
dbus:
                                         active
target:
                                         active
rabbitmq-server:
                                         active
memcached:
                                         active
```

Figure 4.6: OpenStack services.

[[root@csc-kvm-20 images(keystone_admin)]# openstack image list I ID | Status | I Name 6caaacf7-f8d7-4130-89d0-2de7c9daf43f | ubuntu64Database active f8d2f807-369b-4835-80f0-450b7549883d ubuntu64Analytics active ubuntuShrink 07171a29-a9ac-4112-8759-36eadb4b2ec8 active 1bbda1e0-fe7f-4677-abbe-d1e0c6941aa8 ubuntu64Base_team2 | active 2c901d3b-536d-4930-b9c0-d28efd368b56 test1 active ubuntu e1c350c2-4302-4901-b932-fa1126c3698d active 71cfccb1-6e22-44e5-b9ed-931730a0a071 fedora active cce7f1ff-47fc-4195-a5e1-07cfbbfd0adb ubuntu64 active bf2fb192-7509-455b-a919-3cb7ca655263 test active 6f2d696f-41e5-43c9-a834-e550476b44cb cirros active [[root@csc-kvm-20 images(keystone_admin)]# pwd /gpfs/team2/glance/images [[root@csc-kvm-20 images(keystone_admin)]# ls -1 | grep 6caaacf7-f8d7-4130-89d0-2de7c9daf43f -rw-r---- 1 glance glance 1778581504 Apr 19 20:40 <mark>6caaacf7-f8d7-4130-89d0-2de7c9daf43f</mark> [root@csc-kvm-20 images(keystone_admin)]#

Figure 4.7: Images are stored in /gpfs directory.

root@csc-kvm-20 team2(keystone_demo)]#	nova list				
ID	Name	Status	Task State	Power State	Networks
77e3bcf6-91d4-4019-81f0-6b2950ef087e 51617569-66c3-465a-a140-7d62d0ee889c	Analytics Database	ACTIVE SHUTOFF	-	Running Shutdown	team2=192.168.4.12, 172.24.4.235 team2=192.168.4.8
root@csc-kvm-20 team2(kevstone demo)]#		,	,	,	T

Figure 4.8: Database VM and Analytics VM were successfully created for client team2.

2. Ubuntu 16.04.02 LTS (Xenial Xerus) qcow2 Base image setup

Base .iso image is created using qemu and virt-manager. Steps for base image setup are mentioned in Appendix A.2.

3. Networking configuration setup

As described in Section 4.1.1, our network topology consists of two networks, named 'public' and 'team2' for providing external as well as private network connectivity respectively. It consists of a Router whose one of the interface is connected to the public network for external connectivity and the other interface is connected to private network named 'team2'. Figure 4.2 shows the networking configuration of our platform.

4. Modified Glance to store images to /gpfs directory

On adding the customized images to Glance, they are stored in the /gpfs/glance directory as indicated. Images are immediately available for new users to use to boot up their VMs. Figure 4.7 and 4.8 describe this step.

5. Data ingestion using Nutch

The user provides seed URL which are placed in seed.txt. The pages crawled are indexed and kept in crawldb, a nutch module. Data is successfully ingested into Cassandra server from a client machine. Several formats, including csv files can be used to ingest data into

Figure 4.9: Web pages are successfully crawled using nutch.

Cassandra. On querying, the imported data was successfully retrieved. Data generated is further sent to Solr for indexing. Figure 4.9 identifies this web crawling step.

6. Data indexing using Solr

Solr dashboard displays the indexed data uploaded from Nutch. Figure 4.10 and 4.12 displays the results of this step.

7. Data filtering using Mortar

Mortar interface is used to query data using PESTLE tree. Filtered data can be viewed using the Mortar interface.

8. Data visualization using Portrait

The structured data from PostGreSQL can be visualized using Portrait interface. This data can be used by the user to make informed decisions. Figure 4.11 shows the Portrait visualization of our project.

