# DEPARTMENT OF COMPUTER APPLICATIONS

## MCA 251 – DATA MINING AND BIG DATA LAB

II/II MCA - (I SEMESTER)

LAB MANUAL



# R.V.R. & J.C.COLLEGE OF ENGINEERING

(AUTONOMOUS)

(ACCREDITED BY NAAC WITH 'A' GRADE)

(Approved by A.I.C.T.E.)

(Affiliated to Acharya Nagarjuna University)

Chandramoulipuram :: Chowdavaram

GUNTUR – 522019 :: ANDHRA PRADESH

## PROFORMA FOR LAB BASED COURSE DESCRIPTION

Course Code : CA251

Course Title : DATA MINING AND BIG DATA LAB

Year & Semester : II/II MCA (I semester)

Periods/Week : 06 – LAB

Regulation : R20

Nature of the Course : Core

Name of the Instructors : Dr. M.Sridhar

Designation : Associate Professor

E-Mail : mandapati 12@gmail.com

## **COURSE CONTENT**

#### CA251: DATA MINING AND BIG DATA LAB

Lectures: ---Sessional Marks: 40Practical's: 6 Periods/WeekSem. End Exam Marks: 60Sem. End Exam Duration: 3 hoursCredits: 02

## **Prerequisite:**

## **Course Objectives:**

At the end of the course the students will understand

- To learn the algorithms used for various types of Data Mining Problems.
- To discover interesting patterns, analyze supervised and unsupervised models and estimate the accuracy of the algorithms.
- Exercise the data mining techniques with varied input values for different parameters.
- To understand setting up of Hadoop Cluster
- To solve problems using Map Reduce Technique
- To solve Big Data problem

## **Course Outcomes:**

At the end of the course the students will able to

- Ability to understand the various kinds of tools.
- Demonstrate the classification, clustering and etc. in large data sets.
- Ability to add mining algorithms as a component to the exiting tools.
- Ability to apply mining techniques for realistic data.
- Set up multi-node Hadoop Clusters
- Apply Map Reduce algorithms for various algorithms
- Design a new algorithm that uses Map Reduce to apply on Unstructured and structured data.

## **LAB CYCLE 1**(Data Mining)

- 1. Create the following NumPy arrays:
  - a) A 1-D array called zeros having 10 elements and all the elements are set to zero.
  - b) A 1-D array called vowels having the elements 'a', 'e', 'i', 'o' and 'u'.
  - c) A 2-D array called ones having 2 rows and 5 columns and all the elements are set to 1 and *dtype* as int.
  - d) Use nested Python lists to create a 2-D array called *myarray1* having 3 rows and 3 columns and store the following data:
    - i. 2.7, -2, -19
    - ii. 0, 3.4, 99.9
    - iii. 10.6, 0, 13
  - e) A 2-D array called *myarray2* using *arange()* having 3 rows and 5 columns with start value = 4, step size 4 and *dtype* as float.

Using the arrays created in the above, write NumPy commands for the following:

- a) Find the dimensions, shape, size, data type of the items and itemsize of arrays zeros, vowels, ones, myarray1 and myarray2.
- b) Reshape the array ones to have all the 10 elements in a single row.
- c) Display the 2<sup>nd</sup> and 3<sup>rd</sup> element of the array *vowels*.
- d) Display all elements in the 2<sup>nd</sup> and 3<sup>rd</sup> row of the array *myarray1*.
- e) Display the elements in the 1<sup>st</sup> and 2<sup>nd</sup> column of the array *myarray1*.
- f) Display the elements in the 1<sup>st</sup> column of the 2<sup>nd</sup> and 3<sup>rd</sup> row of the array *myarray1*.
- g) Reverse the array of vowels.
- h) Divide all elements of array ones by 3.
- i) Add the arrays myarray1 and myarray2.
- j) Subtract myarray1 from myarray2 and store the result in a new array.
- k) Multiply myarray1 and myarray2 element wise.
- I) Do the matrix multiplication of *myarray1* and *myarray2* and store the result in a new array *myarray3*.
- m) Divide myarray1 by myarray2.
- n) Find the cube of all elements of myarray1 and divide the resulting array by 2.
- o) Find the square root of all elements of myarray2 and divide the resulting array by 2. The result should be rounded to two places of decimals.
- p) Find the transpose of ones and myarray2.
- q) Sort the array vowels in reverse.
- r) Sort the array myarray1 such that it brings the lowest value of the column in the first row and so on.
- s) Use NumPy. split() to split the array myarray2 into 5 arrays column wise. Store your resulting arrays in *myarray2A*, *myarray2B*, *myarray2C*, *myarray2D* and *myarray2E*. Print the arrays *myarray2A*, *myarray2B*, *myarray2D* and *myarray2E*.
- t) Split the array zeros at array index 2, 5, 7, 8 and store the resulting arrays in zerosA, zerosB, zerosC and zerosD and print them.
- u) Concatenate the arrays *myarray2A*, *myarray2B* and *myarray2C* into an array having 3 rows and 3 columns.

- v) Create a 2-D array called *myarray4* using *arange()* having 14 rows and 3 columns with start value = -1, step size 0.25 having. Split this array row wise into 3 equal parts and print the result.
- w) Using the myarray4 created in the above questions, write commands for the following:
  - i. Find the sum of all elements.
  - ii. Find the sum of all elements row wise.
  - iii. Find the sum of all elements column wise.
  - iv. Find the max of all elements.
  - v. Find the min of all elements in each row.
  - vi. Find the mean of all elements in each row.
  - vii. Find the standard deviation column wise.
- 2. Write a Python program to do the following operations(Using NumPy Library)
  - a) Create multi-dimensional arrays and find its shape and dimension
  - b) Create a matrix full of zeros and ones
  - c) Reshape and flatten data in the array
  - d) Append data vertically and horizontally
  - e) Apply indexing and slicing on array
  - f) Use statistical functions on array Min, Max, Mean, Median and Standard Deviation.
- 3. Write a Python program to do the following operations(Using NumPy Library)
  - a) Dot and matrix product of two arrays
  - b) Compute the Eigen values of a matrix
  - c) Solve a linear matrix equation such as  $3 * x^0 + x^1 = 9$  and  $x^0 + 2 * x^1 = 8$ .
  - d) Compute the multiplicative inverse of a matrix
  - e) Compute the rank of a matrix
  - f) Compute the determinant of an array.
- 4. Suppose that the data for analysis includes the attribute *age*. The *age* values for the data tuples are (in increasing order) 13, 15, 16, 16, 19, 20, 20, 21, 22, 22, 25, 25, 25, 25, 30, 33, 33, 35, 35, 35, 36, 40, 45, 46, 52, 70.

Write a Python program for the following using the above data:

- a) Calculate measures of central tendency.
- b) To find (roughly) the first quartile (Q1) and the third quartile (Q3) of the data.
- c) Give the five-number summary of the data.
- d) Show a boxplot of the data.
- 5. Suppose that a hospital tested the age and body fat data for 18 randomly selected adults with the following results:

age	23	23	27	27	39	41	47	49	50
%fat	9.5	26.5	7.8	17.8	31.4	25.9	27.4	27.2	31.2
age	52	54	54	56	57	58	58	60	61

- a) Calculate the mean, median, and standard deviation of age and %fat.
- b) Draw the boxplots for age and %fat.
- c) Draw a scatter plot and a q-q plot based on these two variables.
- 6. Write a Python program to perform the following using the three fundamental Pandas data structures: the Series, DataFrame, and Index.

- a) Series as generalized NumPy array
- b) Series as specialized dictionary
- c) Constructing Series objects
- d) DataFrame as a generalized NumPy array
- e) DataFrame as specialized dictionary
- f) Constructing DataFrame objects:
  - i. From a single Series object.
  - ii. From a list of dicts.
  - iii. From a dictionary of Series objects.
  - iv. From a two-dimensional NumPy array.
  - v. From a NumPy structured array.
- g) Index as immutable array.
- h) Index as ordered set.
- i) Data Selection in Series:
  - i. Series as dictionary
  - ii. Series as one-dimensional array
  - iii. Indexers: loc, iloc, and ix
- j) Data Selection in DataFrame
  - i. DataFrame as a dictionary
  - ii. DataFrame as two-dimensional array
- 7. Write a Python program to perform the following:
  - a) Input as CSV File
  - b) Reading a CSV File
  - c) Reading Specific Rows
  - d) Reading Specific Columns
  - e) Reading Specific Columns and Rows
  - f) Reading Specific Columns for a Range of Rows
  - g) Identify the missing data
  - h) Identify the outlier data
  - i) Replace with mean or mode
  - j) Remove Blank Rows
  - k) Data Categories
  - I) Data types
  - m) Analyze the data
  - n) Visualize the data
  - o) Find correlation among all attributes
- 8. Write a python program to perform transformation of data using Discretization (Binning) and Normalization (MinMaxScaler or MaxAbsScaler) on given dataset.
- 9. Write a program to implement three frequent itemset mining algorithms:
  - a) Apriori
  - b) FP-growth
- 10. Write a program to implement Decision tree algorithm.
- 11. Write a program to implement Naïve Bayesian Classification.
- 12. Write a program to implement k-means clustering algorithm.

## **LAB CYCLE 2** (Hadoop)

- 1. Study and configure hadoop for big data. Use web based tools to monitor your Hadoop setup.
- 2. Implement the following file management tasks in Hadoop:

- Adding files and directories
- Retrieving files
- Deleting files

**Hint:** A typical Hadoop workflow creates data files (such as log files) elsewhere and copies them into HDFS using one of the above command line utilities.

- 3. Run a basic Word Count Map Reduce program to understand MapReduce Paradigm.
- 4. Implement Matrix Multiplication with Hadoop MapReduce

## **Web References**

- 1. https://www.tutorialspoint.com/machine\_learning\_with\_python/machine\_learning\_with\_python\_data\_preprocessing\_analysis\_visualization.htm
- 2. https://cloudxlab.com/blog/numpy-pandas-introduction/
- 3. nptel.ac.in/courses/106106093/35
- 4. https://www.cse.iitb.ac.in/infolab/Data/Talks/krithi-talk-impact.pp
- 5. https://hortonworks.com/hadoop-tutorial/hello-world-an-introduction-to-hadoop-hcatalog-hive-and-pig/https://developer.ibm.com/hadoop/docs/getting-started/tutorials/overview-tutorial/overview-lab-1-getting-started-hadoop-biginsights-2/

#### Aim:

Create the following NumPy arrays:

- a) A 1-D array called zeros having 10 elements and all the elements are set to zero.
- b) A 1-D array called *vowels* having the elements 'a', 'e', 'i', 'o' and 'u'.
- c) A 2-D array called ones having 2 rows and 5 columns and all the elements are set to 1 and dtype as int.
- d) Use nested Python lists to create a 2-D array called *myarray1* having 3 rows and 3 columns and store the following data:
  - i. 2.7, -2, -19
  - ii. 0, 3.4, 99.9
  - iii. 10.6, 0, 13
- e) A 2-D array called *myarray2* using *arange()* having 3 rows and 5 columns with start value = 4, step size 4 and *dtype* as float.

