



# **SIES (NERUL) COLLEGE OF ARTS, SCIENCE AND COMMERCE**

NAAC ACCREDITED 'A' GRADE COLLEGE

(ISO 9001:2015 CERTIFIED INSTITUTION)

NERUL, NAVI MUMBAI - 400706

## *Certificate*

Seat No: 3713538

Certified that VARMA VISHAL VIJAY

Of Class MSC.IT PART-1 has duly completed the practical

course in the subject of RESEARCH IN COMPUTING

during the academic year 2021-22 as per the syllabus

prescribed by the University of Mumbai.

Subject Teacher

External Examiner

Head of Department

Principal

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Sr. No.	Practical	Date	Sign
1	A. Write a program for obtaining on descriptive statistics of data. B. Import data from different data sources (from Excel, csv, mysql, sql server, oracle to R/Python/Excel)		
2	A. Design a survey form for a given case study, collect the primary data and analyse it B. Perform suitable analysis of given secondary data.		
3	A. Perform testing of hypothesis using one sample t-test. B. Perform testing of hypothesis using two sample t-test. C. Perform testing of hypothesis using paired t-test.		
4	A. Perform testing of hypothesis using chi-squared goodness-of-fit test. B. Perform testing of hypothesis using chi-squared Test of Independence		
5	Perform testing of hypothesis using Z-test.		
6	A. Perform testing of hypothesis using one-way ANOVA. B. Perform testing of hypothesis using two-way ANOVA. C. Perform testing of hypothesis using multivariate ANOVA (MANOVA).		
7	A. Perform the Random sampling for the given data and analyse it. B. Perform the Stratified sampling for the given data and analyse it.		
8	Compute different types of correlation.		
9	A. Perform linear regression for prediction. B. Perform polynomial regression for prediction.		
10	A. Perform multiple linear regression. B. Perform Logistic regression.		

## Practical No 1

### A. Write a program for obtaining descriptive statistics of data.

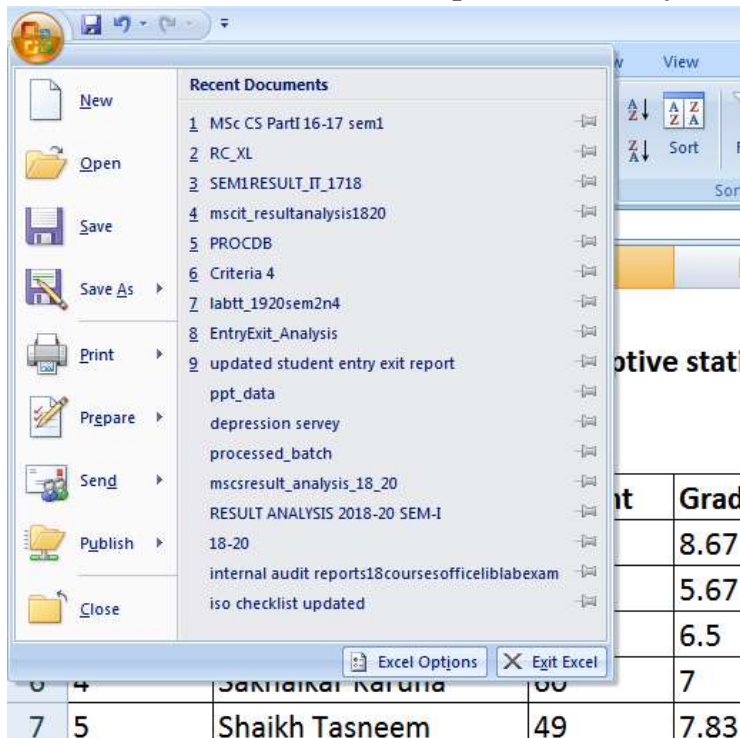
#### **Solution:**

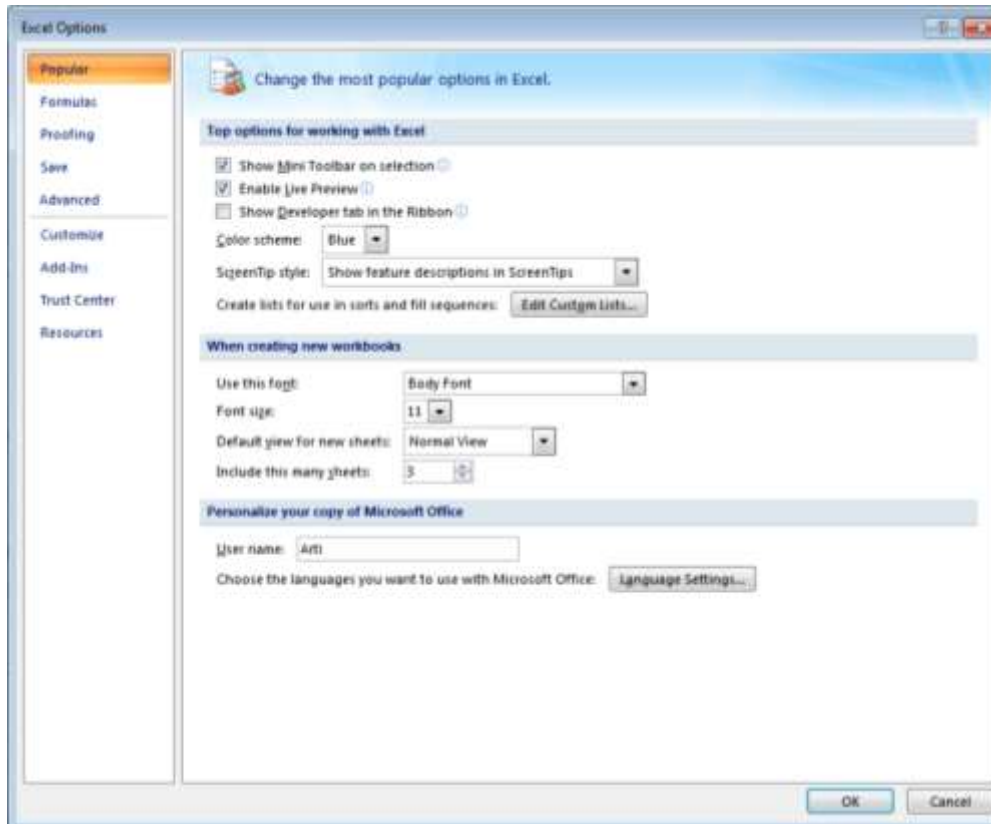
The data is usually given in the exam or we can generate our own sample data.

Sr.No	Name	Age	Grade
1	Parade Rohini	20	8.67
2	Patil Aditi	21	5.67
3	Repalle Nissi	22	6.5
4	Sakhalikar Karuna	20	7
5	Shaikh Tasneem	21	7.83
6	Sharma Rishu	22	7
7	Sharma Sandeshwar	20	7.67
8	Nadar Anandraj	21	5.33
9	Yadav Sachin	23	6.67
10	Anjali Singh	22	6.83

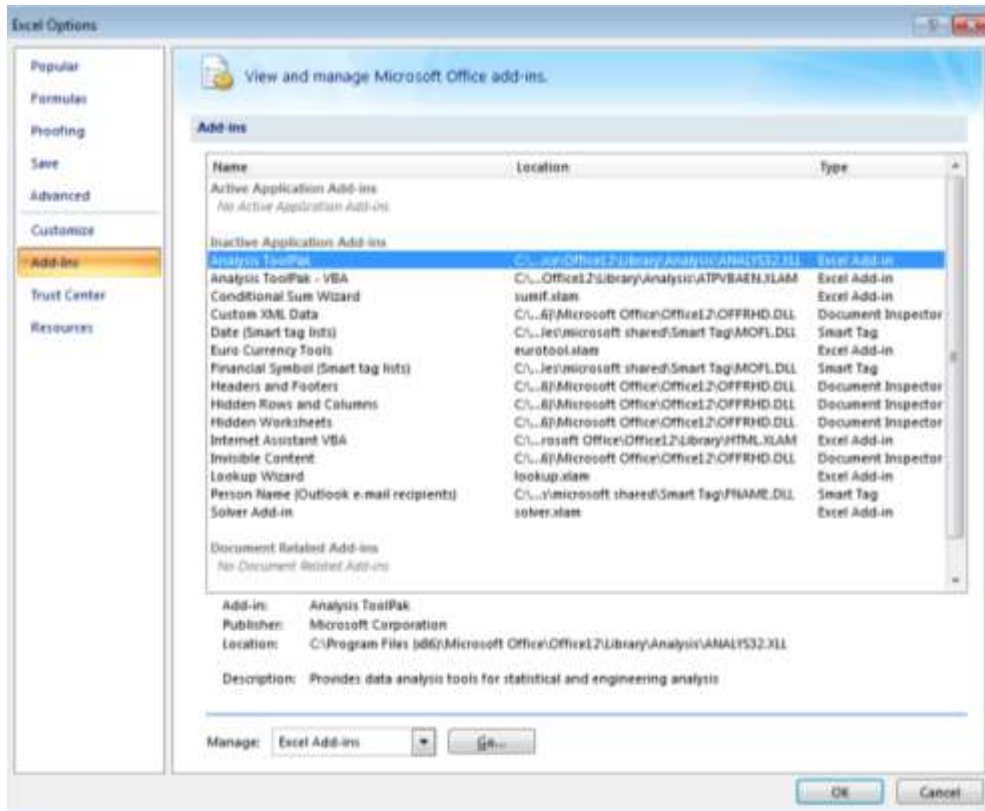
First, we need to install the Data Analysis pack in Excel. The steps for installation are given below:

Click on the Office Icon in the top left corner of your excel window. Click on Excel Options

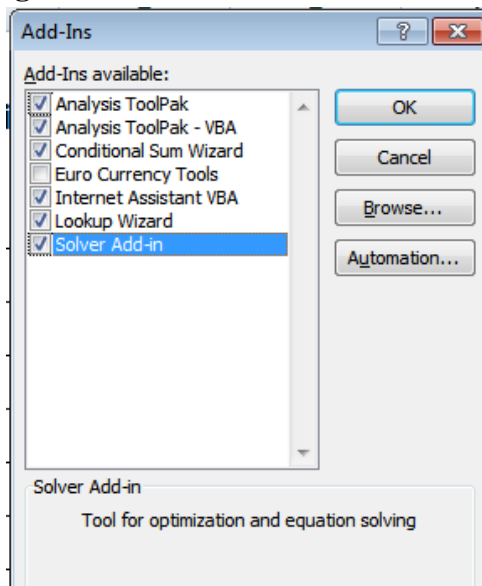




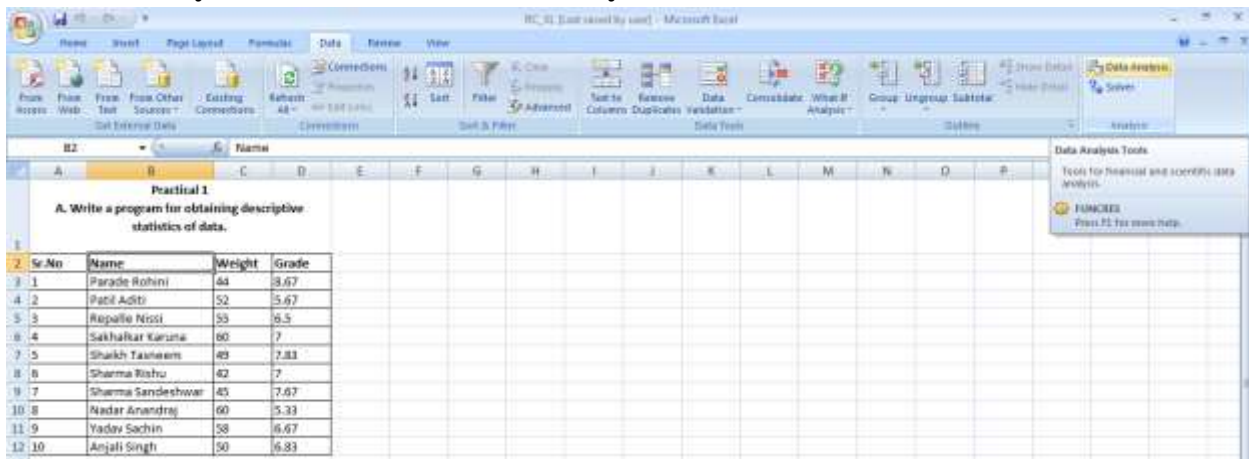
Click on Add-Ins. Select Analysis Toolpak and click on Go.



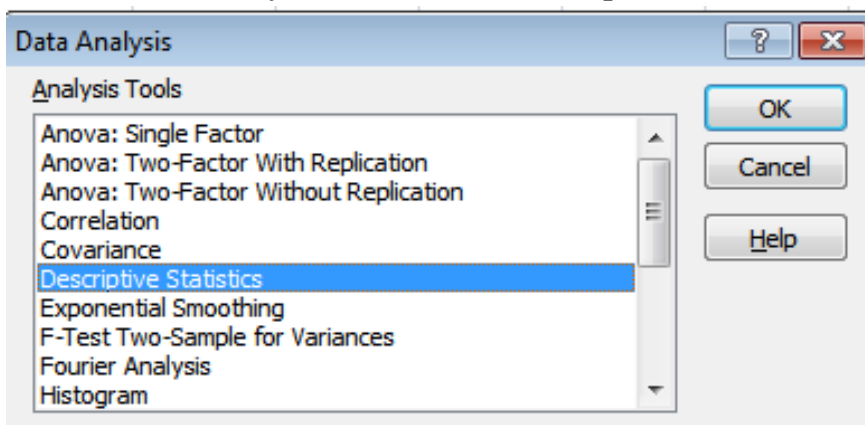
Select all of the options given in the checkbox. Eurocurrency is optional and can be ignored. Click OK.



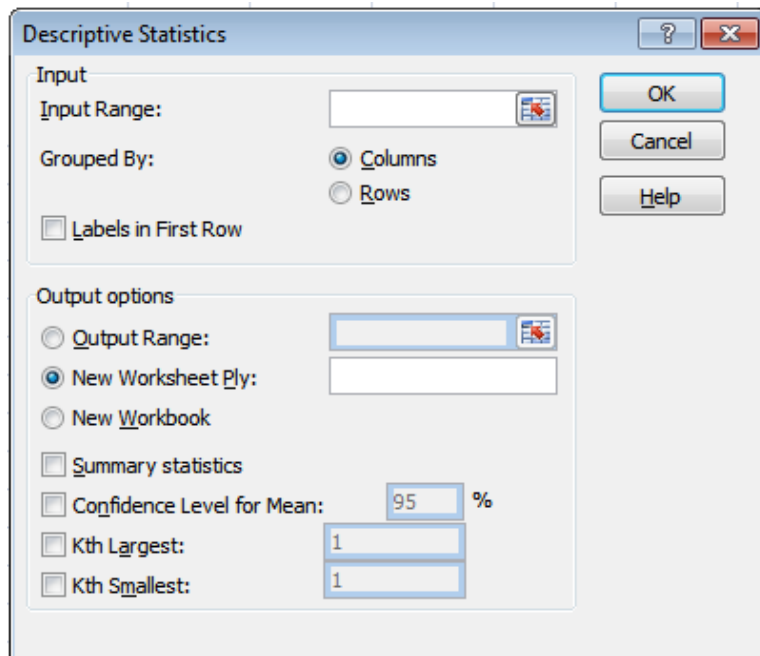
The data analysis tool is installed successfully.



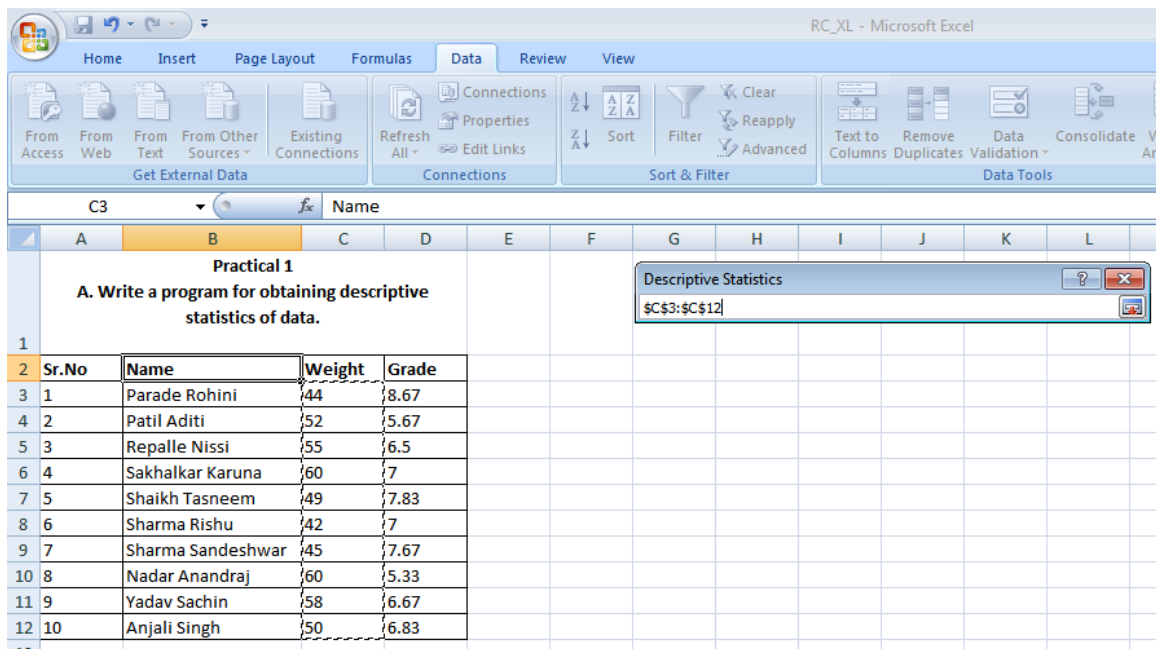
Click on Data Analysis tool and click Descriptive Statistics.



Select the Input Range as the value for which you have been asked to or need to take statistics. In this example , we will consider the values of weight. Click on the icon besides the input range textbox to select the range.



The image shows the 'Descriptive Statistics' dialog box in Microsoft Excel. It has two main sections: 'Input' and 'Output options'. In the 'Input' section, the 'Input Range' is empty, and there is a selection icon to its right. 'Grouped By' is set to 'Columns', and 'Labels in First Row' is unchecked. In the 'Output options' section, 'New Worksheet Ply' is selected, and 'Summary statistics' is unchecked. 'Confidence Level for Mean' is set to 95%. 'Kth Largest' and 'Kth Smallest' are both set to 1. Buttons for 'OK', 'Cancel', and 'Help' are on the right.



The image shows a screenshot of the Microsoft Excel interface. The 'Data' tab is active in the ribbon. A 'Descriptive Statistics' dialog box is open, showing the input range '\$C\$3:\$C\$12'. The worksheet contains a table with student data. The table has columns for 'Sr.No', 'Name', 'Weight', and 'Grade'. The data rows are numbered 1 through 12 in the first column.

Sr.No	Name	Weight	Grade
1	Parade Rohini	44	8.67
2	Patil Aditi	52	5.67
3	Repalle Nissi	55	6.5
4	Sakhalkar Karuna	60	7
5	Shaikh Tasneem	49	7.83
6	Sharma Rishu	42	7
7	Sharma Sandeshwar	45	7.67
8	Nadar Anandraj	60	5.33
9	Yadav Sachin	58	6.67
10	Anjali Singh	50	6.83

Next, Select the output range i.e. the cells where you want the output to be displayed.

The screenshot shows the Microsoft Excel interface with the 'Data' tab selected. The 'Data Tools' group on the ribbon includes 'Sort & Filter' and 'Data Tools'. The 'Descriptive Statistics' dialog box is open, showing the 'Input Range' as '\$F\$2:\$F\$12'. The worksheet contains a table with student data:

Sr.No	Name	Weight	Grade
1	Parade Rohini	44	8.67
2	Patil Aditi	52	5.67
3	Repalle Nissi	55	6.5
4	Sakhalkar Karuna	60	7
5	Shaikh Tasneem	49	7.83
6	Sharma Rishu	42	7
7	Sharma Sandeshwar	45	7.67
8	Nadar Anandraj	60	5.33
9	Yadav Sachin	58	6.67
10	Anjali Singh	50	6.83

Select all 4 checkboxes namely Summary Statistics, Confidence Level for mean, Kth largest and Kth Smallest respectively and click OK.

The screenshot shows the 'Descriptive Statistics' dialog box with the following settings:

- Input Range:** \$C\$3:\$C\$12
- Grouped By:** Columns
- Labels in first row:** ☐
- Output options:**
  - Output Range:** \$F\$2:\$F\$12
  - Summary statistics:** ☒
  - Confidence Level for Mean:** 95 %
  - Kth Largest:** 1
  - Kth Smallest:** 1

The worksheet data is the same as in the previous screenshot.

The output is given is as shown below. It describes various statistics related to your sample data.

Practical 1							
Practical 1							
A. Write a program for obtaining descriptive statistics of data.							
Sr.No	Name	Weight	Grade	Column1			
1	Parade Rohini	44	8.67				
2	Patil Aditi	52	5.67	Mean			
3	Repalle Nissi	55	6.5	Standard Error			
4	Sakhalkar Karuna	60	7	Median			
5	Shaikh Tasneem	49	7.83	Mode			
6	Sharma Rishu	42	7	Standard Deviation			
7	Sharma Sandeshwar	45	7.67	Sample Variance			
8	Nadar Anandraj	60	5.33	Kurtosis			
9	Yadav Sachin	58	6.67	Skewness			
10	Anjali Singh	50	6.83	Range			
				Minimum			
				Maximum			
				Sum			
				Count			
				Largest(1)			
				Smallest(1)			
				Confidence Level(9			

## B. Import data from different data sources (from Excel, csv, mysql, sql server, oracle to R/Python/Excel)

SQLite:

### Code:

```
import sqlite3 as sq
import pandas as pd
#####
Base='C:/VKHCG'
sDatabaseName=Base + '/01-Vermeulen/00-RawData/SQLite/vermeulen.db'
conn = sq.connect(sDatabaseName)
sFileName='C:/VKHCG/01-Vermeulen/01-Retrieve/01-EDS/02-Python/Retrieve_IP_DATA.csv'
print('Loading :',sFileName)
IP_DATA_ALL_FIX=pd.read_csv(sFileName,header=0,low_memory=False)
IP_DATA_ALL_FIX.index.names = ['RowIDCSV']
```



```

sTable='IP_DATA_ALL'
print('Storing :',sDatabaseName,' Table:',sTable)
IP_DATA_ALL_FIX.to_sql(sTable, conn, if_exists="replace")
print('Loading :',sDatabaseName,' Table:',sTable)
TestData=pd.read_sql_query("select * from IP_DATA_ALL;", conn)
print('#####')
print('## Data Values')
print('#####')
print(TestData)
print('#####')
print('## Data Profile')
print('#####')
print('Rows :',TestData.shape[0])
print('Columns :',TestData.shape[1])
print('#####')
print('### Done!! #####')

```

### Output:

```

Loading : C:/VKHCG/01-Vermeulen/01-Retrieve/01-EDS/02-Python/Retrieve_IP_DATA.csv
Storing : C:/VKHCG/01-Vermeulen/00-RawData/SQLite/vermeulen.db Table: IP_DATA_ALL
Loading : C:/VKHCG/01-Vermeulen/00-RawData/SQLite/vermeulen.db Table: IP_DATA_ALL
#####
## Data Values
#####
      RowIDCSV  RowID  ID  ... Longitude First.IP.Number Last.IP.Number
0             0      0   1  ...   25.9119      692781056      692781567
1             1      1   2  ...   25.9119      692781824      692783103
2             2      2   3  ...   25.9119      692909056      692909311
3             3      3   4  ...   25.9119      692909568      692910079
4             4      4   5  ...   25.9119      693051392      693052415
...          ...    ...  ...  ...      ...      ...      ...
1247497      1247497  1247497  1247498  ...   -79.7611      1068157850      1068157850
1247498      1247498  1247498  1247499  ...     8.7668      1334409600      1334409607
1247499      1247499  1247499  1247500  ...    43.2583      1596886528      1596886783
1247500      1247500  1247500  1247501  ...   -80.4451      1742189568      1742190591
1247501      1247501  1247501  1247502  ...   139.5357      1905782573      1905782573

[1247502 rows x 10 columns]
#####
## Data Profile
#####
Rows : 1247502
Columns : 10
#####
### Done!! #####

```

### Microsoft Excel:

#### Code:

```

#####Retrieve-Country-Currency.py
#####
# -*- coding: utf-8 -*-
#####
import os
import pandas as pd
#####
Base='C:/VKHCG'
#####

```

```

sFileDir=Base + '/01-Vermeulen/01-Retrieve/01-EDS/02-Python'
#if not os.path.exists(sFileDir):
#os.makedirs(sFileDir)
#####
CurrencyRawData = pd.read_excel('C:/VKHCG/01-Vermeulen/00-RawData/Country_Currency.xlsx')
sColumns = ['Country or territory', 'Currency', 'ISO-4217']
CurrencyData = CurrencyRawData[sColumns]
CurrencyData.rename(columns={'Country or territory': 'Country', 'ISO-4217':
'CurrencyCode'}, inplace=True)
CurrencyData.dropna(subset=['Currency'],inplace=True)
CurrencyData['Country'] = CurrencyData['Country'].map(lambda x: x.strip())
CurrencyData['Currency'] = CurrencyData['Currency'].map(lambda x:
x.strip())
CurrencyData['CurrencyCode'] = CurrencyData['CurrencyCode'].map(lambda x:
x.strip())
print(CurrencyData)
print('~~~~~ Data from Excel Sheet Retrived Successfully ~~~~~ ')
#####
sFileName=sFileDir + '/Retrieve-Country-Currency.csv'
CurrencyData.to_csv(sFileName, index = False)
#####

```

### **Output:**

	Country	Currency	CurrencyCode
1	Afghanistan	Afghan afghani	AFN
2	Akrotiri and Dhekelia (UK)	European euro	EUR
3	Aland Islands (Finland)	European euro	EUR
4	Albania	Albanian lek	ALL
5	Algeria	Algerian dinar	DZD
..	...	...	...
271	Wake Island (USA)	United States dollar	USD
272	Wallis and Futuna (France)	CFP franc	XPF
274	Yemen	Yemeni rial	YER
276	Zambia	Zambian kwacha	ZMW
277	Zimbabwe	United States dollar	USD