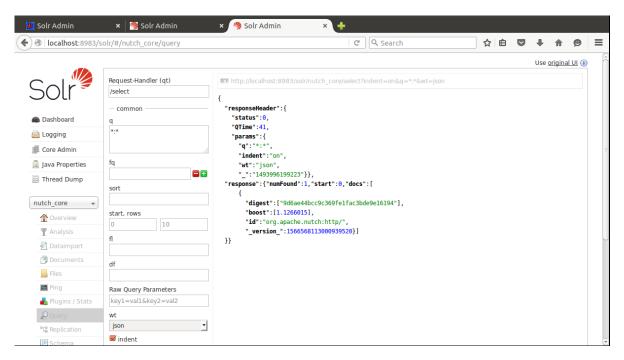


Figure 4.10: Solr Query returns indexed data.

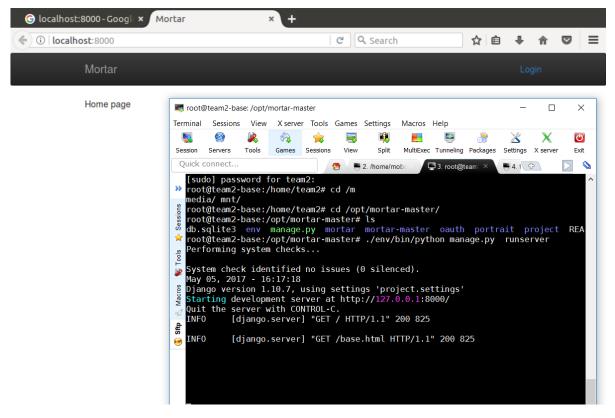


Figure 4.11: Mortar service running.

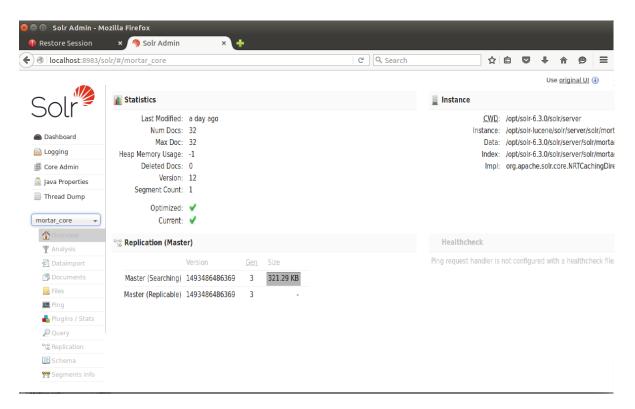


Figure 4.12: Data filtered by Mortar.

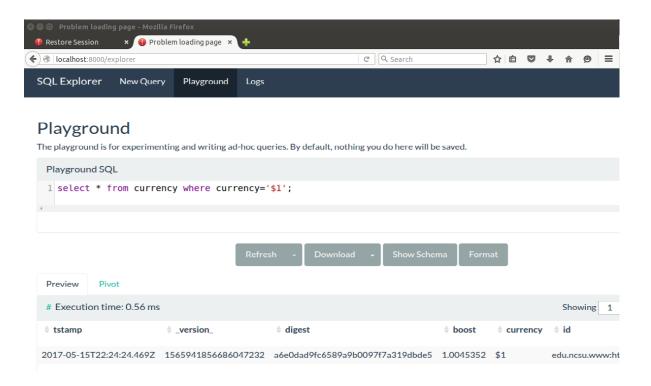


Figure 4.13: Data Visualization Using Portrait.

VERIFICATION AND VALIDATION

arious scenarios have been tested to ensure that our implementation of analytics cloud platform meets all the functional and nonfunctional requirements.

5.1 Test Cases

In this section, we discuss the test cases we formulated to validate the functional and nonfunctional requirements as listed in Section 2.

5.1.1 Functional Requirement 1 - Built on RHEL 7.3

Test case: Verify that host physical machine has RHEL 7 as base operating system **Test steps:**

- 1. The base host machine (Intel blade server) already came with RHEL 7.3 installed on it.
- 2. We verified this using command -cat /etc/redhat-release

Expected Behavior	Observed Behavior
RHEL 7.3 is installed as the base operating system	As expected, refer figure 5.1

Table 5.1: Test case - Built on RHEL 7.3.

5.1.2 Functional Requirement 2 - Cloud built using OpenStack Platform 10

Test case: Verify that OpenStack Platform 10 is installed using PackStack.

Test steps:



Figure 5.1: RHEL 7.3 base OS.