Using the arrays created in the above, write NumPy commands for the following:

- a) Find the dimensions, shape, size, data type of the items and itemsize of arrays zeros, vowels, ones, myarray1 and myarray2.
- b) Reshape the array ones to have all the 10 elements in a single row.
- c) Display the 2<sup>nd</sup> and 3<sup>rd</sup> element of the array *vowels*.
- d) Display all elements in the 2<sup>nd</sup> and 3<sup>rd</sup> row of the array *myarray1*.
- e) Display the elements in the 1<sup>st</sup> and 2<sup>nd</sup> column of the array *myarray1*.
- f) Display the elements in the 1<sup>st</sup> column of the 2<sup>nd</sup> and 3<sup>rd</sup> row of the array *myarray* 1.
- g) Reverse the array of vowels.
- h) Divide all elements of array ones by 3.
- i) Add the arrays myarray1 and myarray2.
- j) Subtract myarray1 from myarray2 and store the result in a new array.
- k) Multiply myarray1 and myarray2 element wise.
- I) Do the matrix multiplication of *myarray1* and *myarray2* and store the result in a new array *myarray3*.
- m) Divide myarray1 by myarray2.
- n) Find the cube of all elements of myarray1 and divide the resulting array by 2.
- o) Find the square root of all elements of myarray2 and divide the resulting array by 2. The result should be rounded to two places of decimals.
- p) Find the transpose of ones and myarray2.
- q) Sort the array vowels in reverse.
- r) Sort the array myarray1 such that it brings the lowest value of the column in the first row and so on.
- s) Use NumPy. split() to split the array myarray2 into 5 arrays column wise. Store your resulting arrays in *myarray2A*, *myarray2B*, *myarray2C*, *myarray2D* and *myarray2E*. Print the arrays *myarray2A*, *myarray2B*, *myarray2D* and *myarray2E*.
- t) Split the array zeros at array index 2, 5, 7, 8 and store the resulting arrays in zerosA, zerosB, zerosC and zerosD and print them.

- u) Concatenate the arrays *myarray2A*, *myarray2B* and *myarray2C* into an array having 3 rows and 3 columns.
- v) Create a 2-D array called *myarray4* using *arange()* having 14 rows and 3 columns with start value = -1, step size 0.25 having. Split this array row wise into 3 equal parts and print the result.
- w) Using the myarray4 created in the above questions, write commands for the following:
  - i. Find the sum of all elements.
  - ii. Find the sum of all elements row wise.
  - iii. Find the sum of all elements column wise.
  - iv. Find the max of all elements.
  - v. Find the min of all elements in each row.
  - vi. Find the mean of all elements in each row.
  - vii. Find the standard deviation column wise.

#### Ans:

## **Create the following NumPy arrays:**

```
import numpy as np
# a) A 1-D array called zeros having 10 elements and all the elements are
set to zero.
zeros = np.zeros(10,dtype=int)
zeros
array([0, 0, 0, 0, 0, 0, 0, 0, 0, 0])
# b) A 1-D array called vowels having the elements 'a', 'e', 'i', 'o' and
'u'. # # b. A 1-D array called vowels having the elements 'a', 'e', 'i', 'o'
and 'u'.
vowels = np.array(['a','e','i','o','u'])
vowels
array(['a', 'e', 'i', 'o', 'u'], dtype='<U1')</pre>
# c) A 2-D array called ones having 2 rows and 5 columns and all the
elements are set to 1 and dtype as int.
ones = np.ones((2,5), dtype=int)
ones
array([[1, 1, 1, 1, 1],
       [1, 1, 1, 1, 1]])
# d) Use nested Python lists to create a 2-D array called myarray1 having 3
rows and 3 columns and store the following data: i. 2.7, -2, -19, ii. 0,
3.4, 99.9, iii. 10.6, 0, 13
myarray1 = np.array([[2.7, -2, -19], [0, 3.4, 99.9], [10.6, 0, 13]])
myarray1
array([[ 2.7, -2., -19.],
       [ 0., 3.4, 99.9],
       [ 10.6,
                0., 13.]])
```

## Using the arrays created in the above, write NumPy commands for the following:

# a) Find the dimensions, shape, size, data type of the items and itemsize
of arrays zeros, vowels, ones, myarray1 and myarray2.
zeros.ndim

```
1
zeros.shape
(10,)
zeros.dtype
dtype('int32')
zeros.itemsize
vowels.ndim
vowels.shape
(5,)
vowels.size
vowels.dtype
dtype('<U1')
vowels.itemsize
ones.ndim
ones.shape
```

```
(2, 5)
ones.size
10
ones.dtype
dtype('int32')
ones.itemsize
myarray1.ndim
2
myarray1.shape
(3, 3)
myarray1.size
myarray1.dtype
dtype('float64')
myarray1.itemsize
myarray2.ndim
myarray2.shape
(3, 3)
myarray2.size
9
myarray2.dtype
dtype('float64')
myarray2.itemsize
```

8

```
# b) Reshape the array ones to have all the 10 elements in a single row.
ones = np.ones((2,5),dtype=int)
ones.reshape (1, 10)
array([[1, 1, 1, 1, 1, 1, 1, 1, 1, 1]])
# c) Display the 2nd and 3rd element of the array vowels.
print(vowels[1], vowels[2])
еi
# d) Display all elements in the 2nd and 3rd row of the array myarray1.
myarray1 = np.array([[2.7, -2, -19], [0, 3.4, 99.9], [10.6, 0, 13]])
myarray1[1:3]
array([[ 0. , 3.4, 99.9],
       [10.6, 0., 13.]])
# e) Display the elements in the 1st and 2nd column of the array myarray1.
myarray1 = np.array([[2.7, -2, -19], [0, 3.4, 99.9], [10.6, 0, 13]])
myarray1[0:3,0:2]
array([[2.7, -2.],
       [ 0. , 3.4],
       [10.6, 0.]])
# f) Display the elements in the 1st column of the 2nd and 3rd row of the
array myarray1.
myarray1 = np.array([[2.7, -2, 19], [0, 3.4, 99.9], [10.6, 0, 13]])
myarray1[1:3,0:3]
array([[ 0. , 3.4, 99.9],
       [10.6, 0., 13.]])
# g) Reverse the array of vowels.
vowels = np.array(['a','e','i','o','u'])
vowels[::-1]
array(['u', 'o', 'i', 'e', 'a'], dtype='<U1')</pre>
# h) Divide all elements of array ones by 3.
ones = np.ones((2,5),dtype=int)
ones/3
array([[0.33333333, 0.33333333, 0.33333333, 0.33333333, 0.33333333],
       [0.33333333, 0.33333333, 0.33333333, 0.33333333, 0.33333333]])
# i) Add the arrays myarray1 and myarray2.
myarray1 = np.array([[2.7,-2,-19],[0,3.4,99.9],[10.6,0,13]])
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
myarray1 + myarray2
array([[ 6.7, 6., -7.],
       [ 16. , 23.4, 123.9],
       [ 38.6, 32., 49.]])
```

```
# j) Subtract myarray1 from myarray2 and store the result in a new array
myarray1 = np.array([[2.7, -2, -19], [0, 3.4, 99.9], [10.6, 0, 13]])
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
newarray=myarray2-myarray1
newarray
array([[ 1.3, 10., 31.],
      [ 16. , 16.6, -75.9],
[ 17.4, 32. , 23. ]])
# k) Multiply myarray1 and myarray2 element wise.
myarray1 = np.array([[2.7, -2, -19], [0, 3.4, 99.9], [10.6, 0, 13]])
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
myarray2 * myarray1
array([[ 10.8, -16., -228.],
      [ 0., 68., 2397.6],
       [ 296.8, 0., 468. ]])
# 1) Do the matrix multiplication of myarray1 and myarray2 and store the
result in a new array myarray3.
myarray1 = np.array([[2.7,-2,-19],[0,3.4,99.9],[10.6,0,13]])
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
myarray3 = myarray2 @ myarray1
myarray3
array([[ 138. , 19.2, 879.2],
                36., 2006.],
       [ 297.6,
                52.8, 3132.8]])
       [ 457.2,
# m) Divide myarray1 by myarray2.
myarray1 = np.array([[2.7,-2,-19],[0,3.4,99.9],[10.6,0,13]])
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
myarray1 / myarray2
array([[ 0.675
                   , -0.25
                                , -1.58333333],
                  , 0.17
                               , 4.1625 ],
       [ 0.
       [ 0.37857143, 0.
                               , 0.36111111])
# n) Find the cube of all elements of myarray1 and divide the resulting
array by 2.
myarray1 = np.array([[2.7, -2, -19], [0, 3.4, 99.9], [10.6, 0, 13]])
myarraycube = myarray1 ** 3
myarraycube/2
array([[ 9.841500e+00, -4.000000e+00, -3.429500e+03],
       [ 0.000000e+00, 1.965200e+01, 4.985015e+05],
       [ 5.955080e+02, 0.000000e+00, 1.098500e+03]])
```

```
# o) Find the square root of all elements of myarray2 and divide the
resulting array by 2. The result should be rounded to two places of
decimals.
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
arraysqrt = np.sqrt(myarray2)
newarraysqrt = arraysqrt/2
np.around(newarraysqrt,2)
array([[1. , 1.41, 1.73],
           , 2.24, 2.45],
       [2.
       [2.65, 2.83, 3. ]])
# p) Find the transpose of ones and myarray2.
ones = np.ones((2,5),dtype=int)
ones.transpose()
array([[1, 1],
       [1, 1],
       [1, 1],
       [1, 1],
       [1, 1]])
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
myarray2.transpose()
array([[ 4., 16., 28.],
       [ 8., 20., 32.],
       [12., 24., 36.]])
# g) Sort the array vowels in reverse.
vowels = np.array(['a','e','i','o','u'])
vowels[ : : -1]
array(['u', 'o', 'i', 'e', 'a'], dtype='<U1')
# r) Sort the array myarray1 such that it brings the lowest value of the
column in the first row and so on.
myarray1 = np.array([[2.7, -2, -19], [0, 3.4, 99.9], [10.6, 0, 13]])
myarray1.sort()
myarray1
array([[-19., -2., 2.7],
       [ 0., 3.4, 99.9],
       [ 0., 10.6, 13.]])
# s) Use NumPy. split() to split the array myarray2 into 5 arrays column
wise. Store your resulting arrays in myarray2A, myarray2B, myarray2C,
myarray2D and myarray2E. Print the arrays myarray2A, myarray2B, myarray2C,
myarray2D and myarray2E
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
myarray2A, myarray2B, myarray2C = np.split(myarray2,[1,3])
myarray2A, myarray2B, myarray2C
(array([[ 4., 8., 12.]]),
 array([[16., 20., 24.],
        [28., 32., 36.]]),
 array([], shape=(0, 3), dtype=float64))
```

```
# t) Split the array zeros at array index 2, 5, 7, 8 and store the resulting
arrays in zerosA, zerosB, zerosC and zerosD and print them.
zeros = np.zeros(10,dtype=int)
zerosnew = np.split(zeros, [2,5,7,8])
zerosA = zerosnew[0]
zerosB = zerosnew[1]
zerosC = zerosnew[2]
zerosD = zerosnew[3]
# u) Concatenate the arrays myarray2A, myarray2B and myarray2C into an array
having 3 rows and 3 columns
myarray2 = np.arange(4,45,4,dtype=float)
myarray2.resize(3,3)
myarray2A, myarray2B, myarray2C = np.split(myarray2,[1,3])
np.concatenate((myarray2A, myarray2B, myarray2C),axis=0)
array([[ 4., 8., 12.],
       [16., 20., 24.],
       [28., 32., 36.]])
# v) Create a 2-D array called myarray4 using arange() having 14 rows and 3
columns with start value = -1, step size 0.25 having. Split this array row
wise into 3 equal parts and print the result.
myarray4 = np.arange(-1,45,0.25,dtype=float)
myarray4.resize(14,3)
np.split(myarray4,3,axis=1)
[array([[-1. ],
        [-0.25],
        [ 0.5],
        [ 1.25],
        [ 2. ],
        [ 2.75],
        [ 3.5 ],
        [ 4.25],
        [5.],
        [ 5.75],
        [ 6.5 ],
        [ 7.25],
        [8.],
        [ 8.75]]),
 array([[-0.75],
        [ 0. ],
        [0.75],
        [ 1.5 ],
        [ 2.25],
        [ 3. ],
        [ 3.75],
        [ 4.5 ],
        [ 5.25],
        [ 6. ],
        [ 6.75],
        [ 7.5],
        [ 8.25],
```