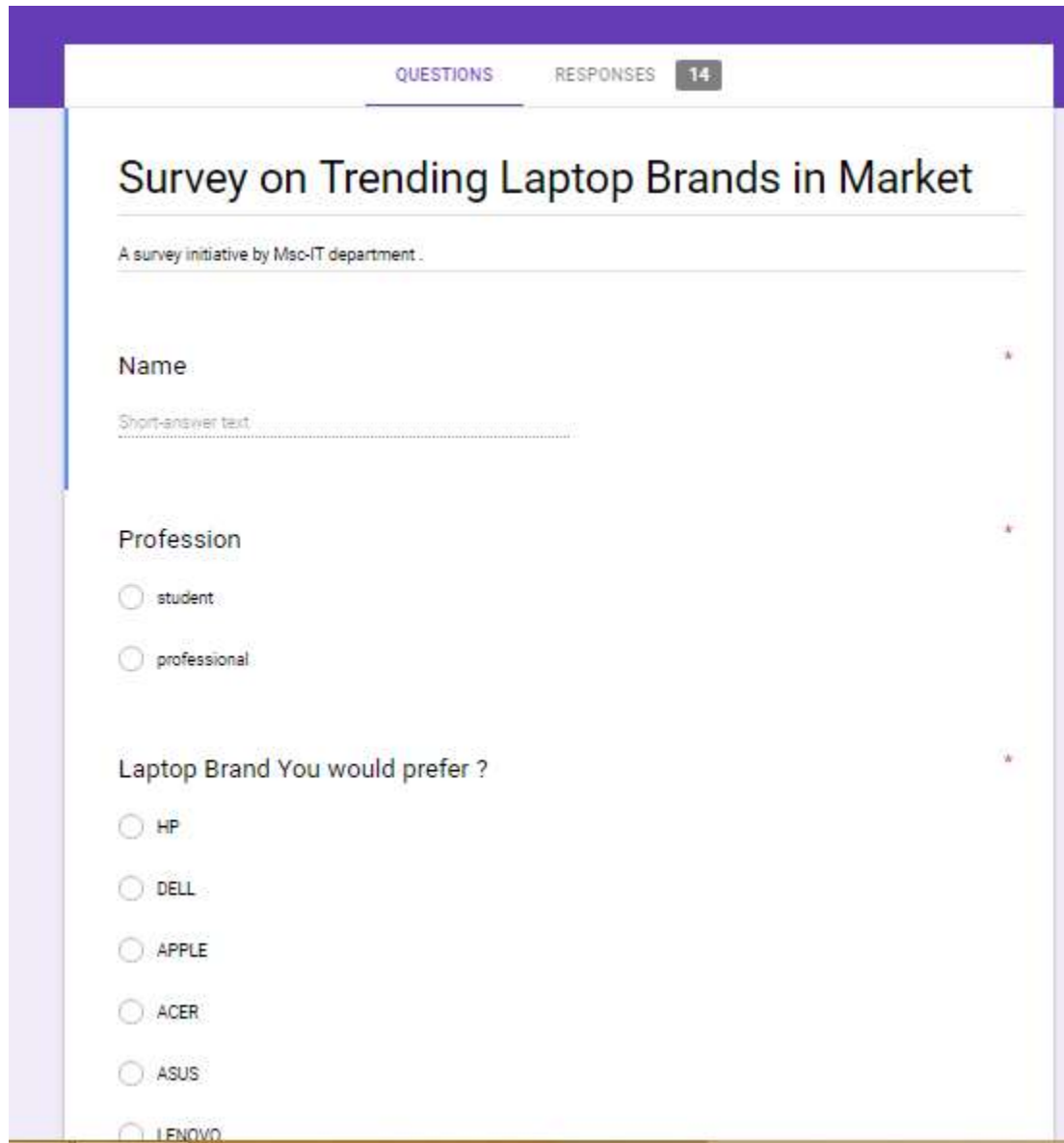
[253 rows x 3 columns]

~~~~~ Data from Excel Sheet Retrived Successfully ~~~~~

## Practical No 2

A. Design a survey form for a given case study, collect the primary data and analyse it.

→ Open Google forms → select empty form → edit according to the case study → click on share button:



The image shows a Google Form titled "Survey on Trending Laptop Brands in Market". At the top, there are tabs for "QUESTIONS" and "RESPONSES" with a count of "14". Below the title, a subtitle reads "A survey initiative by Msc-IT department .". The form contains three questions:

- Name**: A short-answer text field.
- Profession**: A multiple-choice question with two options: "student" and "professional".
- Laptop Brand You would prefer ?**: A multiple-choice question with six options: "HP", "DELL", "APPLE", "ACER", "ASUS", and "LENOVO".

- ☐ HP
- ☐ DELL
- ☐ APPLE
- ☐ ACER
- ☐ ASUS
- ☐ LENOVO

111

Why do you prefer this brand ? \*

- ☐ price
- ☐ performance
- ☐ specification
- ☐ services
- ☐ looks

Level of satisfaction \*

1 2 3 4 5

worst ☐ ☐ ☐ ☐ ☐ excellent

How much would you refer this brand to others \*

1 2 3 4 5 6 7 8 9 10

☐ ☐ ☐ ☐ ☐ ☐ ☐ ☐ ☐ ☐

suggestion \*

Long-answer text

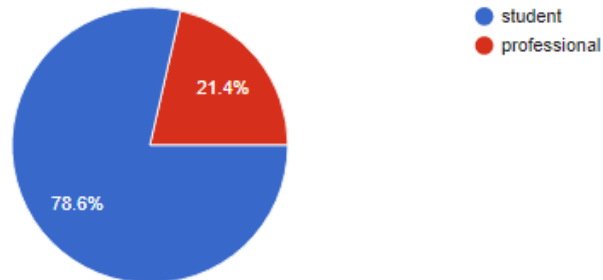
QUESTIONS

RESPONSES

14

## Profession

14 responses



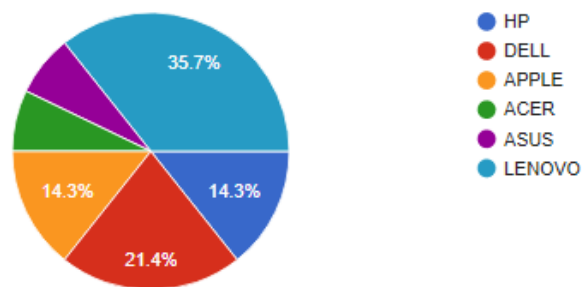
QUESTIONS

RESPONSES

14

## Laptop Brand You would prefer ?

14 responses



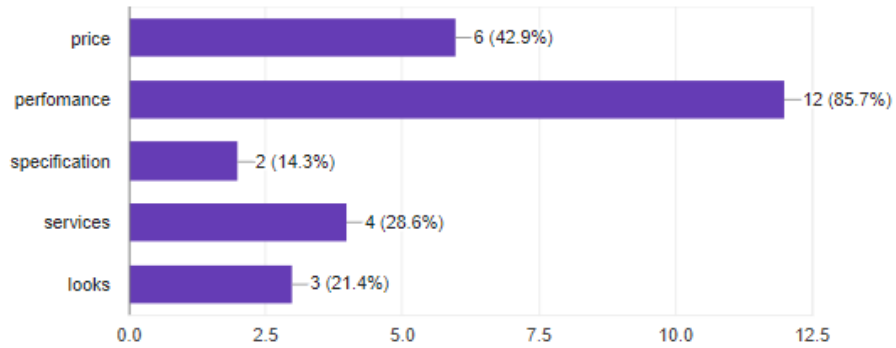
QUESTIONS

RESPONSES

14

## Why do you prefer this brand ?

14 responses



QUESTIONS

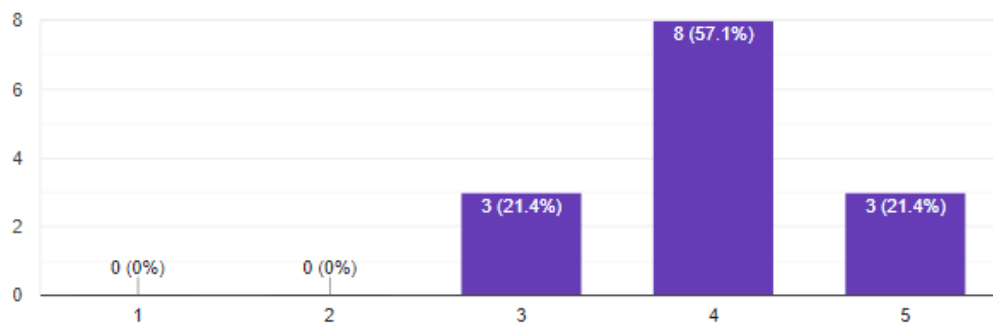
RESPONSES

14

0.0 2.5 5.0 7.5 10.0 12.5

## Level of satisfaction

14 responses



QUESTIONS

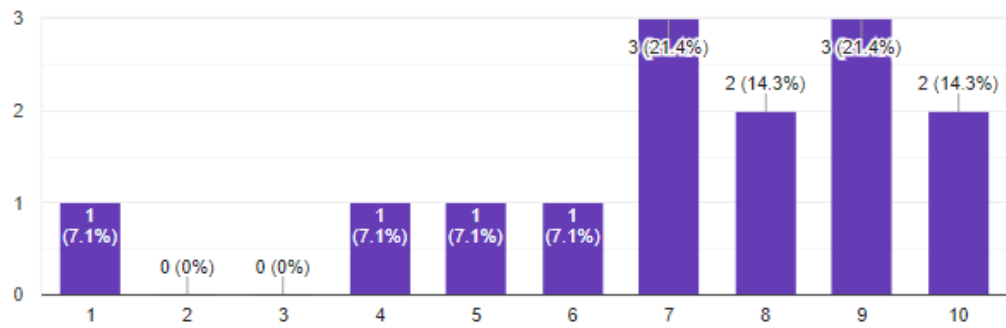
RESPONSES

14

### How much would you refer this brand to others

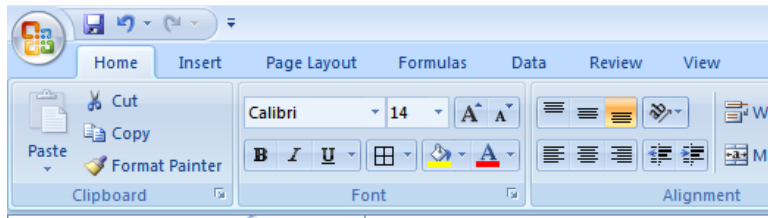


14 responses




## B. Perform analysis of given secondary data.

**Solution:** The data will be given or can be randomly generated.



|    | A      | B     | C      | D     | E     | F       |
|----|--------|-------|--------|-------|-------|---------|
| 1  | Age    | Male  | Female | Total | Male% | Female% |
| 2  | 0-10   | 3460  | 49760  |       |       |         |
| 3  | 10-20  | 8104  | 16413  |       |       |         |
| 4  | 20-30  | 45961 | 44106  |       |       |         |
| 5  | 30-40  | 44592 | 3791   |       |       |         |
| 6  | 40-50  | 15601 | 42985  |       |       |         |
| 7  | 50-60  | 27862 | 38568  |       |       |         |
| 8  | 60-70  | 14768 | 22844  |       |       |         |
| 9  | 70-80  | 12410 | 23886  |       |       |         |
| 10 | 80-90  | 8897  | 28460  |       |       |         |
| 11 | 90-100 | 47689 | 12315  |       |       |         |

We start by adding the values in the male and female column. To perform addition, select the values to be added and an additional cell in which sum is to displayed.



|    | A      | B     | C      | D     | E     | F       |
|----|--------|-------|--------|-------|-------|---------|
| 1  | Age    | Male  | Female | Total | Male% | Female% |
| 2  | 0-10   | 3460  | 49760  |       |       |         |
| 3  | 10-20  | 8104  | 16413  |       |       |         |
| 4  | 20-30  | 45961 | 44106  |       |       |         |
| 5  | 30-40  | 44592 | 3791   |       |       |         |
| 6  | 40-50  | 15601 | 42985  |       |       |         |
| 7  | 50-60  | 27862 | 38568  |       |       |         |
| 8  | 60-70  | 14768 | 22844  |       |       |         |
| 9  | 70-80  | 12410 | 23886  |       |       |         |
| 10 | 80-90  | 8897  | 28460  |       |       |         |
| 11 | 90-100 | 47689 | 12315  |       |       |         |



Next drag the dot at the end of the cell to apply the formula to other columns. Take your mouse near the cell the pointer changes to plus indicating we should drag the mouse in the cells we wish to perform a similar action. This will auto fill the values in the column.

|    | A      | B     | C      | D     | E     | F       |
|----|--------|-------|--------|-------|-------|---------|
| 1  | Age    | Male  | Female | Total | Male% | Female% |
| 2  | 0-10   | 3460  | 49760  | 53220 |       |         |
| 3  | 10-20  | 38734 | 16413  | 55147 |       |         |
| 4  | 20-30  | 35029 | 44106  | 79135 |       |         |
| 5  | 30-40  | 47641 | 3791   | 51432 |       |         |
| 6  | 40-50  | 3706  | 42985  | 46691 |       |         |
| 7  | 50-60  | 48759 | 38568  | 87327 |       |         |
| 8  | 60-70  | 48807 | 22844  | 71651 |       |         |
| 9  | 70-80  | 22926 | 23886  | 46812 |       |         |
| 10 | 80-90  | 21885 | 28460  | 50345 |       |         |
| 11 | 90-100 | 30404 | 12315  | 42719 |       |         |
| 12 |        |       |        |       |       |         |

Next step is to calculate the percentage of males in the data. We need to add formula for this. Click on the textbox near the fx icon to type the formula. Always start a formula with an = sign.

|    | A      | B     | C      | D     | E           | F       |
|----|--------|-------|--------|-------|-------------|---------|
| 1  | Age    | Male  | Female | Total | Male%       | Female% |
| 2  | 0-10   | 3460  | 49760  | 53220 | $B2/D2*100$ |         |
| 3  | 10-20  | 25660 | 16413  | 42073 |             |         |
| 4  | 20-30  | 44833 | 44106  | 88939 |             |         |
| 5  | 30-40  | 30030 | 3791   | 33821 |             |         |
| 6  | 40-50  | 25572 | 42985  | 68557 |             |         |
| 7  | 50-60  | 29091 | 38568  | 67659 |             |         |
| 8  | 60-70  | 17137 | 22844  | 39981 |             |         |
| 9  | 70-80  | 43866 | 23886  | 67752 |             |         |
| 10 | 80-90  | 40605 | 28460  | 69065 |             |         |
| 11 | 90-100 | 1569  | 12315  | 13884 |             |         |
| 12 |        |       |        |       |             |         |

Drag to fill the remaining rows.

RC\_XL - Microsoft Excel

Home Insert Page Layout Formulas Data Review View

Clipboard: Cut, Copy, Paste, Format Painter

Font: Calibri, 14, Bold, Italic, Underline, Text Color, Background Color

Alignment: Wrap Text, Merge & Center

Number: Number, Currency, Percentage, Increase/Decrease Decimal

Conditional Formatting, Format as Table, Cell Styles

Formula Bar: E2 =B2/D2\*100

Decrease Decimal: Show less precise values by showing fewer decimal places.

|    | A      | B     | C      | D     | E     | F       | G | H | I |
|----|--------|-------|--------|-------|-------|---------|---|---|---|
| 1  | Age    | Male  | Female | Total | Male% | Female% |   |   |   |
| 2  | 0-10   | 3460  | 49760  | 53220 | 6.50  |         |   |   |   |
| 3  | 10-20  | 37970 | 16413  | 54383 | 69.82 |         |   |   |   |
| 4  | 20-30  | 13055 | 44106  | 57161 | 22.84 |         |   |   |   |
| 5  | 30-40  | 5218  | 3791   | 9009  | 57.92 |         |   |   |   |
| 6  | 40-50  | 21019 | 42985  | 64004 | 32.84 |         |   |   |   |
| 7  | 50-60  | 7592  | 38568  | 46160 | 16.45 |         |   |   |   |
| 8  | 60-70  | 34034 | 22844  | 56878 | 59.84 |         |   |   |   |
| 9  | 70-80  | 4434  | 23886  | 28320 | 15.66 |         |   |   |   |
| 10 | 80-90  | 35231 | 28460  | 63691 | 55.32 |         |   |   |   |
| 11 | 90-100 | 4173  | 12315  | 16488 | 25.31 |         |   |   |   |

Apply similar steps to find female %.

Home Insert Page Layout Formulas Data Review View

Clipboard: Cut, Copy, Paste, Format Painter

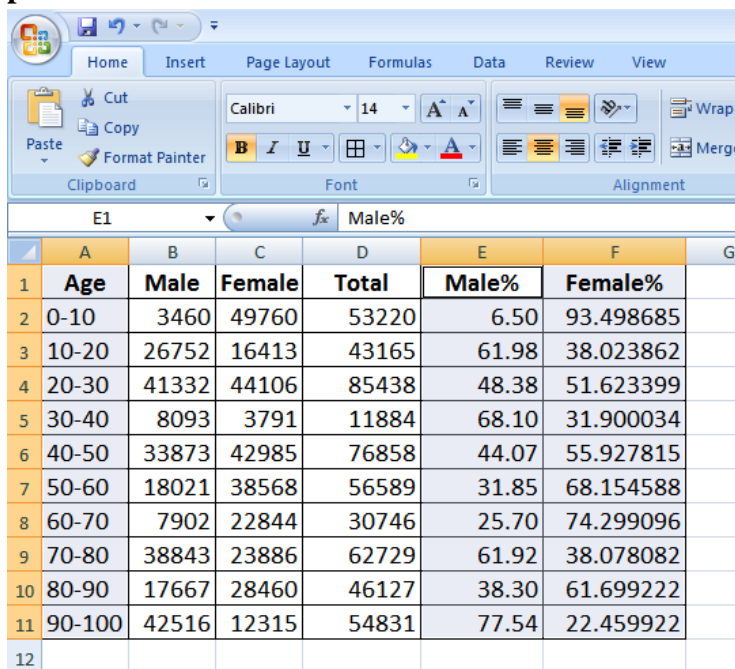
Font: Calibri, 14, Bold, Italic, Underline, Text Color, Background Color

Alignment: Wrap Text, Merge & Center

Formula Bar: F2 =C2/D2\*100

|    | A      | B     | C      | D     | E     | F         |
|----|--------|-------|--------|-------|-------|-----------|
| 1  | Age    | Male  | Female | Total | Male% | Female%   |
| 2  | 0-10   | 3460  | 49760  | 53220 | 6.50  | 93.498685 |
| 3  | 10-20  | 26752 | 16413  | 43165 | 61.98 | 38.023862 |
| 4  | 20-30  | 41332 | 44106  | 85438 | 48.38 | 51.623399 |
| 5  | 30-40  | 8093  | 3791   | 11884 | 68.10 | 31.900034 |
| 6  | 40-50  | 33873 | 42985  | 76858 | 44.07 | 55.927815 |
| 7  | 50-60  | 18021 | 38568  | 56589 | 31.85 | 68.154588 |
| 8  | 60-70  | 7902  | 22844  | 30746 | 25.70 | 74.299096 |
| 9  | 70-80  | 38843 | 23886  | 62729 | 61.92 | 38.078082 |
| 10 | 80-90  | 17667 | 28460  | 46127 | 38.30 | 61.699222 |
| 11 | 90-100 | 42516 | 12315  | 54831 | 77.54 | 22.459922 |

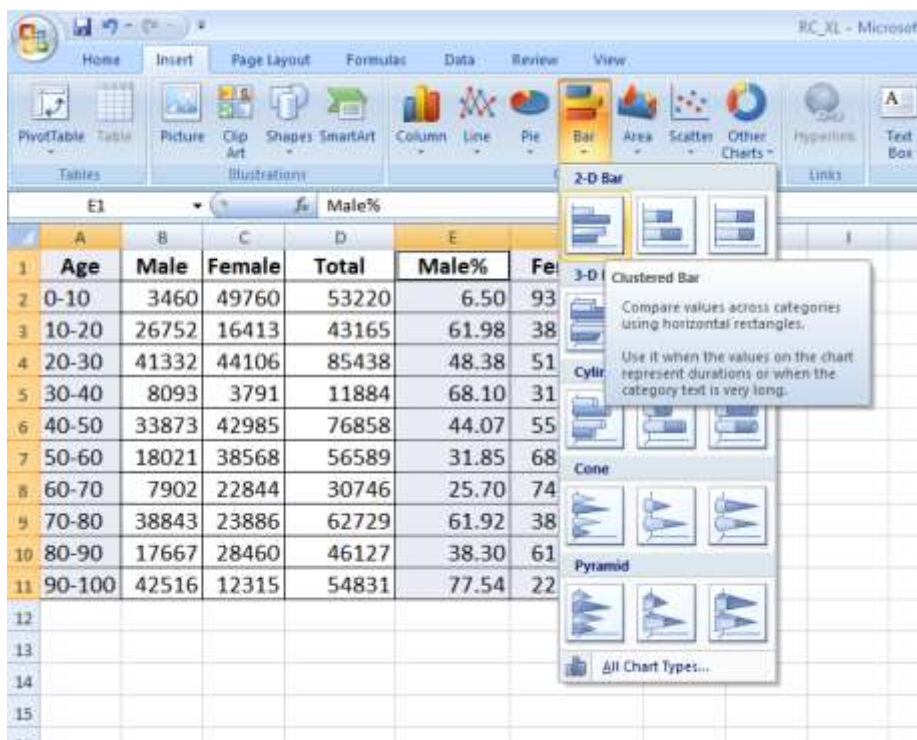
Select the column to be displayed in the chart including the column name. In our example it is Age, Male% and Female%. Select the age column and press ctrl key. Keep the ctrl key pressed and select the male% and female% column.

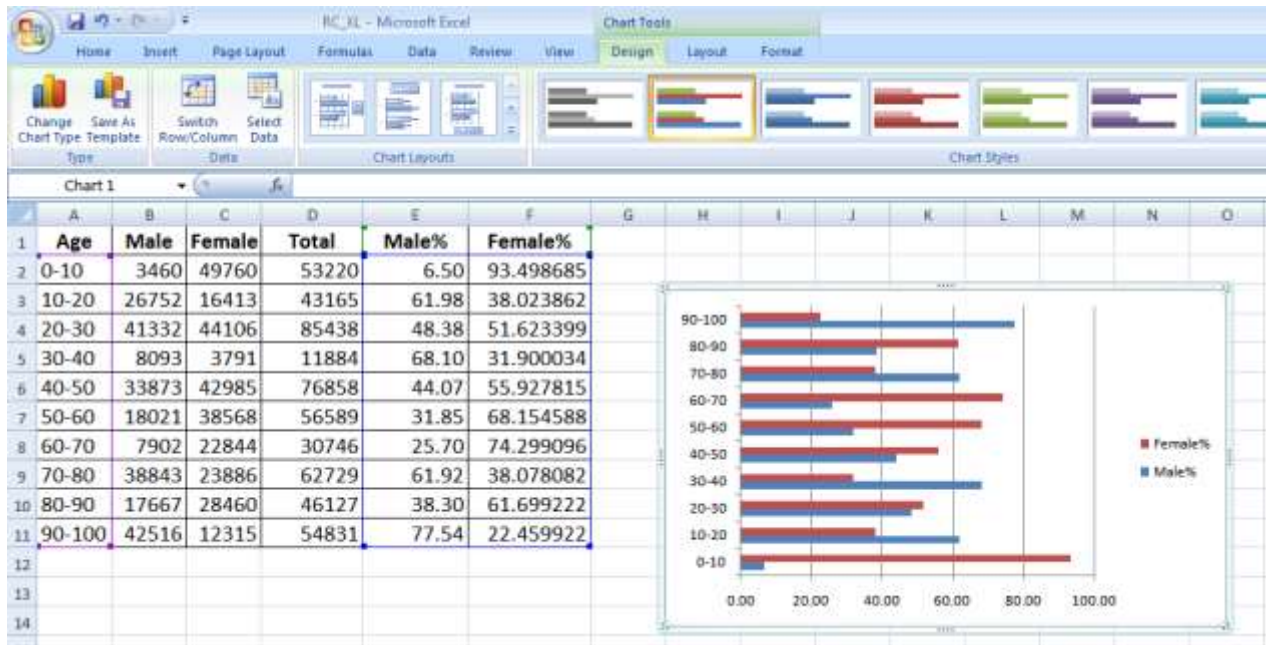


The screenshot shows the Microsoft Excel interface with the ribbon set to 'Home'. The active cell is E1, containing the text 'Male%'. Below the ribbon is a data table with the following content:

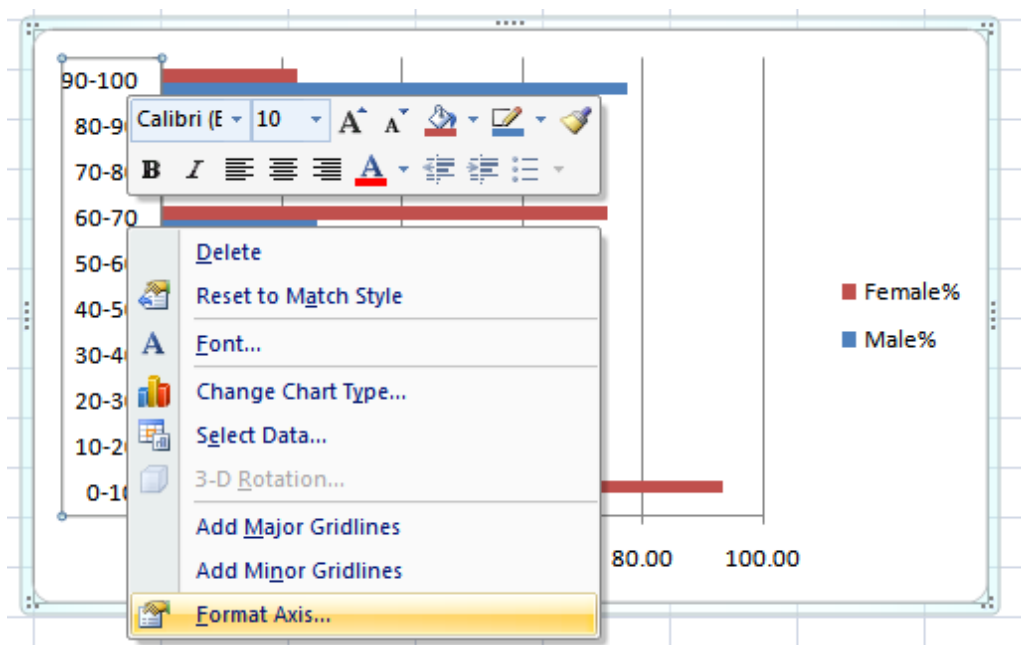
|    | A          | B           | C             | D            | E            | F              | G |
|----|------------|-------------|---------------|--------------|--------------|----------------|---|
| 1  | <b>Age</b> | <b>Male</b> | <b>Female</b> | <b>Total</b> | <b>Male%</b> | <b>Female%</b> |   |
| 2  | 0-10       | 3460        | 49760         | 53220        | 6.50         | 93.498685      |   |
| 3  | 10-20      | 26752       | 16413         | 43165        | 61.98        | 38.023862      |   |
| 4  | 20-30      | 41332       | 44106         | 85438        | 48.38        | 51.623399      |   |
| 5  | 30-40      | 8093        | 3791          | 11884        | 68.10        | 31.900034      |   |
| 6  | 40-50      | 33873       | 42985         | 76858        | 44.07        | 55.927815      |   |
| 7  | 50-60      | 18021       | 38568         | 56589        | 31.85        | 68.154588      |   |
| 8  | 60-70      | 7902        | 22844         | 30746        | 25.70        | 74.299096      |   |
| 9  | 70-80      | 38843       | 23886         | 62729        | 61.92        | 38.078082      |   |
| 10 | 80-90      | 17667       | 28460         | 46127        | 38.30        | 61.699222      |   |
| 11 | 90-100     | 42516       | 12315         | 54831        | 77.54        | 22.459922      |   |
| 12 |            |             |               |              |              |                |   |

Go to Insert and select the 2-D Clustered Bar Chart.

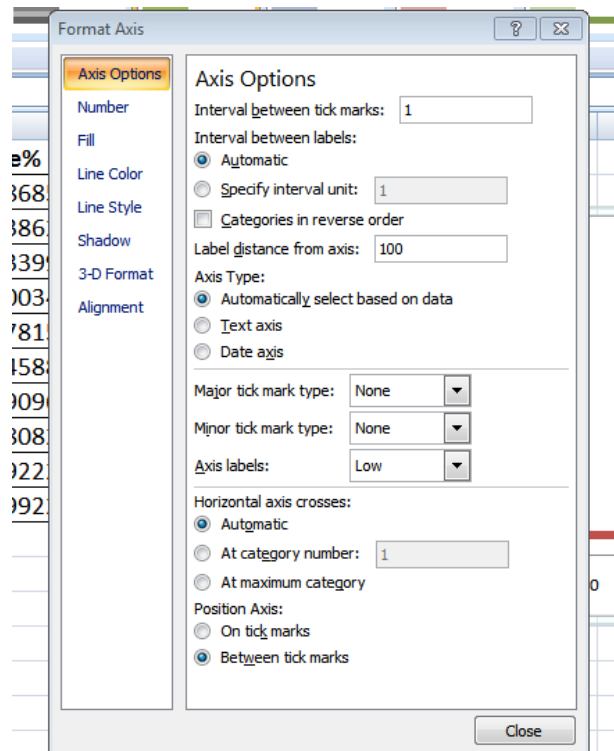




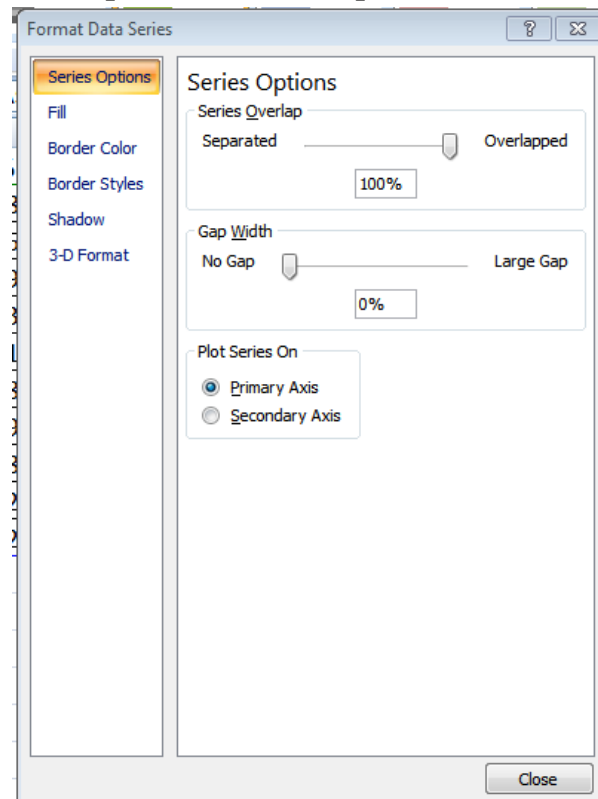
Click on the Vertical Axis and Select Format Axis.



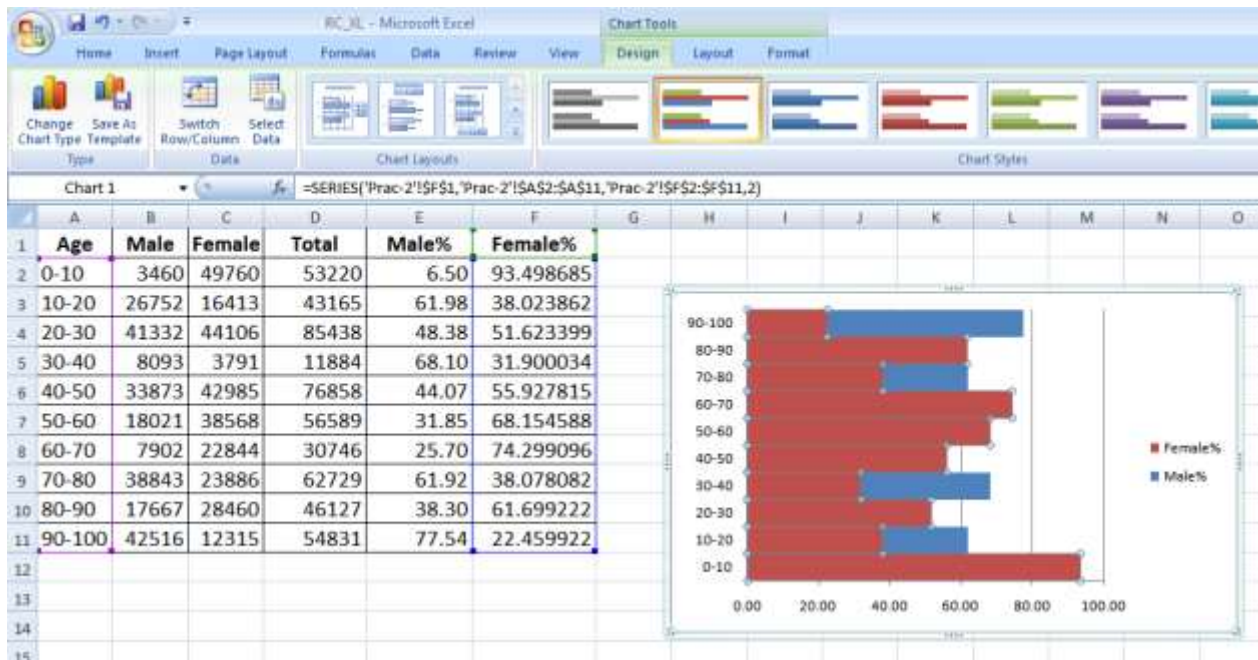
**Set Major Tick mark type and Minor tick mark type as None. Set Axis Labels as Low. Click on Close.**



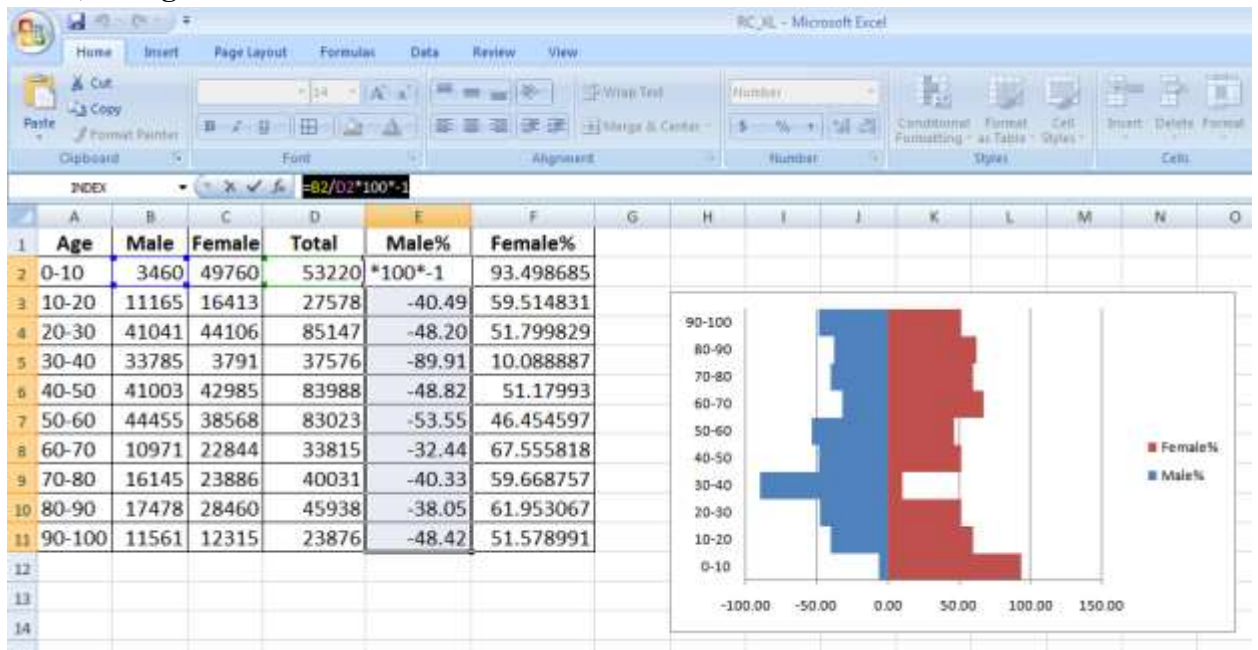
**Right click on any data bar in the chart and click on Format Data Series. Set Series Overlap to 100% and Gap width to 0%. Click on Close.**







Next , change the formula in male% to “=B2/D2\*100\*-1”. i.e. add \*-1 to the formula.



## Practical No 3

### A. Perform testing of hypothesis using one sample t-test.

#### Code:

```
# -*- coding: utf-8 -*-
"""
Created on Mon Dec 16 18:01:46 2019
@author: Ahtesham Shaikh
"""

from scipy.stats import ttest_1samp
import numpy as np
ages = np.genfromtxt('ages.csv')
print(ages)
ages_mean = np.mean(ages)
print(ages_mean)
tset, pval = ttest_1samp(ages, 30)
print('p-values - ',pval)
if pval< 0.05: # alpha value is 0.05
    print(" we are rejecting null hypothesis")
else:
    print("we are accepting null hypothesis")
```

#### Output:

```
In [4]: runfile('K:/Research In Computing/Practical Material/Programs/
Practical_05/Prac_3A.py', wdir='K:/Research In Computing/Practical Material/
Programs/Practical_05')
[20. 30. 25. 13. 16. 17. 34. 35. 38. 42. 43. 45. 48. 49. 50. 51. 54. 55.
 56. 59. 61. 62. 18. 22. 29. 30. 31. 39. 52. 53. 67. 36. 47. 54. 40. 40.
 35. 22. 59. 58. 30. 43. 22. 45. 21. 59. 51. 47. 25. 58. 50. 23. 24. 45.
 37. 59. 28. 28. 48. 42. 54. 36. 36. 24. 26. 24. 50. 48. 34. 44. 56. 55.
 35. 33. 39. 53. 34. 28. 56. 24. 21. 29. 28. 58. 35. 57. 26. 25. 59. 56.
 22. 57. 48. 33. 23. 26. 57. 32. 53. 31. 35. 44. 54. 25. 31. 58. 26. 32.
 26. 50. 41. 49. 26. 33. 34. 24. 43. 42. 51. 36. 38. 38. 40. 38. 56. 39.
 23. 33. 53. 30. 38.]
39.47328244274809
p-values - 5.362905195437013e-14
we are rejecting null hypothesis
```

**B. Write a program for t-test comparing two means for independent samples.**

A college Principal informed classroom teachers that some of their students showed unusual potential for intellectual gains. One month later the students identified by the teachers as having potential for unusual intellectual gains showed significantly greater gains performance on a test said to measure IQ than did students who were not identified. Below are the data for the students:

| <b>Experimental</b> | <b>Comparison</b> |
|---------------------|-------------------|
| <b>35</b>           | <b>2</b>          |
| <b>40</b>           | <b>27</b>         |
| <b>12</b>           | <b>38</b>         |
| <b>15</b>           | <b>31</b>         |
| <b>21</b>           | <b>1</b>          |
| <b>14</b>           | <b>19</b>         |
| <b>46</b>           | <b>1</b>          |
| <b>10</b>           | <b>34</b>         |
| <b>28</b>           | <b>3</b>          |
| <b>48</b>           | <b>1</b>          |
| <b>16</b>           | <b>2</b>          |
| <b>30</b>           | <b>3</b>          |
| <b>32</b>           | <b>2</b>          |
| <b>48</b>           | <b>1</b>          |
| <b>31</b>           | <b>2</b>          |
| <b>22</b>           | <b>1</b>          |
| <b>12</b>           | <b>3</b>          |
| <b>39</b>           | <b>29</b>         |
| <b>19</b>           | <b>37</b>         |
| <b>25</b>           | <b>2</b>          |

Solution:

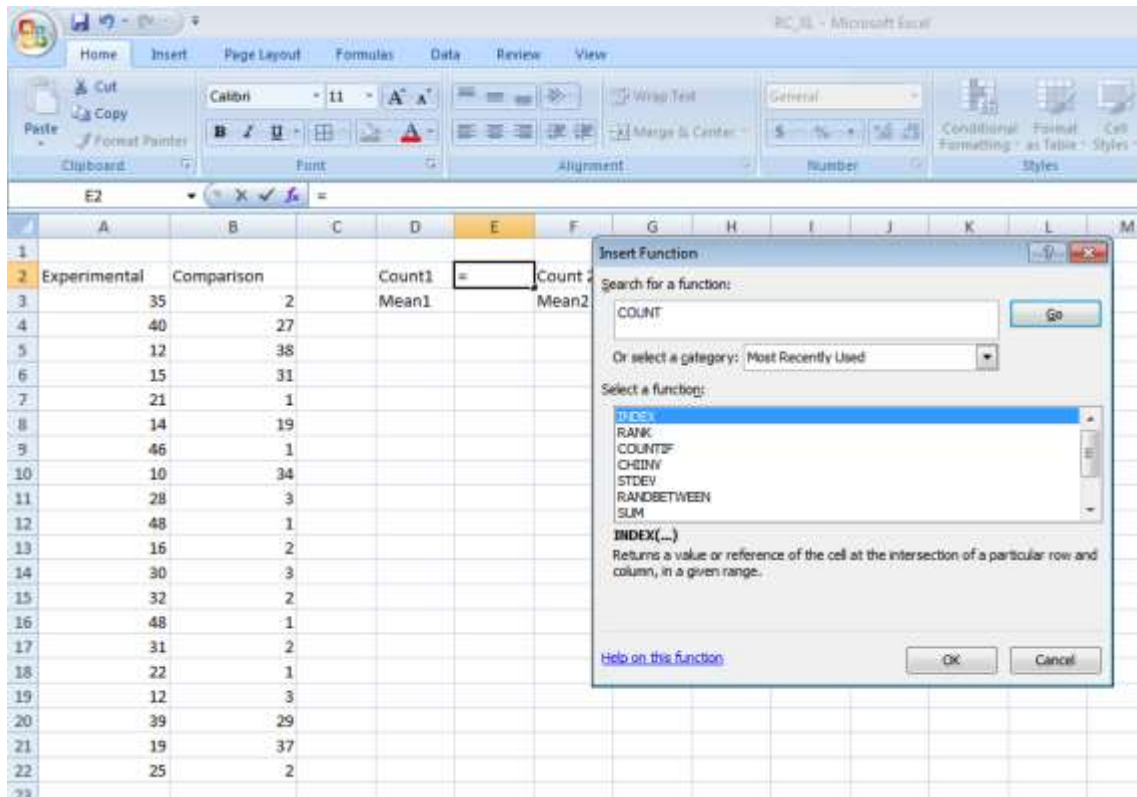
H0: Difference in score is not likely the result of experimental treatment

H1: Difference in score is likely the result of experimental treatment

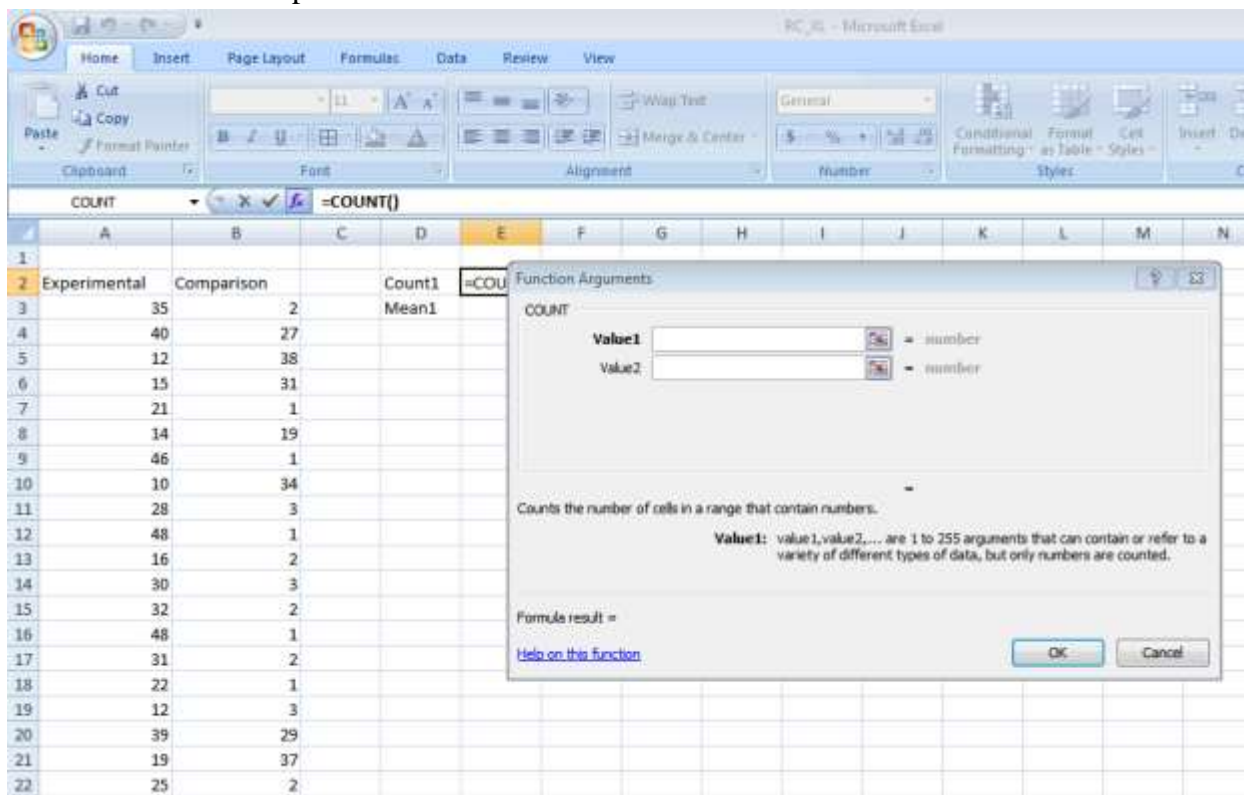
We start by counting the size of the sample using count function in Excel.

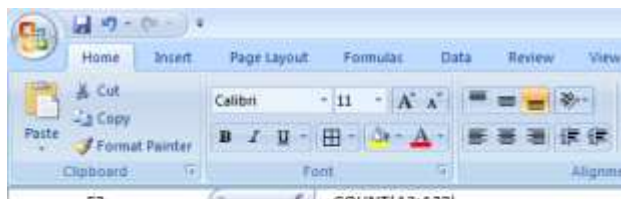
Click on fx and Type COUNT in the search box. Select the Count function from the list of displayed results.





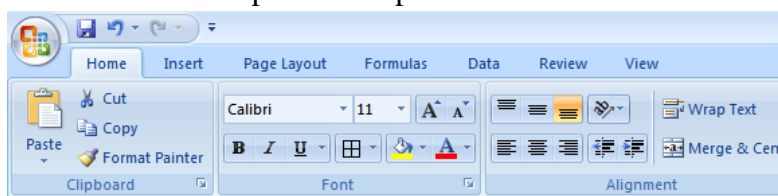
Select the range of cells to be counted by selecting the icon besides value1 and Click OK. We select the values in Experimental column. i.e. A3:A22





|    | A            | B          | C | D      | E  | F       |
|----|--------------|------------|---|--------|----|---------|
| 1  |              |            |   |        |    |         |
| 2  | Experimental | Comparison |   | Count1 | 20 | Count 2 |
| 3  | 35           | 2          |   | Mean1  |    | Mean2   |
| 4  | 40           | 27         |   |        |    |         |
| 5  | 12           | 38         |   |        |    |         |
| 6  | 15           | 31         |   |        |    |         |
| 7  | 21           | 1          |   |        |    |         |
| 8  | 14           | 19         |   |        |    |         |
| 9  | 46           | 1          |   |        |    |         |
| 10 | 10           | 34         |   |        |    |         |
| 11 | 28           | 3          |   |        |    |         |
| 12 | 48           | 1          |   |        |    |         |
| 13 | 16           | 2          |   |        |    |         |
| 14 | 30           | 3          |   |        |    |         |
| 15 | 32           | 2          |   |        |    |         |
| 16 | 48           | 1          |   |        |    |         |
| 17 | 31           | 2          |   |        |    |         |
| 18 | 22           | 1          |   |        |    |         |
| 19 | 12           | 3          |   |        |    |         |
| 20 | 39           | 29         |   |        |    |         |
| 21 | 19           | 37         |   |        |    |         |
| 22 | 25           | 2          |   |        |    |         |

Perform similar steps for Comparison Column.



|    | A            | B          | C | D      | E  | F       | G  |
|----|--------------|------------|---|--------|----|---------|----|
| 1  |              |            |   |        |    |         |    |
| 2  | Experimental | Comparison |   | Count1 | 20 | Count 2 | 20 |
| 3  | 35           | 2          |   | Mean1  |    | Mean2   |    |
| 4  | 40           | 27         |   |        |    |         |    |
| 5  | 12           | 38         |   |        |    |         |    |
| 6  | 15           | 31         |   |        |    |         |    |
| 7  | 21           | 1          |   |        |    |         |    |
| 8  | 14           | 19         |   |        |    |         |    |
| 9  | 46           | 1          |   |        |    |         |    |
| 10 | 10           | 34         |   |        |    |         |    |
| 11 | 28           | 3          |   |        |    |         |    |
| 12 | 48           | 1          |   |        |    |         |    |
| 13 | 16           | 2          |   |        |    |         |    |
| 14 | 30           | 3          |   |        |    |         |    |
| 15 | 32           | 2          |   |        |    |         |    |
| 16 | 48           | 1          |   |        |    |         |    |
| 17 | 31           | 2          |   |        |    |         |    |
| 18 | 22           | 1          |   |        |    |         |    |
| 19 | 12           | 3          |   |        |    |         |    |
| 20 | 39           | 29         |   |        |    |         |    |
| 21 | 19           | 37         |   |        |    |         |    |
| 22 | 25           | 2          |   |        |    |         |    |

The screenshot shows the Microsoft Excel interface. The formula bar at the top displays the formula `=SUM(A3:A22)` for cell A23. The worksheet contains the following data:

|    | A            | B          | C | D      | E     | F       | G     |
|----|--------------|------------|---|--------|-------|---------|-------|
| 1  |              |            |   |        |       |         |       |
| 2  | Experimental | Comparison |   | Count1 | 20    | Count 2 | 20    |
| 3  | 35           | 2          |   | Mean1  | 27.15 | Mean2   | 11.95 |
| 4  | 40           | 27         |   |        |       |         |       |
| 5  | 12           | 38         |   |        |       |         |       |
| 6  | 15           | 31         |   |        |       |         |       |
| 7  | 21           | 1          |   |        |       |         |       |
| 8  | 14           | 19         |   |        |       |         |       |
| 9  | 46           | 1          |   |        |       |         |       |
| 10 | 10           | 34         |   |        |       |         |       |
| 11 | 28           | 3          |   |        |       |         |       |
| 12 | 48           | 1          |   |        |       |         |       |
| 13 | 16           | 2          |   |        |       |         |       |
| 14 | 30           | 3          |   |        |       |         |       |
| 15 | 32           | 2          |   |        |       |         |       |
| 16 | 48           | 1          |   |        |       |         |       |
| 17 | 31           | 2          |   |        |       |         |       |
| 18 | 22           | 1          |   |        |       |         |       |
| 19 | 12           | 3          |   |        |       |         |       |
| 20 | 39           | 29         |   |        |       |         |       |
| 21 | 19           | 37         |   |        |       |         |       |
| 22 | 25           | 2          |   |        |       |         |       |
| 23 | 543          | 239        |   |        |       |         |       |
| 24 |              |            |   |        |       |         |       |

[illegible]

|    | A            | B          | C   | D      | E      | F       | G        |
|----|--------------|------------|-----|--------|--------|---------|----------|
| 1  |              |            |     |        |        |         |          |
| 2  | Experimental | Comparison |     | Count1 | 20     | Count 2 | 20       |
| 3  |              | 35         | 2   | Mean1  | 27.15  | Mean2   | 11.95    |
| 4  |              | 40         | 27  | s.d.1  | 12.508 | s.d.2   | 14.61245 |
| 5  |              | 12         | 38  |        |        |         |          |
| 6  |              | 15         | 31  |        |        |         |          |
| 7  |              | 21         | 1   |        |        |         |          |
| 8  |              | 14         | 19  |        |        |         |          |
| 9  |              | 46         | 1   |        |        |         |          |
| 10 |              | 10         | 34  |        |        |         |          |
| 11 |              | 28         | 3   |        |        |         |          |
| 12 |              | 48         | 1   |        |        |         |          |
| 13 |              | 16         | 2   |        |        |         |          |
| 14 |              | 30         | 3   |        |        |         |          |
| 15 |              | 32         | 2   |        |        |         |          |
| 16 |              | 48         | 1   |        |        |         |          |
| 17 |              | 31         | 2   |        |        |         |          |
| 18 |              | 22         | 1   |        |        |         |          |
| 19 |              | 12         | 3   |        |        |         |          |
| 20 |              | 39         | 29  |        |        |         |          |
| 21 |              | 19         | 37  |        |        |         |          |
| 22 |              | 25         | 2   |        |        |         |          |
| 23 |              | 543        | 239 |        |        |         |          |
| 24 |              |            |     |        |        |         |          |

[illegible]

In the variable1 Range select 1<sup>st</sup> column(A3:A22) . In the variable Range select 2nd column(B3:B22) . In Hypothesized Mean Difference Type 0. Check the Labels Checkbox. And finally select the output range for displaying the output.

The screenshot shows the 't-Test: Paired Two Sample for Means' dialog box in Microsoft Excel. The 'Input' section has 'Variable 1 Range' set to \$A\$3:\$A\$22 and 'Variable 2 Range' set to \$B\$3:\$B\$22. The 'Hypothesized Mean Difference' is 0. The 'Labels' checkbox is checked. The 'Alpha' is 0.05. The 'Output options' section has 'Output Range' selected, with a text box for the range. The background worksheet shows columns A and B with data, and columns D and E with summary statistics like Count1, Mean1, s.d.1, Count2, Mean2, and s.d.2.

The output is

The screenshot shows the output of the t-Test: Paired Two Sample for Means in Microsoft Excel. The output is displayed in columns D and E. The output includes summary statistics for both variables, the t-Test results, and the Pearson Correlation. The output range is highlighted with a black box.

| Variable   | Count | Mean  | Variance | Observations |
|------------|-------|-------|----------|--------------|
| Variable 1 | 20    | 27.15 | 161.538  | 19           |
| Variable 2 | 20    | 11.95 | 219.3905 | 19           |

| t-Test: Paired Two Sample for Means | t-Test: Paired Two Sample for Means |                              |          |
|-------------------------------------|-------------------------------------|------------------------------|----------|
| Mean                                | 26.73684                            | Mean                         | 12.47368 |
| Variance                            | 161.538                             | Variance                     | 219.3905 |
| Observations                        | 19                                  | Observations                 | 19       |
| Pearson Correlation                 | -0.38129                            | Pearson Correlation          |          |
| Hypothesized Mean Difference        | 0                                   | Hypothesized Mean Difference |          |
| df                                  | 18                                  | df                           |          |
| t Stat                              | 2.714014                            | t Stat                       |          |
| P(T<=t) one-tail                    | 0.007111                            | P(T<=t) one-tail             |          |
| t Critical one-tail                 | 1.734094                            | t Critical one-tail          |          |
| P(T<=t) two-tail                    | 0.014222                            | P(T<=t) two-tail             |          |
| t Critical two-tail                 | 2.100922                            | t Critical two-tail          |          |



S1 and s2 are standard deviation and n1 and n2 is count or population size.

To draw conclusion about hypothesis we use the if condition. If  $t_{obs}(E_{20}) < t_{stat}(E_{14})$ , accept else reject.

The screenshot shows a Microsoft Excel spreadsheet with a t-test analysis. The data is organized in columns A through Q. The analysis includes sample means, standard deviations, and t-test results. A dialog box for the IF function is open, showing the logical test and the values to return if the test is true or false.

|    | A            | B          | C | D                                   | E        | F      | G  | H | I | J | K | L | M | N | O | P | Q |
|----|--------------|------------|---|-------------------------------------|----------|--------|----|---|---|---|---|---|---|---|---|---|---|
| 1  |              |            |   |                                     |          |        |    |   |   |   |   |   |   |   |   |   |   |
| 2  | Experimental | Comparison |   | Count1                              | 20       | Count2 | 20 |   |   |   |   |   |   |   |   |   |   |
| 3  | 35           | 2          |   | Mean1                               | 27.15    |        |    |   |   |   |   |   |   |   |   |   |   |
| 4  | 40           | 27         |   | s.d.1                               | 12.508   |        |    |   |   |   |   |   |   |   |   |   |   |
| 5  | 12           | 38         |   | t-Test: Paired Two Sample for Means |          |        |    |   |   |   |   |   |   |   |   |   |   |
| 6  | 15           | 31         |   |                                     |          |        |    |   |   |   |   |   |   |   |   |   |   |
| 7  | 21           | 1          |   |                                     | 35       |        |    |   |   |   |   |   |   |   |   |   |   |
| 8  | 14           | 19         |   | Mean                                | 26.73684 |        |    |   |   |   |   |   |   |   |   |   |   |
| 9  | 46           | 1          |   | Variance                            | 161.538  |        |    |   |   |   |   |   |   |   |   |   |   |
| 10 | 10           | 34         |   | Observat                            | 19       |        |    |   |   |   |   |   |   |   |   |   |   |
| 11 | 28           | 3          |   | Pearson C                           | -0.38129 |        |    |   |   |   |   |   |   |   |   |   |   |
| 12 | 48           | 1          |   | Hypothesi                           | 0        |        |    |   |   |   |   |   |   |   |   |   |   |
| 13 | 16           | 2          |   | df                                  | 18       |        |    |   |   |   |   |   |   |   |   |   |   |
| 14 | 30           | 3          |   | t Stat                              | 2.714014 |        |    |   |   |   |   |   |   |   |   |   |   |
| 15 | 32           | 2          |   | P(T<=t) on                          | 0.007111 |        |    |   |   |   |   |   |   |   |   |   |   |
| 16 | 48           | 1          |   | t Critical o                        | 1.734064 |        |    |   |   |   |   |   |   |   |   |   |   |
| 17 | 31           | 2          |   | P(T<=t) tw                          | 0.014222 |        |    |   |   |   |   |   |   |   |   |   |   |
| 18 | 22           | 1          |   | t Critical t                        | 2.109922 |        |    |   |   |   |   |   |   |   |   |   |   |
| 19 | 12           | 3          |   |                                     |          |        |    |   |   |   |   |   |   |   |   |   |   |
| 20 | 39           | 29         |   | Tobs                                | 3.534054 |        |    |   |   |   |   |   |   |   |   |   |   |
| 21 | 19           | 37         |   |                                     |          |        |    |   |   |   |   |   |   |   |   |   |   |
| 22 | 25           | 2          |   | Conclusion                          | ected")  |        |    |   |   |   |   |   |   |   |   |   |   |
| 23 | 543          | 239        |   |                                     |          |        |    |   |   |   |   |   |   |   |   |   |   |

Function Arguments

Logical\_test: E20:E14 = FALSE

Value\_if\_true: "Hypothesis Accepted" = "Hypothesis Accepted"

Value\_if\_false: "Hypothesis Rejected" = "Hypothesis Rejected"

Checks whether a condition is met, and returns one value if TRUE, and another value if FALSE.

Value\_if\_true is the value that is returned if Logical\_test is TRUE. If omitted, TRUE is returned. You can nest up to seven IF functions.

Formula result = Hypothesis Rejected

Help on this function

OK Cancel

P(T<=t) two-tail  
t Critical two-tail

|    | A            | B          | C   | D                                                                 | E        | F        | G                            | H | I | J | K | L | M | N | O | P | Q                                                                          |
|----|--------------|------------|-----|-------------------------------------------------------------------|----------|----------|------------------------------|---|---|---|---|---|---|---|---|---|----------------------------------------------------------------------------|
| 1  |              |            |     |                                                                   |          |          |                              |   |   |   |   |   |   |   |   |   |                                                                            |
| 2  | Experimental | Comparison |     | Count1                                                            | 20       | Count 2  | 20                           |   |   |   |   |   |   |   |   |   |                                                                            |
| 3  |              | 35         | 2   | Mean1                                                             | 27.15    | Mean2    | 11.95                        |   |   |   |   |   |   |   |   |   | H0: Difference in score is not likely the result of experimental treatment |
| 4  |              | 40         | 27  | s.d.1                                                             | 12.508   | s.d.2    | 14.61245                     |   |   |   |   |   |   |   |   |   | H1: Difference in score is likely the result of experimental treatment     |
| 5  |              | 12         | 38  | t-Test: Paired Two Sample for t-Test: Paired Two Sample for Means |          |          |                              |   |   |   |   |   |   |   |   |   |                                                                            |
| 6  |              | 15         | 31  |                                                                   |          |          |                              |   |   |   |   |   |   |   |   |   |                                                                            |
| 7  |              | 21         | 1   |                                                                   | 35       | 2        |                              |   |   |   |   |   |   |   |   |   |                                                                            |
| 8  |              | 14         | 19  | Mean                                                              | 26.73684 | 12.47368 | Mean                         |   |   |   |   |   |   |   |   |   |                                                                            |
| 9  |              | 46         | 1   | Variance                                                          | 161.538  | 219.5965 | Variance                     |   |   |   |   |   |   |   |   |   |                                                                            |
| 10 |              | 10         | 34  | Observati                                                         | 19       | 19       | Observations                 |   |   |   |   |   |   |   |   |   |                                                                            |
| 11 |              | 28         | 3   | Pearson C                                                         | -0.38129 |          | Pearson Correlation          |   |   |   |   |   |   |   |   |   |                                                                            |
| 12 |              | 48         | 1   | Hypothesi                                                         | 0        |          | Hypothesized Mean Difference |   |   |   |   |   |   |   |   |   |                                                                            |
| 13 |              | 16         | 2   | df                                                                | 18       |          | df                           |   |   |   |   |   |   |   |   |   |                                                                            |
| 14 |              | 30         | 3   | t Stat                                                            | 2.714014 |          | t Stat                       |   |   |   |   |   |   |   |   |   |                                                                            |
| 15 |              | 32         | 2   | P(T<=t) on                                                        | 0.007111 |          | P(T<=t) one-tail             |   |   |   |   |   |   |   |   |   |                                                                            |
| 16 |              | 48         | 1   | t Critical o                                                      | 1.734064 |          | t Critical one-tail          |   |   |   |   |   |   |   |   |   |                                                                            |
| 17 |              | 31         | 2   | P(T<=t) tw                                                        | 0.014222 |          | P(T<=t) two-tail             |   |   |   |   |   |   |   |   |   |                                                                            |
| 18 |              | 22         | 1   | t Critical t                                                      | 2.100922 |          | t Critical two-tail          |   |   |   |   |   |   |   |   |   |                                                                            |
| 19 |              | 12         | 3   |                                                                   |          |          |                              |   |   |   |   |   |   |   |   |   |                                                                            |
| 20 |              | 39         | 29  | Tobs                                                              | 3.594054 |          |                              |   |   |   |   |   |   |   |   |   |                                                                            |
| 21 |              | 19         | 37  |                                                                   |          |          |                              |   |   |   |   |   |   |   |   |   |                                                                            |
| 22 |              | 25         | 2   | Conclusion                                                        |          |          | Hypothesis Rejected          |   |   |   |   |   |   |   |   |   |                                                                            |
| 23 |              | 543        | 239 |                                                                   |          |          |                              |   |   |   |   |   |   |   |   |   |                                                                            |

C.

## D. Perform testing of hypothesis using paired t-test

### Code:

# -\*- coding: utf-8 -\*-

''''

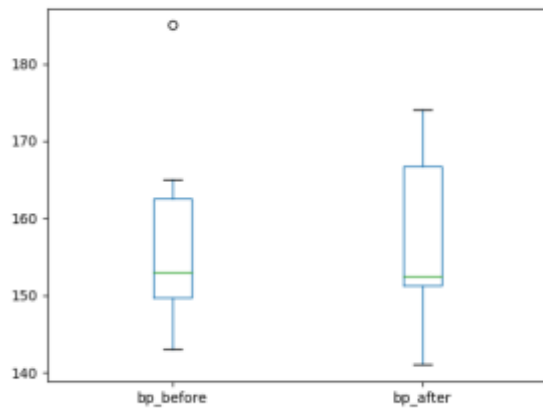
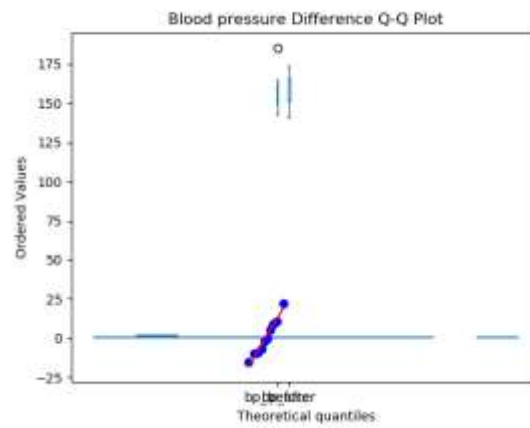
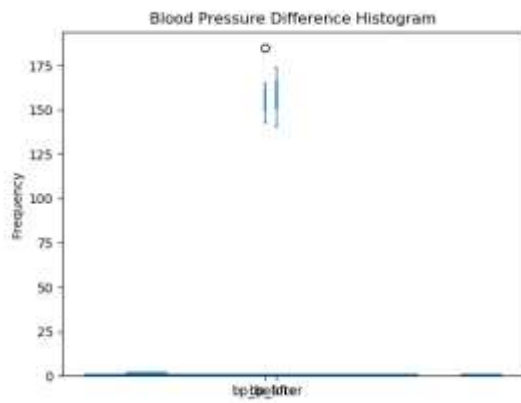
Created on Mon Dec 16 19:49:23 2019

@author: MyHome

''''