- 1. We verify that OpenStack is installed and all the services are up and running
- 2. We verified this using command *openstack-status*

Expected Behavior	Observed Behavior
OpenStack is successfully deployed on top of	As expected, refer figure 4.6
RHEL 7.3 and all the essential components of	
OpenStack like Nova, Neutron and Cinder are	
up and running	

Table 5.2: Test case - Cloud built using OpenStack Platform 10.

5.1.3 Functional Requirement 3 - Database VM

Test case: Verify that the cloud platform must have customized database image. **Test steps:**

1. We verified this using command – nova list

Expected Behavior	Observed Behavior
Database VM instance has been created and con-	As expected, refer figure 4.8
figured	

Table 5.3: Test case - Database VM.

5.1.4 Functional Requirement 4 - Analytics VM

Test case: Verify that the cloud platform must have customized analytics image. **Test steps:**

1. We verified this using command – nova list

Expected Behavior	Observed Behavior
Analytics VM instance has been created and con-	As expected, refer figure 4.8
figured	

Table 5.4: Test case - Analytics VM.

5.1.5 Functional Requirement 5 - GPFS Distributed store

Test case: Verify that the glance is configured to use the GPFS Distributed store for storage of image.

Test steps:

- 1. Run the command *cd* /*gpfs*/*team2*/*glance*/*images*/
- 2. Run the command -ls-l
- 3. Verify that images are present in this directory

Expected Behavior	Observed Behavior
On adding the customized images to - Glance,	As expected, refer figure 4.7
they are stored in the /gpfs/glance directory as	
indicated	

Table 5.5: Test case – GPFS distributed store.

5.1.6 Functional Requirement 6 – Database VM for storage of both structured and unstructured data

Test case: Verify that the database VM has capabilities to store both structured data in PostgreSQL 9.2.1 [10] and unstructured data in Cassandra 2.2.8 [2].

Test steps:

- 1. ssh into Database VM
- 2. Run command -ps-ef | grep cassandra to show running Cassandra process
- 3. Run command -ps -ef | grep postgres to show running PostgreSQL process

Expected Behavior	Observed Behavior
Database VM is correctly configured with Cassan-	As expected, refer figure 5.2
dra [2] and PostgreSQL [10]	

Table 5.6: Test case – Database VM for storage of both structured and unstructured data.

5.1.7 Functional Requirement 7 - Analytics VM for web crawling

Test case: Verify that the Analytics VM has capabilities to crawl the web given input seed URLs and gather unstructured data.

Test steps:

Figure 5.2: Cassandra and Postgresql services are running.



Figure 5.3: Unstructured data collected by Nutch stored in Cassandra.

- 1. ssh into Analytics VM.
- 2. Place the seed URL in \$NUTCH_HOME/urls/seed.txt text file. Run command *nutch inject urls*
- 3. Generate a batch of top 100 URLs using injected urls by running command nutch generate -topN 100
- 4. Run fetch job for batch-id obtained in step 3 to generate fetch-list using command *nutch fetch* <*batch-id> resume*
- 5. Parse the fetched URLs by running command *nutch parse <batch-id>-force*
- 6. Check the crawled content within the folder /opt/apache-nutch-2.2.1/src/testresources/testcrawl/segments

Expected Behavior	Observed Behavior
Analytics VM is correctly configured with Nutch	As expected, refer figures 4.9 and 5.3
and able to crawl the web. The seed url were stored	
in crawldb – a module of Nutch. A fetch-list was	
generated, which was crawled successfully. The	
crawled data was placed in segments directory of	
Nutch.	

Table 5.7: Test case – Analytics VM for web crawling.

5.1.8 Functional Requirement 8 - Analytics VM for data indexing

Test case: Verify that the Analytics VM has capabilities to index the data crawled by Nutch. **Test steps:**

- 1. ssh into Analytics VM
- 2. Run steps 1-6 from test case for Functional Requirement 7
- 3. Next, run the command *nutch solrindex*
- 4. Run select query on Solr dashboard to view indexed data

Expected Behavior	Observed Behavior
Solr dashboard displays the indexed data up-	As expected, refer figures 5.4, 5.5,
loaded from Nutch	4.10 and 4.12

Table 5.8: Test case – Analytics VM for data indexing.

5.1.9 Functional Requirement 9 - Analytics VM for data filtering

Test case: Verify that the Analytics VM has capabilities to filter the data indexed by Solr using installed package Mortar.