[ 9. ]]),

# w) Using the myarray4 created in the above questions, write commands for the following:

```
# i. Find the sum of all elements.
myarray4 = np.arange(-1,45,0.25,dtype=float)
myarray4.resize(14,3)
myarray4.sum()
173.25
# ii. Find the sum of all elements row wise.
myarray4 = np.arange(-1,45,0.25,dtype=float)
myarray4.resize(14,3)
myarray4.sum(axis=1)
array([-2.25, 0. , 2.25, 4.5 , 6.75, 9. , 11.25, 13.5 , 15.75,
      18. , 20.25, 22.5 , 24.75, 27. ])
# iii. Find the sum of all elements column wise.
myarray4 = np.arange(-1,45,0.25,dtype=float)
myarray4.resize(14,3)
myarray4.sum(axis=0)
array([54.25, 57.75, 61.25])
# iv. Find the max of all elements.
myarray4 = np.arange(-1,45,0.25,dtype=float)
myarray4.resize(14,3)
myarray4.max()
9.25
# v. Find the min of all elements in each row.
myarray4 = np.arange(-1,45,0.25,dtype=float)
myarray4.resize(14,3)
myarray4.min(axis=1)
array([-1. , -0.25, 0.5 , 1.25, 2. , 2.75, 3.5 , 4.25, 5. ,
        5.75, 6.5, 7.25, 8., 8.75])
# vi. Find the mean of all elements in each row.
myarray4 = np.arange(-1,45,0.25,dtype=float)
myarray4.resize(14,3)
myarray4.mean(axis=1)
```

Aim: Write a Python program to do the following operations(Using NumPy Library)

- a) Create multi-dimensional arrays and find its shape and dimension
- b) Create a matrix full of zeros and ones
- c) Reshape and flatten data in the array
- d) Append data vertically and horizontally
- e) Apply indexing and slicing on array
- f) Use statistical functions on array Min, Max, Mean, Median and Standard Deviation.

#### PROCEDURE:

- 1. Create: Open a new file in Python shell, write a program and save the program with .py extension.
- 2. Execute: Go to Run -> Run module (F5)

#### PROGRAM LOGIC:

## a) Create multi-dimensional arrays and find its shape and dimension

```
Import numpy as np #creation of multi-dimensional array a=np.array([[1,2,3],[2,3,4],[3,4,5]])
```

## #shape

```
b=a.shape
print("shape:",a.shape)
```

#### #dimension

```
c=a.ndim
print("dimensions:",a.ndim)
```

#### b) Create a matrix full of zeros and ones

## #matrix full of zeros

```
z=np.zeros((2,2))
print("zeros:",z)
```

#### #matrix full of ones

```
o=np.ones((2,2))
print("ones:",o)
```

## c) Reshape and flatten data in the array

## #matrix reshape

```
a=np.array([[1,2,3,4],[2,3,4,5],[3,4,5,6],[4,5,6,7]])
b=a.reshape(4,2,2)
print("reshape:",b)
```

#### #matrix flatten

```
c=a.flatten()
print("flatten:",c)
```

```
d) Append data vertically and horizontally #Appending data vertically
```

```
x=np.array([[10,20],[80,90]])
y=np.array([[30,40],[60,70]])
v=np.vstack((x,y))
print("vertically:",v)
#Appending data horizontally
h=np.hstack((x,y))
print("horizontally:",h)
```

# e) Apply indexing and slicing on array #indexing

```
a=np.array([[1,2,3,4],[2,3,4,5],[3,4,5,6],[4,5,6,7]])
temp = a[[0, 1, 2, 3], [1, 1, 1, 1]]
print("indexing",temp)
```

## #slicing

i=a[:4,::2]
print("slicing",i

f) Use statistical functions on array - Min, Max, Mean, Median and Standard Deviation #min for finding minimum of an array

```
a=np.array([[1,3,-1,4],[3,-2,1,4]])
b=a.min() print("minimum:",b)
```

## #max for finding maximum of an array

```
C=a.max()
Print("maximum",c)
```

## #mean

```
a=np.array([1,2,3,4,5])
d=a.mean()
print("mean:",d)
```

## #median

```
e=np.median(a)
print("median:",e)
```

#### #standard deviation

```
f=a.std()
print("standard deviation",f)
```

## INPUT/OUTPUT:

```
a) shape: (3, 3) dimensions: 2 zeros: [[0. 0.] [0. 0.]] ones: [[1. 1.]
```

```
[1. 1.]]
b) reshape:
   [[[1 2]
   [3 4]]
   [[2 3]
   [4 5]]
   [[3 4]
   [5 6]]
   [[45]
   [67]]]
   flatten: [1 2 3 4 2 3 4 5 3 4 5 6 4 5 6 7]
c) vertically:
   [[10 20]
   [80 90]
   [30 40]
   [60 70]]
   horizontally:
    [[10 20 30 40]
   [80 90 60 70]]
d) indexing
   [2 3 4 5]
   slicing
   [[1 3]
   [2 4]
   [3 5]
   [4 6]]
e) minimum: -2
   maximum: 4
   mean: 3
   median: 3 s
   tandard deviation: 1.4142135623730951
```

Aim: Write a Python program to do the following operations(Using NumPy Library)

- a) Dot and matrix product of two arrays
- b) Compute the Eigen values of a matrix
- c) Solve a linear matrix equation such as  $3 * x^0 + x^1 = 9$  and  $x^0 + 2 * x^1 = 8$ .
- d) Compute the multiplicative inverse of a matrix
- e) Compute the rank of a matrix
- f) Compute the determinant of an array.

#### PROCEDURE:

- 1. Create: Open a new file in Python shell, write a program and save the program with .py extension.
- 2. Execute: Go to Run -> Run module (F5)

#### PROGRAM LOGIC:

a) Dot and matrix product of two arrays

## #dot product of two arrays

Import numpy as np a=np.array([1,2,3])

b=np.array([1,2,3])

print("dot product of one dimension is:", np.dot(a,b))

#### #matrix elements multiplication

a=np.array([[1,2],[3,4]])

b=np.array([[1,2],[3,4]])

print("element multiplication of matrix;", np.multiply(a,b))

#### #matrix multiplication

print("matrix multiplication", np.matmul(a,b))

## b) Compute the Eigen values of a matrix

## #eigen values of a matrix

Import numpy as np

a=np.array([[1,2],[3,4]])

eigvalues,eigvectors=np.linalg.eig(a)

print("eigen value:",eigvalues,"eigen vector:",eigvectors)

# c) Solve a linear matrix equation such as $3 * x^0 + x^1 = 9$ , $x^0 + 2 * x^1 = 8$ #linear matric equation

Import numpy as np

a=np.array([[3,1],[1,2]])

b=np.array([[9],[8]])

a\_inv=np.linalg.inv(a)

e=np.matmul(a\_inv,b)

print("linear equation:",e)

## d) Compute the multiplicative inverse of a matrix

```
#multiplicative inverse
```

```
import numpy as np
a=np.array([[3,1],[1,2]])
a_inv=np.linalg.inv(a)
print("a inverse:",a_inv)
```

## e) Compute the rank of a matrix

```
#matric rank
a=np.array([[3,1],[1,2]])
b=np.linalg.matrix_rank(a)
print("rank:",b)
```

## f) Compute the determinant of an array

```
a=np.array([[3,1],[1,2]])
b=np.linalg.det(a)
print("determinant:",b)
```

## **INPUT/OUTPUT:**

```
a)
dot product of one dimension is: 20
element multiplication of matrix;
[[ 1 4]
      [ 9 16]]
      matrix multiplication
      [[ 7 10]
      [15 22]]
```

## b) eigen value:

```
[-0.37228132 5.37228132]
```

```
eigen vector:
```

```
[[-0.82456484 -0.41597356]
[0.56576746 -0.90937671]]
```

c) linear equation:

```
[[ 3.6 -1.8]
[-1.6 4.8]]
```

d) a inverse:

```
[[ 0.4 -0.2] [-0.2 0.6]]
```

e)

rank: 2

f)

determinant: 5.0000000000000001

**Aim:** Suppose that the data for analysis includes the attribute *age*. The *age* values for the data tuples are (in increasing order) 13, 15, 16, 16, 19, 20, 20, 21, 22, 25, 25, 25, 25, 30, 33, 33, 35, 35, 35, 36, 40, 45, 46, 52, 70.

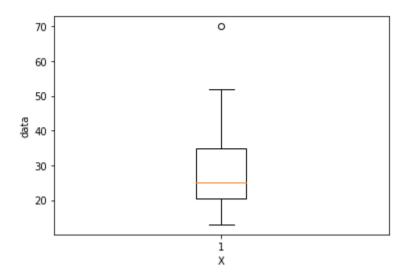
Write a Python program for the following using the above data:

- a) Calculate measures of central tendency.
- b) To find (roughly) the first quartile (Q1) and the third quartile (Q3) of the data.
- c) Give the five-number summary of the data.
- d) Show a boxplot of the data.

#### **Solution:**

```
import math
import statistics
import numpy as np
import scipy.stats
import pandas as pd
x=np.array(([ 13, 15, 16, 16, 19, 20, 20, 21, 22, 22, 25, 25, 25, 25, 30,
33, 33, 35, 35,
35, 35, 36, 40, 45, 46, 52, 701))
print(x)
d=pd.Series(x)
print(d)
[13 15 16 16 19 20 20 21 22 22 25 25 25 25 30 33 33 35 35 35 36 40 45
 46 52 70]
0
      13
1
      15
2
      16
3
      16
4
      19
5
      20
6
      20
7
      21
8
      22
9
      22
10
      25
11
      25
12
      25
13
      25
14
      30
15
      33
16
      33
17
      35
      35
18
19
      35
20
      35
21
      36
22
      40
      45
23
24
      46
25
      52
26
      70
```

```
dtype: int32
#Calculate measures of central tendency
mean = statistics.mean(x)
print("mean:", mean )
mean: 29
median = statistics.median(x)
print("median:", median )
median: 25
mode = statistics.multimode(x)
print("mode:", mode )
mode: [25, 35]
#To find (roughly) the first quartile (Q1) and the third quartile (Q3) of
the data.
quartile=statistics.quantiles(x, n=4, method='inclusive')
print(quartile)
print ("Q1=",quartile[0])
print ("Q3=",quartile[2])
[20.5, 25.0, 35.0]
Q1 = 20.5
Q3 = 35.0
#Give the five-number summary of the data
result=d.describe()
print(result)
#print("count=",result['count'])
#print("mean=",result['mean'])
#print("standard deviation=",result['std'])
#print("minimum;",result['min'])
#print("maximum",result['max'])
#print("Q1=",result['25%'])
#print("Q2=",result['50%'])
#print("Q3=",result['75%'])
        27.000000
count
mean
         29.962963
std
        12.942124
        13.000000
min
25%
        20.500000
50%
        25.000000
75%
        35.000000
         70.000000
max
dtype: float64
#Show a boxplot of the data
import matplotlib.pyplot as plt
fig, d = plt.subplots()
plt.xlabel('X')
plt.ylabel('data')
d.boxplot((x))
plt.show()
```



**Aim:** Suppose that a hospital tested the age and body fat data for 18 randomly selected adults with the following results:

age	23	23	27	27	39	41	47	49	50
%fat	9.5	26.5	7.8	17.8	31.4	25.9	27.4	27.2	31.2
	=-								
age	52	54	54	56	57	58	58	60	61

- a) Calculate the mean, median, and standard deviation of age and %fat.
- b) Draw the boxplots for age and %fat.
- c) Draw a scatter plot and a q-q plot based on these two variables.

