assignment 2 bikes

Drew Murray

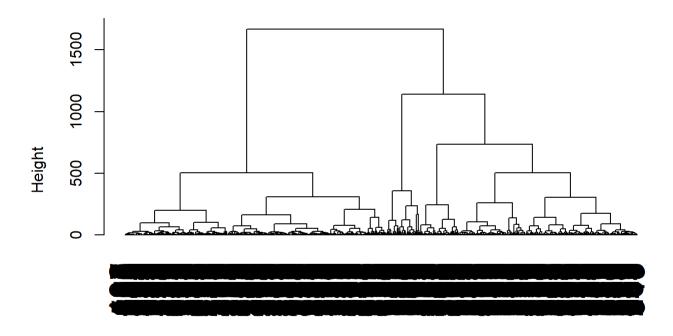
10/1/2022

```
Bikes <- read.csv("C:/Users/dgmur/Downloads/SeoulBikes_Fl2022.csv")
View(Bikes)
bikes2 <- Bikes[,c(1:4,12)]
View(bikes2)</pre>
```

#a

```
distance<- dist(bikes2)
a <- plot(hclust(distance, "average"), hang = -3,cex=2)</pre>
```

Cluster Dendrogram



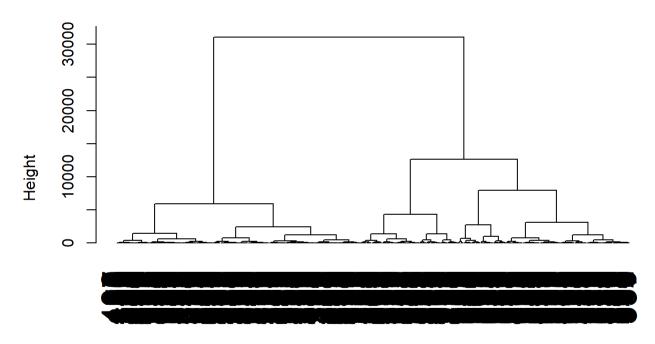
distance hclust (*, "average")

```
a
```

```
## NULL
```

```
b<- plot(hclust(distance, "ward.D2"), hang = -3,cex=2)</pre>
```

Cluster Dendrogram



distance hclust (*, "ward.D2")

b

NULL

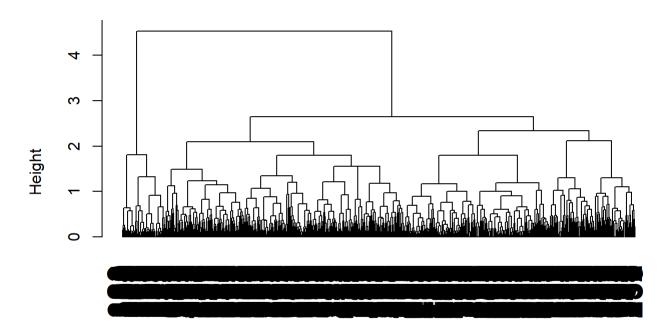
#no, it's a bit challenging to determine the number of clusters

#b

```
bikes2s <- apply(bikes2[ , 1:4], 2, function(x) (x-mean(x))/sd(x))
distance2 <- dist(bikes2s)
c<- plot(hclust(distance2, "average"), hang = -3,cex=2)</pre>
```

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Cluster Dendrogram



distance2 hclust (*, "average")

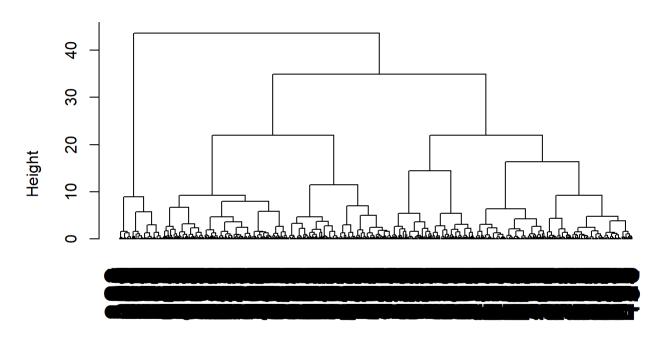
С

NULL

d<- plot(hclust(distance2, "ward.D2"), hang = -3,cex=2)</pre>

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Cluster Dendrogram



distance2 hclust (*, "ward.D2")