Test steps:

- 1. Log into the Mortar interface.
- 2. Create a filter tree and Query Solr with that filter tree.

Expected Behavior	Observed Behavior
Mortar interface is used to query data using PES-	As expected, refer figure 4.12
TLE tree. Filtered data can be viewed using the	
Mortar interface	

Table 5.9: Test case - Analytics VM for data filtering.

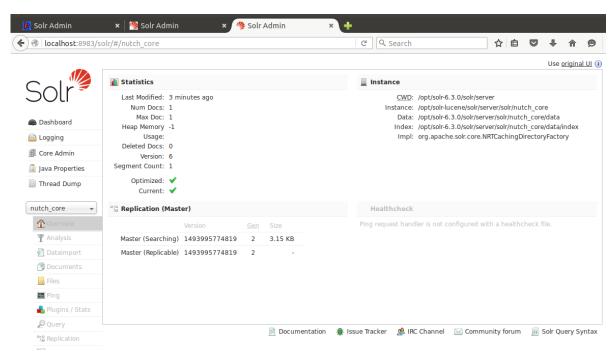


Figure 5.4: Nutchcore entry in Solr.

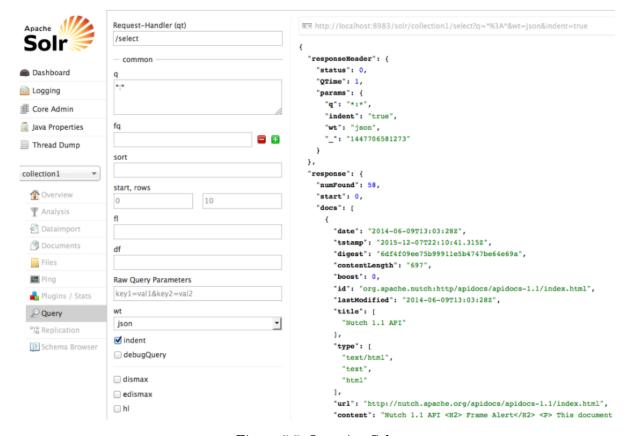


Figure 5.5: Querying Solr.

5.1.10 Functional Requirement 10 - Data import and export

Test case: Verify that the Analytics VM has capabilities to export filtered data in Solr in CSV format. Verify that the Database VM has capabilities to import the CSV file into PostgreSQL [7] **Test steps:**

- 1. Export data from Solr into CSV format.
- 2. Import CSV file into PostGreSQL

Expected Behavior	Observed Behavior
The structured data from the CSV file is present	As expected
in PostGreSQL	

Table 5.10: Test case – Data import and export.

5.1.11 Functional Requirement 11 - Analytics VM for data visualization

Test case: Verify that the Analytics VM has capabilities to visualize the structured data stored in PostgreSQL server on Database VM through Portrait interface.

Test steps:

- 1. Log into Portrait using appropriate credentials
- 2. Query structured data and verify if it is correct

Expected Behavior	Observed Behavior
The structured data from PostGreSQL can be vi-	As expected, refer figure 4.13
sualized using Portrait interface	

Table 5.11: Test case - Analytics VM for data visualization.

5.1.12 Functional Requirement 12 - Authentication and Authorization

Test case: Verify that the analytics cloud platform prevents unauthorized access to VMs. **Test steps:**

- 1. ssh into client DEV VM.
- 2. Try pinging, logging into Database VM.

```
team2@team2-base:~$
team2@team2-base:~$
team2@team2-base:~$
ssh team2@192.168.4.12
Connection reset by 192.168.4.12 port 22
team2@team2-base:~$
team2@team2-base:~$
team2@team2-base:~$
team2@team2-base:~$
```

Figure 5.6: Client cannot SSH into Database VM

Expected Behavior	Observed Behavior
Client should be unable to SSH into database VM	As expected, refer figure 5.6
due to the firewall rules that are in place to ensure	
there is no unauthorized access to database VM.	
One can connect to database machine only on the	
2 thrift client ports assigned for Cassandra and	
PostgreSQL	

Table 5.12: Test case – Authentication and Authorization.

CHAPTER CHAPTER

SCHEDULE AND PERSONNEL

6.1 Schedule

Date	Agenda
02/02/2017	Meeting 1 - Meeting with Prof Streck and Prof Hall to get the system
	requirements and understanding of base architecture.
