

Data Envelopment Analysis(DEA)

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```
# Uploading The Required Libraries
```

```
library(Benchmarking)
```

```
## Loading required package: lpSolveAPI
```

```
## Loading required package: ucminf
```

```
## Loading required package: quadprog
```

```
##
```

```
## Loading Benchmarking version 0.30h, (Revision 244, 2022/05/05 16:31:31) ...
```

```
## Build 2022/05/05 16:31:40
```

```
library(tidyverse)
```

```
## -- Attaching packages ----- tidyverse 1.3.2 --
```

```
## v ggplot2 3.3.6      v purrr  0.3.4
```

```
## v tibble  3.1.8      v dplyr  1.0.10
```

```
## v tidyr   1.2.1      v stringr 1.4.1
```

```
## v readr   2.1.2      v forcats 0.5.2
```

```
## -- Conflicts ----- tidyverse_conflicts() --
```

```
## x dplyr::filter() masks stats::filter()
```

```
## x dplyr::lag()     masks stats::lag()
```

```
#Compute the Formulation
```

```
#In this section, we will create a matrix and values
```

```
#creating the vectors with our values
```

```
input_values <- matrix(c(150, 400, 320, 520, 350, 320,  
0.2, 0.7, 1.2, 2.0, 1.2, 0.7), ncol=2)
```

```
output_values <- matrix(c(14000, 14000, 42000, 28000, 19000, 14000,  
3500, 21000, 10500, 42000, 25000, 15000), ncol=2)
```

```
# Defining column names
```

```
colnames(input_values) <- c("Staff Hours Per Day", "Supplies Per Day")
```

```
colnames(output_values) <- c("Reimbursed Patient-Days", "Privately Paid Patient-Days")
```

```
#To view the input_values values
```

```
input_values
```

```
##      Staff Hours Per Day Supplies Per Day
## [1,]           150           0.2
## [2,]           400           0.7
## [3,]           320           1.2
## [4,]           520           2.0
## [5,]           350           1.2
## [6,]           320           0.7
```

```
# To view the output_values values
output_values
```

```
##      Reimbursed Patient-Days Privately Paid Patient-Days
## [1,]           14000           3500
## [2,]           14000           21000
## [3,]           42000           10500
## [4,]           28000           42000
## [5,]           19000           25000
## [6,]           14000           15000
```

*#As we can see, we are obtaining the identical numbers as in the performance data table from the six nu
#In the next part, we will conduct a Data Envelopment Analysis (DEA), which is an analytical method tha*