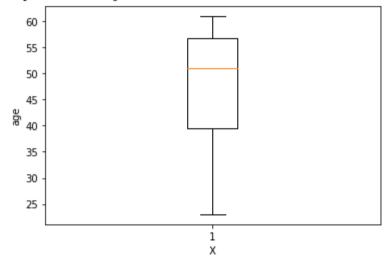
#### **Solution:**

```
import math
import statistics
import numpy as np
import scipy.stats
import pandas as pd
age=np.array(([23,23,27,27,39,41,47,49,50,52,54,54,56,57,58,58,60,61]))
print("age",age)
fat=np.array(([9.5,26.5,7.8,17.8,31.4,25.9,27.4,27.2,31.2,34.6,42.5,28.8,33.
4,30.2,34.1,32.9,41.2,35.7]))
print("fat", fat)
d=pd.Series(age)
print(d)
f=pd.Series(fat)
print(f)
age [23 23 27 27 39 41 47 49 50 52 54 54 56 57 58 58 60 61]
fat [ 9.5 26.5 7.8 17.8 31.4 25.9 27.4 27.2 31.2 34.6 42.5 28.8 33.4 30.2
 34.1 32.9 41.2 35.7]
0
      23
      23
1
2
      27
3
      27
4
      39
5
      41
6
      47
7
      49
8
      50
9
      52
10
      54
11
      54
12
      56
13
      57
14
      58
15
      58
16
      60
17
      61
dtype: int32
       9.5
```

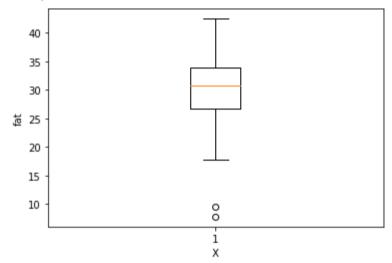
```
1
    26.5
2
      7.8
3
      17.8
4
     31.4
5
     25.9
     27.4
6
7
      27.2
8
      31.2
9
     34.6
10
    42.5
    28.8
11
12
     33.4
13
      30.2
14
     34.1
15
     32.9
16
    41.2
17
     35.7
dtype: float64
#Calculate the mean of age and %fat.
mean = statistics.mean(age)
print(" age mean:", mean )
mean = statistics.mean(fat)
print(" fat mean:", mean )
 age mean: 46
fat mean: 28.783333333333333
#Calculate the median of age and %fat.
median = statistics.median(age)
print(" age median:", median )
median = statistics.median(fat)
print("fat median:", median )
 age median: 51.0
fat median: 30.7
#Calculate the standard deviation of age and %fat.
std=np.std(age)
print(" age standard deviation=",std)
std=np.std(fat)
print(" fat standard deviation=",std)
 age standard deviation= 12.846193652519204
 fat standard deviation= 8.993655170915401
#Draw the boxplots for age
import matplotlib.pyplot as plt
fig, d = plt.subplots()
d.boxplot((age))
print(" boxplots for age")
plt.xlabel('X')
plt.ylabel('age')
plt.show()
#Draw the boxplots for %fat
import matplotlib.pyplot as plt
fig, f = plt.subplots()
f.boxplot((fat))
print(" boxplots for fat")
```

```
plt.xlabel('X')
plt.ylabel('fat')
plt.show()
```

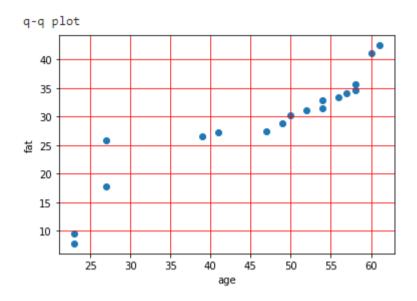
## boxplots for age



## boxplots for fat



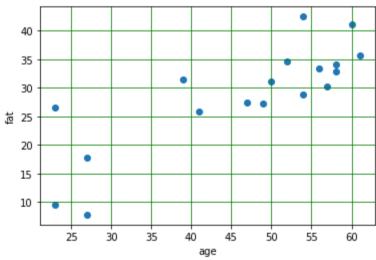
```
#Draw a q-q plot based on these two variables.
import numpy as np
import statsmodels.api as sm
import pylab as py
import matplotlib.pyplot as plt
plt.figure()
plt.scatter(np.sort(age), np.sort(fat))
print("q-q plot")
plt.xlabel('age')
plt.ylabel('fat')
plt.grid(color= 'red')
plt.show()
```



##Draw a scatter plot based on these two variables.
import matplotlib.pyplot as plt

```
plt.scatter(age, fat)
print("scatter plot")
plt.xlabel('age')
plt.ylabel('fat')
plt.grid(color= 'green')
plt.show()
```

## scatter plot



**Aim:** Write a Python program to perform the following using the three fundamental Pandas data structures: the Series, DataFrame, and Index.

- a) Series as generalized NumPy array
- b) Series as specialized dictionary
- c) Constructing Series objects
- d) DataFrame as a generalized NumPy array
- e) DataFrame as specialized dictionary
- f) Constructing DataFrame objects:
  - i. From a single Series object.
  - ii. From a list of dicts.
  - iii. From a dictionary of Series objects.
  - iv. From a two-dimensional NumPy array.
  - v. From a NumPy structured array.
- g) Index as immutable array.
- h) Index as ordered set.
- i) Data Selection in Series:
  - vi. Series as dictionary
  - vii. Series as one-dimensional array
  - viii. Indexers: loc, iloc, and ix
- j) Data Selection in DataFrame
  - ix. DataFrame as a dictionary
  - x. DataFrame as two-dimensional array

#### **Solution:**

```
import pandas as pd
#a) Series as generalized NumPy array
data = pd.Series([0.25, 0.5, 0.75, 1.0],
                 index=['a', 'b', 'c', 'd'])
data
     0.25
а
     0.50
h
     0.75
d
     1.00
dtype: float64
#b) Series as specialized dictionary
population dict = {'California': 38332521,
                    'Texas': 26448193,
                    'New York': 19651127,
                   'Florida': 19552860,
                   'Illinois': 12882135}
population = pd.Series(population dict)
```

```
population
            38332521
California
Texas
             26448193
New York
            19651127
Florida
             19552860
Illinois
             12882135
dtype: int64
#c) Constructing Series objects
import numpy as np
import pandas as pd
Series=pd.Series(data=[2,4,6,8,10,12,14])
print("index:", Series.index)
print("shape:", Series.shape)
print("dtype:",Series.dtype)
print("size:", Series.size)
print("empty:", Series.empty)
print("hasnans:", Series.hasnans)
print("nbytes:", Series.nbytes)
print("ndim:", Series.ndim)
index: RangeIndex(start=0, stop=7, step=1)
shape: (7,)
dtype: int64
size: 7
empty: False
hasnans: False
nbytes: 56
ndim: 1
#d) DataFrame as a generalized NumPy array
area dict = {'California': 423967, 'Texas': 695662, 'New York': 141297,
             'Florida': 170312, 'Illinois': 149995}
area = pd.Series(area dict)
area
California 423967
Texas
             695662
New York
             141297
Florida
              170312
Illinois
              149995
dtype: int64
states = pd.DataFrame({'population': population,
                       'area': area})
states
```

	population	area
California	38332521	423967
Texas	26448193	695662
New York	19651127	141297
Florida	19552860	170312

# population area 12882135 149995

#e) DataFrame as specialized dictionary

states['area']

Illinois

California 423967
Texas 695662
New York 141297
Florida 170312
Illinois 149995
Name: area, dtype: int64

#f) Constructing DataFrame objects:

#i. From a single Series object.

pd.DataFrame(population, columns=['population'])

	population
California	38332521
Texas	26448193
New York	19651127
Florida	19552860
Illinois	12882135

a b

0 0 0

1 1 2

**2** 2 4

 population
 area

 California
 38332521
 423967

 Texas
 26448193
 695662

 New York
 19651127
 141297

```
population
                    area
 Florida
          19552860
                  170312
  Illinois
          12882135
                 149995
#iv. From a two-dimensional NumPy array.
pd.DataFrame(np.random.rand(3, 2),
             columns=['foo', 'bar'],
             index=['a', 'b', 'c'])
      foo
              bar
          0.317771
  0.983789
          0.490791
  0.691952
c 0.851536
          0.421588
#v. From a NumPy structured array.
A = np.zeros(3, dtype=[('A', 'i8'), ('B', 'f8')])
print(A)
pd.DataFrame(A)
[(0, 0.) (0, 0.) (0, 0.)]
       В
  A
  0.0
   0.0
   0.0
ind = pd.Index([2, 3, 5, 7, 11])
#g) Index as immutable array
print(ind[1])
print(ind[::2])
ind[1] = 0
Int64Index([2, 5, 11], dtype='int64')
#h) Index as ordered set.
indA = pd.Index([1, 3, 5, 7, 9])
indB = pd.Index([2, 3, 5, 7, 11])
print("intersection:",indA & indB)
print(" union:",indA | indB)
print("symmetric difference",indA ^ indB )
intersection: Int64Index([3, 5, 7], dtype='int64')
union: Int64Index([1, 2, 3, 5, 7, 9, 11], dtype='int64')
symmetric difference Int64Index([1, 2, 9, 11], dtype='int64')
#i) Data Selection in Series:
```

```
import pandas as pd
#i. Series as dictionary
data = pd.Series([0.25, 0.5, 0.75, 1.0],
                 index=['a', 'b', 'c', 'd'])
data
    0.25
    0.50
b
    0.75
С
    1.00
dtype: float64
#ii. Series as one-dimensional array
# slicing by explicit index
data['a':'c']
     0.25
а
    0.50
     0.75
dtype: float64
#iii. Indexers: loc, iloc, and ix
data = pd.Series(['a', 'b', 'c'], index=[1, 3, 5])
data
     а
3 b
    С
dtype: object
# explicit index when indexing
print(data[1])
# implicit index when slicing
data[1:3]
3 b
dtype: object
#Loc
print(data.loc[1])
data.loc[1:3]
а
1
    а
dtype: object
#iloc
print(data.iloc[1])
data.iloc[1:3]
b
    b
```

```
5 c
dtype: object
#j) Data Selection in DataFrame
        #i. DataFrame as a dictionary
area = pd.Series({'California': 423967, 'Texas': 695662,
                   'New York': 141297, 'Florida': 170312,
                   'Illinois': 149995})
pop = pd.Series({'California': 38332521, 'Texas': 26448193,
                  'New York': 19651127, 'Florida': 19552860,
                  'Illinois': 12882135})
data = pd.DataFrame({'area':area, 'pop':pop})
data
           area
                   pop
California 423967
               38332521
   Texas 695662 26448193
New York 141297 19651127
 Florida 170312 19552860
  Illinois 149995 12882135
#ii. DataFrame as two-dimensional array
import numpy as np
import pandas as pd
df = pd.DataFrame({'color': ['red', 'blue', 'black'] * 2,
                    'vehicle': ['car', 'truck'] * 3,
                    'value': np.arange(1,7)})
df
   color vehicle value
0
  red
            car
                    1
1
   blue
           truck
                    2
2 black
            car
                    3
3
   red
           truck
                    4
   blue
            car
                    5
5 black
           truck
                    6
```