02/02/2017	Meeting 2 - Meeting among team-members to discuss problem statement,
	clear use-case ambiguities and plan initial tasks.
02/07/2017	Meeting 3 - Got ssh access to physical server. Team meeting to ensure every
	member has access to the physical server setup on their personal machines.
02/09/2017	Milestone 1 - OpenStack installation on physical server. Deployment carried
	out using PackStack. Met Prof Hall post lecture to resolve issues occurring
	in accessing Apache server running on the physical machine.
03/02/2017	Meeting 4 - Meeting with Dr. Kowolenko, Prof Streck and Prof Hall to gather
	requirements on Big Data Analytics and what the application should offer
	an end-user.
03/06/2017	Meeting 5 - Meeting among team-members to decide on the open source
	frameworks for databases, data ingestion, analytics and UI that need to be
	installed on the image. Each member was assigned a set of frameworks to
	understand, install and create a script for their installation.
03/14/2017	Meeting 6 - Meeting among team-members to assess each other,Äôs
	progress on the assigned tasks.
03/15/2017	Milestone 2 - Ubuntu 16.04.02 LTS base image creation

03/16/2017	Meeting 7 - Meeting among team-members to complete the intermediate
	project report. Milestone 3 - Image creation with the database, data inges-
	tion, analytics and UI tools/packages.
03/24/2017	Meeting 8 - Meeting among team-members to decide on presentation topics.
03/26/2017	Milestone 4 - Proof of Concept for Nutch application for SaaS case.
03/27/2017	Milestone 5 - Moving images from machine to /gpfs directory
03/28/2017	Milestone 6 - Developing intermediate project presentation slides
03/30/2017	First Project Presentation
04/18/2017	Meeting 9 - End-to-end integration plan and documentation discussion
04/19/2017	Milestone 7 - Proof of Concept for Cassandra data ingestion for PaaS case
04/28/2017	Milestone 8 - Nutch-Cassandra-Solr Integration
05/02/2017	Second Project Presentation
05/03/2017	Milestone 9 - Mortar, Potrait & UIMA installation and testing
05/05/2017	Milestone 10 - End to end integration and validation of entire model
05/05/2017	Milestone 11 - Submit final report

Table 6.1: Schedules.

6.2 Task Distribution

Task	Rushikesh	Karan	Payal	Nithya	Ran
Meeting 1 02/02/2017	✓	✓	✓	✓	✓
Milestone 1 OpenStack instal-	✓	✓	✓	✓	√
lation 02/09/2017					
Meeting 4 03/02/2017	✓	✓	✓	✓	✓
Milestone 2 Ubuntu base image		✓			✓
creation 03/15/2017					
Milestone 3 Image creation	✓	✓	✓	✓	✓
Packages installation	✓	✓	✓	✓	✓
Milestone 4 Nutch POC	✓		✓		
Milestone 5 Move images to		✓	✓		
/gpfs					
Milestone 6 Intermediate	✓	✓		✓	√
project presentation meeting					
First project presentation	✓	✓	√	✓	√
03/30/2017					

Documentation update			√	✓	
04/12/2017					
Milestone 7 04/19/2017	✓			✓	
Milestone 8 Nutch-Cassandra-	✓	✓	✓	✓	
Solr Integration 04/28/2017					
Milestone 9 Mortar, Portrait &	✓		✓		✓
UIMA installation and testing					
05/03/2017					
Milestone 10 End to end inte-	✓	✓	✓	✓	✓
gration and validation of entire					
model 05/05/2017					
Milestone 11 Submit final re-	√	√	√	√	√
port 05/05/2017					

Table 6.2: Task Distribution.

BIBLIOGRAPHY

[1] Apache Ant.

http://ant.apache.org/.

Apache Ant - Pure Java build tool, simpler and easier to use than GNU Make.

[2] Apache Cassandra.

http://cassandra.apache.org.

Apache Cassandra - A free and open-source distributed NoSQL database management system.

[3] Apache Solr.

http://lucene.apache.org/solr/.

Apache Solr - An open-source search server built on Apache Lucene.

[4] Apache UIMA.

https://uima.apache.org/.

Apache UIMA - Unstructured Information Management application which analyzes large volumes of unstructured information in order to discover knowledge that is relevant to an end user.