```
#FDH-based DEA Analysis
#Now we'll use FDH to define and compute the DEA analysis.The Free disposability hull (FDH) is the assu
#Giving the input_values and output values.
Anal.FDH<- dea(input_values,output_values,RTS = "FDH")
#Making a data frame with efficiency values.
EV.FDH <- as.data.frame(Anal.FDH$eff)
# assigning an appropriate name
colnames(EV.FDH) <- c("Efficiency_FDH")
# Identification of peers
p.FDH <- peers(Anal.FDH)
# assigning an appropriate name for peers
colnames(p.FDH) <- c("Peer1_FDH")
# Using the lambda function, determine the relative weights assigned to peers.
lambda_FDH <- lambda(Anal.FDH)
# giving Lambda exact column name
colnames(lambda_FDH) <- c("L1_FDH", "L2_FDH", "L3_FDH", "L4_FDH", "L5_FDH", "L6_FDH")
# Creating a tabular data with peer, lambda, and efficiency
peer_lambda_EV.FDH <- cbind(p.FDH, lambda_FDH, EV.FDH)
# displaying summary chart
peer_lambda_EV.FDH
```

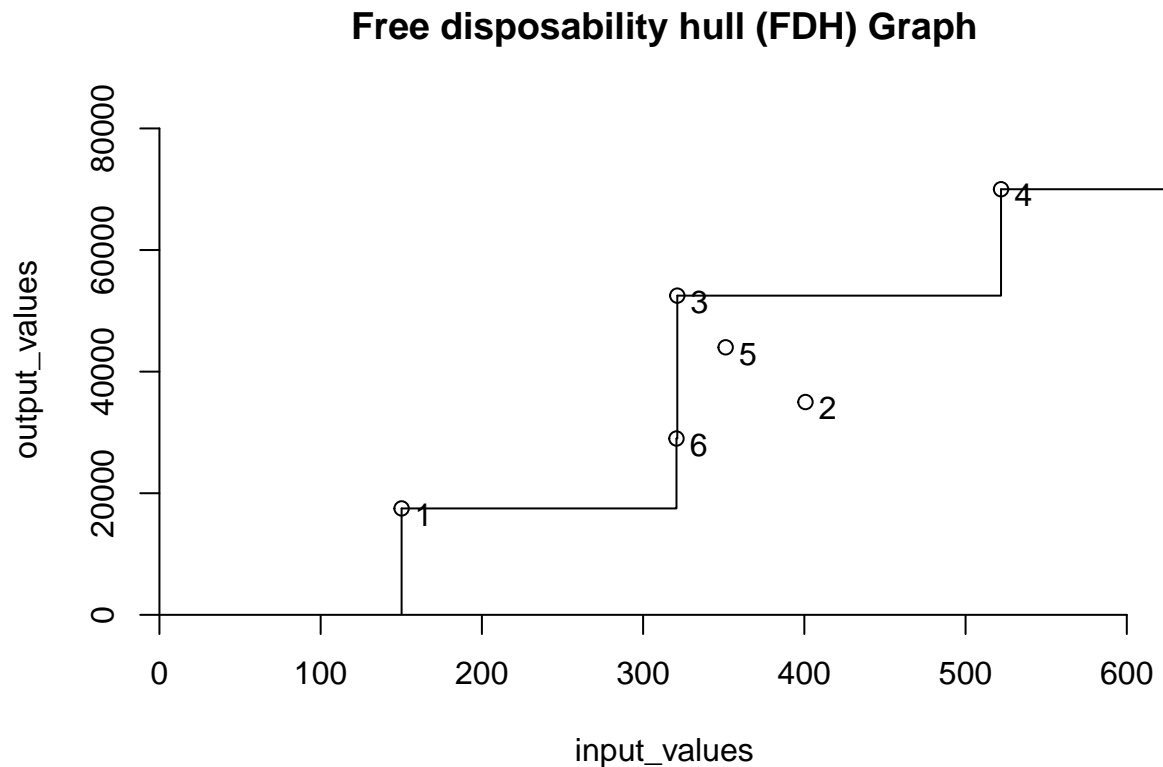
```
##      Peer1_FDH L1_FDH L2_FDH L3_FDH L4_FDH L5_FDH L6_FDH Efficiency_FDH
## 1           1      1      0      0      0      0      0           1
## 2           2      0      1      0      0      0      0           1
## 3           3      0      0      1      0      0      0           1
## 4           4      0      0      0      1      0      0           1
## 5           5      0      0      0      0      1      0           1
## 6           6      0      0      0      0      0      1           1
```

#As we learnt in this session, peers are a good method to discover inefficient DMUs or units, and Lambda is a good approach to find inefficient units.When solving the DEA model, values are the raw weights assigned

by peer units. The summary figure above indicates that each DMU or facility is operating at maximum capacity/efficiency. Because each peer was allocated a single unit, the Lambda and efficiency values are both 1 as well as

displaying the Plot results

```
dea.plot(input_values,output_values,RTS="FDH",ORIENTATION="in-out",txt=TRUE, xlab = "input_values", ylab = "output_values")
```