Aim: Write a Python program to perform the following:

- a) Input as CSV File
- b) Reading a CSV File
- c) Reading Specific Rows
- d) Reading Specific Columns
- e) Reading Specific Columns and Rows
- f) Reading Specific Columns for a Range of Rows
- g) Identify the missing data
- h) Identify the outlier data
- i) Replace with mean or mode
- j) Remove Blank Rows
- k) Data Categories
- I) Data types
- m) Analyze the data
- n) Visualize the data
- o) Find correlation among all attributes

#### **Solution:**

5

smith79

1	booker12	9012	Rachel	Booker
2	grey07	2070	Laura	Grey
3	johnson81	4081	Craig	Johnson
4	jenkins46	9346	Mary	Jenkins

5079

Jamie

Username Identifier Firstname Lastname

Smith

```
#Reading a CSV File
import pandas as pd
df = pd.read csv('Z:\data.csv')
print(df.to string())
  Username Identifier First name Last name
Ω
  booker12
              9012 Rachel Booker
   grey07
                  2070
                           Laura
1
2 johnson81
                  4081
                           Craig Johnson
3 jenkins46
                  9346
                             Mary Jenkins
                   5079 Jamie
    smith79
                                     Smith
#Reading Specific Rows
import csv
with open('Z:\data.csv') as csv file:
    csv reader = csv.reader(csv file)
   rows = list(csv reader)
   print(rows[3])
   print(rows[2])
['johnson81', '4081', 'Craig', 'Johnson']
['grey07', '2070', 'Laura', 'Grey']
#Reading Specific Cols
import csv
with open('Z:\data.csv') as csv file:
   csv reader = csv.reader(csv file)
    cols = list(csv reader)
   print(cols[1])
   print(cols[2])
['booker12', '9012', 'Rachel', 'Booker']
['grey07', '2070', 'Laura', 'Grey']
#Reading Specific Rows and cols
import csv
with open('Z:\data.csv') as csv file:
   csv reader = csv.reader(csv file)
   rows = list(csv reader)
   print(rows[3])
   print(rows[2])
   print(cols[1])
   print(cols[2])
['johnson81', '4081', 'Craig', 'Johnson']
['grey07', '2070', 'Laura', 'Grey']
#Reading Specific Columns for a Range of Rows
import pandas as pd
data = pd.read csv('Z:\data.csv')
print (data.loc[2:6])
```

```
Username Identifier First name Last name
2 johnson81
              4081 Craig Johnson
                          Mary Jenkins
                  9346
3 jenkins46
    smith79
                  5079
                            Jamie
#Identify the missing data
import pandas as pd
df = pd.read csv('Z:\data.csv')
df.isnull()
  Username; Identifier; First name; Last name
0
                                  False
                                  False
1
2
                                  False
3
                                  False
                                  False
#h) Identify the outlier data
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
# Reading the data
df = pd.read csv('Z:\data.csv')
print(df.shape)
print(df.info())
Matplotlib is building the font cache; this may take a moment.
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 5 entries, 0 to 4
Data columns (total 4 columns):
# Column Non-Null Count Dtype
---
               _____
    Username 5 non-null object
    Identifier 5 non-null
1
                              int64
   First name 5 non-null
                               object
   Last name 5 non-null
                               object
dtypes: int64(1), object(3)
memory usage: 288.0+ bytes
None
df.describe()
                    Identifier
                    5.000000
   count
```

5917.600000

mean

#### **Identifier** 3170.552523 std 2070.000000 min 25% 4081.000000 50% 5079.000000 9012.000000 75% 9346.000000 max #Replace with mean or mode import csv df = pd.read csv('Z:\data.csv') df.dropna(inplace = True) print(df.to string()) Username Identifier First name Last name booker12 9012 Rachel Booker 2070 Laura 4081 Craig grey07 1 Grey 2 johnson81 Craig Johnson 3 jenkins46 9346 Mary Jenkins Smith smith79 5079 Jamie #j) Remove Blank Rows import pandas as pd df = pd.read csv('Z:\data.csv') new df = df.dropna() print(new df.to string()) Username Identifier First name Last name 9012 0 booker12 Rachel Booker 1 grey07 2070 Laura Grey 2 johnson81 4081 Craig Johnson 3 jenkins46 9346 Mary Jenkins smith79 5079 Jamie Smith # Data Categories #Data types import csv df = pd.read csv('Z:\data.csv') df.dtypes

Username

Identifier First name

Last name

dtype: object

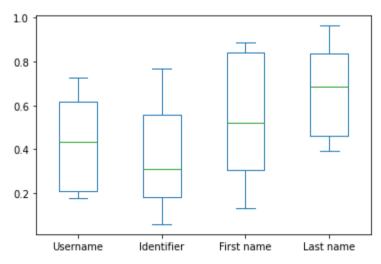
object int64

object

object

```
#Analyze the data
df.head()
```

	Username	Identifier	First name	Last name				
0	booker12	9012	Rachel	Booker				
1	grey07	2070	Laura	Grey				
2	johnson81	4081	Craig	Johnson				
3	jenkins46	9346	Mary	Jenkins				
4	smith79	5079	Jamie	Smith				
<pre>#Find correlation among all attributes import csv df = pd.read_csv('Z:\data.csv') print(df.corr())</pre>								
Id	entifier	Identii 1.0	fier					
im df 'I	<pre>import pandas as pd import numpy as np df = pd.DataFrame(np.random.rand(6, 4), columns=['Username', 'Identifier','First name','Last name']) df.plot.box()</pre>							



Aim: Write a python program to perform transformation of data using Discretization (Binning) and Normalization (MinMaxScaler or MaxAbsScaler) on given dataset.

#### **Solution:**

```
import numpy as np
import math
from sklearn.datasets import load iris
from sklearn import datasets, linear model, metrics
# load iris data set
dataset = load iris()
a = dataset.data
b = np.zeros(150)
# take 1st column among 4 column of data set
for i in range (150):
    b[i] = a[i, 1]
b=np.sort(b) #sort the array
# create bins
bin1=np.zeros((30,5))
bin2=np.zeros((30,5))
bin3=np.zeros((30,5))
# Bin mean
for i in range (0,150,5):
    k=int(i/5)
    mean=(b[i] + b[i+1] + b[i+2] + b[i+3] + b[i+4])/5
    for j in range (5):
        bin1[k,j]=mean
print("Bin Mean: \n",bin1)
# Bin boundaries
for i in range (0,150,5):
    k=int(i/5)
    for j in range (5):
        if (b[i+j]-b[i]) < (b[i+4]-b[i+j]):</pre>
            bin2[k,j]=b[i]
            bin2[k,j]=b[i+4]
print("Bin Boundaries: \n", bin2)
# Bin median
for i in range (0,150,5):
    k=int(i/5)
    for j in range (5):
        bin3[k,j]=b[i+2]
print("Bin Median: \n", bin3)
Bin Mean:
 [[2.18 2.18 2.18 2.18 2.18]
```

[2.34 2.34 2.34 2.34 2.34] [2.48 2.48 2.48 2.48 2.48] [2.52 2.52 2.52 2.52 2.52] [2.62 2.62 2.62 2.62 2.62] [2.7 2.7 2.7 2.7 ] [2.74 2.74 2.74 2.74 2.74] [2.8 2.8 2.8 2.8 2.8 ] [2.8 2.8 2.8 2.8 2.8 ] [2.86 2.86 2.86 2.86 2.86] [2.9 2.9 2.9 2.9 ] [2.96 2.96 2.96 2.96 2.96] [3. 3. 3. 3. 3. 1 ] [3. 3. 3. 3. 3. 3. 3. 3. 3. ] [3. 3. [3. 3. 3. 3. 1 [3.04 3.04 3.04 3.04 3.04] [3.1 3.1 3.1 3.1 ] [3.12 3.12 3.12 3.12 3.12] [3.2 3.2 3.2 3.2 ] [3.2 3.2 3.2 3.2 ] [3.26 3.26 3.26 3.26 3.26] [3.34 3.34 3.34 3.34 3.34] [3.4 3.4 3.4 3.4 ] [3.4 3.4 3.4 3.4 3.4 1 [3.5 3.5 3.5 3.5 3.5 1 [3.58 3.58 3.58 3.58 3.58] [3.74 3.74 3.74 3.74 3.74] [3.82 3.82 3.82 3.82 3.82] [4.12 4.12 4.12 4.12 4.12]] Bin Boundaries: [[2. 2.3 2.3 2.3 2.3] [2.3 2.3 2.3 2.4 2.4] [2.4 2.5 2.5 2.5 2.5] [2.5 2.5 2.5 2.5 2.6] [2.6 2.6 2.6 2.6 2.7] [2.7 2.7 2.7 2.7 2.7] [2.7 2.7 2.7 2.8 2.8] [2.8 2.8 2.8 2.8 2.8] [2.8 2.8 2.8 2.8 2.8] [2.8 2.8 2.9 2.9 2.9] [2.9 2.9 2.9 2.9 2.9] [2.9 2.9 3. 3. 3.] [3. 3. 3. 3. ] [3. 3. 3. 3. ] [3. 3. 3. 3. ] [3. 3. 3. 3. ] [3. 3. 3. 3.1 3.1] [3.1 3.1 3.1 3.1 3.1] [3.1 3.1 3.1 3.1 3.2] [3.2 3.2 3.2 3.2 3.2] [3.2 3.2 3.2 3.2 3.2] [3.2 3.2 3.3 3.3 3.3] [3.3 3.3 3.4 3.4] [3.4 3.4 3.4 3.4 3.4] [3.4 3.4 3.4 3.4 3.4] [3.5 3.5 3.5 3.5 3.5] [3.5 3.6 3.6 3.6 3.6]

```
[3.7 3.7 3.7 3.8 3.8]
 [3.8 3.8 3.8 3.8 3.9]
 [3.9 3.9 3.9 4.4 4.4]]
Bin Median:
 [[2.2 2.2 2.2 2.2 2.2]
 [2.3 2.3 2.3 2.3 2.3]
 [2.5 2.5 2.5 2.5 2.5]
 [2.5 2.5 2.5 2.5 2.5]
 [2.6 2.6 2.6 2.6 2.6]
 [2.7 2.7 2.7 2.7 2.7]
 [2.7 2.7 2.7 2.7 2.7]
 [2.8 2.8 2.8 2.8 2.8]
 [2.8 2.8 2.8 2.8 2.8]
 [2.9 2.9 2.9 2.9 2.9]
 [2.9 2.9 2.9 2.9 2.9]
[3. 3. 3. 3. ]
 [3. 3. 3. 3. ]
 [3. 3. 3. 3. ]
 [3. 3. 3. 3. ]
 [3. 3. 3. 3. ]
 [3. 3. 3. 3. ]
 [3.1 3.1 3.1 3.1 3.1]
 [3.1 3.1 3.1 3.1 3.1]
 [3.2 3.2 3.2 3.2 3.2]
 [3.2 3.2 3.2 3.2 3.2]
 [3.3 3.3 3.3 3.3]
 [3.3 3.3 3.3 3.3 3.3]
[3.4 3.4 3.4 3.4 3.4]
 [3.4 3.4 3.4 3.4 3.4]
 [3.5 3.5 3.5 3.5 3.5]
 [3.6 3.6 3.6 3.6 3.6]
 [3.7 3.7 3.7 3.7 3.7]
 [3.8 3.8 3.8 3.8 3.8]
[4.1 4.1 4.1 4.1 4.1]]
## Perform transformation of data using normalization (MinMaxScaler or
MaxAbsScaler) on given dataset.
from sklearn.preprocessing import MinMaxScaler
data = [[-1, 2], [-0.5, 6], [0, 10], [1, 18]]
scaler = MinMaxScaler()
print(scaler.fit(data))
MinMaxScaler()
print("data:\n", scaler.data max )
print("Transformed data:\n", scaler.transform(data))
MinMaxScaler()
data:
[ 1. 18.]
```

Transformed data: [[0. 0. ] [0.25 0.25] [0.5 0.5 ] [1. 1. ]]

Aim: Write a program to implement three frequent itemset mining using Apriori algorithms.

