DEA_Analysis and representative experiment

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Statement:

The field of information technology should be attentive to the imperative of sustainable cost reduction. Data centers, with their energy consumption rivaling that of industrial facilities and small communities, underscore the necessity of implementing progressive and transparent energy policies. These policies should be geared toward optimizing energy efficiency and overall operational effectiveness. To this end, I suggest employing Data Envelopment Analysis (DEA) to evaluate energy consumption and performance metrics. This evaluation should encompass a diverse range of data centers, including those with varying demands, sizes, and capabilities. The insights derived from the DEA analysis will serve as a foundation for recommending effective energy policies. Furthermore, they will empower data-center managers to pinpoint operational inefficiencies and initiate corrective measures.

Summary: Based on my examination and assessment, I have appraised the energy consumption and performance metrics of data centers with the aim of advancing sustainability and reducing costs.

In this process, it is vital to collect data pertaining to energy usage, performance measures, and other essential information to create a comprehensive dataset that accommodates various demands and sizes. An essential step in this process is defining input and output variables, such as the number of machines, shutdown operations, and energy consumption. I have opted to use the "Benchmarking" package for Data Envelopment Analysis (DEA), encompassing both natural DEA and constant returns to scale, which aids in determining the efficiency rating of data centers. When operations are optimized, the efficiency score reaches 1; any score below 1 signifies deficiencies in the data. To address potential inefficiencies stemming from inadequate values, I have incorporated specific methods to identify the precise prerequisites for achieving efficiency.

Load the csv file

```
df=read.csv("C:\\Users\\jeeva thangamani\\Downloads\\energy.csv")
df
##
       X Energy.Policy Scheduling.Model Work.Load D.C..Size Shut.Downs
## 1
                Always
                              Monolithic
                                              High
                                                         1000
                                                                   37166
## 2
       2
                Margin
                                   Mesos
                                              High
                                                         1000
                                                                   13361
## 3
       3
                 Gamma
                                   Omega
                                              High
                                                         1000
                                                                   14252
## 4
       4
                Always
                                   Mono.
                                                Low
                                                         1000
                                                                   36404
## 5
       5
           Exponential
                                   Mesos
                                                         1000
                                                                   19671
                                                Low
```

```
## 6
       6
                                                  Low
                                                            1000
                                                                       32407
                   Load
                                     Omega
## 7
       7
                 Margin
                                     Mono.
                                                 High
                                                            5000
                                                                        6981
## 8
       8
                  Gamma
                                     Mono.
                                                 High
                                                            5000
                                                                        9877
## 9
       9
                                                            5000
                                                                       33589
                 Random
                                     Mesos
                                                 High
## 10 10
                 Margin
                                     Omega
                                                 High
                                                            5000
                                                                        8578
## 11 11
            Exponential
                                     Omega
                                                 High
                                                            5000
                                                                       11863
## 12 12
                                                            5000
                                                                       15452
                 Margin
                                     Omega
                                                  Low
## 13 13
                 Margin
                                     Mono.
                                                 High
                                                           10000
                                                                        9680
## 14 14
                  Gamma
                                     Mono.
                                                 High
                                                          10000
                                                                       11388
## 15 15
                 Margin
                                                 High
                                                          10000
                                                                       18150
                                     Omega
## 16 16
                  Gamma
                                     Omega
                                                 High
                                                          10000
                                                                       18409
## 17 17
                  Gamma
                                     Mesos
                                                  Low
                                                          10000
                                                                       29707
## 18 18
                 Random
                                                          10000
                                                                       40772
                                     Omega
                                                  Low
      Computing.Time..h. MWh.Consumed Queue.Time..ms.
##
## 1
                                  49.01
                                                     90.1
                   104.42
## 2
                   104.26
                                  49.65
                                                   1093.0
## 3
                   104.17
                                  49.60
                                                      0.1
## 4
                    49.25
                                  23.92
                                                     78.3
## 5
                    49.63
                                  24.65
                                                   1188.7
## 6
                    49.34
                                  24.19
                                                      1.1
## 7
                    99.96
                                 237.09
                                                    126.2
                    99.96
## 8
                                 235.92
                                                    129.8
## 9
                   100.03
                                                   1122.6
                                 234.90
## 10
                   100.26
                                 239.13
                                                      0.7
## 11
                   100.26
                                 236.95
                                                      1.0
## 12
                    46.70
                                 115.82
                                                      0.5
## 13
                   101.56
                                 481.36
                                                    325.2
## 14
                   101.56
                                 479.36
                                                    327.9
## 15
                   101.63
                                 486.11
                                                      2.6
## 16
                   101.63
                                 484.69
                                                      2.5
## 17
                    45.83
                                                   1107.6
                                 228.31
## 18
                    46.09
                                 233.50
                                                      3.8
library(Benchmarking)
## Loading required package: lpSolveAPI
## Loading required package: ucminf
## Loading required package: quadprog
library(lpSolveAPI)
library(ucminf)
library(quadprog)
```