```
#CRS-based DEA Analysis
#Now we'll formulate and calculate the DEA analysis with Constant Returns to Scale (CRS). The CRS is par
# Giving the input_values and output_values
Anal.CRS <- dea(input_values,output_values,RTS = "CRS")
# observing the efficiency values
EV.CRS <- as.data.frame(Anal.CRS$eff)
# assigning a appropriate name
colnames(EV.CRS) <- c("Efficiency_CRS")
# Identification of peers
Peers_CRS <- peers(Anal.CRS)
# assigning an appropriate name
colnames(Peers_CRS) <- c("Peer1_CRS", "Peer2_CRS", "Peer3_CRS")
# Identifying the relative weights given to the peers using lambda function
lambda_CRS <- lambda(Anal.CRS)
# assign a appropriate column name for Lambda
```

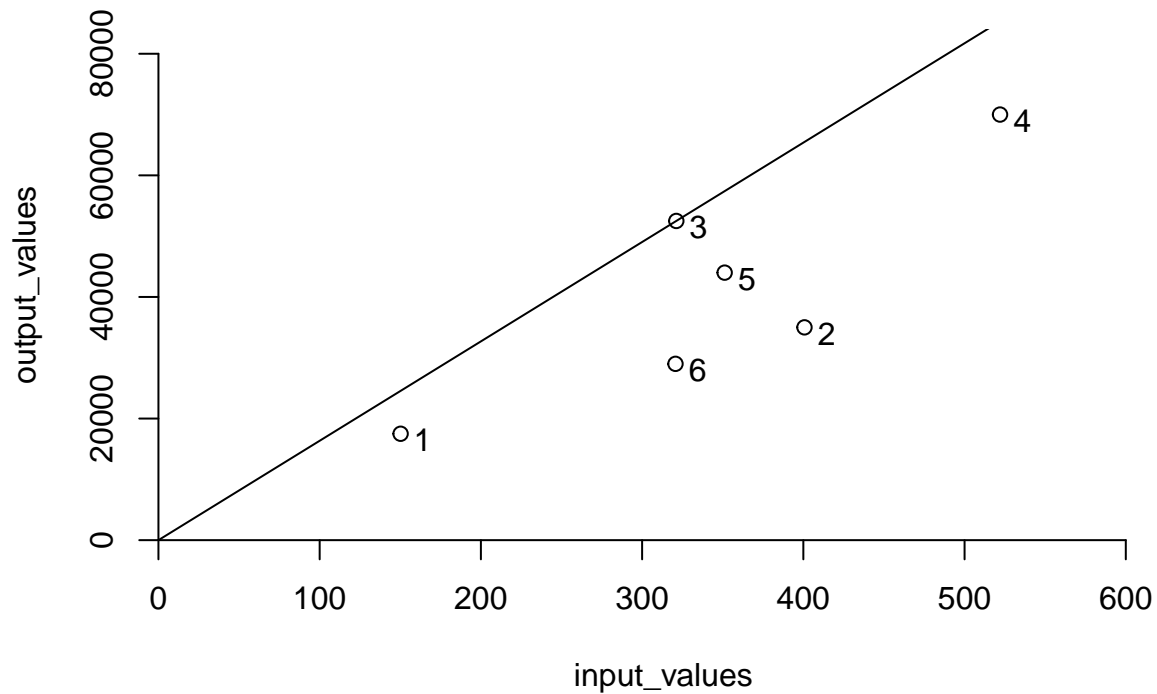
```
colnames(lambda_CRS) <- c("L1_CRS", "L2_CRS", "L3_CRS", "L4_CRS")
# Create a tabular data with peer, lambda, and efficiency
Peers_lambda_EV.CRS <- cbind(Peers_CRS, lambda_CRS, EV.CRS)
#displaying summary chart
Peers_lambda_EV.CRS
```

```
##      Peer1_CRS Peer2_CRS Peer3_CRS      L1_CRS      L2_CRS L3_CRS      L4_CRS
## 1           1         NA         NA 1.0000000 0.0000000      0 0.0000000
## 2           2         NA         NA 0.0000000 1.0000000      0 0.0000000
## 3           3         NA         NA 0.0000000 0.0000000      1 0.0000000
## 4           4         NA         NA 0.0000000 0.0000000      0 1.0000000
## 5           1           2           4 0.2000000 0.08048142      0 0.5383307
## 6           1           2           4 0.3428571 0.39499264      0 0.1310751
##      Efficiency_CRS
## 1           1.0000000
## 2           1.0000000
## 3           1.0000000
## 4           1.0000000
## 5           0.9774987
## 6           0.8674521
```

#In terms of Constant Returns to Scale (CRS), the facilities 1, 2, 3, and 4 are utilizing all of their efficiency, as demonstrated by the lambdas and peers. Facility 5 and 6, on the other hand, require portions of 1, 2, and 4, as demonstrated by the peers and lambdas above. It suggests that these two facilities (5 and 6) have opportunity to improve because their efficiency rates are 97.74% and 86.74%, respectively.