## **Solution:**

```
data = [
        ['T100',['I1','I2','I5']],
        ['T200',['I2','I4']],
        ['T300',['I2','I3']],
        ['T400',['I1','I2','I4']],
        ['T500',['I1','I3']],
        ['T600', ['I2', 'I3']],
        ['T700',['I1','I3']],
        ['T800',['I1','I2','I3','I5']],
        ['T900',['I1','I2','I3']]
        ]
init = []
for i in data:
    for q in i[1]:
        if(q not in init):
            init.append(q)
init = sorted(init)
print(init)
sp = 0.4
s = int(sp*len(init))
from collections import Counter
c = Counter()
for i in init:
    for d in data:
        if(i in d[1]):
            c[i]+=1
print("C1:")
for i in c:
    print(str([i])+": "+str(c[i]))
1 = Counter()
for i in c:
    if(c[i] >= s):
        l[frozenset([i])]+=c[i]
print("L1:")
for i in 1:
    print(str(list(i))+": "+str(l[i]))
print()
pl = 1
pos = 1
for count in range (2,1000):
    nc = set()
    temp = list(1)
    for i in range(0,len(temp)):
```

```
for j in range(i+1,len(temp)):
            t = temp[i].union(temp[j])
            if(len(t) == count):
                nc.add(temp[i].union(temp[j]))
    nc = list(nc)
    c = Counter()
    for i in nc:
        c[i] = 0
        for q in data:
            temp = set(q[1])
            if(i.issubset(temp)):
               c[i]+=1
    print("C"+str(count)+":")
    for i in c:
        print(str(list(i))+": "+str(c[i]))
    print()
    1 = Counter()
    for i in c:
        if(c[i] >= s):
            l[i]+=c[i]
    print("L"+str(count)+":")
    for i in 1:
        print(str(list(i))+": "+str(l[i]))
    print()
    if(len(1) == 0):
       break
    pl = 1
    pos = count
print("Result: ")
print("L"+str(pos)+":")
for i in pl:
    print(str(list(i))+": "+str(pl[i]))
print()
from itertools import combinations
for 1 in pl:
    c = [frozenset(q) for q in combinations(l,len(l)-1)]
    mmax = 0
    for a in c:
        b = 1-a
        ab = 1
        sab = 0
        sa = 0
        sb = 0
        for q in data:
            temp = set(q[1])
            if(a.issubset(temp)):
                sa+=1
            if(b.issubset(temp)):
                sb+=1
            if(ab.issubset(temp)):
                sab+=1
        temp = sab/sa*100
        if(temp > mmax):
            mmax = temp
        temp = sab/sb*100
        if(temp > mmax):
```

```
mmax = temp
        print(str(list(a))+" -> "+str(list(b))+" = "+str(sab/sa*100)+"%")
        print(str(list(b))+" -> "+str(list(a))+" = "+str(sab/sb*100)+"%")
    curr = 1
    print("choosing:", end=' ')
    for a in c:
        b = 1-a
        ab = 1
        sab = 0
        sa = 0
        sb = 0
        for q in data:
            temp = set(q[1])
            if(a.issubset(temp)):
                sa+=1
            if(b.issubset(temp)):
                sb+=1
            if(ab.issubset(temp)):
                sab+=1
        temp = sab/sa*100
        if(temp == mmax):
            print(curr, end = ' ')
        curr += 1
        temp = sab/sb*100
        if(temp == mmax):
            print(curr, end = ' ')
        curr += 1
    print()
['I1', 'I2', 'I3', 'I4', 'I5']
C1:
['I1']: 6
['I2']: 7
['I3']: 6
['I4']: 2
['I5']: 2
L1:
['I1']: 6
['I2']: 7
['I3']: 6
['I4']: 2
['I5']: 2
C2:
['I2', 'I4']: 2
['I1', 'I4']: 1
['I1', 'I5']: 2
['I5', 'I2']: 2
['I3', 'I4']: 0
['I5', 'I3']: 1
['I5', 'I4']: 0
['I3', 'I2']: 4
['I1', 'I2']: 4
['I1', 'I3']: 4
L2:
['I2', 'I4']: 2
```

```
['I1', 'I5']: 2
['I5', 'I2']: 2
['I3', 'I2']: 4
['I1', 'I2']: 4
['I1', 'I3']: 4
C3:
['I5', 'I2', 'I4']: 0
['I1', 'I3', 'I2']: 2
['I1', 'I5', 'I2']: 2
['13', '12', '14']: 0
['I1', 'I3', 'I5']: 1
['I5', 'I3', 'I2']: 1
['I1', 'I2', 'I4']: 1
L3:
['I1', 'I3', 'I2']: 2
['I1', 'I5', 'I2']: 2
['I5', 'I3', 'I2', 'I1']: 1
L4:
Result:
L3:
['I1', 'I3', 'I2']: 2
['I1', 'I5', 'I2']: 2
['I1', 'I3'] -> ['I2'] = 50.0%
['I2'] -> ['I1', 'I3'] = 28.57142857142857%
['I1', 'I2'] -> ['I3'] = 50.0%
['I3', 'I2'] -> ['I1'] = 50.0%
['I1'] -> ['I3', 'I2'] = 33.3333333333333333333
choosing: 1 3 5
['I1', 'I5'] -> ['I2'] = 100.0%
['I2'] -> ['I1', 'I5'] = 28.57142857142857%
['I1', 'I2'] -> ['I5'] = 50.0%
['I5'] -> ['I1', 'I2'] = 100.0%
['I5', 'I2'] -> ['I1'] = 100.0%
choosing: 1 4 5
```

Aim: Write a program to implement Decision tree algorithm.

# **Solution:**

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns

from sklearn.preprocessing import LabelEncoder#for train test splitting
from sklearn.model_selection import train_test_split#for decision tree
object
from sklearn.tree import DecisionTreeClassifier#for checking testing results
from sklearn.metrics import classification_report, confusion_matrix#for
visualizing tree
from sklearn.tree import plot_tree

#reading the data
df = sns.load_dataset('iris')
df.head()
```

	sepal_length	sepal_width	petal_length	petal_width	species
0	5.1	3.5	1.4	0.2	setosa
1	4.9	3.0	1.4	0.2	setosa
2	4.7	3.2	1.3	0.2	setosa
3	4.6	3.1	1.5	0.2	setosa
4	5.0	3.6	1.4	0.2	setosa

```
#getting information of dataset
df.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 150 entries, 0 to 149
Data columns (total 5 columns):

#	Column	Non-Null Count	Dtype					
0	sepal_length	150 non-null	float64					
1	sepal_width	150 non-null	float64					
2	petal_length	150 non-null	float64					
3	petal_width	150 non-null	float64					
4	species	150 non-null	object					
<pre>dtypes: float64(4), object(1)</pre>								

memory usage: 6.0+ KB

```
df.shape
```

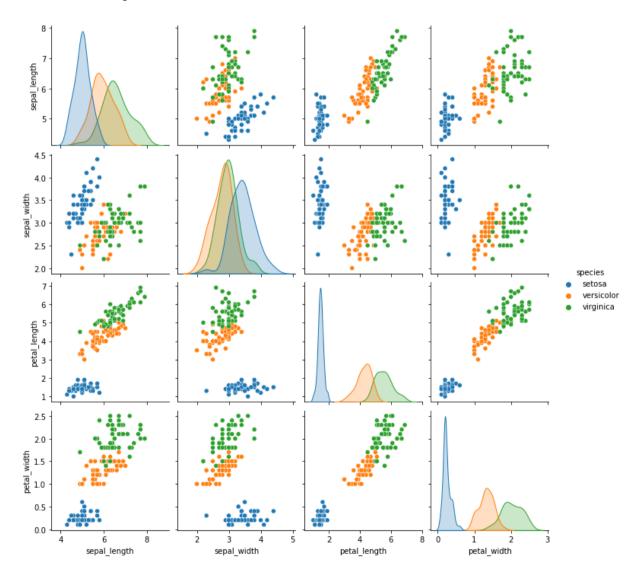
(150, 5)

df.isnull().any()

sepal\_length False
sepal\_width False
petal\_length False
petal\_width False
species False
dtype: bool

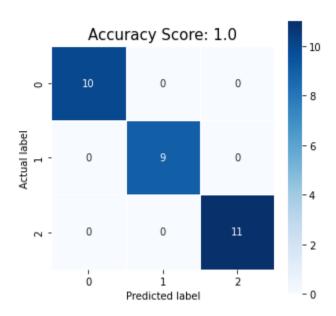
# let's plot pair plot to visualise the attributes all at once
sns.pairplot(data=df, hue = 'species')

<seaborn.axisgrid.PairGrid at 0x1966ff22a60>



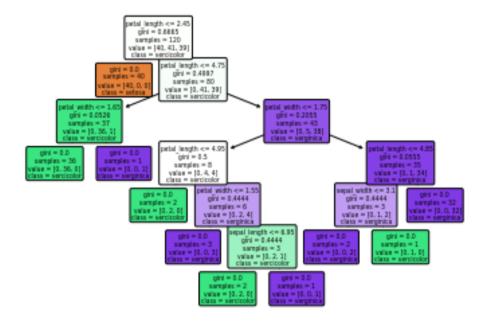
```
# correlation matrix
sns.heatmap(df.corr())
<AxesSubplot:>
                                         -1.0
 sepal_length -
                                         - 0.8
                                         - 0.6
 sepal width
                                          0.4
                                         - 0.2
 petal length
                                          0.0
                                          -0.2
 petal_width
                                          -0.4
         sepal length sepal width petal length petal width
target = df['species']
df1 = df.copy()
df1 = df1.drop('species', axis =1)
# Defining the attributes
X = df1
target
0
        setosa
1
         setosa
2
         setosa
3
         setosa
        setosa
145
      virginica
146
      virginica
147
      virginica
148
      virginica
149
      virginica
Name: species, Length: 150, dtype: object
#label encoding
le = LabelEncoder()
target = le.fit transform(target)
target
```

```
y = target
# Splitting the data - 80:20 ratio
X train, X test, y train, y test = train test split(X , y, test size = 0.2,
random state = 42)
print("Trainingsplit input- ", X train.shape)
print("Testing split input- ", X test.shape)
Trainingsplit input- (120, 4)
Testing split input- (30, 4)
# Defining the decision tree algorithm
dtree=DecisionTreeClassifier()
dtree.fit(X train, y train)
print('Decision Tree Classifier Created')
Decision Tree Classifier Created
# Predicting the values of test data
y pred = dtree.predict(X test)
print("Classification report - \n", classification report(y test,y pred))
Classification report -
              precision recall fl-score support
           0
                  1.00
                           1.00
                                     1.00
                                                  10
          1
                  1.00
                           1.00
                                     1.00
                                                  9
                  1.00
                           1.00
                                     1.00
                                                  11
                                      1.00
                                                  30
   accuracy
  macro avg
                 1.00
                           1.00
                                      1.00
                                                  30
                  1.00
                            1.00
                                      1.00
                                                  30
weighted avg
cm = confusion matrix(y test, y pred)
plt.figure(figsize=(5,5))
sns.heatmap(data=cm,linewidths=.5, annot=True, square = True, cmap ='Blues')
plt.ylabel('Actual label')
plt.xlabel('Predicted label')
all_sample_title = 'Accuracy Score: {0}'.format(dtree.score(X test, y test))
plt.title(all sample title, size = 15)
Text(0.5, 1.0, 'Accuracy Score: 1.0')
```



# Visualising the graph without the use of graphvizplt.figure(figsize =
(20,20))

dec\_tree = plot\_tree(decision\_tree=dtree, feature\_names = df1.columns,
 class\_names =["setosa", "vercicolor", "verginica"] , filled = True ,
 precision = 4,
 rounded = True)



Aim: Write a program to implement Naïve Bayesian Classification.