d

NULL

#I prefer the standardized because it's easier to determine the actual amount of clusters in the dendrogram #c

clust4<- kmeans(bikes2,4)
clust4</pre>

```
## K-means clustering with 4 clusters of sizes 214, 197, 200, 119
##
## Cluster means:
##
     Day
         Month
              Year RentedBikeCount
                           Snowfall
## 1 17.17290 7.476636 2018.000
                    1876.0467 0.001401869
## 2 14.53299 6.035533 2017.848
                     771.1066 0.018274112
## 3 15.55000 5.715000 2017.840
                     216.6050 0.257500000
## 4 15.36134 6.991597 2018.000
                    2710.8908 0.000000000
##
## Clustering vector:
##
  ##
 [75] 2 2 3 3 3 3 2 2 2 2 3 3 3 2 2 2 3 3 3 2 2 2 3 2 3 3 3 2 2 1 3 2 3 3 2 2 2
## [186] 1 4 2 4 4 2 2 4 4 2 3 4 2 2 4 4 4 4 1 2 2 4 3 1 1 1 2 3 3 1 1 1 1 2 2 2 1
## [260] 1 2 2 1 1 1 1 2 2 2 3 1 1 1 1 2 2 2 1 1 4 1 1 2 2 1 4 4 4 1 2 3 1 3 3 3 2
## [482] 1 1 1 1 1 2 4 1 4 3 2 2 3 4 1 3 4 4 2 3 4 1 1 1 1 1 3 3 4 4 4 4 1 1 4 1 2
## [519] 4 4 1 1 1 1 4 3 4 3 4 4 4 2 3 1 4 4 4 3 4 4 4 1 1 4 1 4 4 4 1 4 4 4 1 4 4
## [556] 1 4 1 4 4 4 4 4 4 4 2 4 4 4 4 1 1 4 3 4 2 4 3 3 2 4 4 4 4 1 4 3 1 4 4 4 1 1
## [593] 4 4 4 4 4 2 2 4 4 4 4 1 2 2 4 1 1 1 1 2 2 1 1 4 1 1 2 2 4 4 2 4 4 1 1 4 4
##
## Within cluster sum of squares by cluster:
## [1] 14027256 9469312 5183165 14939972
 (between SS / total SS = 93.2 %)
##
##
## Available components:
##
## [1] "cluster"
            "centers"
                    "totss"
                            "withinss"
                                    "tot.withinss"
## [6] "betweenss"
            "size"
                            "ifault"
                    "iter"
```

```
clust3 <- kmeans(bikes2,3)
clust3</pre>
```

```
## K-means clustering with 3 clusters of sizes 149, 369, 212
##
## Cluster means:
##
   Day
     Month
        Year RentedBikeCount
               Snowfall
           2618.2349 0.000000000
## 1 15.20134 7.040268 2018.000
## 2 15.08943 5.945799 2017.832
           437.9295 0.149322493
## 3 17.18396 7.174528 2018.000
           1733.8962 0.001415094
##
## Clustering vector:
 ##
 ##
 ##
## [334] 3 3 3 3 2 2 3 2 2 2 2 2 3 3 3 3 2 2 3 3 3 3 3 2 2 3 3 3 3 2 2 2 2 2 2
##
## Within cluster sum of squares by cluster:
## [1] 20044550 29919366 18341768
 (between_SS / total_SS = 89.3 %)
##
##
## Available components:
##
      "centers"
## [1] "cluster"
               "withinss"
                    "tot.withinss"
           "totss"
## [6] "betweenss"
      "size"
           "iter"
               "ifault"
```

```
clust2 <- kmeans(bikes2,2)
clust2</pre>
```

```
## K-means clustering with 2 clusters of sizes 331, 399
##
## Cluster means:
##
   Day
      Month
         Year RentedBikeCount
                   Snowfall 
## 1 16.52266 7.290030 2018.000
              2179.4713 0.0009063444
## 2 15.05514 5.892231 2017.845
              495.9749 0.1380952381
##
## Clustering vector:
##
 ## [223] 2 1 1 2 2 1 1 1 1 1 2 2 1 1 1 1 1 2 2 1 1 1 1 1 2 2 1 1 1 1 1 2 2 2 1 1 1 1 1 2 2 2 1 1 1 1 1 2 2 1 1 2 1
## [297] 2 2 2 2 1 2 2 2 1 2 2 2 2 2 2 1 2 1 1 1 1 2 2 1 1 1 1 2 2 1 1 1 1 1 2 2 2 1
## [556] 1 1 1 1 1 1 1 1 1 2 1 1 1 1 1 1 2 2 2 2 1 1 1 1 1 1 1 1 1 1 1 1
##
## Within cluster sum of squares by cluster:
## [1] 80841025 46574439
##
 (between SS / total SS = 80.1 %)
##
## Available components:
##
## [1] "cluster"
        "centers"
             "totss"
                   "withinss"
                        "tot.withinss"
## [6] "betweenss"
        "size"
             "iter"
                   "ifault"
```