```
# displaying the Plot results
dea.plot(input_values,output_values,RTS="crs",ORIENTATION="in-out",
txt=TRUE, xlab = 'input_values', ylab= 'output_values', main="Constant Returns to Scale (CRS) Graph")
```

Constant Returns to Scale (CRS) Graph



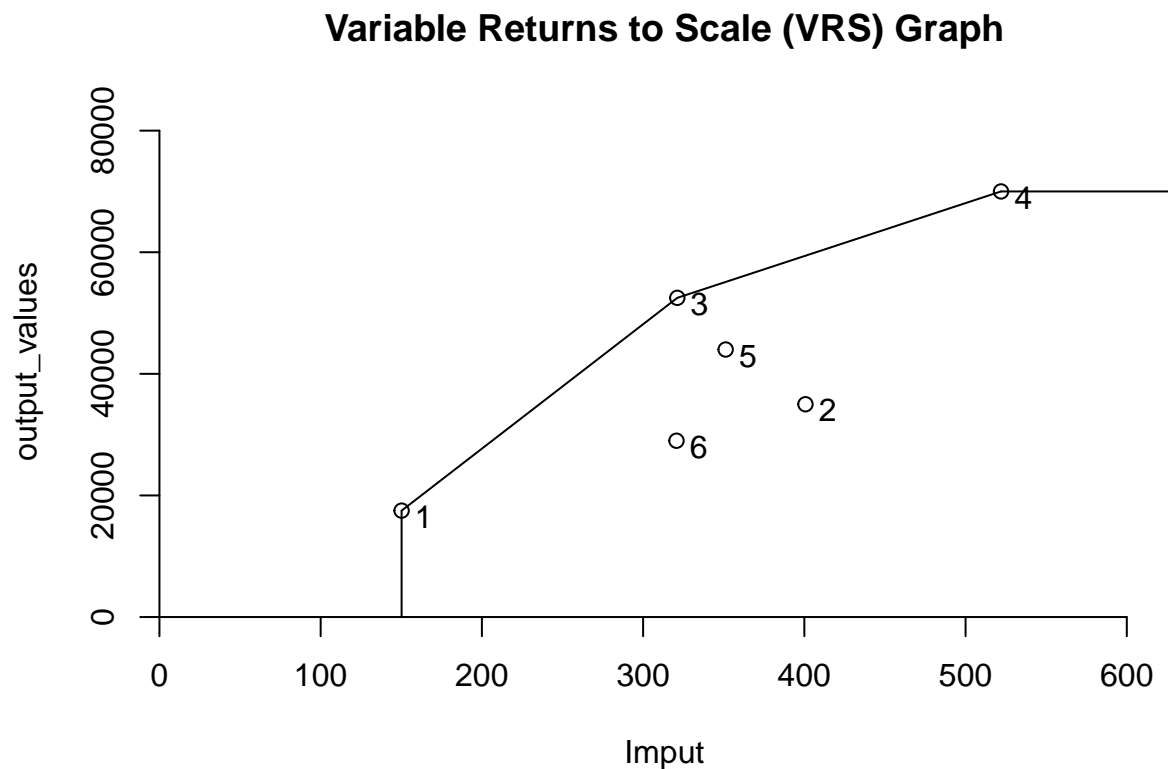
```
#VRS DEA Analysis
#Now we will construct and calculate the DEA analysis utilizing Variable Returns to Scale (VRS). VRS is
# Giving the input_values and output_values
Anal.VRS <- dea(input_values,output_values,RTS = "VRS")
# To observe efficiency values
EV.VRS <- as.data.frame(Anal.VRS$eff)
# assigning an appropriate name
colnames(EV.VRS) <- c("Efficiency_VRS")
# Identify the peers
Peers_VRS <- peers(Anal.VRS)
# assigning an appropriate name
colnames(Peers_VRS) <- c("Peer1_VRS", "Peer2_VRS", "Peer3_VRS")
# Identify the relative weights given to the peers using lambda function
lambda_VRS <- lambda(Anal.VRS)
# To assign an appropriate column name for Lambda
colnames(lambda_VRS) <- c("L1_VRS", "L2_VRS", "L3_VRS", "L4_VRS", "L5_VRS")
# Create a tabular data with peer, lambda, and efficiency
peers_lambda_EV.VRS <- cbind(Peers_VRS, lambda_VRS, EV.VRS)
#displaying summary chart
peers_lambda_EV.VRS
```

##	Peer1_VRS	Peer2_VRS	Peer3_VRS	L1_VRS	L2_VRS	L3_VRS	L4_VRS	L5_VRS
## 1	1	NA	NA	1.0000000	0.0000000	0	0	0.0000000
## 2	2	NA	NA	0.0000000	1.0000000	0	0	0.0000000
## 3	3	NA	NA	0.0000000	0.0000000	1	0	0.0000000
## 4	4	NA	NA	0.0000000	0.0000000	0	1	0.0000000