```
from scipy import stats
import matplotlib.pyplot as plt
import pandas as pd
df = pd.read_csv("blood_pressure.csv")
print(df[['bp_before', 'bp_after']].describe())
#First let's check for any significant outliers in
#each of the variables.
df[['bp_before', 'bp_after']].plot(kind='box')
# This saves the plot as a png file
plt.savefig('boxplot_outliers.png')
# make a histogram to differences between the two scores.
df['bp_difference'] = df['bp_before'] - df['bp_after']
df['bp_difference'].plot(kind='hist', title= 'Blood Pressure Difference Histogram')
#Again, this saves the plot as a png file
plt.savefig('blood pressure difference histogram.png')
stats.probplot(df['bp_difference'], plot= plt)
plt.title('Blood pressure Difference Q-Q Plot')
plt.savefig('blood pressure difference qq plot.png')
stats.shapiro(df['bp_difference'])
stats.ttest_rel(df['bp_before'], df['bp_after'])
```

## Output:



|       | bp_before  | bp_after   |
|-------|------------|------------|
| count | 10.000000  | 10.000000  |
| mean  | 157.000000 | 156.600000 |
| std   | 12.192894  | 11.529672  |
| min   | 143.000000 | 141.000000 |
| 25%   | 149.750000 | 151.250000 |
| 50%   | 153.000000 | 152.500000 |
| 75%   | 162.500000 | 166.750000 |
| max   | 185.000000 | 174.000000 |

>>> |



The screenshot shows the Microsoft Excel interface. The formula bar at the top displays the formula  $=B4-C4$ . The worksheet contains a table with the following data:

|   | System  | $O_i$ | $E_i$ | $O_i - E_i$ | $(O_i - E_i)^2$ |
|---|---------|-------|-------|-------------|-----------------|
| 4 | Windows | 20    | 33.33 | -13.33      | 177.7778        |
| 5 | Mac     | 60    | 33.33 | 26.67       |                 |
| 6 | Linux   | 20    | 33.33 | -13.33      |                 |
| 7 | Total   | 100   |       |             |                 |
| 8 | Count   | 3     |       |             |                 |

Calculate  $(O_i - E_i)^2$

The screenshot shows an Excel spreadsheet with the following data:

| System  | O <sub>i</sub> | E <sub>i</sub> | O <sub>i</sub> - E <sub>i</sub> | (O <sub>i</sub> - E <sub>i</sub> ) <sup>2</sup> |
|---------|----------------|----------------|---------------------------------|-------------------------------------------------|
| Windows | 20             | 33.33          | -13.33                          | 177.7778                                        |
| Mac     | 60             | 33.33          | 26.67                           | 711.1111                                        |
| Linux   | 20             | 33.33          | -13.33                          | 177.7778                                        |
| Total   | 100            |                |                                 |                                                 |
| Count   | 3              |                |                                 |                                                 |

The formula bar shows  $=D4*D4$  for cell E4.

Calculate sum of  $(O_i - E_i)^2$

E

The screenshot shows an Excel spreadsheet with the following data:

| System  | O <sub>i</sub> | E <sub>i</sub> | O <sub>i</sub> - E <sub>i</sub> | (O <sub>i</sub> - E <sub>i</sub> ) <sup>2</sup> |
|---------|----------------|----------------|---------------------------------|-------------------------------------------------|
| Windows | 20             | 33.33          | -13.33                          | 177.7778                                        |
| Mac     | 60             | 33.33          | 26.67                           | 711.1111                                        |
| Linux   | 20             | 33.33          | -13.33                          | 177.7778                                        |
| Total   | 100            |                |                                 | 1066.667                                        |
| Count   | 3              |                |                                 |                                                 |

The formula bar shows  $=D4*D4$  for cell E4.

Calculate Chi-square as  $(O_i - E_i)^2 / E_i$

The screenshot shows an Excel spreadsheet with the following data:

| System    | O <sub>i</sub> | E <sub>i</sub> | O <sub>i</sub> - E <sub>i</sub> | (O <sub>i</sub> - E <sub>i</sub> ) <sup>2</sup> |
|-----------|----------------|----------------|---------------------------------|-------------------------------------------------|
| Windows   | 20             | 33.33          | -13.33                          | 177.7778                                        |
| Mac       | 60             | 33.33          | 26.67                           | 711.1111                                        |
| Linux     | 20             | 33.33          | -13.33                          | 177.7778                                        |
| Total     | 100            |                |                                 | 1066.667                                        |
| Count     | 3              |                |                                 |                                                 |
| Chisq-obs | 32             |                |                                 |                                                 |

The formula bar shows  $=E7/C4$  for cell B10.

Calculate chi-squared tabled value using the CHINV function() where the probability is usually given as  $\alpha=0.05$  and degree of freedom is no of rows-1. In this case,  $3-1=2$ .

The screenshot shows the Microsoft Excel interface with the following data table:

| System    | O <sub>i</sub> | E <sub>i</sub> | O <sub>i</sub> -E <sub>i</sub> | (O <sub>i</sub> -E <sub>i</sub> ) <sup>2</sup> |
|-----------|----------------|----------------|--------------------------------|------------------------------------------------|
| Windows   | 20             | 33.33          | -13.33                         | 177.7778                                       |
| Mac       | 60             | 33.33          | 26.67                          | 711.1111                                       |
| Linux     | 20             | 33.33          | -13.33                         | 177.7778                                       |
| Total     | 100            |                |                                | 1066.667                                       |
| Count     | 3              |                |                                |                                                |
| Chisq-obs | 32             |                |                                |                                                |

The formula bar shows the active cell A12 with the formula `=`. The **Insert Function** dialog box is open, showing the search results for `chiinv`. The function `CHINV` is selected from the list. The description states: **CHINV(probability,deg\_freedom)** Returns the inverse of the one-tailed probability of the chi-squared distribution.

The screenshot shows the same Excel interface with the formula `=CHINV(.05,2)` entered in cell A12. The **Function Arguments** dialog box is open for the `CHINV` function. The arguments are:

- Probability:** .05 (displayed as 0.05)
- Deg\_freedom:** 2 (displayed as 2)

The dialog box also shows the formula result: `= 5.991464547`. The description states: Returns the inverse of the one-tailed probability of the chi-squared distribution. **Deg\_freedom** is the number of degrees of freedom, a number between 1 and  $10^{10}$ , excluding  $10^{10}$ .

Finally, draw the conclusion.

The screenshot shows Microsoft Excel with a Chi-Square test calculation. The formula bar displays  $=IF(B10>A13,"Hypothesis Accepted","Hypothesis Rejected")$ . The spreadsheet data is as follows:

| System    | O <sub>i</sub> | E <sub>i</sub> | O <sub>i</sub> -E <sub>i</sub> | (O <sub>i</sub> -E <sub>i</sub> ) <sup>2</sup> |
|-----------|----------------|----------------|--------------------------------|------------------------------------------------|
| Windows   | 20             | 33.33          | -13.33                         | 177.7778                                       |
| Mac       | 60             | 33.33          | 26.67                          | 711.1111                                       |
| Linux     | 20             | 33.33          | -13.33                         | 177.7778                                       |
| Total     | 100            |                |                                | 1066.667                                       |
| Count     | 3              |                |                                |                                                |
| Chisq-obs | 32             |                |                                |                                                |
| 5.991465  |                |                |                                |                                                |

The IF function dialog box is open, showing the following arguments:

- Logical\_test:** B10>A13 = TRUE
- Value\_if\_true:** "Hypothesis Accepted" = "Hypothesis Accepted"
- Value\_if\_false:** "Hypothesis Rejected" = "Hypothesis Rejected"

The formula result is "Hypothesis Accepted".

The screenshot shows the final conclusion of the Chi-Square test. The spreadsheet data is as follows:

| System     | O <sub>i</sub> | E <sub>i</sub> | O <sub>i</sub> -E <sub>i</sub> | (O <sub>i</sub> -E <sub>i</sub> ) <sup>2</sup> |
|------------|----------------|----------------|--------------------------------|------------------------------------------------|
| Windows    | 20             | 33.33          | -13.33                         | 177.7778                                       |
| Mac        | 60             | 33.33          | 26.67                          | 711.1111                                       |
| Linux      | 20             | 33.33          | -13.33                         | 177.7778                                       |
| Total      | 100            |                |                                | 1066.667                                       |
| Count      | 3              |                |                                |                                                |
| Chisq-obs  | 32             |                |                                |                                                |
| 5.991465   |                |                |                                |                                                |
| Conclusion |                |                | Hypothesis Accepted            |                                                |

The conclusion is "Hypothesis Accepted".

### **B. Perform testing of hypothesis using chi-squared test of independence**

In a study to understand the performance of M. Sc. IT Part -1 class, a college selects a random sample of 20 students. Each student was asked his grade obtained in B. Sc.IT . The sample is as given below

| Sr | Rno | Name             | Gender | Grade |
|----|-----|------------------|--------|-------|
| 1  | 1   | BALAKRISHNAN     | M      | B     |
| 2  | 2   | DURGESH          | M      | A     |
| 3  | 3   | AKSHAY           | M      | D     |
| 4  | 4   | PRAVIN           | M      | C     |
| 5  | 5   | SNEHA KOLI       | F      | B     |
| 6  | 6   | SWATI            | F      | A     |
| 7  | 7   | ANUSHKA          | F      | C     |
| 8  | 8   | SOMNATH          | M      | A     |
| 9  | 9   | SUPRIYA          | F      | A     |
| 10 | 10  | MARISH           | M      | D     |
| 11 | 11  | SNEHAL<br>MOHITE | F      | D     |
| 12 | 12  | KARTHIK          | M      | B     |
| 13 | 13  | DURGESHREE       | F      | O     |
| 14 | 14  | ANKITA           | F      | O     |
| 15 | 15  | TEJAS            | M      | B     |
| 16 | 16  | BHAVANA          | F      | O     |
| 17 | 17  | NAVNEET          | F      | O     |
| 18 | 18  | ABDUL            | M      | D     |
| 19 | 19  | POOJA            | F      | A     |
| 20 | 20  | JAYANTHI         | F      | D     |

**Null Hypothesis - H<sub>0</sub> :** The performance of girls students is same as boys students.

**Alternate Hypothesis - H<sub>1</sub> :** The performance of boys and girls students are different .

**Solution:**

We start by calculating the number of male students who got O,A,B,C and D grade respectively. We use the COUNTIFS() function in Excel for the same. COUNTIFS() can work on multiple conditions.

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COUNTIFS =COUNTIFS(\$D\$2:\$D\$21,"M",\$E\$2:\$E\$21,"A")

|    | A  | B   | C             | D      | E     | F      | G      | H | I | J | K     | L | M | N | O | P |
|----|----|-----|---------------|--------|-------|--------|--------|---|---|---|-------|---|---|---|---|---|
| 1  | Sr | Rno | Name          | Gender | Grade |        |        |   |   |   | Total |   |   |   |   |   |
| 2  | 1  | 1   | BALAKRISHNAN  | M      | B     | Male   | 21,"A" |   |   |   |       |   |   |   |   |   |
| 3  | 2  | 2   | DURGESH       | M      | A     | Female |        |   |   |   |       |   |   |   |   |   |
| 4  | 3  | 3   | AKSHAY        | M      | D     | Total  |        |   |   |   |       |   |   |   |   |   |
| 5  | 4  | 4   | PRAVIN        | M      | C     |        |        |   |   |   |       |   |   |   |   |   |
| 6  | 5  | 5   | SNEHA KOLI    | F      | B     |        |        |   |   |   |       |   |   |   |   |   |
| 7  | 6  | 6   | SWATI         | F      | A     |        |        |   |   |   |       |   |   |   |   |   |
| 8  | 7  | 7   | ANUSHKA       | F      | C     |        |        |   |   |   |       |   |   |   |   |   |
| 9  | 8  | 8   | SOMNATH       | M      | A     |        |        |   |   |   |       |   |   |   |   |   |
| 10 | 9  | 9   | SUPRIYA       | F      | A     |        |        |   |   |   |       |   |   |   |   |   |
| 11 | 10 | 10  | MARISH        | M      | D     |        |        |   |   |   |       |   |   |   |   |   |
| 12 | 11 | 11  | SNEHAL MOHITE | F      | D     |        |        |   |   |   |       |   |   |   |   |   |
| 13 | 12 | 12  | KARTHIK       | M      | B     |        |        |   |   |   |       |   |   |   |   |   |
| 14 | 13 | 13  | DURGESHREE    | F      | O     |        |        |   |   |   |       |   |   |   |   |   |
| 15 | 14 | 14  | ANKITA        | F      | O     |        |        |   |   |   |       |   |   |   |   |   |
| 16 | 15 | 15  | TEJAS         | M      | B     |        |        |   |   |   |       |   |   |   |   |   |
| 17 | 16 | 16  | BHAVANA       | F      | O     |        |        |   |   |   |       |   |   |   |   |   |
| 18 | 17 | 17  | NAVNEET       | F      | O     |        |        |   |   |   |       |   |   |   |   |   |
| 19 | 18 | 18  | ABDUL         | M      | D     |        |        |   |   |   |       |   |   |   |   |   |
| 20 | 19 | 19  | POOJA         | F      | A     |        |        |   |   |   |       |   |   |   |   |   |
| 21 | 20 | 20  | JAYANTHI      | F      | D     |        |        |   |   |   |       |   |   |   |   |   |

Function Arguments

COUNTIFS

Criteria\_range1: \$D\$2:\$D\$21 = (M;M;M;M;M;F;F;F;M;F;...)

Criteria1: "M" = "M"

Criteria\_range2: \$E\$2:\$E\$21 = (B;A;D;C;B;A;C;A;A;...)

Criteria2: "A" = "A"

= 2

Counts the number of cells specified by a given set of conditions or criteria.

Criteria\_range1: is the range of cells you want evaluated for the particular condition.

Formula result = 2

Help on this function

OK Cancel

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G2 =COUNTIFS(\$D\$2:\$D\$21,"M",\$E\$2:\$E\$21,"A")

|    | A  | B   | C             | D      | E     | F      | G | H | I | J | K |
|----|----|-----|---------------|--------|-------|--------|---|---|---|---|---|
| 1  | Sr | Rno | Name          | Gender | Grade |        |   |   |   |   |   |
| 2  | 1  | 1   | BALAKRISHNAN  | M      | B     | Male   | 2 | 3 | 1 | 2 |   |
| 3  | 2  | 2   | DURGESH       | M      | A     | Female | 3 | 0 | 0 | 3 |   |
| 4  | 3  | 3   | AKSHAY        | M      | D     | Total  |   |   |   |   |   |
| 5  | 4  | 4   | PRAVIN        | M      | C     |        |   |   |   |   |   |
| 6  | 5  | 5   | SNEHA KOLI    | F      | B     |        |   |   |   |   |   |
| 7  | 6  | 6   | SWATI         | F      | A     |        |   |   |   |   |   |
| 8  | 7  | 7   | ANUSHKA       | F      | C     |        |   |   |   |   |   |
| 9  | 8  | 8   | SOMNATH       | M      | A     |        |   |   |   |   |   |
| 10 | 9  | 9   | SUPRIYA       | F      | A     |        |   |   |   |   |   |
| 11 | 10 | 10  | MARISH        | M      | D     |        |   |   |   |   |   |
| 12 | 11 | 11  | SNEHAL MOHITE | F      | D     |        |   |   |   |   |   |
| 13 | 12 | 12  | KARTHIK       | M      | B     |        |   |   |   |   |   |
| 14 | 13 | 13  | DURGESHREE    | F      | O     |        |   |   |   |   |   |
| 15 | 14 | 14  | ANKITA        | F      | O     |        |   |   |   |   |   |
| 16 | 15 | 15  | TEJAS         | M      | B     |        |   |   |   |   |   |
| 17 | 16 | 16  | BHAVANA       | F      | O     |        |   |   |   |   |   |
| 18 | 17 | 17  | NAVNEET       | F      | O     |        |   |   |   |   |   |
| 19 | 18 | 18  | ABDUL         | M      | D     |        |   |   |   |   |   |
| 20 | 19 | 19  | POOJA         | F      | A     |        |   |   |   |   |   |
| 21 | 20 | 20  | JAYANTHI      | F      | D     |        |   |   |   |   |   |





The observed chi-sq is calculated as the sum of the last column.

| Sr | Rno | Name             | Gender | Grade | O              | A              | B                              | C                                           | D                                                           | Total |
|----|-----|------------------|--------|-------|----------------|----------------|--------------------------------|---------------------------------------------|-------------------------------------------------------------|-------|
| 1  | 1   | 1 BALAKRISHNAN   | M      | B     | Male           | 0              | 2                              | 3                                           | 1                                                           | 3     |
| 2  | 2   | 2 DURGESH        | M      | A     | Female         | 4              | 3                              | 1                                           | 1                                                           | 2     |
| 3  | 3   | 3 AKSHAY         | M      | D     | Total          | 4              | 5                              | 4                                           | 2                                                           | 5     |
| 4  | 4   | 4 PRAVIN         | M      | C     |                |                |                                |                                             |                                                             |       |
| 5  | 5   | 5 SNEHA KOLI     | F      | B     | O <sub>i</sub> | E <sub>i</sub> | O <sub>i</sub> -E <sub>i</sub> | O <sub>i</sub> -E <sub>i</sub> <sup>2</sup> | O <sub>i</sub> -E <sub>i</sub> <sup>2</sup> /E <sub>i</sub> |       |
| 6  | 6   | 6 SWATI          | F      | A     | 0              | 8.8            | -8.8                           | 77.44                                       | 8.8                                                         |       |
| 7  | 7   | 7 ANUSHKA        | F      | C     | 2              | 8.75           | -6.75                          | 45.5625                                     | 5.207143                                                    |       |
| 8  | 8   | 8 SOMNATH        | M      | A     | 3              | 8.8            | -5.8                           | 33.64                                       | 3.822727                                                    |       |
| 9  | 9   | 9 SUPRIYA        | F      | A     | 1              | 8.9            | -7.9                           | 62.41                                       | 7.01236                                                     |       |
| 10 | 10  | 10 MARISH        | M      | D     | 3              | 8.75           | -5.75                          | 33.0625                                     | 3.778571                                                    |       |
| 11 | 11  | 11 SNEHAL MOHITE | F      | D     | 4              | 10.8           | -6.8                           | 46.24                                       | 4.281481                                                    |       |
| 12 | 12  | 12 KARTHIK       | M      | B     | 3              | 10.75          | -7.75                          | 60.0625                                     | 5.587209                                                    |       |
| 13 | 13  | 13 DURGESHREE    | F      | O     | 1              | 10.8           | -9.8                           | 96.04                                       | 8.892593                                                    |       |
| 14 | 14  | 14 ANKITA        | F      | O     | 1              | 10.9           | -9.9                           | 98.01                                       | 8.991743                                                    |       |
| 15 | 15  | 15 TEJAS         | M      | B     | 2              | 10.75          | -8.75                          | 76.5625                                     | 7.122093                                                    |       |
| 16 | 16  | 16 BHAVANA       | F      | O     |                |                |                                |                                             |                                                             |       |
| 17 | 17  | 17 NAVNEET       | F      | O     |                |                |                                |                                             |                                                             |       |
| 18 | 18  | 18 ABDUL         | M      | D     |                |                |                                |                                             |                                                             |       |
| 19 | 19  | 19 POOJA         | F      | A     |                |                |                                |                                             |                                                             |       |
| 20 | 20  | 20 JAYANTHI      | F      | D     |                |                |                                |                                             |                                                             |       |

The tabulated bhi sq is calculated using Chi-inv. The df is no of rows-1\* no of cols-1.

| Sr | Rno | Name             | Gender | Grade | O              | A              | B                              | C                                           | D                                                           | Total |
|----|-----|------------------|--------|-------|----------------|----------------|--------------------------------|---------------------------------------------|-------------------------------------------------------------|-------|
| 1  | 1   | 1 BALAKRISHNAN   | M      | B     | Male           | 0              | 2                              | 3                                           | 1                                                           | 3     |
| 2  | 2   | 2 DURGESH        | M      | A     | Female         | 4              | 3                              | 1                                           | 1                                                           | 2     |
| 3  | 3   | 3 AKSHAY         | M      | D     | Total          | 4              | 5                              | 4                                           | 2                                                           | 5     |
| 4  | 4   | 4 PRAVIN         | M      | C     |                |                |                                |                                             |                                                             |       |
| 5  | 5   | 5 SNEHA KOLI     | F      | B     | O <sub>i</sub> | E <sub>i</sub> | O <sub>i</sub> -E <sub>i</sub> | O <sub>i</sub> -E <sub>i</sub> <sup>2</sup> | O <sub>i</sub> -E <sub>i</sub> <sup>2</sup> /E <sub>i</sub> |       |
| 6  | 6   | 6 SWATI          | F      | A     | 0              | 8.8            | -8.8                           | 77.44                                       | 8.8                                                         |       |
| 7  | 7   | 7 ANUSHKA        | F      | C     | 2              | 8.75           | -6.75                          | 45.5625                                     | 5.207143                                                    |       |
| 8  | 8   | 8 SOMNATH        | M      | A     | 3              | 8.8            | -5.8                           | 33.64                                       | 3.822727                                                    |       |
| 9  | 9   | 9 SUPRIYA        | F      | A     | 1              | 8.9            | -7.9                           | 62.41                                       | 7.01236                                                     |       |
| 10 | 10  | 10 MARISH        | M      | D     | 3              | 8.75           | -5.75                          | 33.0625                                     | 3.778571                                                    |       |
| 11 | 11  | 11 SNEHAL MOHITE | F      | D     | 4              | 10.8           | -6.8                           | 46.24                                       | 4.281481                                                    |       |
| 12 | 12  | 12 KARTHIK       | M      | B     | 3              | 10.75          | -7.75                          | 60.0625                                     | 5.587209                                                    |       |
| 13 | 13  | 13 DURGESHREE    | F      | O     | 1              | 10.8           | -9.8                           | 96.04                                       | 8.892593                                                    |       |
| 14 | 14  | 14 ANKITA        | F      | O     | 1              | 10.9           | -9.9                           | 98.01                                       | 8.991743                                                    |       |
| 15 | 15  | 15 TEJAS         | M      | B     | 2              | 10.75          | -8.75                          | 76.5625                                     | 7.122093                                                    |       |
| 16 | 16  | 16 BHAVANA       | F      | O     |                |                |                                |                                             |                                                             |       |
| 17 | 17  | 17 NAVNEET       | F      | O     |                |                |                                |                                             |                                                             |       |
| 18 | 18  | 18 ABDUL         | M      | D     |                |                |                                |                                             |                                                             |       |
| 19 | 19  | 19 POOJA         | F      | A     |                |                |                                |                                             |                                                             |       |
| 20 | 20  | 20 JAYANTHI      | F      | D     |                |                |                                |                                             |                                                             |       |



Microsoft Excel - RC\_XL

Formulas > IF (D7>H20,"Hypothesis Accepted","Hypothesis Rejected")

Function Arguments

Logical\_test: D7>H20 = TRUE

Value\_if\_true: "Hypothesis Accepted" = "Hypothesis Accepted"

Value\_if\_false: "Hypothesis Rejected" = "Hypothesis Rejected"

Formula result: = Hypothesis Accepted

OK Cancel

| Sr | Rno | Name          | Gender | Grade | O          | A       | B        | C       | D          | Total    |
|----|-----|---------------|--------|-------|------------|---------|----------|---------|------------|----------|
| 1  | 1   | BALAKRISHNAN  | M      | B     | Male       | 0       | 2        | 3       | 1          | 9        |
| 2  | 2   | DURGESH       | M      | A     | Female     | 4       | 3        | 1       | 1          | 11       |
| 3  | 3   | AKSHAY        | M      | D     | Total      | 4       | 5        | 4       | 2          | 20       |
| 4  | 4   | PRAVIN        | M      | C     |            |         |          |         |            |          |
| 5  | 5   | SNEHA KOLI    | F      | B     | OI         | EI      | OI-EI    | OI-EI^2 | OI-EI^2/EI |          |
| 6  | 6   | SWATI         | F      | A     | 0          | 8.8     | -8.8     | 77.44   | 8.8        |          |
| 7  | 7   | ANUSHKA       | F      | C     | 2          | 8.75    | -6.75    | 45.5625 | 5.207143   |          |
| 8  | 8   | SOMNATH       | M      | A     | 3          | 8.8     | -5.8     | 33.64   | 3.822727   |          |
| 9  | 9   | SUPRIYA       | F      | A     | 1          | 8.9     | -7.9     | 62.41   | 7.01236    |          |
| 10 | 10  | MARISH        | M      | D     | 3          | 8.75    | -5.75    | 33.0625 | 3.778571   |          |
| 11 | 11  | SNEHAL MOHITE | F      | D     | 4          | 10.8    | -6.8     | 46.24   | 4.281481   |          |
| 12 | 12  | KARTHIK       | M      | B     | 3          | 10.75   | -7.75    | 60.0625 | 5.587209   |          |
| 13 | 13  | DURGESHREE    | F      | O     | 1          | 10.8    | -9.8     | 96.04   | 8.892593   |          |
| 14 | 14  | ANKITA        | F      | O     | 1          | 10.9    | -9.9     | 98.01   | 8.991743   |          |
| 15 | 15  | TEJAS         | M      | B     | 2          | 10.75   | -8.75    | 76.5625 | 7.122093   |          |
| 16 | 16  | BHAVANA       | F      | O     |            |         |          | chi-sq  | 63.49592   |          |
| 17 | 17  | NAVNEET       | F      | O     |            |         |          |         |            |          |
| 18 | 18  | ABDUL         | M      | D     |            |         |          |         |            |          |
| 19 | 19  | POOJA         | F      | A     |            | chi-inv | 9.487729 |         |            |          |
| 20 | 20  | JAYANTHI      | F      | D     |            |         |          |         |            |          |
| 21 |     |               |        |       | Conclusion |         |          |         |            | Accepted |

Microsoft Excel - RC\_XL

| Sr | Rno | Name          | Gender | Grade | O          | A       | B        | C       | D          | Total               |
|----|-----|---------------|--------|-------|------------|---------|----------|---------|------------|---------------------|
| 1  | 1   | BALAKRISHNAN  | M      | B     | Male       | 0       | 2        | 3       | 1          | 9                   |
| 2  | 2   | DURGESH       | M      | A     | Female     | 4       | 3        | 1       | 1          | 11                  |
| 3  | 3   | AKSHAY        | M      | D     | Total      | 4       | 5        | 4       | 2          | 20                  |
| 4  | 4   | PRAVIN        | M      | C     |            |         |          |         |            |                     |
| 5  | 5   | SNEHA KOLI    | F      | B     | OI         | EI      | OI-EI    | OI-EI^2 | OI-EI^2/EI |                     |
| 6  | 6   | SWATI         | F      | A     | 0          | 8.8     | -8.8     | 77.44   | 8.8        |                     |
| 7  | 7   | ANUSHKA       | F      | C     | 2          | 8.75    | -6.75    | 45.5625 | 5.207143   |                     |
| 8  | 8   | SOMNATH       | M      | A     | 3          | 8.8     | -5.8     | 33.64   | 3.822727   |                     |
| 9  | 9   | SUPRIYA       | F      | A     | 1          | 8.9     | -7.9     | 62.41   | 7.01236    |                     |
| 10 | 10  | MARISH        | M      | D     | 3          | 8.75    | -5.75    | 33.0625 | 3.778571   |                     |
| 11 | 11  | SNEHAL MOHITE | F      | D     | 4          | 10.8    | -6.8     | 46.24   | 4.281481   |                     |
| 12 | 12  | KARTHIK       | M      | B     | 3          | 10.75   | -7.75    | 60.0625 | 5.587209   |                     |
| 13 | 13  | DURGESHREE    | F      | O     | 1          | 10.8    | -9.8     | 96.04   | 8.892593   |                     |
| 14 | 14  | ANKITA        | F      | O     | 1          | 10.9    | -9.9     | 98.01   | 8.991743   |                     |
| 15 | 15  | TEJAS         | M      | B     | 2          | 10.75   | -8.75    | 76.5625 | 7.122093   |                     |
| 16 | 16  | BHAVANA       | F      | O     |            |         |          | chi-sq  | 63.49592   |                     |
| 17 | 17  | NAVNEET       | F      | O     |            |         |          |         |            |                     |
| 18 | 18  | ABDUL         | M      | D     |            |         |          |         |            |                     |
| 19 | 19  | POOJA         | F      | A     |            | chi-inv | 9.487729 |         |            |                     |
| 20 | 20  | JAYANTHI      | F      | D     |            |         |          |         |            |                     |
| 21 |     |               |        |       | Conclusion |         |          |         |            | Hypothesis Accepted |

## Practical No 5

**Aim:** Perform testing of hypothesis using Z-test.

### **Program Code for one-sample Z test.**

#### **Code:**