[5] Django: The web framework for perfectionists with deadlines.

https://www.djangoproject.com/.

Django – A complete high-level web framework that encourages rapid development and clean, pragmatic design.

[6] Highly extensible, highly scalable Web crawler.

http://nutch.apache.org/.

Apache Nutch - A highly extensible, highly scalable Web crawler.

[7] Import CSV data into postgresql, the comfortable way ;-).

http://blog.aplikate.eu/2015/01/03/import-csv-data-into-postgresql-the-comfortable-way/. Reference for importing CSV data into PostgreSQL.

[8] Neutron with existing external network.

https://www.rdoproject.org/networking/neutron-with-existing-external-network/.

Neutron with existing external network - This site was followed to setup OpenStack Pack-Stack to integrate with the current network infrastructure on the host. As discussed in the appendix, the commands on this page had to be modiled to work with the current OpenStack version and tools.

[9] PackStack.

https://www.rdoproject.org/install/quickstart/.

Packstack – Packstack is a utility that uses Puppet modules to deploy various parts of OpenStack.

[10] PostgreSQL.

https://www.postgresql.org/.

PostgreSQL - PostgreSQL is a powerful, open source object-relational database system.

[11] J. Streck, Project abstracts for spring 2017 cloud computing (csc 547) projects 1 through 4 configure a cloud for big data analytics.

https://github.ncsu.edu/nkumar8/CSC547_S17_Project/tree/master/Documentation/project_abstracts.pdf, 2017.

This is the first document we received to get an initial scope of the project requirements.

[12] M. JOHNSON, Alchemy cookbook open source text analytics system setup and usage.

https://github.ncsu.edu/nkumar8/CSC547_S17_Project/blob/master/AlchemyCookbook.pdf, 2017.

This guide was used to design the data analysis engines, install the required packages, and create a workflow.

[13] M. KOWOLENKO AND M. A. VOUK, Developing an open source 'bigdata' cognitive computing platform.

This document is a reference paper for Big Data Analytics. It was used to gain better understanding of the data analytics platform and aiding us to build the needed data analytics engine for our project.

[14] UBUNTU, Ubuntu 16.04.2 LTS (Xenial Xerus).

http://releases.ubuntu.com/16.04/.

Ubuntu – An open source operating system. This particular version of Ubuntu was installed as the base image in our project.

[15] W. Zhu and M. Gupta and V. Kumar and S. Perepa and A. Sathi and C. Statchuk, Building Big Data and Analytics Solutions in the Cloud.

http://www.redbooks.ibm.com/redpapers/pdfs/redp5085.pdf.

This is the reference paper for cloud issues and environment in a general big data analytics platform. We used this to narrow down the issues we need to address in our project.

1. Installation of OpenStack using PackStack

This section covers the commands used to install OpenStack with PackStack. Packstack is a command line utility suitable for deploying both single node proof of concept installations and more complex multi-node installations.

As suggested by Mr. Hall, to install OpenStack using PackStack, we use instructions from PackStack documentation [8].

The figure above shows the commands to install OpenStack using PackStack utility. During the installation process, we faced an error as follows while running the last command -sudo packstack -allinone

```
ERROR: Error appeared during Puppet run: 10.26.20.10_controller.pp

Error: Execution of '/usr/bin/yum -d 0 -e 0 -y install openstack-gnocchi-metricd'
returned 1: Transaction check error:

You will find full trace in log
/var/tmp/packstack/20170209-135026-rJ3Pz0/manifests/10.26.20.10_controller.pp.log
```

In order to resolve this error we executed command: *sudo yum remove python-cadf* and re-ran the last command – *sudo packstack* –*allinone*. On completion, OpenStack had been successfully installed on our machine. Test case for functional requirement 2.1.2. Cloud built using OpenStack Platform 10 correctly validates that all components are up and running.

```
$ sudo yum install -y https://www.rdoproject.org/repos/rdo-release.rpm
$ sudo yum update -y
$ sudo yum install -y openstack-packstack
$ sudo packstack --allinone
```

Figure 1: OpenStack install using PackStack.