#I chose 2 clusters because had a highest cluster sum of squares, while the cluster mean >0

#d

```
clust5 <- kmeans(bikes2s,5)
clust5</pre>
```

```
## K-means clustering with 5 clusters of sizes 145, 62, 176, 154, 193
##
## Cluster means:
##
     Day
         Month
              Year RentedBikeCount
## 1 -0.8246137 -1.0519563 0.3044458
                  -0.7876544
## 2 0.0317477 1.5865597 -3.2801577
                  -0.8613488
## 3 0.8515252 0.2197148 0.3044458
                   0.9809081
## 4 0.8697834 -0.5194636 0.3044458
                  -0.7512608
## 5 -0.8612147 0.4947903 0.3044458
                   0.5734086
##
## Clustering vector:
##
  [75] 1 1 1 1 1 4 4 4 4 4 4 4 4 4 4 4 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 4 4 4 4 4
## [149] 4 4 3 1 1 5 5 1 1 1 5 5 1 5 1 5 1 5 3 4 4 4 4 4 3 4 3 3 3 4 4 3 3 3 5 5 1 1
## [186] 5 5 1 5 5 1 1 5 5 1 1 3 4 4 3 3 3 3 4 4 3 4 3 3 3 4 1 1 5 5 5 5 5 1 1 5
## [482] 4 3 3 3 4 1 5 5 5 1 1 1 1 5 5 1 5 1 1 3 3 3 3 3 4 4 3 3 3 3 3 3 5 1
##
## Within cluster sum of squares by cluster:
## [1] 104.19797 68.50358 185.44553 185.27594 288.14813
##
 (between SS / total SS = 71.5 %)
##
## Available components:
##
                      "withinss"
## [1] "cluster"
                             "tot.withinss"
         "centers"
                "totss"
## [6] "betweenss"
         "size"
                "iter"
                      "ifault"
```

```
clust10 <- kmeans(bikes2s,10)
clust10</pre>
```

```
## K-means clustering with 10 clusters of sizes 59, 73, 109, 63, 62, 64, 55, 79, 105, 61
##
## Cluster means:
##
               Day
                          Month
                                         Year RentedBikeCount
## 1
       -0.9945660 -0.3243994
                                   0.3044458
                                                      1.1051452
        1.1257982 -0.4700918
##
   2
                                   0.3044458
                                                      0.8925944
##
   3
       -0.9521511 -1.1442897
                                   0.3044458
                                                     -0.7966331
## 4
        1.0091282
                     0.9286758
                                                      0.6205653
                                   0.3044458
## 5
        0.0317477
                     1.5865597 -3.2801577
                                                     -0.8613488
## 6
        0.8323217
                     0.5540155
                                   0.3044458
                                                     -0.7924549
## 7
       -1.0237642
                     0.6696209
                                   0.3044458
                                                     -0.8666002
## 8
       -0.8080809
                     0.8161070
                                   0.3044458
                                                      0.8085666
## 9
        0.6852582 -1.1986357
                                                     -0.8200875
                                   0.3044458
## 10
        0.1583915 0.1706348
                                   0.3044458
                                                      1.4982069
##
##
   Clustering vector:
##
      [1]
                          5
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##
     [26]
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     [51]
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## [151]
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## [176]
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## [226]
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## [251]
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## [276]
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## [301]
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## [326]
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## [401]
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## [426]
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## [476]
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## [501]
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## [526]
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## [551]
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## [576]
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## [601]
            2
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## [651] 10 10 10
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## [676]
            8
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                                                                                        4
                                                                                                6
                                                                                                   6
## [701]
## [726]
            4
               4
                   4
                       4
##
## Within cluster sum of squares by cluster:
     [1] 30.75580 44.36339 54.49731 26.31513 68.50358 39.31211 33.26050 47.71110
##
##
     [9] 53.74947 34.85223
##
     (between_SS / total_SS = 85.1 %)
##
```

```
## Available components:
##
## [1] "cluster" "centers" "totss" "withinss" "tot.withinss"
## [6] "betweenss" "size" "iter" "ifault"
```

```
clust100 <- kmeans(bikes2s,100)
clust100</pre>
```

```
## K-means clustering with 100 clusters of sizes 5, 9, 11, 7, 13, 10, 4, 8, 9, 16, 3, 6, 4, 7, 1
0, 4, 2, 8, 6, 6, 11, 5, 7, 2, 5, 8, 8, 3, 5, 14, 5, 2, 8, 9, 2, 4, 5, 9, 3, 7, 6, 8, 7, 6, 6,