```
from statsmodels.stats import weightstats as stests
import pandas as pd
from scipy import stats
df = pd.read_csv("blood_pressure.csv")
df[['bp_before', 'bp_after']].describe()
print(df)
ztest ,pval = stests.ztest(df['bp_before'], x2=None, value=156)
print(float(pval))
if pval<0.05:
    print("reject null hypothesis")
else:
    print("accept null hypothesis")
```

#### **Output:**

```
Patient  gender agegrp  bp_before  bp_after
0         1   Male   30-45         143         153
1         2   Male   30-45         163         170
2         3   Male   45-60         153         168
3         4   Male   45-60         153         142
4         5   Male    60+         146         141
5         6  Female   30-45         152         152
6         7  Female   30-45         161         152
7         8  Female   45-60         165         174
8         9  Female   45-60         149         151
9        10  Female    60+         185         163
0.795362004282681
accept null hypothesis
>>> |
```

### **Two-sample Z test**

#### **Code:**

```
import pandas as pd
from statsmodels.stats import weightstats as stests
df = pd.read_csv("blood_pressure.csv")
df[['bp_before', 'bp_after']].describe()
print(df)
ztest ,pval = stests.ztest(df['bp_before'], x2=df['bp_after'], value=0)
print(float(pval))
if pval<0.05:
```

```
print("reject null hypothesis")
else:
    print("accept null hypothesis")
```

### **Output:**

Taking value = 156