```
[team2@csc-kvm-20 ~]$ sudo cat /etc/glance/glance-api.conf | grep -A 3 -B 3 gpfs
#
# (string value)
#image_cache_dir = <None>
image_cache_dir = /gpfs/team2/glance/image-cache

#
# Default publisher_id for outgoing Glance notifications.

"
# (string value)
# (string value)
#filesystem_store_datadir = /var/lib/glance/images
filesystem_store_datadir = /gpfs/team2/glance/images/
```

Figure 2: Configuring Glance to use GPFS.

2. Configuring Glance Service to use GPFS for storing the images

Functional Requirement 5. GPFS Distributed store stated that all images in the analytics cloud platform must be stored to the provided IBM's General Parallel File System (GPFS) distributed store. This section identifies the steps taken to complete this requirement.

The configuration of glance service to use GPFS as storage backend by changing two parameter values in file /etc/glance/glance-api.conf. We modify parameters as follows:

- 1. Set parameter filesystem_store_datadir value to /gpfs/team2/glance/images/
- 2. Set parameter image cache dir value to /gpfs/team2/glance/image-cache

3. Base image creation

This section of the Appendix details the steps followed to create our Ubuntu 16.04 Base image. Following are the steps followed:

- 1. Download Ubuntu 16.04 ISO from ubuntu website.
- 2. Install qemu-kvm and virt-manager Command – sudo apt-get install qemu-kvm; sudo apt-get install virt-manager
- 3. Create Qemu Image
 Command qemu-img create -f qcow2 /tmp/ubuntu_team2.qcow2 10G

- 5. Use Virt-Manager GUI to complete ubuntu installation.
- 6. After Completing the installation, Start the VM, Login into it and install various required packages.

Commands – sudo apt-get install openssh-server; sudo apt-get install cloud-init cloud-utils; dpkg-reconfigure cloud-init

7. Shutdown the instance

Command – *virsh stop ubuntu*

8. Cleanup Mac Address

Command – virt-sysprep -d ubuntu

9. Undefine the libvirt domain

Command – virsh undefine ubuntu

10. Compress created image

Command - virt-sparsify -compress /tmp/ubuntu_team2.qcow2 ubuntu_team2.qcow2

11. Upload the newly created image

4. Installation of Software Stack on customized images

This section details the commands used for creation of Database and analytics VM and the steps followed to install the software stack as described in Section 4.1.2.

- Command to create a customized Analytics image openstack image create -disk-format qcow2 -container-format bare -private -file team2_ubuntu64Analy.qcow2 ubuntu64Analytics
- Command to create a customized Database image openstack image create –disk-format qcow2 –container-format bare –private –file team2_ubuntu64Analy.qcow2 ubuntu64Database

The figure below illustrates the command run to create the customized Database image.

Once the customized images are set up, Database and Analytics instances are brought up. We then install the software stack on each of these instances using Meagan,Äôs steps. Since Meagan,Äôs steps [12] were for a Centos Base image, and our base image is Ubuntu, we adopted her script steps and installed the softwares. Re-iterating the steps in the Alchemy cookbook shall be redundant, hence we do not repeat the steps here. The adapted scripts for installations can be accessed at

https://github.ncsu.edu/nkumar8/CSC547_S17_Project/tree/master/MeganScripts

 $[[root@csc-kvm-20\ team2(keystone_admin)] \#\ open stack\ image\ create\ --disk-format\ qcow2\ --container-format\ bare\ --private\ --file\ team2_ubuntu64Analy.qcow2\ ubuntu64Database$

Field	Value
checksum container_format created_at disk_format file id min_disk min_ram name owner protected schema size status tags updated_at virtual_size visibility	5de8ccdf004ee29f3c21699f28ed3482 bare 2017-04-20T00:40:35Z qcow2 /v2/images/6caaacf7-f8d7-4130-89d0-2de7c9daf43f/file 6caaacf7-f8d7-4130-89d0-2de7c9daf43f 0 0 ubuntu64Database 125e0a41fc914aff9c518f32f77a64c0 False /v2/schemas/image 1778581504 active 2017-04-20T00:40:51Z None private

Figure 3: Adding the customized image.

In Order to aid the data scientist, to customize the image further to his likings, we prepared scripts for installation of various data analysis packages like pip, anaconda, nltk, scikit etc. These additional software package installation scripts can be accessed at https://github.ncsu.edu/nkumar8/CSC547_S17_Project/tree/master/Scripts