7, 6, 11, 6, 10, 4, 10, 6, 7, 13, 4, 10, 8, 9, 7, 5, 11, 10, 4, 8, 8, 7, 8, 7, 10, 9, 11, 8, 8,
8, 6, 7, 9, 13, 3, 5, 8, 8, 9, 9, 3, 5, 11, 6, 11, 9, 6, 11, 10, 6, 7, 7, 7, 5, 6
##
## Cluster means:
##
               Day
                         Month
                                     Year RentedBikeCount
## 1
       -0.64989403 0.948918350 0.3044458
                                              1.359262530
## 2
       -0.77612398 -1.472830685 0.3044458
                                              -0.756259494
## 3
       -0.28841736 1.191327465
                                0.3044458
                                              0.823922304
## 4
       1.47617898 -0.856352017 0.3044458
                                              0.652479271
## 5
       -1.48009870 -1.178039221 0.3044458
                                              -1.128434411
## 6
        0.58842177 -1.340793836 0.3044458
                                              -0.562422610
## 7
       -0.47948360 0.717048761 0.3044458
                                              2.103626047
## 8
       -0.90550968 -0.297380688 0.3044458
                                              0.952530565
## 9
       0.101878104
## 10
       1.33822767 1.586559718 -3.2801577
                                              -0.989617901
## 11
       -1.63448764 0.137374790 0.3044458
                                              -1.293766435
                                              -0.097093139
## 12
        0.58084798 -1.021973152 0.3044458
## 13
        0.54297899 -0.152462195
                                0.3044458
                                              2.317330412
## 14
       -1.57497923 -1.187594286
                                0.3044458
                                              -0.651471812
## 15
       -0.19546621 1.586559718 -3.2801577
                                              -0.787705962
## 16
      -0.13866273 -0.007543702 0.3044458
                                              -0.476567348
## 17
        1.67904854 -0.587217673 0.3044458
                                              1.238136711
## 18
       -0.69249664 0.137374790 0.3044458
                                              -0.575282223
## 19
        0.14535465 -0.780442330 0.3044458
                                              0.565274779
## 20
        0.69445493 -0.780442330 0.3044458
                                              0.441480990
## 21
        0.40355228 0.374514142 0.3044458
                                              0.716718435
## 22
        1.21326002 1.238755335
                                0.3044458
                                              0.412453480
## 23
        0.24273204 -0.359488613 0.3044458
                                              -0.712149063
## 24
       1.50863811 0.572130269 0.3044458
                                              1.852303311
## 25
        0.39528995 -0.558233975
                                0.3044458
                                              1.125334956
                                              0.929319230
## 26
       -1.50194619 1.224263486 0.3044458
## 27
       -1.26053141 -0.840825036 0.3044458
                                              0.011937885
## 28
       -0.08185926 -0.538911509
                                0.3044458
                                              1.684399091
## 29
       1.50863811 -0.326364386
                               0.3044458
                                              2.049733061
## 30
        0.48617552 1.586559718 -3.2801577
                                              -0.963471799
## 31
      -0.26363039 -1.021973152
                                0.3044458
                                              -0.009299153
## 32
       -0.99071489 0.282293283
                                0.3044458
                                              -1.104340594
## 33
       -0.40847925 -0.732136166
                                0.3044458
                                              0.622902922
## 34
      -1.55874967 0.523824104 0.3044458
                                              0.543812446
## 35
       -0.02505578 0.717048761
                                0.3044458
                                               1.912599424
## 36
       -0.99071489
                   1.296722733
                                0.3044458
                                              0.011137494
## 37
        1.05421029 0.137374790 0.3044458
                                              0.617140108
## 38
       -1.43251972 -0.345686852 0.3044458
                                              1.161239898
## 39
        0.59978247 0.427211776
                                0.3044458
                                              1.496929761
## 40
       0.06420683 0.551427627
                                0.3044458
                                              -0.636988548
## 41
        0.16428914 0.233987119 0.3044458
                                              1.504755805
## 42
       -0.40847925 0.608359892 0.3044458
                                              1.134752889
## 43
        0.89191464 -0.193867479
                                0.3044458
                                              -0.618693900
## 44
        0.90273435 -0.490605345
                                0.3044458
                                              -1.278825805
```