```
## 5      5      NA      NA 0.0000000 0.0000000      0      0 1.0000000
## 6      1      2      5 0.4014399 0.3422606      0      0 0.2562995
## Efficiency_VRS
## 1      1.0000000
## 2      1.0000000
## 3      1.0000000
## 4      1.0000000
## 5      1.0000000
## 6      0.8963283
```

#When we run the Variable Returns to Scale (VRS), we can see that facilities 1, 2, 3, 4, and 5 are all operating at full capacity or efficiency. This is not the case with facility 6, which has an efficiency of 89.63%. Peers and lambdas indicate that facility 6 requires parts of facilities 1, 2, and 5 to be more efficient.

```
# displaying the Plot results
dea.plot(input_values,output_values,RTS="vrs",ORIENTATION="in-out",
txt=TRUE, xlab ='Input', ylab = 'output_values', main ="Variable Returns to Scale (VRS) Graph")
```



```
#IRS Analysis for DEA
#Now we'll formulate and compute the DEA analysis with Increasing Returns to Scale (IRS).IRS shows whet
# Giving the input_values and output_values
Anal.IRS <- dea(input_values,output_values,RTS = "irs")
# observe efficiency values
EV.IRS <- as.data.frame(Anal.IRS$eff)
# assigning an appropriate name
```

```

colnames(EV.IRS) <- c("Efficiency_IRS")
# Identify the peers
Peers_IRS <- peers(Anal.IRS)
# assign an appropriate name
colnames(Peers_IRS) <- c("Peer1_IRS", "Peer2_IRS", "Peer3_IRS")
# Identify the relative weights given to the peers using lambda function
lambda_IRS <- lambda(Anal.IRS)
# assigning an appropriate column name for Lambda
colnames(lambda_IRS) <- c("L1_IRS", "L2_IRS", "L3_IRS", "L4_IRS", "L5_IRS")
# Create a tabular data with peer, lambda, and efficiency
peers_lambda_EV.IRS <- cbind(Peers_IRS, lambda_IRS, EV.IRS)
#displaying summary chart
peers_lambda_EV.IRS

```