```
    Patient  gender agegrp  bp_before  bp_after
0         1    Male  30-45        143        153
1         2    Male  30-45        163        170
2         3    Male  45-60        153        168
3         4    Male  45-60        153        142
4         5    Male   60+        146        141
5         6  Female  30-45        152        152
6         7  Female  30-45        161        152
7         8  Female  45-60        165        174
8         9  Female  45-60        149        151
9        10  Female   60+        185        163
5.4416896169443565e-189
reject null hypothesis
>>>
```

Taking value = 0

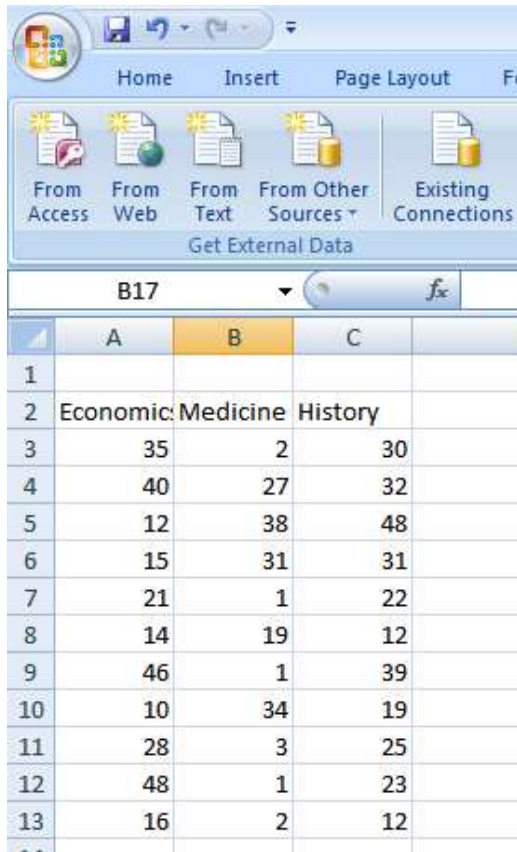
```
RESTART: D:\D-Drive\SIES\Msc IT\Msc IT (Part-1)\Pra
Material\5_2.py
    Patient  gender agegrp  bp_before  bp_after
0         1    Male  30-45        143        153
1         2    Male  30-45        163        170
2         3    Male  45-60        153        168
3         4    Male  45-60        153        142
4         5    Male   60+        146        141
5         6  Female  30-45        152        152
6         7  Female  30-45        161        152
7         8  Female  45-60        165        174
8         9  Female  45-60        149        151
9        10  Female   60+        185        163
0.9399140932267469
accept null hypothesis
>>> |
```

## Practical No 6

### A. Perform testing of hypothesis using One -way ANOVA.

Solution:

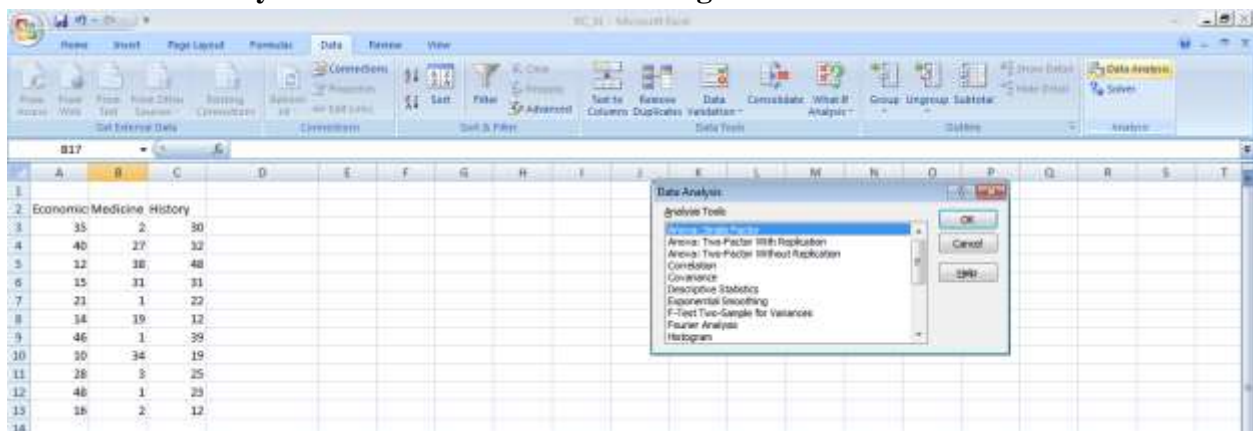
Data is given.

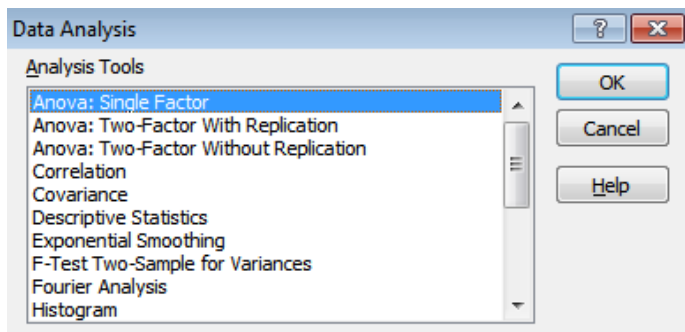


The screenshot shows the 'Get External Data' ribbon in Microsoft Excel. Below the ribbon, a data table is displayed with columns A, B, and C. The data is as follows:

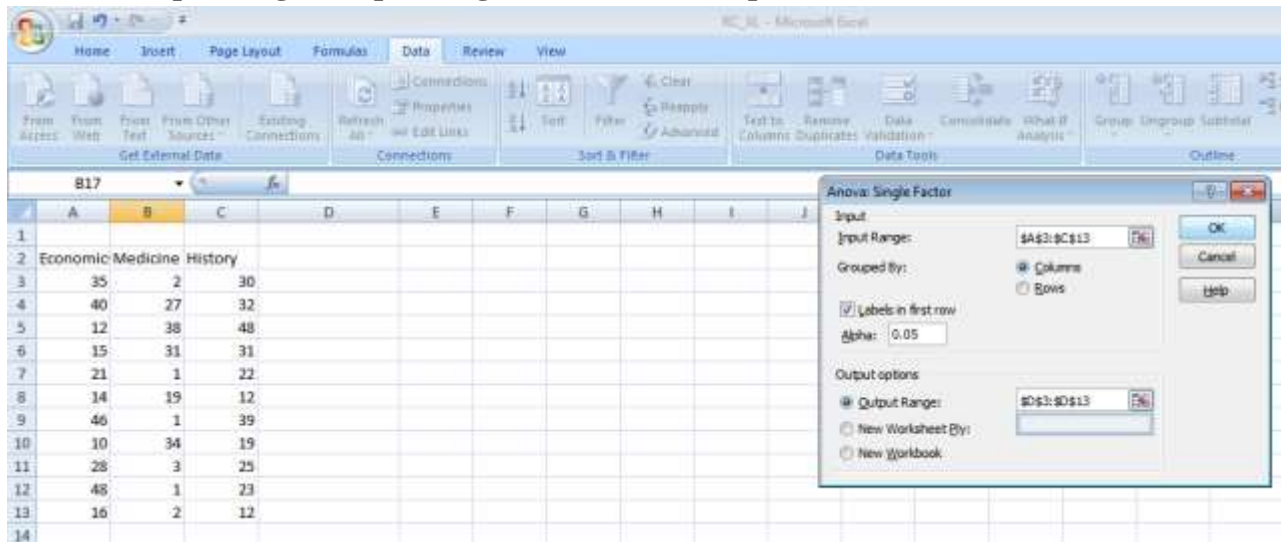
|    | A        | B        | C       |
|----|----------|----------|---------|
| 1  |          |          |         |
| 2  | Economic | Medicine | History |
| 3  | 35       | 2        | 30      |
| 4  | 40       | 27       | 32      |
| 5  | 12       | 38       | 48      |
| 6  | 15       | 31       | 31      |
| 7  | 21       | 1        | 22      |
| 8  | 14       | 19       | 12      |
| 9  | 46       | 1        | 39      |
| 10 | 10       | 34       | 19      |
| 11 | 28       | 3        | 25      |
| 12 | 48       | 1        | 23      |
| 13 | 16       | 2        | 12      |

Click on data analysis tool and select ANOVA:Single Factor





Select the input range, Output range and define the Alpha value. Click OK.



RC\_XL - Microsoft Excel

Home Insert Page Layout Formulas Data Review View

From Access From Web From Text From Other Sources Existing Connections Refresh All Properties Edit Links Connections Sort & Filter Filter Reapply Advanced Text to Columns Remove Duplicates

D3 Anova: Single Factor

|    | A        | B        | C       | D | E | F | G | H | I | J |
|----|----------|----------|---------|---|---|---|---|---|---|---|
| 1  |          |          |         |   |   |   |   |   |   |   |
| 2  | Economic | Medicine | History |   |   |   |   |   |   |   |
| 3  | 35       | 2        | 30      |   |   |   |   |   |   |   |
| 4  | 40       | 27       | 32      |   |   |   |   |   |   |   |
| 5  | 12       | 38       | 48      |   |   |   |   |   |   |   |
| 6  | 15       | 31       | 31      |   |   |   |   |   |   |   |
| 7  | 21       | 1        | 22      |   |   |   |   |   |   |   |
| 8  | 14       | 19       | 12      |   |   |   |   |   |   |   |
| 9  | 46       | 1        | 39      |   |   |   |   |   |   |   |
| 10 | 10       | 34       | 19      |   |   |   |   |   |   |   |
| 11 | 28       | 3        | 25      |   |   |   |   |   |   |   |
| 12 | 48       | 1        | 23      |   |   |   |   |   |   |   |
| 13 | 16       | 2        | 12      |   |   |   |   |   |   |   |
| 14 |          |          |         |   |   |   |   |   |   |   |

| Anova: Single Factor |          |     |          |          |          |          |  |
|----------------------|----------|-----|----------|----------|----------|----------|--|
| SUMMARY              |          |     |          |          |          |          |  |
| Groups               | Count    | Sum | Average  | Variance |          |          |  |
| 35                   | 10       | 250 | 25       | 212.8889 |          |          |  |
| 2                    | 10       | 157 | 15.7     | 244.6778 |          |          |  |
| 30                   | 10       | 263 | 26.3     | 131.1222 |          |          |  |
| ANOVA                |          |     |          |          |          |          |  |
| Source of Variation  | SS       | df  | MS       | F        | P-value  | F crit   |  |
| Between Groups       | 668.4667 | 2   | 334.2333 | 1.703277 | 0.201073 | 3.354131 |  |
| Within Groups        | 5298.2   | 27  | 196.2296 |          |          |          |  |
| Total                | 5966.667 | 29  |          |          |          |          |  |



Since the p values greater than 0.05. Hypothesis is Rejected.

The screenshot shows Microsoft Excel with the following data and formula:

| Groups | Count | Sum | Average | Variance |
|--------|-------|-----|---------|----------|
| 35     | 10    | 250 | 25      | 212.8889 |
| 2      | 10    | 157 | 15.7    | 244.6778 |
| 30     | 10    | 263 | 26.3    | 131.1222 |

| Source of Variation | SS       | df | MS       | F        | P-value  | F crit   |
|---------------------|----------|----|----------|----------|----------|----------|
| Between Groups      | 668.4667 | 2  | 334.2333 | 1.703277 | 0.201073 | 3.354131 |
| Within Groups       | 5298.2   | 27 | 196.2296 |          |          |          |
| Total               | 5966.667 | 29 |          |          |          |          |

The formula bar shows: `=IF(I14<0.05,"Hypothesis Accepted","Hypothesis Rejected")`

The IF function dialog box is open, showing the following arguments:

- Logical\_test: `I14<0.05`
- Value\_if\_true: `"Hypothesis Accepted"`
- Value\_if\_false: `"Hypothesis Rejected"`

The formula result is: `"Hypothesis Rejected"`

The screenshot shows Microsoft Excel with the following data and conclusion:

| Groups | Count | Sum | Average | Variance |
|--------|-------|-----|---------|----------|
| 35     | 10    | 250 | 25      | 212.8889 |
| 2      | 10    | 157 | 15.7    | 244.6778 |
| 30     | 10    | 263 | 26.3    | 131.1222 |

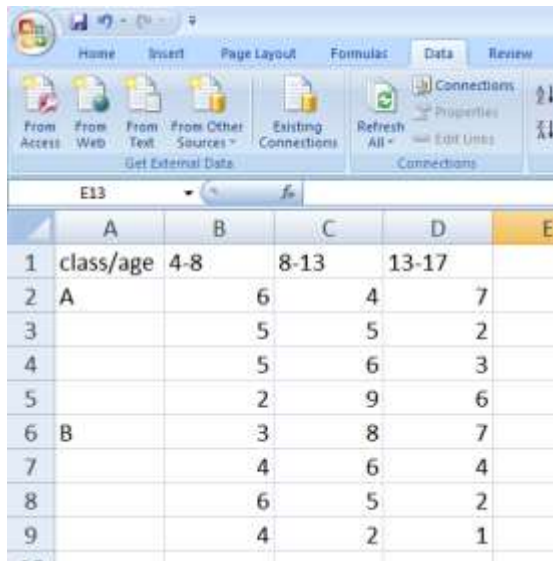
| Source of Variation | SS       | df | MS       | F        | P-value  | F crit   |
|---------------------|----------|----|----------|----------|----------|----------|
| Between Groups      | 668.4667 | 2  | 334.2333 | 1.703277 | 0.201073 | 3.354131 |
| Within Groups       | 5298.2   | 27 | 196.2296 |          |          |          |
| Total               | 5966.667 | 29 |          |          |          |          |

The conclusion in cell I20 is: `Hypothesis Rejected`

## B. Perform testing of hypothesis using Two -way ANOVA.

**Solution:**

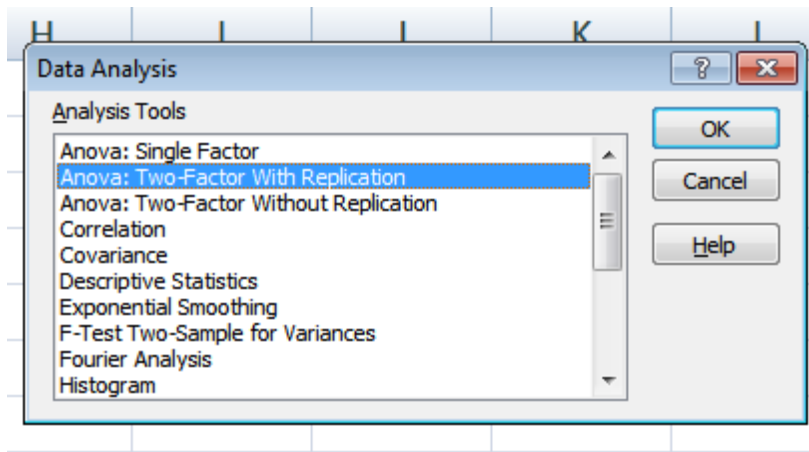
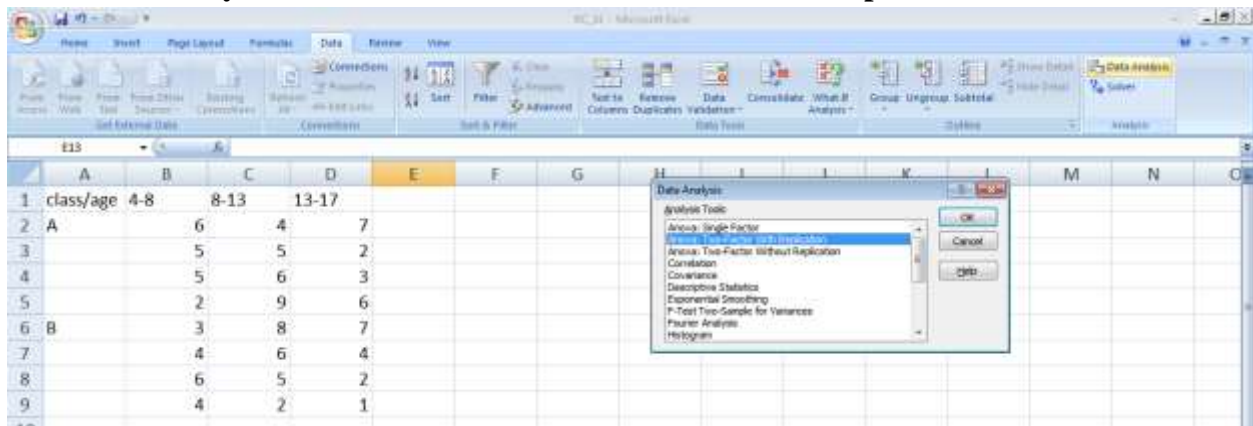
**Given Data Set**



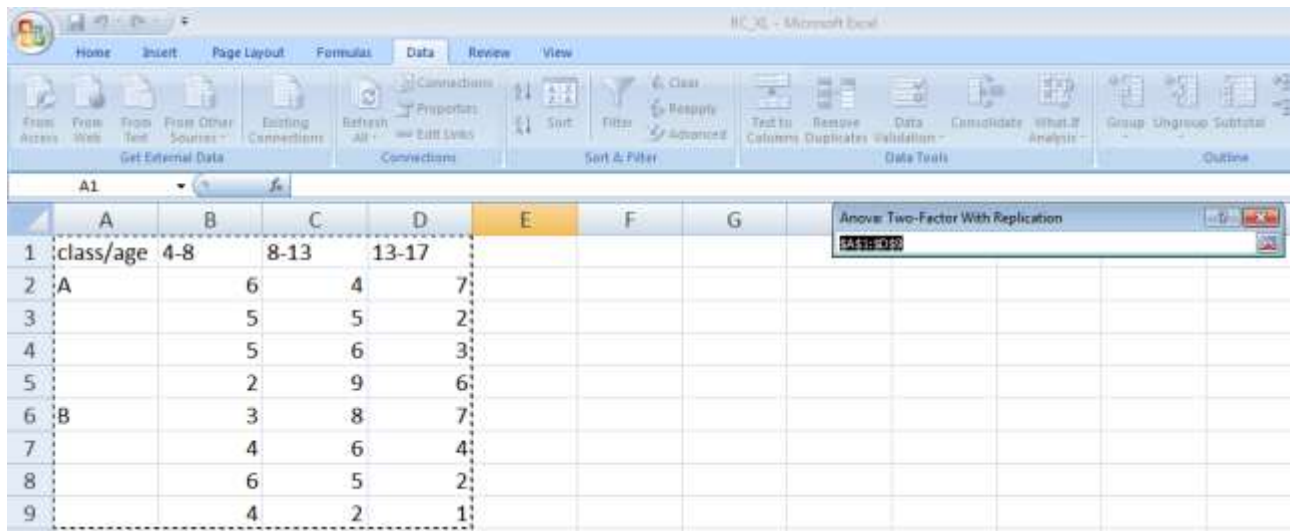
The screenshot shows the Microsoft Excel interface with the 'Data' tab selected. The ribbon includes options for 'From Access', 'From Web', 'From Text', 'From Other Sources', 'Existing Connections', 'Refresh All', 'Properties', 'Edit Links', and 'Connections'. The data table is as follows:

|   | A         | B   | C    | D     | E |
|---|-----------|-----|------|-------|---|
| 1 | class/age | 4-8 | 8-13 | 13-17 |   |
| 2 | A         |     | 6    | 4     | 7 |
| 3 |           |     | 5    | 5     | 2 |
| 4 |           |     | 5    | 6     | 3 |
| 5 |           |     | 2    | 9     | 6 |
| 6 | B         |     | 3    | 8     | 7 |
| 7 |           |     | 4    | 6     | 4 |
| 8 |           |     | 6    | 5     | 2 |
| 9 |           |     | 4    | 2     | 1 |

**Go to Data analysis tool and select Anova:Two Factor With Replication**



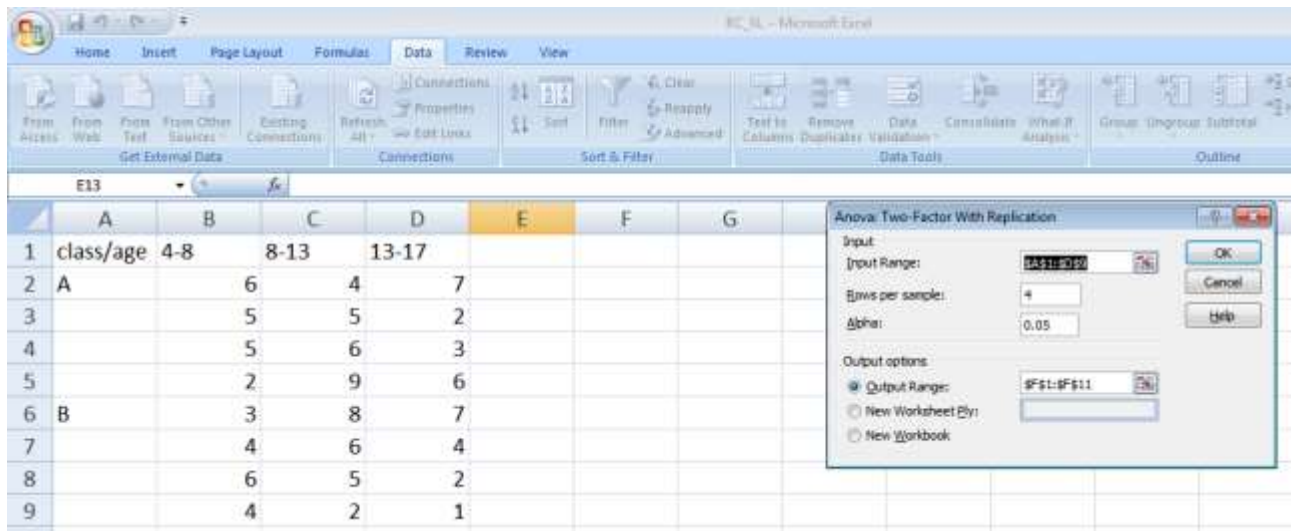
Select all the values in the table. No of rows should be counted and entered.



The screenshot shows the Microsoft Excel interface with the 'Data' tab selected. The data table is as follows:

|   | A         | B   | C    | D     |
|---|-----------|-----|------|-------|
| 1 | class/age | 4-8 | 8-13 | 13-17 |
| 2 | A         | 6   | 4    | 7     |
| 3 |           | 5   | 5    | 2     |
| 4 |           | 5   | 6    | 3     |
| 5 |           | 2   | 9    | 6     |
| 6 | B         | 3   | 8    | 7     |
| 7 |           | 4   | 6    | 4     |
| 8 |           | 6   | 5    | 2     |
| 9 |           | 4   | 2    | 1     |

The 'Anova: Two-Factor With Replication' dialog box is open, showing the input range as \$A\$1:\$D\$9.



The screenshot shows the same Microsoft Excel interface with the 'Anova: Two-Factor With Replication' dialog box. The configuration is as follows:

- Input Range: \$A\$1:\$D\$9
- Rows per sample: 4
- Alpha: 0.05
- Output options:
  - ☒ Output Range: \$F\$1:\$F\$11
  - ☐ New Worksheet Ply:
  - ☐ New Workbook



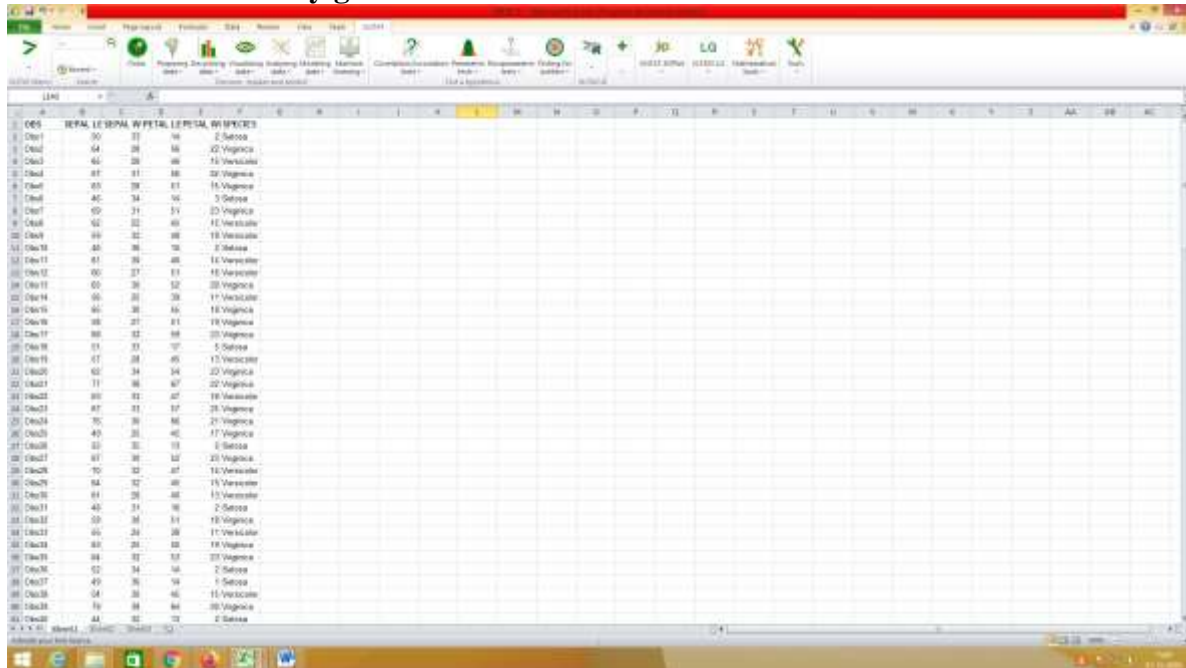
| RC_XL - M                                                                                                                          |           |     |      |       |   |                                    |         |         |         |         |         |         |   |
|------------------------------------------------------------------------------------------------------------------------------------|-----------|-----|------|-------|---|------------------------------------|---------|---------|---------|---------|---------|---------|---|
| Home Insert Page Layout Formulas Data Review View                                                                                  |           |     |      |       |   |                                    |         |         |         |         |         |         |   |
| From Access From Web From Text From Other Sources Existing Connections Refresh All Properties Edit Links Connections Sort & Filter |           |     |      |       |   |                                    |         |         |         |         |         |         |   |
| K1                                                                                                                                 |           |     |      |       |   |                                    |         |         |         |         |         |         |   |
|                                                                                                                                    | A         | B   | C    | D     | E | F                                  | G       | H       | I       | J       | K       | L       | M |
| 1                                                                                                                                  | class/age | 4-8 | 8-13 | 13-17 |   | Anova: Two-Factor With Replication |         |         |         |         |         |         |   |
| 2                                                                                                                                  | A         |     | 6    | 4     | 7 |                                    |         |         |         |         |         |         |   |
| 3                                                                                                                                  |           |     | 5    | 5     | 2 | SUMMAR                             | 4-8     | 8-13    | 13-17   | Total   |         |         |   |
| 4                                                                                                                                  |           |     | 5    | 6     | 3 | A                                  |         |         |         |         |         |         |   |
| 5                                                                                                                                  |           |     | 2    | 9     | 6 | Count                              | 4       | 4       | 4       | 12      |         |         |   |
| 6                                                                                                                                  | B         |     | 3    | 8     | 7 | Sum                                | 18      | 24      | 18      | 60      |         |         |   |
| 7                                                                                                                                  |           |     | 4    | 6     | 4 | Average                            | 4.5     | 6       | 4.5     | 5       |         |         |   |
| 8                                                                                                                                  |           |     | 6    | 5     | 2 | Variance                           | 3       | 4.66667 | 5.66667 | 4.18182 |         |         |   |
| 9                                                                                                                                  |           |     | 4    | 2     | 1 |                                    |         |         |         |         |         |         |   |
| 10                                                                                                                                 |           |     |      |       |   | B                                  |         |         |         |         |         |         |   |
| 11                                                                                                                                 |           |     |      |       |   | Count                              | 4       | 4       | 4       | 12      |         |         |   |
| 12                                                                                                                                 |           |     |      |       |   | Sum                                | 17      | 21      | 14      | 52      |         |         |   |
| 13                                                                                                                                 |           |     |      |       |   | Average                            | 4.25    | 5.25    | 3.5     | 4.33333 |         |         |   |
| 14                                                                                                                                 |           |     |      |       |   | Variance                           | 1.58333 | 6.25    | 7       | 4.60606 |         |         |   |
| 15                                                                                                                                 |           |     |      |       |   |                                    |         |         |         |         |         |         |   |
| 16                                                                                                                                 |           |     |      |       |   | Total                              |         |         |         |         |         |         |   |
| 17                                                                                                                                 |           |     |      |       |   | Count                              | 8       | 8       | 8       |         |         |         |   |
| 18                                                                                                                                 |           |     |      |       |   | Sum                                | 35      | 45      | 32      |         |         |         |   |
| 19                                                                                                                                 |           |     |      |       |   | Average                            | 4.375   | 5.625   | 4       |         |         |         |   |
| 20                                                                                                                                 |           |     |      |       |   | Variance                           | 1.98214 | 4.83929 | 5.71429 |         |         |         |   |
| 21                                                                                                                                 |           |     |      |       |   |                                    |         |         |         |         |         |         |   |
| 22                                                                                                                                 |           |     |      |       |   |                                    |         |         |         |         |         |         |   |
| 23                                                                                                                                 |           |     |      |       |   | ANOVA                              |         |         |         |         |         |         |   |
| 24                                                                                                                                 |           |     |      |       |   | Source of Vari                     | SS      | df      | MS      | F       | P-value | F crit  |   |
| 25                                                                                                                                 |           |     |      |       |   | Sample                             | 2.66667 | 1       | 2.66667 | 0.56805 | 0.46078 | 4.41387 |   |
| 26                                                                                                                                 |           |     |      |       |   | Columns                            | 11.5833 | 2       | 5.79167 | 1.23373 | 0.31469 | 3.55456 |   |
| 27                                                                                                                                 |           |     |      |       |   | Interacti                          | 0.58333 | 2       | 0.29167 | 0.06213 | 0.93996 | 3.55456 |   |
| 28                                                                                                                                 |           |     |      |       |   | Within                             | 84.5    | 18      | 4.69444 |         |         |         |   |
| 29                                                                                                                                 |           |     |      |       |   |                                    |         |         |         |         |         |         |   |
| 30                                                                                                                                 |           |     |      |       |   | Total                              | 99.3333 | 23      |         |         |         |         |   |

Since all the p-values are greater than 0.05, the observation is not statistically significant.

## C. Perform testing of hypothesis using multivariate ANOVA (MANOVA).

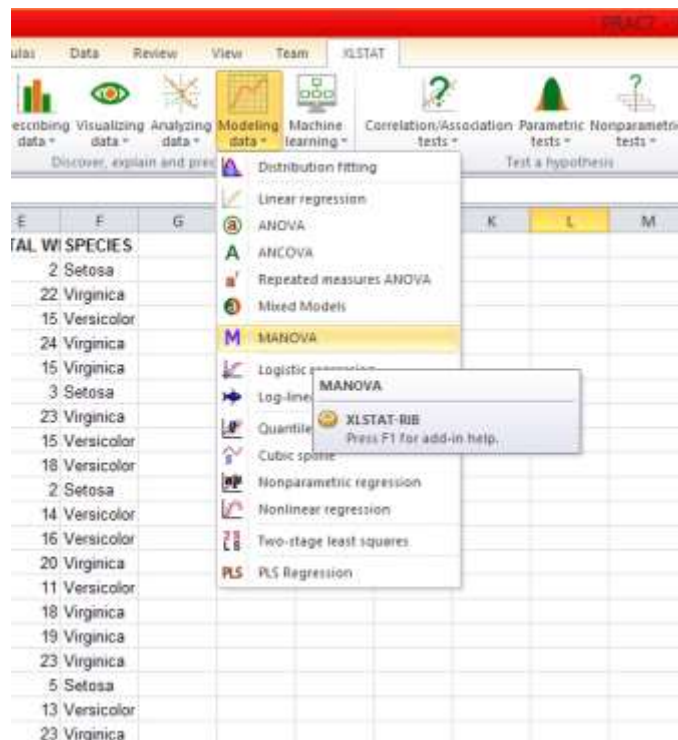
**Solution:**

The data set is usually given.



|     | SEPAL | PETAL | SPECIES |
|-----|-------|-------|---------|
| 1   | 5.1   | 3.5   | Setosa  |
| 2   | 4.9   | 3.0   | Setosa  |
| 3   | 4.7   | 3.2   | Setosa  |
| 4   | 4.6   | 3.1   | Setosa  |
| 5   | 5.0   | 3.6   | Setosa  |
| 6   | 5.4   | 4.4   | Setosa  |
| 7   | 4.8   | 3.4   | Setosa  |
| 8   | 5.2   | 3.7   | Setosa  |
| 9   | 5.2   | 3.4   | Setosa  |
| 10  | 5.2   | 3.6   | Setosa  |
| 11  | 5.6   | 4.3   | Setosa  |
| 12  | 5.4   | 4.1   | Setosa  |
| 13  | 5.5   | 4.5   | Setosa  |
| 14  | 5.5   | 4.2   | Setosa  |
| 15  | 4.9   | 3.6   | Setosa  |
| 16  | 5.1   | 3.3   | Setosa  |
| 17  | 4.8   | 3.1   | Setosa  |
| 18  | 5.1   | 3.8   | Setosa  |
| 19  | 5.3   | 3.8   | Setosa  |
| 20  | 5.2   | 3.2   | Setosa  |
| 21  | 5.2   | 3.5   | Setosa  |
| 22  | 5.2   | 3.2   | Setosa  |
| 23  | 5.4   | 3.4   | Setosa  |
| 24  | 5.2   | 3.7   | Setosa  |
| 25  | 5.2   | 3.4   | Setosa  |
| 26  | 5.2   | 3.6   | Setosa  |
| 27  | 5.2   | 3.6   | Setosa  |
| 28  | 5.2   | 3.6   | Setosa  |
| 29  | 5.2   | 3.6   | Setosa  |
| 30  | 5.2   | 3.6   | Setosa  |
| 31  | 5.2   | 3.6   | Setosa  |
| 32  | 5.2   | 3.6   | Setosa  |
| 33  | 5.2   | 3.6   | Setosa  |
| 34  | 5.2   | 3.6   | Setosa  |
| 35  | 5.2   | 3.6   | Setosa  |
| 36  | 5.2   | 3.6   | Setosa  |
| 37  | 5.2   | 3.6   | Setosa  |
| 38  | 5.2   | 3.6   | Setosa  |
| 39  | 5.2   | 3.6   | Setosa  |
| 40  | 5.2   | 3.6   | Setosa  |
| 41  | 5.2   | 3.6   | Setosa  |
| 42  | 5.2   | 3.6   | Setosa  |
| 43  | 5.2   | 3.6   | Setosa  |
| 44  | 5.2   | 3.6   | Setosa  |
| 45  | 5.2   | 3.6   | Setosa  |
| 46  | 5.2   | 3.6   | Setosa  |
| 47  | 5.2   | 3.6   | Setosa  |
| 48  | 5.2   | 3.6   | Setosa  |
| 49  | 5.2   | 3.6   | Setosa  |
| 50  | 5.2   | 3.6   | Setosa  |
| 51  | 5.2   | 3.6   | Setosa  |
| 52  | 5.2   | 3.6   | Setosa  |
| 53  | 5.2   | 3.6   | Setosa  |
| 54  | 5.2   | 3.6   | Setosa  |
| 55  | 5.2   | 3.6   | Setosa  |
| 56  | 5.2   | 3.6   | Setosa  |
| 57  | 5.2   | 3.6   | Setosa  |
| 58  | 5.2   | 3.6   | Setosa  |
| 59  | 5.2   | 3.6   | Setosa  |
| 60  | 5.2   | 3.6   | Setosa  |
| 61  | 5.2   | 3.6   | Setosa  |
| 62  | 5.2   | 3.6   | Setosa  |
| 63  | 5.2   | 3.6   | Setosa  |
| 64  | 5.2   | 3.6   | Setosa  |
| 65  | 5.2   | 3.6   | Setosa  |
| 66  | 5.2   | 3.6   | Setosa  |
| 67  | 5.2   | 3.6   | Setosa  |
| 68  | 5.2   | 3.6   | Setosa  |
| 69  | 5.2   | 3.6   | Setosa  |
| 70  | 5.2   | 3.6   | Setosa  |
| 71  | 5.2   | 3.6   | Setosa  |
| 72  | 5.2   | 3.6   | Setosa  |
| 73  | 5.2   | 3.6   | Setosa  |
| 74  | 5.2   | 3.6   | Setosa  |
| 75  | 5.2   | 3.6   | Setosa  |
| 76  | 5.2   | 3.6   | Setosa  |
| 77  | 5.2   | 3.6   | Setosa  |
| 78  | 5.2   | 3.6   | Setosa  |
| 79  | 5.2   | 3.6   | Setosa  |
| 80  | 5.2   | 3.6   | Setosa  |
| 81  | 5.2   | 3.6   | Setosa  |
| 82  | 5.2   | 3.6   | Setosa  |
| 83  | 5.2   | 3.6   | Setosa  |
| 84  | 5.2   | 3.6   | Setosa  |
| 85  | 5.2   | 3.6   | Setosa  |
| 86  | 5.2   | 3.6   | Setosa  |
| 87  | 5.2   | 3.6   | Setosa  |
| 88  | 5.2   | 3.6   | Setosa  |
| 89  | 5.2   | 3.6   | Setosa  |
| 90  | 5.2   | 3.6   | Setosa  |
| 91  | 5.2   | 3.6   | Setosa  |
| 92  | 5.2   | 3.6   | Setosa  |
| 93  | 5.2   | 3.6   | Setosa  |
| 94  | 5.2   | 3.6   | Setosa  |
| 95  | 5.2   | 3.6   | Setosa  |
| 96  | 5.2   | 3.6   | Setosa  |
| 97  | 5.2   | 3.6   | Setosa  |
| 98  | 5.2   | 3.6   | Setosa  |
| 99  | 5.2   | 3.6   | Setosa  |
| 100 | 5.2   | 3.6   | Setosa  |
| 101 | 5.2   | 3.6   | Setosa  |
| 102 | 5.2   | 3.6   | Setosa  |
| 103 | 5.2   | 3.6   | Setosa  |
| 104 | 5.2   | 3.6   | Setosa  |
| 105 | 5.2   | 3.6   | Setosa  |
| 106 | 5.2   | 3.6   | Setosa  |
| 107 | 5.2   | 3.6   | Setosa  |
| 108 | 5.2   | 3.6   | Setosa  |
| 109 | 5.2   | 3.6   | Setosa  |
| 110 | 5.2   | 3.6   | Setosa  |
| 111 | 5.2   | 3.6   | Setosa  |
| 112 | 5.2   | 3.6   | Setosa  |
| 113 | 5.2   | 3.6   | Setosa  |
| 114 | 5.2   | 3.6   | Setosa  |
| 115 | 5.2   | 3.6   | Setosa  |
| 116 | 5.2   | 3.6   | Setosa  |
| 117 | 5.2   | 3.6   | Setosa  |
| 118 | 5.2   | 3.6   | Setosa  |
| 119 | 5.2   | 3.6   | Setosa  |
| 120 | 5.2   | 3.6   | Setosa  |
| 121 | 5.2   | 3.6   | Setosa  |
| 122 | 5.2   | 3.6   | Setosa  |
| 123 | 5.2   | 3.6   | Setosa  |
| 124 | 5.2   | 3.6   | Setosa  |
| 125 | 5.2   | 3.6   | Setosa  |
| 126 | 5.2   | 3.6   | Setosa  |
| 127 | 5.2   | 3.6   | Setosa  |
| 128 | 5.2   | 3.6   | Setosa  |
| 129 | 5.2   | 3.6   | Setosa  |
| 130 | 5.2   | 3.6   | Setosa  |
| 131 | 5.2   | 3.6   | Setosa  |
| 132 | 5.2   | 3.6   | Setosa  |
| 133 | 5.2   | 3.6   | Setosa  |
| 134 | 5.2   | 3.6   | Setosa  |
| 135 | 5.2   | 3.6   | Setosa  |
| 136 | 5.2   | 3.6   | Setosa  |
| 137 | 5.2   | 3.6   | Setosa  |
| 138 | 5.2   | 3.6   | Setosa  |
| 139 | 5.2   | 3.6   | Setosa  |
| 140 | 5.2   | 3.6   | Setosa  |
| 141 | 5.2   | 3.6   | Setosa  |
| 142 | 5.2   | 3.6   | Setosa  |
| 143 | 5.2   | 3.6   | Setosa  |
| 144 | 5.2   | 3.6   | Setosa  |
| 145 | 5.2   | 3.6   | Setosa  |
| 146 | 5.2   | 3.6   | Setosa  |
| 147 | 5.2   | 3.6   | Setosa  |
| 148 | 5.2   | 3.6   | Setosa  |
| 149 | 5.2   | 3.6   | Setosa  |
| 150 | 5.2   | 3.6   | Setosa  |

XLSTAT is an Excel add-in which needs to be downloaded and installed from the XLSTAT Website.



**General MANOVA**

General Options Missing data Outputs




Y / Dependent variables:  

☐ Range: 
☒ Sheet

X / Explanatory variables:  

☐ Workbook

☐ Weights:   
☒ Column labels




   OK Cancel Help

**General MANOVA**

General Options Missing data Outputs

Significance level (%):  ☐ Interactions / Level:

☒ Wilks' test  
☒ Hotelling-Lawley test  
☒ Pillai test  
☒ Roy test

   OK Cancel Help

**XLSTAT - Selections**

List of selections:

| Selection name            | Rows | Columns |
|---------------------------|------|---------|
| Y / Dependent variables   | 150  | 4       |
| X / Explanatory variables | 150  | 1       |

☐ Do not show this message anymore

Continue Back Cancel

You are using the MSTAT trial version. Number of days remaining until the trial expires: 15

ALSTAT 2018 4.1.63355 - General MANOVA - Start time: 21/12/2018 at 11:16:46 / End time: 21/12/2019 at 11:16:46  
Y / Dependent variables: Workbook = PRAC7.xlsx / Sheet = Sheet1 / Range = 'Sheet1!\$B:\$E' / 150 rows and 4 columns  
X / Explanatory variables: Workbook = PRAC7.xlsx / Sheet = Sheet1 / Range = 'Sheet1!\$F:\$F' / 150 rows and 1 column  
Significance level (N): 5

Summary statistics:

| Variable | Sum of squares | Mean square | df  | Minimum | Maximum | Mean   | St. deviation |
|----------|----------------|-------------|-----|---------|---------|--------|---------------|
| SEPAL LN | 150            | 0           | 150 | 42.000  | 70.000  | 56.000 | 8.281         |
| SEPAL WE | 150            | 0           | 150 | 10.000  | 44.000  | 30.578 | 4.259         |
| PETAL LN | 150            | 0           | 150 | 10.000  | 69.000  | 37.580 | 17.655        |
| PETAL WE | 150            | 0           | 150 | 1.000   | 25.000  | 11.903 | 7.622         |

| Variable | Categories | Frequency | %      |
|----------|------------|-----------|--------|
| SPECIES  | Setosa     | 50        | 33.333 |
|          | Vericolour | 50        | 33.333 |
|          | Virginica  | 50        | 33.333 |

Wilks' test (Bart's approximation):

| SPECIES      |          |
|--------------|----------|
| Lambda       | 0.002    |
| F (Observed) | 190.145  |
| DF1          | 8        |
| DF2          | 286      |
| F (Critical) | 1.971    |
| p-value      | < 0.0001 |

Ho: The variable or the interaction of the corresponding column has no significant effect on the dependent variables.  
Ha: The variable or the interaction of the corresponding column has a significant effect on the dependent variables.  
SPEOCIS: As the computed p-value is lower than the significance level alpha=0.05, one should reject the null hypothesis H0, and accept the alternative hypothesis Ha.  
The risk to reject the null hypothesis H0 while it is true is lower than 0.01%.

Hottel-Lawley's test:

| SPECIES      |          |
|--------------|----------|
| Lambda       | 32.417   |
| F (Observed) | 560.532  |
| DF1          | 8        |
| DF2          | 286      |
| F (Critical) | 1.971    |
| p-value      | < 0.0001 |

Ho: The variable or the interaction of the corresponding column has no significant effect on the dependent variables.  
Ha: The variable or the interaction of the corresponding column has a significant effect on the dependent variables.  
SPEOCIS: As the computed p-value is lower than the significance level alpha=0.05, one should reject the null hypothesis H0, and accept the alternative hypothesis Ha.  
The risk to reject the null hypothesis H0 while it is true is lower than 0.01%.

Pillai's test:

| SPECIES      |          |
|--------------|----------|
| Lambda       | 1.102    |
| F (Observed) | 53.466   |
| DF1          | 8        |
| DF2          | 286      |
| F (Critical) | 1.970    |
| p-value      | < 0.0001 |

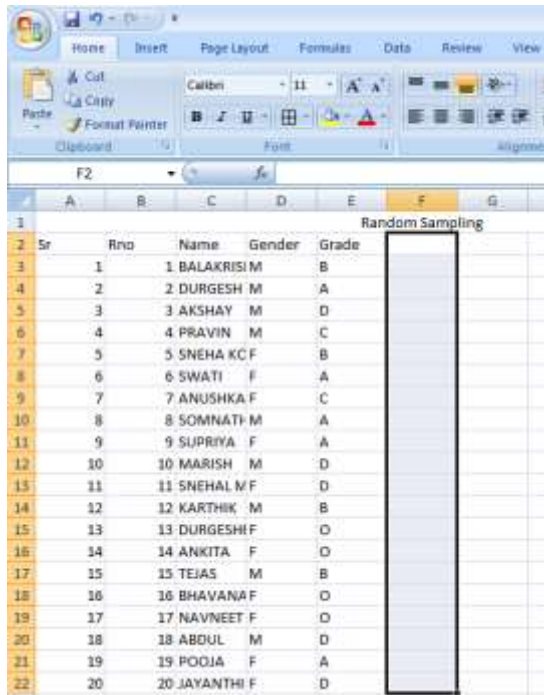
Ho: The variable or the interaction of the corresponding column has no significant effect on the dependent variables.  
Ha: The variable or the interaction of the corresponding column has a significant effect on the dependent variables.  
SPEOCIS: As the computed p-value is lower than the significance level alpha=0.05, one should reject the null hypothesis H0, and accept the alternative hypothesis Ha.  
The risk to reject the null hypothesis H0 while it is true is lower than 0.01%.

## Practical No 7

**A. Perform the Random sampling for the given data and analyze it.**

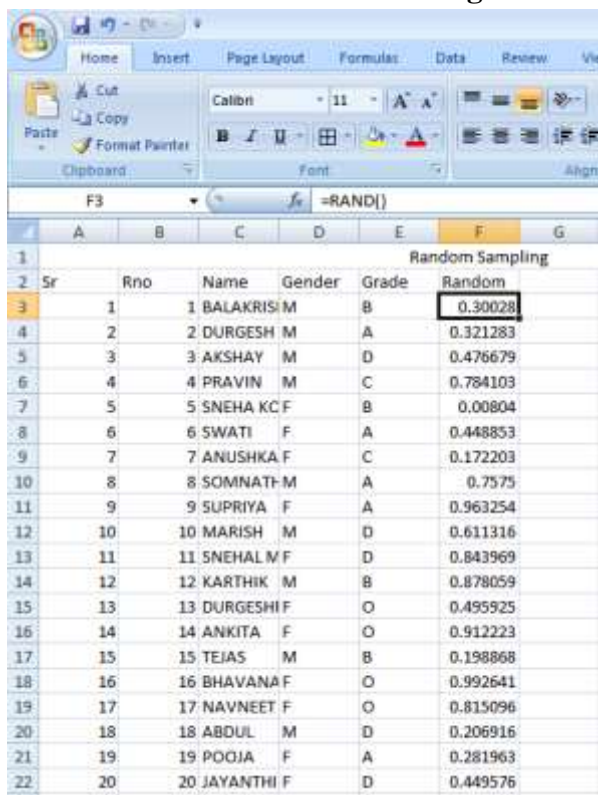
**Solution:**

**Given data set**



| Sr | Rno | Name       | Gender | Grade | Random Sampling |
|----|-----|------------|--------|-------|-----------------|
| 1  | 1   | BALAKRISHN | M      | B     |                 |
| 2  | 2   | DURGESH    | M      | A     |                 |
| 3  | 3   | AKSHAY     | M      | D     |                 |
| 4  | 4   | PRAVIN     | M      | C     |                 |
| 5  | 5   | SNEHA KC   | F      | B     |                 |
| 6  | 6   | SWATI      | F      | A     |                 |
| 7  | 7   | ANUSHKA    | F      | C     |                 |
| 8  | 8   | SOMNATH    | M      | A     |                 |
| 9  | 9   | SUPRIYA    | F      | A     |                 |
| 10 | 10  | MARISH     | M      | D     |                 |
| 11 | 11  | SNEHAL M   | F      | D     |                 |
| 12 | 12  | KARTHIK    | M      | B     |                 |
| 13 | 13  | DURGESHI   | F      | O     |                 |
| 14 | 14  | ANKITA     | F      | O     |                 |
| 15 | 15  | TEJAS      | M      | B     |                 |
| 16 | 16  | BHAVANA    | F      | O     |                 |
| 17 | 17  | NAVNEET    | F      | O     |                 |
| 18 | 18  | ABDUL      | M      | D     |                 |
| 19 | 19  | POOJA      | F      | A     |                 |
| 20 | 20  | JAYANTHI   | F      | D     |                 |

**Make another column for indexing random numbers**

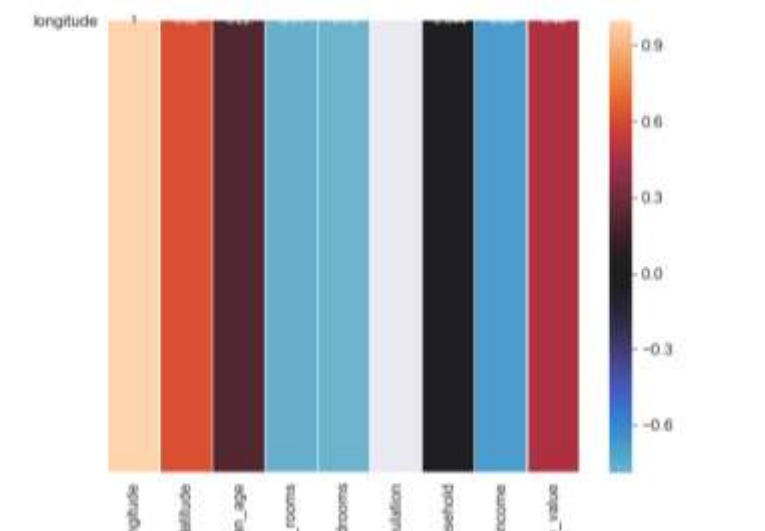


| Sr | Rno | Name       | Gender | Grade | Random   |
|----|-----|------------|--------|-------|----------|
| 1  | 1   | BALAKRISHN | M      | B     | 0.30028  |
| 2  | 2   | DURGESH    | M      | A     | 0.321283 |
| 3  | 3   | AKSHAY     | M      | D     | 0.476679 |
| 4  | 4   | PRAVIN     | M      | C     | 0.784103 |
| 5  | 5   | SNEHA KC   | F      | B     | 0.00804  |
| 6  | 6   | SWATI      | F      | A     | 0.448853 |
| 7  | 7   | ANUSHKA    | F      | C     | 0.172203 |
| 8  | 8   | SOMNATH    | M      | A     | 0.7575   |
| 9  | 9   | SUPRIYA    | F      | A     | 0.963254 |
| 10 | 10  | MARISH     | M      | D     | 0.611316 |
| 11 | 11  | SNEHAL M   | F      | D     | 0.843969 |
| 12 | 12  | KARTHIK    | M      | B     | 0.878059 |
| 13 | 13  | DURGESHI   | F      | O     | 0.495925 |
| 14 | 14  | ANKITA     | F      | O     | 0.912223 |
| 15 | 15  | TEJAS      | M      | B     | 0.198868 |
| 16 | 16  | BHAVANA    | F      | O     | 0.992641 |
| 17 | 17  | NAVNEET    | F      | O     | 0.815096 |
| 18 | 18  | ABDUL      | M      | D     | 0.206916 |
| 19 | 19  | POOJA      | F      | A     | 0.281963 |
| 20 | 20  | JAYANTHI   | F      | D     | 0.449576 |

Select samples randomly using the index

function=INDEX(\$C\$3:\$C\$22,RANK(F3,\$F\$3:\$F\$22))

| RC_XL - Mi                                        |                 |     |              |        |       |          |               |   |   |   |
|---------------------------------------------------|-----------------|-----|--------------|--------|-------|----------|---------------|---|---|---|
| Home Insert Page Layout Formulas Data Review View |                 |     |              |        |       |          |               |   |   |   |
| Clipboard Font Alignment Number                   |                 |     |              |        |       |          |               |   |   |   |
| J3                                                |                 |     |              |        |       |          |               |   |   |   |
|                                                   | A               | B   | C            | D      | E     | F        | G             | H | I | J |
| 1                                                 | Random Sampling |     |              |        |       |          |               |   |   |   |
| 2                                                 | Sr              | Rno | Name         | Gender | Grade | Random   | Name          |   |   |   |
| 3                                                 | 1               | 1   | BALAKRISHNAN | M      | B     | 0.947169 | AKSHAY        |   |   |   |
| 4                                                 | 2               | 2   | DURGESH      | M      | A     | 0.489956 | SUPRIYA       |   |   |   |
| 5                                                 | 3               | 3   | AKSHAY       | M      | D     | 0.969858 | BALAKRISHNAN  |   |   |   |
| 6                                                 | 4               | 4   | PRAVIN       | M      | C     | 0.918973 | SNEHA KOLI    |   |   |   |
| 7                                                 | 5               | 5   | SNEHA K      | F      | B     | 0.413253 | SNEHAL MOHITE |   |   |   |
| 8                                                 | 6               | 6   | SWATI        | F      | A     | 0.969559 | DURGESH       |   |   |   |
| 9                                                 | 7               | 7   | ANUSHKA      | F      | C     | 0.485432 | MARISH        |   |   |   |
| 10                                                | 8               | 8   | SOMNATH      | M      | A     | 0.235833 | BHAVANA       |   |   |   |
| 11                                                | 9               | 9   | SUPRIYA      | F      | A     | 0.166878 | NAVNEET       |   |   |   |
| 12                                                | 10              | 10  | MARISH       | M      | D     | 0.356842 | ANKITA        |   |   |   |
| 13                                                | 11              | 11  | SNEHAL       | M      | D     | 0.393515 | DURGESHREE    |   |   |   |
| 14                                                | 12              | 12  | KARTHIK      | M      | B     | 0.906361 | SWATI         |   |   |   |
| 15                                                | 13              | 13  | DURGESH      | F      | O     | 0.693512 | ANUSHKA       |   |   |   |
| 16                                                | 14              | 14  | ANKITA       | F      | O     | 0.034571 |               |   |   |   |
| 17                                                | 15              | 15  | TEJAS        | M      | B     | 0.164724 |               |   |   |   |
| 18                                                | 16              | 16  | BHAVANA      | F      | O     | 0.935225 |               |   |   |   |
| 19                                                | 17              | 17  | NAVNEET      | F      | O     | 0.411199 |               |   |   |   |
| 20                                                | 18              | 18  | ABDUL        | M      | D     | 0.300706 |               |   |   |   |
| 21                                                | 19              | 19  | POOJA        | F      | A     | 0.084952 |               |   |   |   |
| 22                                                | 20              | 20  | JAYANTHI     | F      | D     | 0.670952 |               |   |   |   |





|   | longitude | latitude | ... | median_house_value | ocean_proximity |
|---|-----------|----------|-----|--------------------|-----------------|
| 0 | -122.23   | 37.88    | ... | 452600             | NEAR BAY        |
| 1 | -122.22   | 37.86    | ... | 358500             | NEAR BAY        |
| 2 | -122.24   | 37.85    | ... | 352100             | NEAR BAY        |
| 3 | -122.25   | 37.85    | ... | 341300             | NEAR BAY        |
| 4 | -122.25   | 37.85    | ... | 342200             | NEAR BAY        |