### **Solution:**

```
dataset = [
           [0,0,1,0,0],
           [0,0,1,1,0],
           [1,0,1,0,1],
           [2,1,1,0,1],
           [2,2,0,0,1],
           [2,2,0,1,0],
           [1,2,0,1,1],
           [0,1,1,0,0],
           [0,2,0,0,1],
           [2,1,0,0,1],
           [0,1,0,1,1],
           [1,1,1,1,1],
           [1,0,0,0,1],
           [2,1,1,1,0]
mp = dict()
for i in range(len(dataset)):
    row = dataset[i]
    y = row[-1]
    if (y not in mp):
        mp[y] = list()
    mp[y].append(row)
for label in mp:
    print(label)
    for row in mp[label]:
        print(row)
test = [2,1,0,1]
probYes = 1
count = 0
total = 0
for row in dataset:
    if(row[-1] == 1):
        count+=1
    total+=1
print("Total yes: "+str(count)+" / "+str(total))
probYes *= count/total
for i in range(len(test)):
    count = 0
    total = 0
    for row in mp[1]:
        if(test[i] == row[i]):
            count += 1
        total += 1
```

```
print('for feature '+str(i+1))
    print(str(count)+" / "+str(total))
    probYes *= count/total
probNo = 1
count = 0
total = 0
for row in dataset:
    if(row[-1] == 0):
        count+=1
    total+=1
probNo *= count/total
print("Total no: "+str(count)+" / "+str(total))
for i in range(len(test)):
    count = 0
    total = 0
    for row in mp[0]:
        if(test[i] == row[i]):
            count += 1
        total += 1
    print('for feature '+str(i+1))
    print(str(count)+" / "+str(total))
    probNo *= count/total
print("probability of playing golf YES: "+str(probYes))
print("probability of playing golf NO:"+str(probNo))
prob = probYes/(probYes+probNo)
print("Probability of playing golf: "+str(prob*100)+"%")
0
[0, 0, 1, 0, 0]
[0, 0, 1, 1, 0]
[2, 2, 0, 1, 0]
[0, 1, 1, 0, 0]
[2, 1, 1, 1, 0]
1
[1, 0, 1, 0, 1]
[2, 1, 1, 0, 1]
[2, 2, 0, 0, 1]
[1, 2, 0, 1, 1]
[0, 2, 0, 0, 1]
[2, 1, 0, 0, 1]
[0, 1, 0, 1, 1]
[1, 1, 1, 1, 1]
[1, 0, 0, 0, 1]
Total yes: 9 / 14
for feature 1
3 / 9
for feature 2
4 / 9
for feature 3
6 / 9
for feature 4
3 / 9
Total no: 5 / 14
for feature 1
```

```
2 / 5
for feature 2
2 / 5
for feature 3
1 / 5
for feature 4
3 / 5
probability of playing golf YES: 0.021164021164021163
probability of playing golf NO:0.006857142857142859
Probability of playing golf: 75.5287009063444%
```

**Aim:** Write a program to implement k-means clustering algorithm

## **Solution:**

```
data = [
         [5,2],
         [2,4],
         [9,5],
         [4,6],
         [5,2],
         [1,5],
         [6,7],
         [4,2],
         [6,4],
         [9,2],
         [4,5],
         [1,6],
         [4,7],
         [3,6],
         [1,1],
         [8,4],
         [8,7],
         [7,2],
         [2,2],
         [2,1],
         [1,2],
         [1,4],
         [2,6],
         [7,7],
         [7,4],
         [3,4],
         [1,4]
         1
x = [i[0] \text{ for } i \text{ in } data]
y = [i[1] \text{ for } i \text{ in } data]
import matplotlib.pyplot as plt
plt.scatter(x,y)
plt.show()
import math
def dist(center, point):
    d = 0.0
    for i in range(0,len(point)):
         d += (center[i]-point[i])**2
    return math.sqrt(d)
def assignCenters(centers, dataset):
```

```
clusters = []
    for i in range(len(dataset)):
        distances = []
        for center in centers:
            distances.append(dist(center, dataset[i]))
        temp = [z for z, val in enumerate(distances) if val==min(distances)]
        clusters.append(temp[0])
    return clusters
def mean center(k, dataset, clusters):
    nCenters = []
    for i in range(k):
        x = 0.0
        y = 0.0
        count = 0
        for j in range(len(clusters)):
            if(i == clusters[j]):
                x += dataset[j][0]
                y += dataset[j][1]
                count += 1
        x = x/count
        y = y/count
        nCenters.append([x,y])
    return nCenters
print("enter k")
k = int(input())
centers = []
for i in range(k):
    print("enter center "+str(i))
    temp = [int(x) for x in input().split()]
    centers.append(temp)
print("Initial centers: ")
print(centers)
print("Initial clusters: ")
clusters = assignCenters(centers, data)
for i in range(k):
    print("cluster "+str(i))
    for j in range(len(clusters)):
        if(i == clusters[j]):
            print(data[j],end=' ')
    print()
print()
for itr in range(10):
    print("Iteration "+str(itr))
    centers = mean center(k,data,clusters)
    print("Updated centers: ")
    print(centers)
    clusters = assignCenters(centers, data)
    print("Updated clusters: ")
    for i in range(k):
        print("cluster "+str(i))
        for j in range(len(clusters)):
            if(i == clusters[j]):
                print(data[j],end=' ')
        print()
```

```
print()
```

```
7 -
 6
 5
 4
 3 ·
 2 -
 1 -
                3
                           5
                                6
enter k
enter center 0
6 4
enter center 1
9 4
Initial centers:
[[6, 4], [9, 4]]
Initial clusters:
```

Iteration 0

cluster 0

[1, 4] cluster 1

Updated centers:

[9, 5] [9, 2] [8, 4] [8, 7]

[[3.4347826086956523, 4.043478260869565], [8.5, 4.5]]

Updated clusters:

cluster 0

[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1] [2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]

[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [6, 7] [4, 2] [6, 4] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1] [7, 2] [2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [7, 7] [7, 4] [3, 4]

cluster 1

[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]

Iteration 1

Updated centers:

4.66666666666667]]

Updated clusters:

cluster 0

[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1] [2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4] cluster 1

[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]

Iteration 2

Updated centers:

```
[[2.555555555555554, 3.833333333333], [7.444444444444445,
4.6666666666666711
Updated clusters:
cluster 0
[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1]
[2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]
[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]
Iteration 3
Updated centers:
[[2.555555555555554, 3.8333333333333], [7.444444444444445,
4.66666666666667]]
Updated clusters:
cluster 0
[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1]
[2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]
[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]
Iteration 4
Updated centers:
[[2.555555555555554, 3.8333333333333], [7.444444444444445,
4.6666666666666711
Updated clusters:
cluster 0
[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1]
[2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]
[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]
Iteration 5
Updated centers:
[[2.555555555555554, 3.8333333333333], [7.444444444444445,
4.66666666666667]]
Updated clusters:
cluster 0
[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1]
[2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]
[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]
Iteration 6
Updated centers:
[[2.555555555555554, 3.8333333333333], [7.444444444444445,
4.66666666666667]]
Updated clusters:
cluster 0
[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1]
[2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]
[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]
Iteration 7
Updated centers:
[[2.555555555555554, 3.8333333333333], [7.444444444444445,
```

4.6666666666666711

```
Updated clusters:
cluster 0
[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1]
[2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]
cluster 1
[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]
Iteration 8
Updated centers:
[[2.555555555555554, 3.8333333333333], [7.444444444444445,
4.66666666666667]]
Updated clusters:
cluster 0
[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1]
[2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]
[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]
Iteration 9
Updated centers:
[[2.555555555555554, 3.8333333333333], [7.444444444444445,
4.66666666666667]]
Updated clusters:
cluster 0
[5, 2] [2, 4] [4, 6] [5, 2] [1, 5] [4, 2] [4, 5] [1, 6] [4, 7] [3, 6] [1, 1]
[2, 2] [2, 1] [1, 2] [1, 4] [2, 6] [3, 4] [1, 4]
[9, 5] [6, 7] [6, 4] [9, 2] [8, 4] [8, 7] [7, 2] [7, 7] [7, 4]
```

Aim: Study and configure Hadoop for big data.

Step 1 — Installing Java

To get started, we'll update our package list:

• sudo apt-get update

Next, we'll install OpenJDK, the default Java Development Kit on Ubuntu 16.04.

• sudo apt-get install default-jdk

Once the installation is complete, let's check the version.

• java -version

Step 2 — Installing Hadoop

On the server, we'll use wget to fetch it:

• wget http://apache.mirrors.tds.net/hadoop/common/hadoop-2.7.3/hadoop-2.7.3.tar.gz

Again, we'll right-click to copy the file location, then use wget to transfer the file:

• wget https://dist.apache.org/repos/dist/release/hadoop/common/hadoop-2.7.3/hadoop-2.7.3.tar.gz.mds

Then run the verification:

• shasum -a 256 hadoop-2.7.3.tar.gz

Compare this value with the SHA-256 value in the .mds file:

- cat hadoop-2.7.3.tar.gz.mds
- tar -xzvf hadoop-2.7.3.tar.gz

Finally, we'll move the extracted files into /usr/local, the appropriate place for locally installed software. Change the version number, if needed, to match the version you downloaded.

• sudo mv hadoop-2.7.3 /usr/local/hadoop

With the software in place, we're ready to configure its environment.

# Step 3 — Configuring Hadoop's Java Home

To find the default Java path

• readlink -f /usr/bin/java | sed "s:bin/java::"

To begin, open hadoop-env.sh:

• sudo nano /usr/local/hadoop/etc/hadoop/hadoop-env.sh

Then, choose one of the following options:

Option 1: Set a Static Value

```
#export JAVA_HOME=$\{JAVA_HOME\}
export JAVA_HOME=\usr\lib\jvm\java-8-openjdk-amd64\jre\
```

Option 2: Use Readlink to Set the Value Dynamically

```
#export JAVA_HOME=${JAVA_HOME}
export JAVA_HOME=$(readlink -f /usr/bin/java | sed "s:bin/java::")
```

Step 4 — Running Hadoop

Now we should be able to run Hadoop:

- \$ /usr/local/hadoop/bin/hadoop
- \$ mkdir ~/input
- \$ cp /usr/local/hadoop/etc/hadoop/\*.xml ~/input

### **Aim: Hadoop commands**

Using the command line interface

In this part, we will explore some basic HDFS commands. All HDFS commands start with *hadoop* followed by *dfs* (distributed file system) or *fs* (file system) followed by a dash, and the command. Many HDFS commands are similar to UNIX commands. For details, refer to the *Hadoop Command Guide* and *Hadoop FS Shell Guide*.

We will start with the **hadoop fs** –**ls** command which returns the list of files and directories with permission information.