```

##      Peer1_IRS Peer2_IRS Peer3_IRS      L1_IRS      L2_IRS L3_IRS L4_IRS      L5_IRS
## 1           1         NA         NA 1.0000000 0.0000000      0      0 0.0000000
## 2           2         NA         NA 0.0000000 1.0000000      0      0 0.0000000
## 3           3         NA         NA 0.0000000 0.0000000      1      0 0.0000000
## 4           4         NA         NA 0.0000000 0.0000000      0      1 0.0000000
## 5           5         NA         NA 0.0000000 0.0000000      0      0 1.0000000
## 6           1          2          5 0.4014399 0.3422606      0      0 0.2562995
##      Efficiency_IRS
## 1           1.0000000
## 2           1.0000000
## 3           1.0000000
## 4           1.0000000
## 5           1.0000000
## 6           0.8963283

```

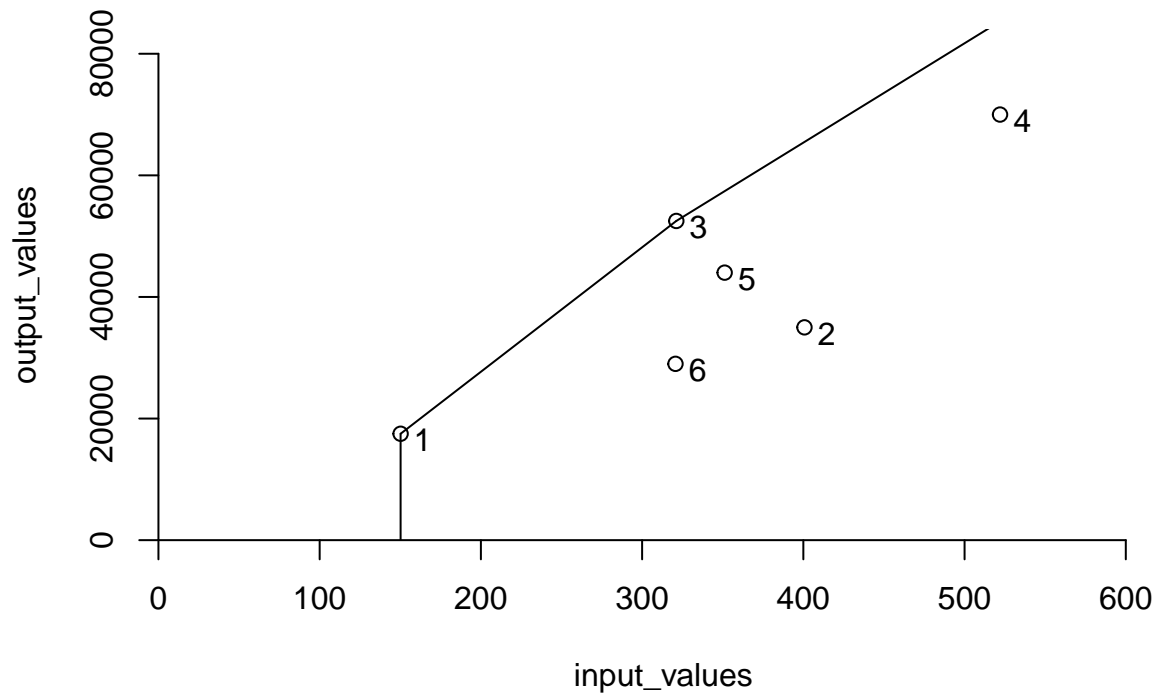
#Rising Returns to Scale (IRS) is the same as Variable Returns to Scale (VRS) since facilities 1, 2, 3, 4, and 5 are all operating at full capacity, while facility 6 requires improvements from units 1, 2, and 5 to enhance their efficiency, which is 89.63%.