Defining the input and output variables for the DEA analysis

```
ip=df[,c("D.C..Size","Shut.Downs")]
op =df[,c("Computing.Time..h.", "MWh.Consumed","MWh.Consumed")]
```

The analysis is performed with specified inputs and outputs. According to the CRS model, data centers are assumed to be operating optimally, and any deviations from this optimal state are considered inefficiencies. In this evaluation, we can focus on data centers that are performing below par (those with scores below 1) to pinpoint areas that require enhancement.

```
d=dea(ip,op,RTS = "crs")
d
## [1] 1.0000 1.0000 0.9991 0.4818 0.4965 0.4872 1.0000 0.9826 0.9578 1.0000
## [11] 0.9806 0.4754 1.0000 0.9939 1.0000 0.9970 0.4687 0.4783
```

The 'peers' function is frequently used to identify peer units linked to each data center. These peer units function as benchmarks or reference points from which less efficient units can gain valuable insights. The 'lambda' function calculates the relative weights assigned to these peers, revealing how closely the performance of benchmark or reference units should be mirrored to attain efficiency.

```
print(d)
## [1] 1.0000 1.0000 0.9991 0.4818 0.4965 0.4872 1.0000 0.9826 0.9578 1.0000
## [11] 0.9806 0.4754 1.0000 0.9939 1.0000 0.9970 0.4687 0.4783
peers(d)
            # It determines the peers For facilities 5,6, the peer units are
1,2,4.
##
         peer1 peer2 peer3
##
    [1,]
             1
                   NA
                         NA
##
             2
                   NA
                         NA
    [2,]
##
  [3,]
             1
                    2
                         NA
                         NA
##
    [4,]
             2
                   NA
##
    [5,]
             2
                   NA
                         NA
##
             2
                   NA
                         NA
    [6,]
##
    [7,]
             7
                   NA
                         NA
##
             2
                         13
    [8,]
                   10
             2
##
                   15
                         NA
   [9,]
## [10,]
            10
                   NA
                         NA
                   13
                         15
## [11,]
             2
## [12,]
             2
                   15
                         NA
## [13,]
            13
                   NA
                         NA
## [14,]
             2
                   13
                         15
## [15,]
            15
                   NA
                         NA
                   15
                         NA
## [16,]
             2
## [17,]
             2
                   15
                         NA
             2
                   15
                         NA
## [18,]
d Weights <- lambda(d)</pre>
#Determine the relative weights assigned to the peers. For facility 4, the
weights are 0.20, 0.08, and 0.54. The facility 6 weights are 0.34, 0.39, and
0.13.
```

```
d_Weights
##
              L1
                        L2 L7
                                  L10
                                          L13
                                                    L15
   ##
   [2,] 0.000000000 1.000000000
                           0 0.0000000 0.0000000 0.00000000
##
   [3,] 0.009970484 0.989150989 0 0.0000000 0.0000000 0.00000000
  [4,] 0.000000000 0.481772407 0 0.0000000 0.0000000 0.00000000
##
   [5,] 0.000000000 0.496475327 0 0.0000000 0.0000000 0.00000000
  [6,] 0.000000000 0.487210473
                           0 0.0000000 0.0000000 0.00000000
##
   [7,] 0.000000000 0.000000000
                           1 0.0000000 0.0000000 0.00000000
  [8,] 0.000000000 0.220982865
                           0 0.5914729 0.1734861 0.00000000
  [9,] 0.000000000 2.033467411
                           0 0.0000000 0.0000000 0.27553094
## [10,] 0.00000000 0.000000000
                           0 1.0000000 0.0000000 0.00000000
## [11,] 0.00000000 0.536265781
                           0 0.0000000 0.4082527 0.02840485
## [12,] 0.00000000 0.262566735
                          0 0.0000000 0.0000000 0.21144095
## [14,] 0.000000000 0.006398513 0 0.0000000 0.8022310 0.19106871
## [16,] 0.000000000 0.022365412 0 0.0000000 0.0000000 0.99479451
## [17,] 0.000000000 0.469111194 0 0.0000000 0.0000000 0.42175357
```

[18,] 0.000000000 0.937209877 0 0.0000000 0.0000000 0.38461980