```
[5 rows x 10 columns]
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 5 entries, 0 to 4
Data columns (total 10 columns):
longitude          5 non-null float64
latitude           5 non-null float64
housing_median_age  5 non-null int64
total_rooms        5 non-null int64
total_bedrooms     5 non-null int64
population         0 non-null float64
household          5 non-null int64
median_income      5 non-null int64
median_house_value  5 non-null int64
ocean_proximity    5 non-null object
dtypes: float64(3), int64(6), object(1)
memory usage: 444.0+ bytes
None
median_house_value    1.000000
latitude              0.972922
longitude             0.475427
total_rooms           -0.435764
median_income         -0.450045
total_bedrooms        -0.539064
household             -0.610050
housing_median_age    -0.641518
population            NaN
Name: median_house_value, dtype: float64
```

## Practical No 8

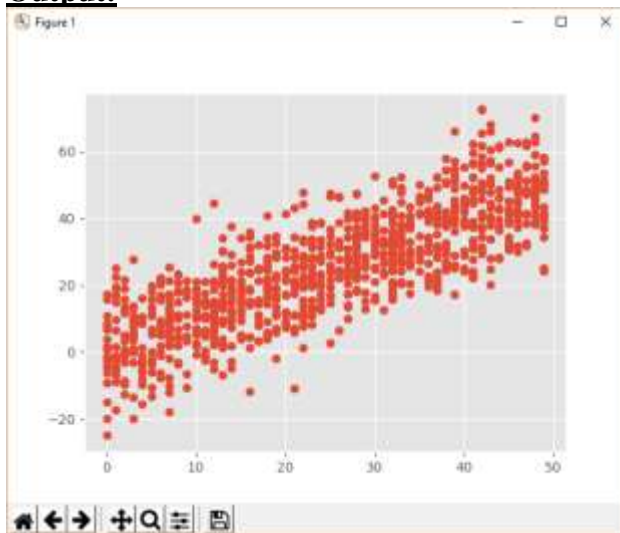
**Aim:** Write a program for computing different correlation.

### **Positive Correlation:**

#### **Code:**

```
import numpy as np
import matplotlib.pyplot as plt
np.random.seed(1)
# 1000 random integers between 0 and 50
x = np.random.randint(0, 50, 1000)
# Positive Correlation with some noise
y = x + np.random.normal(0, 10, 1000)
np.corrcoef(x, y)
plt.style.use('ggplot')
plt.scatter(x, y)
plt.show()
```

#### **Output:**

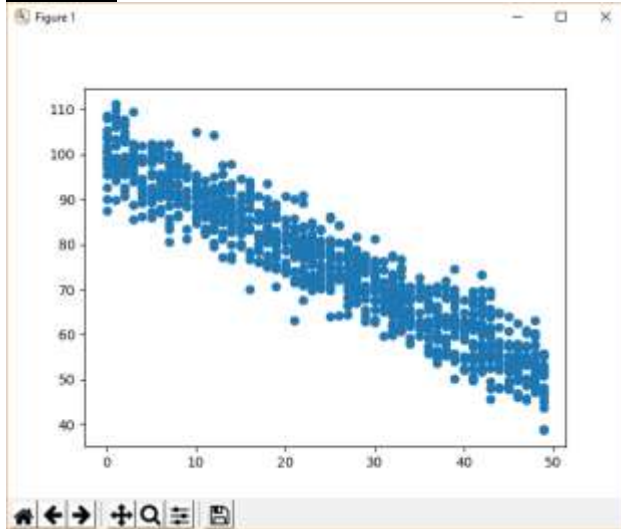


### **Negative Correlation:**

#### **Code:**

```
import numpy as np
import matplotlib.pyplot as plt
np.random.seed(1)
# 1000 random integers between 0 and 50
x = np.random.randint(0, 50, 1000)
# Negative Correlation with some noise
y = 100 - x + np.random.normal(0, 5, 1000)
np.corrcoef(x, y)
plt.scatter(x, y)
plt.show()
```

### **Output:**

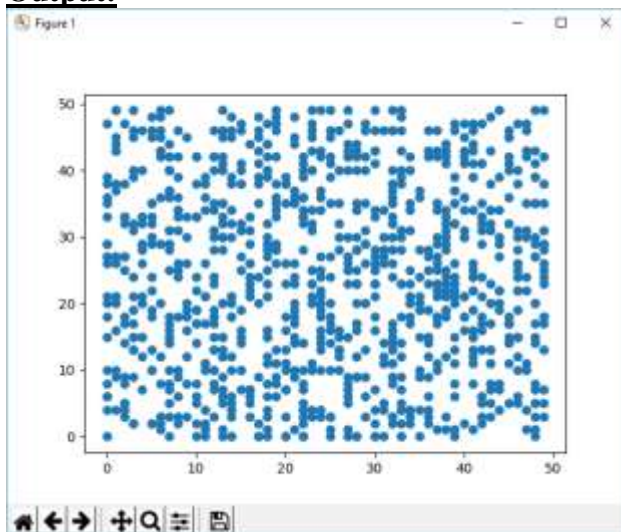


### **No/Weak Correlation:**

#### **Code:**