```

# displaying the Plot results
dea.plot(input_values,output_values,RTS="irs",ORIENTATION="in-out",
txt=TRUE, xlab = 'input_values', ylab= 'output_values', main="Increasing Returns to Scale (IRS) Graph")

```

Increasing Returns to Scale (IRS) Graph



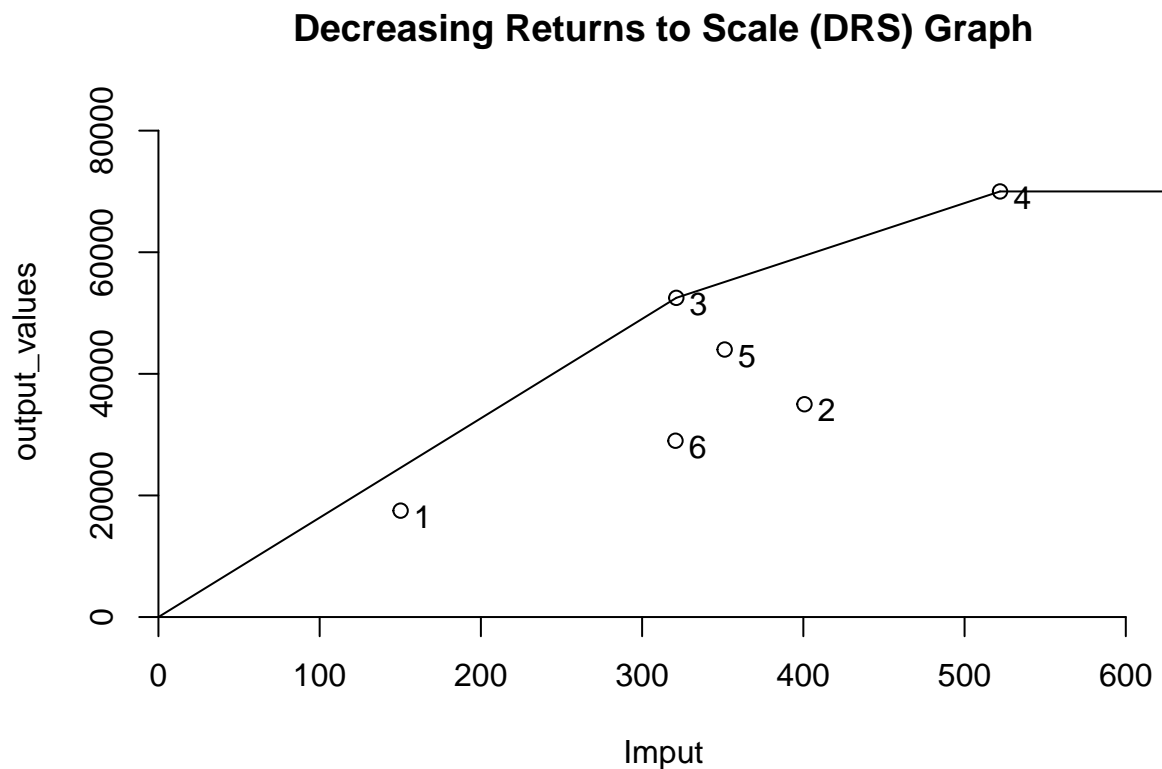
```
#DRS for DEA Analysis
#Now we will develop and perform the DEA analysis based on Decreasing Returns to Scale (DRS).DRS is the
# Giving the input_values and output_values
Anal.DRS <- dea(input_values,output_values,RTS = "DRS")
# To observe the efficiency values
EV.DRS <- as.data.frame(Anal.DRS$eff)
# assigning an appropriate name
colnames(EV.DRS) <- c("Efficiency_DRS")
# Identifying the peers
Peers_DRS <- peers(Anal.DRS)
# assigning an appropriate name
colnames(Peers_DRS) <- c("Peer1_DRS", "Peer2_DRS", "Peer3_DRS")
# Identifying the relative weights given to the peers using lambda function
lambda_DRS <- lambda(Anal.DRS)
# assign an appropriate column name for Lambda
colnames(lambda_DRS) <- c("L1_DRS", "L2_DRS", "L3_DRS", "L4_DRS")
# Create a tabular data with peer, lambda, and efficiency
peers_lambda_EV.DRS <- cbind(Peers_DRS, lambda_DRS, EV.DRS)
#displaying summary chart
peers_lambda_EV.DRS
```

##	Peer1_DRS	Peer2_DRS	Peer3_DRS	L1_DRS	L2_DRS	L3_DRS	L4_DRS
## 1	1	NA	NA	1.0000000	0.0000000	0	0.0000000
## 2	2	NA	NA	0.0000000	1.0000000	0	0.0000000
## 3	3	NA	NA	0.0000000	0.0000000	1	0.0000000
## 4	4	NA	NA	0.0000000	0.0000000	0	1.0000000


```
## 5      1      2      4 0.2000000 0.08048142      0 0.5383307
## 6      1      2      4 0.3428571 0.39499264      0 0.1310751
## Efficiency_DRS
## 1      1.0000000
## 2      1.0000000
## 3      1.0000000
## 4      1.0000000
## 5      0.9774987
## 6      0.8674521
```

#Decreasing Returns to Scale (DRS) is effective in facilities 1, 2, 3, and 4. There is need for improvement in facilities 5 and 6. Both require parts of facilities 1, 2, and 4 to attain their maximum efficiency of 1, as shown in the preceding table.

```
# displaying the Plot results
dea.plot(input_values,output_values,RTS="drs",ORIENTATION="in-out",
txt=TRUE, xlab = 'Input', ylab= 'output_values', main="Decreasing Returns to Scale (DRS) Graph")
```



```
#FRH DEA Analysis
#Now, we'll use Free Replicability Hull to define and perform the DEA analysis (FRH).Both FRH and FDH e
# Giving the input_values and output_values
Anal.FRH <- dea(input_values,output_values,RTS = "add")
# To observe efficiency values
EV.FRH <- as.data.frame(Anal.FRH$eff)
# assigning an appropriate name
```

```

colnames(EV.FRH) <- c("Efficiency_FRH")
# Identifying the peers
Peers_FRH <- peers(Anal.FRH)
# assign an appropriate name
colnames(Peers_FRH) <- c("peer1_FRH")
# Identifying the relative weights given to the peers using lambda function
lambda_FRH <- lambda(Anal.FRH)
# To assign an appropriate column name for Lambda
colnames(lambda_FRH) <- c("L1_FRH", "L2_FRH", "L3_FRH", "L4_FRH", "L5_FRH", "L6_FRH")
# Create a tabular data with peer, lambda, and efficiency
peers_lambda_EV.FRH <- cbind(Peers_FRH, lambda_FRH, EV.FRH)
#displaying summary chart
peers_lambda_EV.FRH

```