Ensure the Hadoop components are all started, and from the same Gnome terminal window as before (and logged on as *biadmin*), follow these instructions:

## 1. List the contents of the root directory

### hadoop fs -ls /

```
biadmin@imtebil ....bm/biginsights/bin
File Edit View Terminal Help
biadmin@imtebil:/opt/ibm/biginsights/bin> hadoop fs -ls /
Found 5 items
            - biadmin biadmgrp
drwxr-xr-x
                                           0 2013-06-19 22:56 /biginsights
drwxr-xr-x - biadmin supergroup
                                           0 2013-07-09 13:48 /hadoop
            - biadmin supergroup
                                           0 2013-07-09 13:50 /hbase
drwxr-xr-x
                                           0 2013-06-19 22:45 /tmp
drwxrwxrwx

    biadmin supergroup

             - biadmin supergroup
                                           0 2013-07-09 13:33 /user
drwxrwxrwx
biadmin@imtebil:/opt/ibm/biginsights/bin>
```

### 2. To list the contents of the /user/biadmin directory, execute:

### hadoop fs -ls

(or)

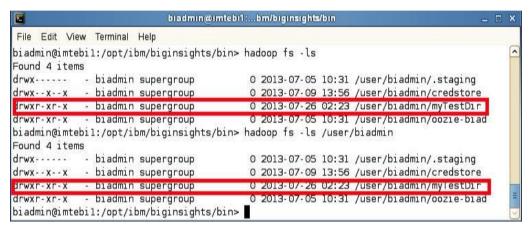
## hadoop fs -ls /user/biadmin

```
biadmin@imtebil:...bm/biginsights/bin
 File Edit
         View Terminal Help
biadmin@imtebil:/opt/ibm/biginsights/bin> hadoop fs -ls /
Found 5 items
drwxr-xr-x - biadmin biadmgrp
                                           0 2013-07-09 13:52 /biginsights
            - biadmin supergroup
drwxr-xr-x
                                           0 2013-07-11 11:04 /hadoop
drwxr-xr-x
            - biadmin supergroup
                                           0 2013-07-11 11:06 /hbase
drwxrwxrwx
            - biadmin supergroup
                                           0 2013-06-19 22:45 /tmp
drwxrwxrwx
             - biadmin supergroup
                                           0 2013-07-09 16:47 /user
biadmin@imtebil:/opt/ibm/biginsights/bin> hadoop fs -ls
Found 3 items
drwx-----
            - biadmin supergroup
                                           0 2013-07-05 10:31 /user/biadmin/.staging
drwx--x--x
            - biadmin supergroup
                                           0 2013-07-09 13:56 /user/biadmin/credstore
             - biadmin supergroup
                                           0 2013-07-05 10:31 /user/biadmin/oozie-biad
drwxr-xr-x
biadmin@imtebil:/opt/ibm/biginsights/bin>
```

# 3. To create the directory *myTestDir* you can issue the following command: hadoop fs -mkdir myTestDir

Where was this directory created? As mentioned in the previous step, any relative paths will be using the user's home directory.

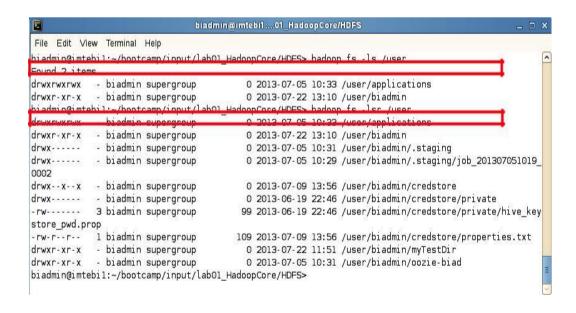
4. Issue the ls command again to see the subdirectory myTestDir: hadoop fs -ls (or ) hadoop fs -ls /user/biadmin



To use HDFS commands recursively generally you add an "r" to the HDFS command (In the Linux shell this is generally done with the "-R" argument).

5. For example, to do a recursive listing we'll use the –lsr command rather than just –ls, like the examples below:

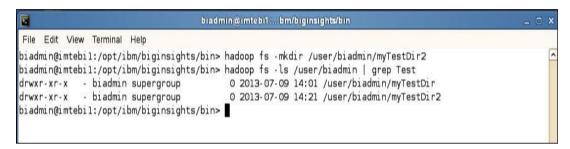
hadoop fs -ls /user hadoop fs -lsr /user



6. You can pipe (using the | character) any HDFS command to be used with the Linux shell. For example, you can easily use *grep* with HDFS by doing the following:

hadoop fs -mkdir /user/biadmin/myTestDir2

hadoop fs -ls /user/biadmin | grep Test



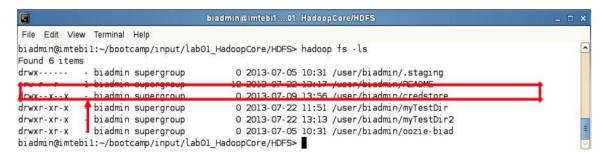
As you can see the grep command only returned the lines which had test in them (thus removing the "Found x items" line and the .staging and oozie-biad directories from the listing

7. To move files between your regular Linux filesystem and HDFS you can use the put and get commands. For example, move the text file README to the hadoop filesystem.

hadoop fs -put /home/biadmin/bootcamp/input/lab01\_HadoopCore/HDFS/README

#### README

hadoop fs -ls /user/biadmin



You should now see a new file called /user/biadmin/README listed as shown above. Note there is a '1' highlighted in the figure. This represents the replication factor. By default, the replication factor in a BigInsights cluster is 3, but since this laboratory environment only has one node, the replication factor is 1.

8. In order to view the contents of this file use the –cat command as follows: hadoop fs -cat README

You should see the output of the README file (that is stored in HDFS). We can also use the linux diff command to see if the file we put on HDFS is actually the same as the original on the local filesystem.

9. Execute the commands below to use the diff command:

cd /home/biadmin/bootcamp/input/lab01\_HadoopCore/HDFS/diff <( hadoop fs -cat README ) README

Since the diff command produces no output we know that the files are the same (the diff command prints all the lines in the files that differ).

To find the size of files you need to use the –du or –dus commands. Keep in mind that these commands return the file size in bytes.

10. To find the size of the README file use the following command:

hadoop fs -du README

11. To find the size of all files individually in the /user/biadmin directory use the following command:

hadoop fs -du /user/biadmin



12. To find the size of all files in total of the /user/biadmin directory use the following command:

hadoop fs -dus /user/biadmin

13. If you would like to get more information about hadoop fs commands, invoke – help as follows:

hadoop fs -help

14. For specific help on a command, add the command name after help. For example, to get help on the dus command you'd do the following:

hadoop fs -help dus

# Aim: Run a basic Word Count Map Reduce program to understand Map Reduce Paradigm

Now that we've seen how the FileSystem (fs) shell can be used to execute Hadoop commands to interact with HDFS, the same fs shell can be used to launch MapReduce jobs. In this section, we will walk through the steps required to run a MapReduce program. The source code for a MapReduce program is contained in a compiled .jar file. Hadoop will load the JAR into HDFS and distribute it to the data nodes, where the individual tasks of the MapReduce job will be executed. Hadoop ships with some example MapReduce programs to run. One of these is a distributed WordCount program which reads text files and counts how often words occur.

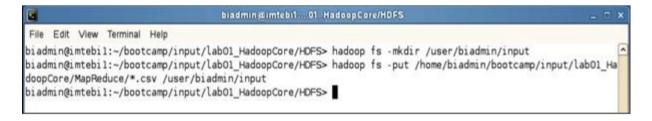
## **Running the WordCount program**

First we need to copy the data files from the local file system to HDFS.

Step 1: Execute the commands below to copy the input files into HDFS.

## hadoop fs -mkdir /user/biadmin/input

# hadoop fs -put /home/biadmin/bootcamp/input/lab01\_HadoopCore/MapReduce/\*.csv /user/biadmin/input



## Copy input files into HDFS

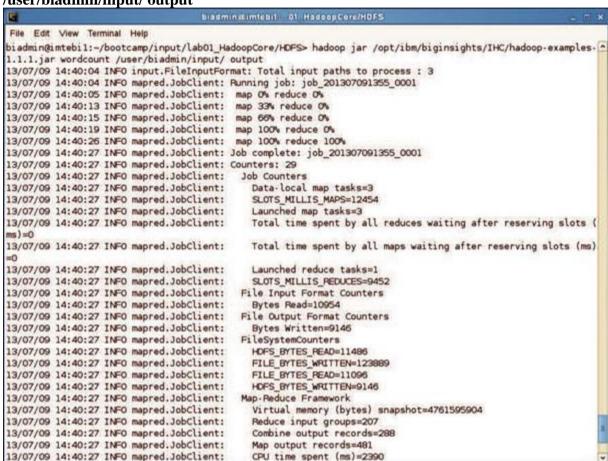
Step 2: Review the files have been copied with the following command:

## hadoop fs -ls input



Step 3: Now we can run the wordcount job with the command below, where "/user/biadmin/input/" is where the input files are, and "output" is the directory where the output of the job will be stored. The "output" directory will be created automatically when executing the command below.

hadoop jar /opt/ibm/biginsights/IHC/hadoop-examples-1.1.1.jar wordcount /user/biadmin/input/ output



# WordCount MapReduce job running

Step 4: Now review the output of step 3: In this case, the output was not split into multiple files.

### hadoop fs -ls output



MapReduce result files

Step 5: To view the contents of the part-r-0000 file issue the command below:

# hadoop fs -cat output/\*00

```
File Edit View Terminal Help biadmin(mintebil 01 HatoopCore/HOPS> hadoop fs -cat output/*00

- 4
- 4
- 5
- 1
- (152456, 1520445, 1553218, 1542203, 1571660, 1557793, 1567143, 1562846, 1581388, 1570812, 1515700, 1462185, 1394690, 13
- (157, 1293244, 1269790, 1224836, 1224836, 1226113, 1255941, 1263595, 1270366, 1267922, 1254308 1
- (157, 1293244, 1269790, 1224836, 1270366, 1267922, 1254308 1
- (157, 1293244, 1269790, 1224836, 1270366, 1267922, 1254308 1
- (157, 1293244, 1269790, 1224836, 1270366, 1267922, 1254308 1
- (157, 1293244, 1269790, 1224836, 1270366, 1267922, 1254308 1
- (157, 1293244, 1269790, 1224836, 1270366, 1267922, 1254308 1
- (157, 129324, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 12642, 126422, 126422, 126422, 126422, 126422, 126422, 126422, 126422, 126422, 126422, 126
```

MapReduce output

Aim: Implement Matrix Multiplication with Hadoop Map Reduce

```
public class MatrixMultiply {
    public static void main(String[] args) throws Exception {
         if (args.length != 2) {
             System.err.println("Usage: MatrixMultiply <in_dir> <out_dir>");
             System.exit(2);
        Configuration conf = new Configuration();
        // M is an m-by-n matrix; N is an n-by-p matrix.
conf.set("m", "1000");
conf.set("p", "1000");
        @SuppressWarnings("deprecation")
        Job job = new Job(conf, "MatrixMultiply");
job.setJarByClass(MatrixMultiply.class);
        job.setOutputKeyClass(Text.class);
        job.setOutputValueClass(Text.class);
        job.setMapperClass(Map.class);
        job.setReducerClass(Reduce.class);
        job.setInputFormatClass(TextInputFormat.class);
        job.setOutputFormatClass(TextOutputFormat.class);
        FileInputFormat.addInputPath(job, new Path(args[0]));
        FileOutputFormat.setOutputPath(job, new Path(args[1]));
        job.waitForCompletion(true);
```