```
import numpy as np
import matplotlib.pyplot as plt
np.random.seed(1)
x = np.random.randint(0, 50, 1000)
y = np.random.randint(0, 50, 1000)
np.corrcoef(x, y)
plt.scatter(x, y)
plt.show()
```

### **Output:**



## Practical No 9

### A. Write a program to Perform linear regression for prediction.

#### Code:

```
# -*- coding: utf-8 -*-
"""
Created on Mon Dec 16 21:56:32 2019
@author: MyHome
"""

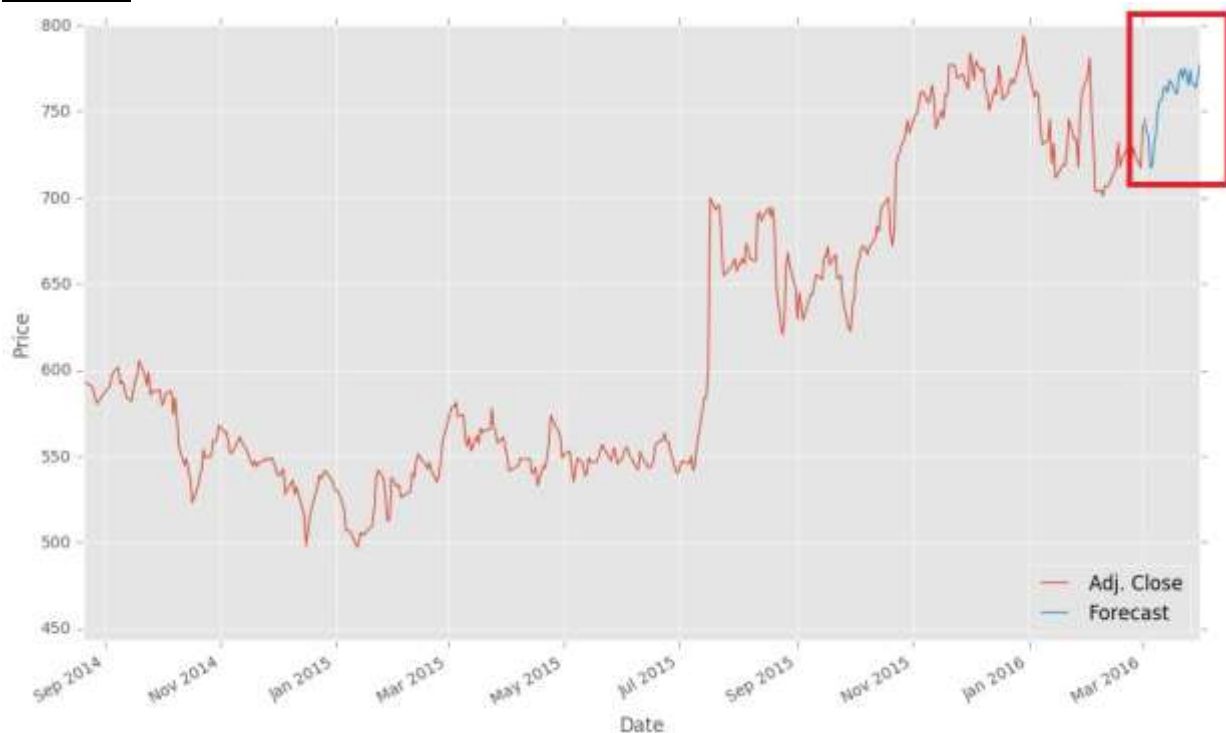
import Quandl, math
import numpy as np
import pandas as pd
from sklearn import preprocessing, cross_validation, svm
from sklearn.linear_model import LinearRegression
import matplotlib.pyplot as plt
from matplotlib import style
import datetime
style.use('ggplot')
df = Quandl.get("WIKI/GOOGL")
df = df[['Adj. Open', 'Adj. High', 'Adj. Low', 'Adj. Close', 'Adj. Volume']]
df['HL_PCT'] = (df['Adj. High'] - df['Adj. Low']) / df['Adj. Close'] * 100.0
df['PCT_change'] = (df['Adj. Close'] - df['Adj. Open']) / df['Adj. Open'] * 100.0
df = df[['Adj. Close', 'HL_PCT', 'PCT_change', 'Adj. Volume']]
forecast_col = 'Adj. Close'
df.fillna(value=-99999, inplace=True)
forecast_out = int(math.ceil(0.01 * len(df)))
df['label'] = df[forecast_col].shift(-forecast_out)
X = np.array(df.drop(['label'], 1))
X = preprocessing.scale(X)
X_lately = X[-forecast_out:]
X = X[:-forecast_out]
df.dropna(inplace=True)
y = np.array(df['label'])
X_train, X_test, y_train, y_test = cross_validation.train_test_split(X, y,
test_size=0.2)
clf = LinearRegression(n_jobs=-1)
clf.fit(X_train, y_train)
confidence = clf.score(X_test, y_test)
forecast_set = clf.predict(X_lately)
```

```

df['Forecast'] = np.nan
last_date = df.iloc[-1].name
last_unix = last_date.timestamp()
one_day = 86400
next_unix = last_unix + one_day
for i in forecast_set:
    next_date = datetime.datetime.fromtimestamp(next_unix)
    next_unix += 86400
df.loc[next_date] = [np.nan for _ in range(len(df.columns)-1)]+[i]
df['Adj. Close'].plot()
df['Forecast'].plot()
plt.legend(loc=4)
plt.xlabel('Date')
plt.ylabel('Price')
plt.show()

```

### **Output:**

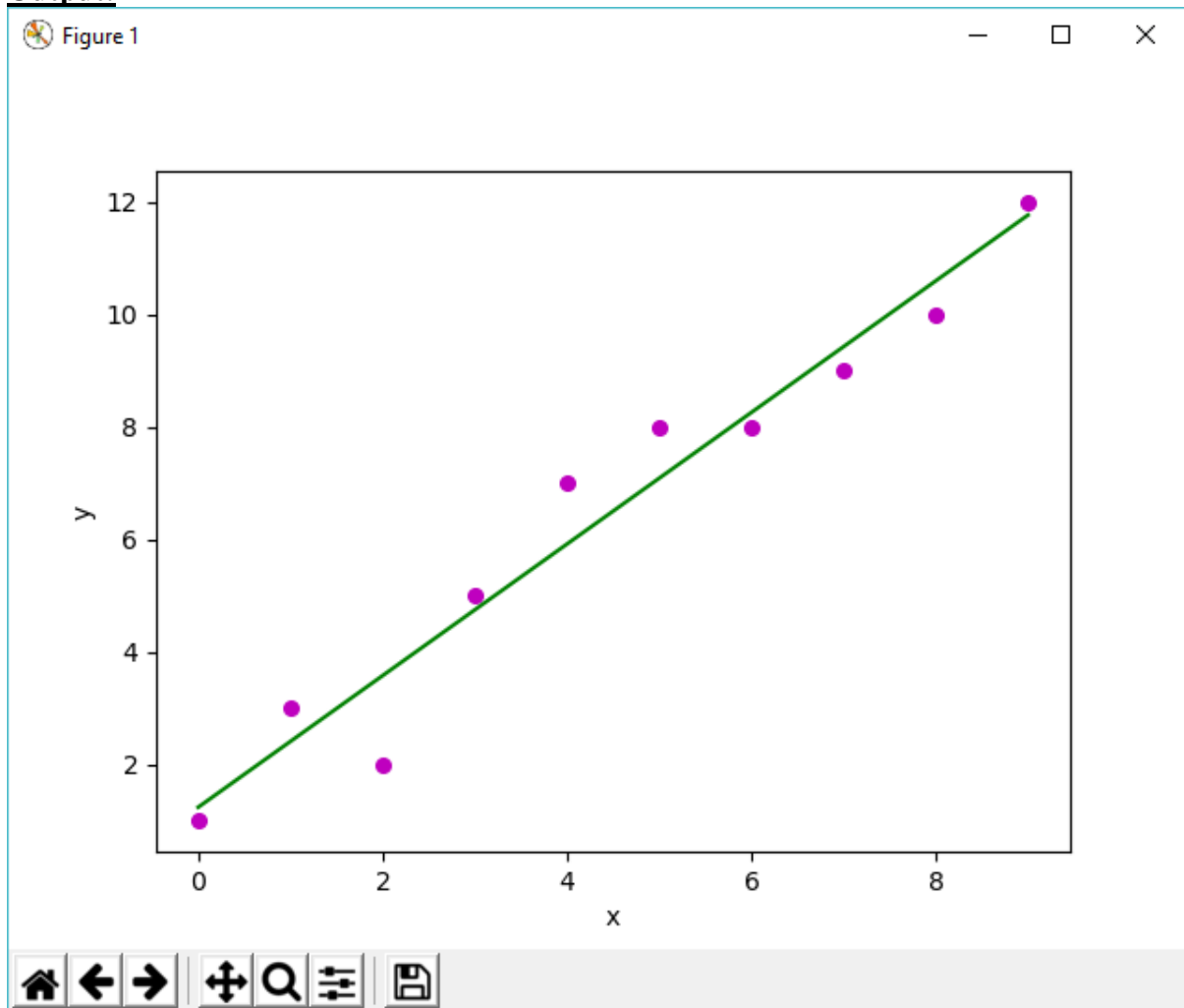


## B. Perform polynomial regression for prediction.

### Code:

```
import numpy as np
import matplotlib.pyplot as plt
def estimate_coef(x, y):
    #number of observations/points
    n = np.size(x)
    # mean of x and y vector
    m_x, m_y = np.mean(x), np.mean(y)
    # calculating cross-deviation and deviation about x
    SS_xy = np.sum(y*x) - n*m_y*m_x
    SS_xx = np.sum(x*x) - n*m_x*m_x
    # calculating regression coefficients
    b_1 = SS_xy / SS_xx
    b_0 = m_y - b_1*m_x
    return(b_0, b_1)
def plot_regression_line(x, y, b):
    # plotting the actual points as scatter plot
    plt.scatter(x, y, color = "m",
        marker = "o", s = 30)
    # predicted response vector
    y_pred = b[0] + b[1]*x
    # plotting the regression line
    plt.plot(x, y_pred, color = "g")
    # putting labels
    plt.xlabel('x')
    plt.ylabel('y')
    # function to show plot
    plt.show()
def main():
    # observations
    x = np.array([0, 1, 2, 3, 4, 5, 6, 7, 8, 9])
    y = np.array([1, 3, 2, 5, 7, 8, 8, 9, 10, 12])
    # estimating coefficients
    b = estimate_coef(x, y)
    print("Estimated coefficients:\nb_0 = {} b_1 = {}".format(b[0], b[1]))
    # plotting regression line
    plot_regression_line(x, y, b)
if __name__ == "__main__":
    main()
```

## Output:



```
RESTART: D:/D-Drive/SIES/Msc IT/Msc IT (Part-1)/Practicals/Research In Computing Material/9_2.py
Estimated coefficients:
b_0 = 1.2363636363636363 b_1 = 1.1696969696969697
>>>
```



## Practical No 10

### A. Write a program for multiple linear regression analysis.

#### Code:

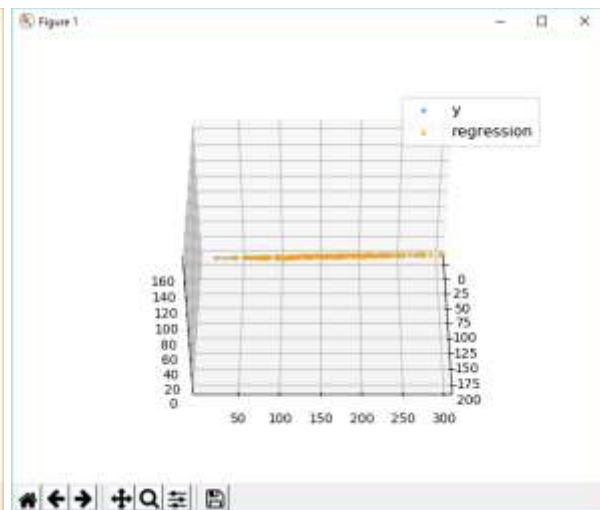
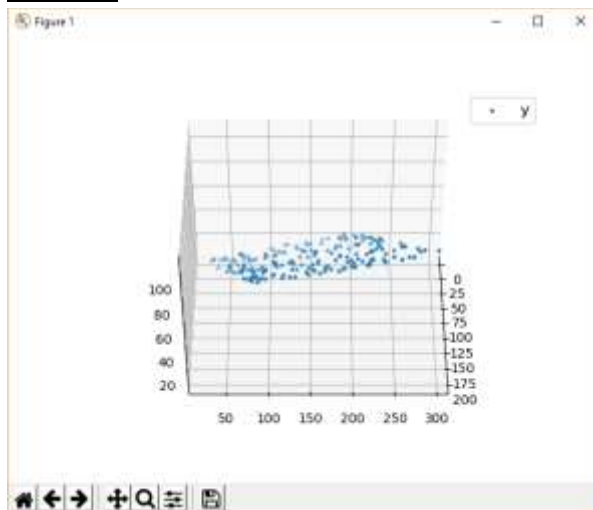
```
import numpy as np
import matplotlib as mpl
from mpl_toolkits.mplot3d import Axes3D
import matplotlib.pyplot as plt
def generate_dataset(n):
    x = []
    y = []
    random_x1 = np.random.rand()
    random_x2 = np.random.rand()
    for i in range(n):
        x1 = i
        x2 = i/2 + np.random.rand()*n
        x.append([1, x1, x2])
        y.append(random_x1 * x1 + random_x2 * x2 + 1)
    return np.array(x), np.array(y)
x, y = generate_dataset(200)
mpl.rcParams['legend.fontsize'] = 12
fig = plt.figure()
ax = fig.gca(projection='3d')
ax.scatter(x[:, 1], x[:, 2], y, label='y', s = 5)
ax.legend()
ax.view_init(45, 0)
plt.show()
def mse(coef, x, y):
    return np.mean((np.dot(x, coef) - y)**2)/2
def gradients(coef, x, y):
    return np.mean(x.transpose()*(np.dot(x, coef) - y), axis = 1)
def multilinear_regression(coef, x, y, lr, b1 = 0.9, b2 = 0.999, epsilon = 1e-8):
    prev_error = 0
    m_coef = np.zeros(coef.shape)
    v_coef = np.zeros(coef.shape)
    moment_m_coef = np.zeros(coef.shape)
    moment_v_coef = np.zeros(coef.shape)
    t = 0
    while True:
        error = mse(coef, x, y)
        if abs(error - prev_error) <= epsilon:
            break
        prev_error = error
        grad = gradients(coef, x, y)
        t += 1
        m_coef = b1 * m_coef + (1-b1)*grad
        v_coef = b2 * v_coef + (1-b2)*grad**2
```

```

moment_m_coef = m_coef / (1-b1**t)
moment_v_coef = v_coef / (1-b2**t)
delta = ((lr / moment_v_coef**0.5 + 1e-8) *(b1 * moment_m_coef + (1-b1)*grad/(1-
b1**t)))
coef = np.subtract(coef, delta)
return coef
coef = np.array([0, 0, 0])
c = multilinear_regression(coef, x, y, 1e-1)
fig = plt.figure()
ax = fig.gca(projection='3d')
ax.scatter(x[:, 1], x[:, 2], y, label='y',
s = 5, color = "dodgerblue")
ax.scatter(x[:, 1], x[:, 2], c[0] + c[1]*x[:, 1] + c[2]*x[:, 2],
label='regression', s = 5, color = "orange")
ax.view_init(45, 0)
ax.legend()
plt.show()

```

### **Output:**



## **B. Perform logistic regression analysis.**

### **Code:**

```
import os
import numpy as np
import pandas as pd
import matplotlib
import matplotlib.pyplot as plt
import scipy.stats as stats
from sklearn import linear_model
from sklearn import preprocessing
from sklearn import metrics
matplotlib.style.use('ggplot')
plt.figure(figsize=(9,9))
def sigmoid(t): # Define the sigmoid function
    return (1/(1 + np.e**(-t)))
plot_range = np.arange(-6, 6, 0.1)
y_values = sigmoid(plot_range)
# Plot curve
plt.plot(plot_range, # X-axis range
y_values, # Predicted values
color="red")
titanic_train = pd.read_csv("titanic_train.csv") # Read the data
char_cabin = titanic_train["Cabin"].astype(str) # Convert cabin to str
new_Cabin = np.array([cabin[0] for cabin in char_cabin]) # Take first letter
titanic_train["Cabin"] = pd.Categorical(new_Cabin) # Save the new cabin var
# Impute median Age for NA Age values
new_age_var = np.where(titanic_train["Age"].isnull(), # Logical check
28, # Value if check is true

titanic_train["Age"]) # Value if check is false
titanic_train["Age"] = new_age_var
label_encoder = preprocessing.LabelEncoder()
# Convert Sex variable to numeric
encoded_sex = label_encoder.fit_transform(titanic_train["Sex"])
# Initialize logistic regression model
log_model = linear_model.LogisticRegression()
# Train the model
log_model.fit(X = pd.DataFrame(encoded_sex),
y = titanic_train["Survived"])
# Check trained model intercept
print(log_model.intercept_)
# Check trained model coefficients
print(log_model.coef_)
# Make predictions
```

```

preds = log_model.predict_proba(X= pd.DataFrame(encoded_sex))
preds = pd.DataFrame(preds)
preds.columns = ["Death_prob", "Survival_prob"]
# Generate table of predictions vs Sex
pd.crosstab(titanic_train["Sex"], preds.ix[:, "Survival_prob"])
# Convert more variables to numeric
encoded_class = label_encoder.fit_transform(titanic_train["Pclass"])
encoded_cabin = label_encoder.fit_transform(titanic_train["Cabin"])
train_features = pd.DataFrame([encoded_class,
encoded_cabin,
encoded_sex,
titanic_train["Age"]]).T
# Initialize logistic regression model
log_model = linear_model.LogisticRegression()

# Train the model
log_model.fit(X = train_features ,
y = titanic_train["Survived"])
# Check trained model intercept
print(log_model.intercept_)
# Check trained model coefficients
print(log_model.coef_)
# Make predictions
preds = log_model.predict(X= train_features)
# Generate table of predictions vs actual
pd.crosstab(preds,titanic_train["Survived"])
log_model.score(X = train_features ,
y = titanic_train["Survived"])
metrics.confusion_matrix(y_true=titanic_train["Survived"], # True labels
y_pred=preds) # Predicted labels
# View summary of common classification metrics
print(metrics.classification_report(y_true=titanic_train["Survived"],
y_pred=preds) )
# Read and prepare test data
titanic_test = pd.read_csv("titanic_test.csv") # Read the data
char_cabin = titanic_test["Cabin"].astype(str) # Convert cabin to str
new_Cabin = np.array([cabin[0] for cabin in char_cabin]) # Take first letter
titanic_test["Cabin"] = pd.Categorical(new_Cabin) # Save the new cabin var
# Impute median Age for NA Age values
new_age_var = np.where(titanic_test["Age"].isnull(), # Logical check
28, # Value if check is true
titanic_test["Age"]) # Value if check is false

titanic_test["Age"] = new_age_var
# Convert test variables to match model features
encoded_sex = label_encoder.fit_transform(titanic_test["Sex"])
encoded_class = label_encoder.fit_transform(titanic_test["Pclass"])

```

```

encoded_cabin = label_encoder.fit_transform(titanic_test["Cabin"])
test_features = pd.DataFrame([encoded_class,
encoded_cabin,encoded_sex,titanic_test["Age"]]).T
# Make test set predictions
test_preds = log_model.predict(X=test_features)
# Create a submission for Kaggle
submission = pd.DataFrame({"PassengerId":titanic_test["PassengerId"],
"Survived":test_preds})
# Save submission to CSV
submission.to_csv("tutorial_logreg_submission.csv",
index=False) # Do not save index values
print(pd)

```

### Output:

---

|                      |                       |                       |
|----------------------|-----------------------|-----------------------|
| <b>Survival_prob</b> | <b>0.193110906347</b> | <b>0.729443792051</b> |
| <b>Sex</b>           |                       |                       |
| <b>female</b>        | 0                     | 312                   |
| <b>male</b>          | 577                   | 0                     |

|             | precision | recall | f1-score | support |
|-------------|-----------|--------|----------|---------|
| 0           | 0.82      | 0.85   | 0.83     | 549     |
| 1           | 0.74      | 0.70   | 0.72     | 340     |
| avg / total | 0.79      | 0.79   | 0.79     | 889     |

---

|                 |          |          |
|-----------------|----------|----------|
| <b>Survived</b> | <b>0</b> | <b>1</b> |
| <b>row_0</b>    |          |          |
| <b>0</b>        | 467      | 103      |
| <b>1</b>        | 82       | 237      |

## Example 2:

### Code:

```
# -*- coding: utf-8 -*-
```

```
"""
```

```
Created on Mon Dec 16 22:24:44 2019
```

```
@author: MyHome
```

```
"""
```

```
import pandas as pd
import numpy as np
from sklearn import preprocessing
import matplotlib.pyplot as plt
plt.rc("font", size=14)
from sklearn.linear_model import LogisticRegression
from sklearn.model_selection import train_test_split
import seaborn as sns
sns.set(style="white")
sns.set(style="whitegrid", color_codes=True)
data = pd.read_csv('bank.csv', header=0)
data = data.dropna()
print(data.shape)
print(list(data.columns))
data['education'].unique()
data['education']=np.where(data['education']=='basic.9y', 'Basic', data['education'])
data['education']=np.where(data['education']=='basic.6y', 'Basic', data['education'])
data['education']=np.where(data['education']=='basic.4y', 'Basic', data['education'])
data['education'].unique()
data['y'].value_counts()
sns.countplot(x='y', data=data, palette='hls')
plt.show();
plt.savefig('Practical10B-plot.jpeg')
count_no_sub = len(data[data['y']==0])
count_sub = len(data[data['y']==1])
pct_of_no_sub = count_no_sub/(count_no_sub+count_sub)
print("percentage of no subscription is", pct_of_no_sub*100)
pct_of_sub = count_sub/(count_no_sub+count_sub)
print("percentage of subscription", pct_of_sub*100)
data.groupby('y').mean()
data.groupby('job').mean()
data.groupby('marital').mean()
data.groupby('education').mean()
##### Purchase Frequency for Job Title
pd.crosstab(data.job,data.y).plot(kind='bar')
plt.title('Purchase Frequency for Job Title')
plt.xlabel('Job')
plt.ylabel('Frequency of Purchase')
```

```

plt.savefig('purchase_fre_job')
##### Marital Status vs Purchase
table=pd.crosstab(data.marital,data.y)
table.div(table.sum(1).astype(float), axis=0).plot(kind='bar', stacked=True)
plt.title('Stacked Bar Chart of Marital Status vs Purchase')
plt.xlabel('Marital Status')
plt.ylabel('Proportion of Customers')
plt.savefig('mariral_vs_pur_stack')
##### Education vs Purchase
table=pd.crosstab(data.education,data.y)
table.div(table.sum(1).astype(float), axis=0).plot(kind='bar', stacked=True)
plt.title('Stacked Bar Chart of Education vs Purchase')

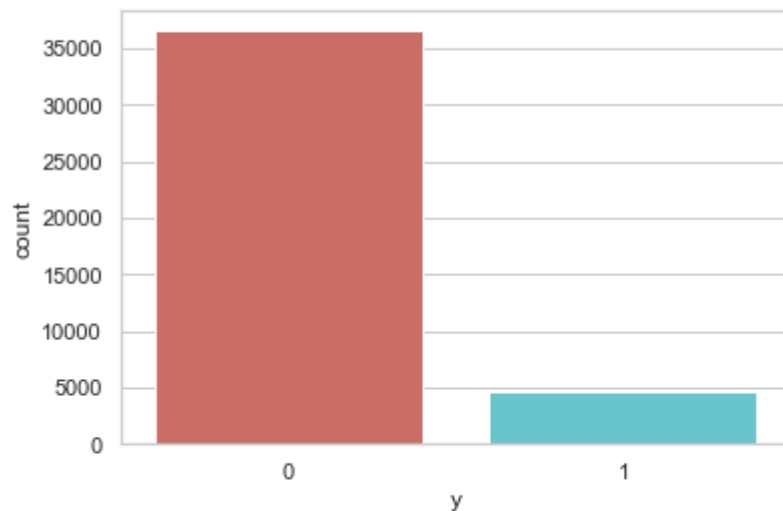
plt.xlabel('Education')
plt.ylabel('Proportion of Customers')
plt.savefig('edu_vs_pur_stack')
pd.crosstab(data.day_of_week,data.y).plot(kind='bar')
plt.title('Purchase Frequency for Day of Week')
plt.xlabel('Day of Week')
plt.ylabel('Frequency of Purchase')
plt.savefig('pur_dayofweek_bar')
##### Purchase Frequency for Month
pd.crosstab(data.month,data.y).plot(kind='bar')
plt.title('Purchase Frequency for Month')
plt.xlabel('Month')
plt.ylabel('Frequency of Purchase')
plt.savefig('pur_fre_month_bar')
##### Age Purchase frequency pattern
data.age.hist()
plt.title('Histogram of Age')
plt.xlabel('Age')
plt.ylabel('Frequency')
plt.savefig('hist_age')

```



## Output:

```
In [47]: runfile('K:/Research In Computing/Practical Material/Programs/Practical_10/Practical_10B.py', wdir='K:/Research In Computing/Practical Material/Programs/Practical_10')
(41188, 21)
['age', 'job', 'marital', 'education', 'default', 'housing', 'loan', 'contact', 'month', 'day_of_week', 'duration', 'campaign', 'pdays', 'previous', 'outcome', 'emp_var_rate', 'cons_price_idx', 'cons_conf_idx', 'euribor3m', 'nr_employed', 'y']
```



percentage of no subscription is 88.73458288821988  
percentage of subscription 11.265417111780131