```

##      peer1_FRH L1_FRH L2_FRH L3_FRH L4_FRH L5_FRH L6_FRH Efficiency_FRH
## 1           1      1      0      0      0      0      0              1
## 2           2      0      1      0      0      0      0              1
## 3           3      0      0      1      0      0      0              1
## 4           4      0      0      0      1      0      0              1
## 5           5      0      0      0      0      1      0              1
## 6           6      0      0      0      0      0      1              1

```

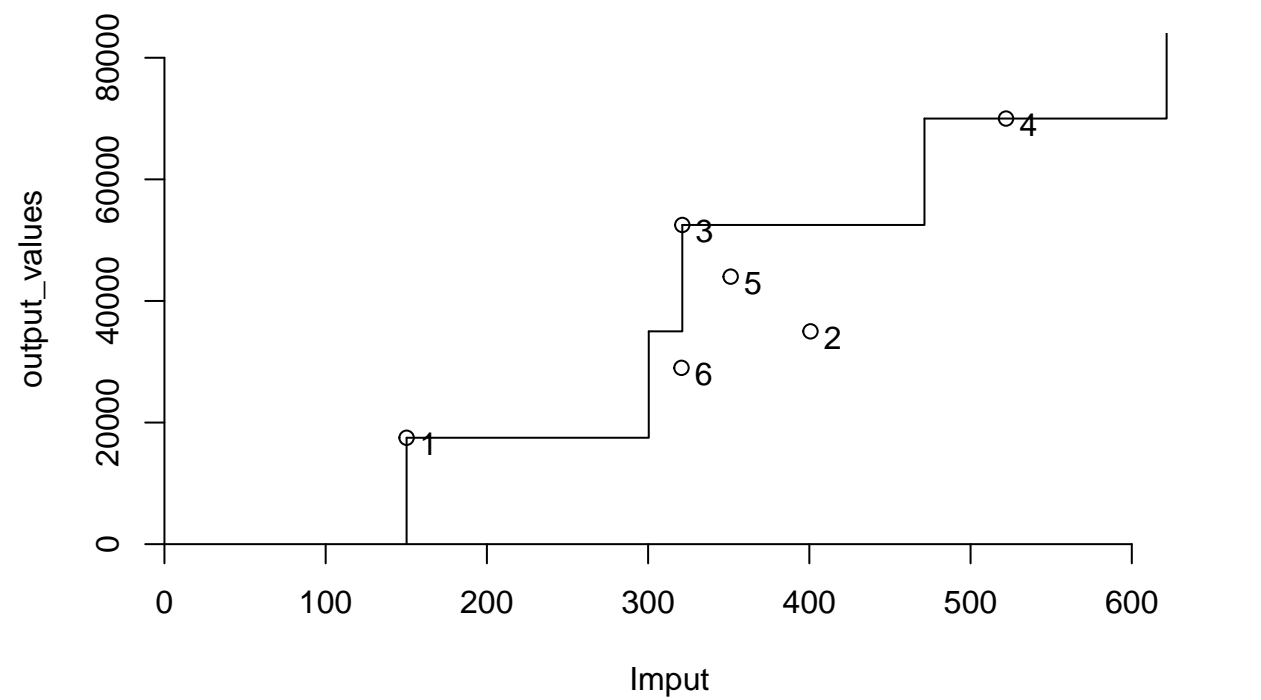
#All of the DMU in Free Replicability Hull (FRH) are extremely efficient. It behaves similarly to the Free disposability hull (FDH), in that each of its values has its own peer, lambdas, and efficiency of 1.

```

# displaying the Plot results
dea.plot(input_values,output_values,RTS="add",ORIENTATION="in-out",
txt=TRUE, xlab = 'Input', ylab= 'output_values', main="Free Replicability Hull (FRH) Graph")

```

Free Replicability Hull (FRH) Graph



#Comparison of various assumptions
#"All DEA models share the premise of estimating the technology using a minimal extrapolation technique"