0.965292353

1.22462072 0.620436433 0.3044458

45

```
## 46
       -0.48759838 -0.566515032
                                  0.3044458
                                                -1.334929394
## 47
        0.42937204
                     1.200110404
                                  0.3044458
                                                 0.639266469
## 48
                     1.059583381
       -1.36251947
                                  0.3044458
                                                -1.258355202
## 49
       -0.08185926 -0.490605345
                                  0.3044458
                                                -1.028925986
## 50
        1.33822767
                    0.166358489
                                  0.3044458
                                                -0.722287348
##
  51
        1.11101377 -0.732136166
                                  0.3044458
                                                 1.397681292
## 52
       -0.68397612   0.311276982
                                  0.3044458
                                                 0.402955509
## 53
        1.03527580 -0.538911509
                                  0.3044458
                                                 0.784226150
##
   54
        0.97306246 -1.228999570
                                  0.3044458
                                                -1.011266569
## 55
        1.44746513 -1.579351970
                                  0.3044458
                                                -1.075649659
## 56
       -0.76350099 -0.224921442
                                  0.3044458
                                                 2.141511215
## 57
        0.04310839 -1.311810137
                                                -1.198786717
                                  0.3044458
## 58
       -1.45934358 -0.261151065
                                  0.3044458
                                                -0.555939443
## 59
       -0.47317210 -0.410095071
                                  0.3044458
                                                 1.255152428
## 60
        1.42749028 -1.021973152
                                  0.3044458
                                                 0.124221291
## 61
                                                 1.790192979
       -0.30907317
                    0.021439996
                                  0.3044458
## 62
       -1.41415900
                     1.586559718 -3.2801577
                                                -0.647826742
## 63
        0.14535465 -1.601647123
                                  0.3044458
                                                -0.738615322
## 64
       -1.30313402
                    0.789508008
                                  0.3044458
                                                 1.947549826
## 65
       -0.87710794
                    1.224263486
                                  0.3044458
                                                -1.318845349
## 66
        1.43763376 -0.333610311
                                  0.3044458
                                                 0.936789545
## 67
       -1.38022445 -0.525109748
                                  0.3044458
                                                 0.738159208
## 68
       -0.18126534
                    0.246063660
                                  0.3044458
                                                 0.520319491
## 69
        0.97306246
                    0.013158939
                                  0.3044458
                                                 1.121127187
##
  70
       -1.22928950
                     0.659081364
                                  0.3044458
                                                -0.504474310
## 71
       -1.06645286
                    0.813661090
                                  0.3044458
                                                 0.996655818
## 72
       -1.06301023 -1.443554222
                                  0.3044458
                                                -0.981759518
##
   73
        0.41517117 -0.913284282
                                  0.3044458
                                                -0.903976077
## 74
       -1.38833924 -1.601647123
                                  0.3044458
                                                -0.652119747
## 75
                    0.318522906
        1.59384332
                                  0.3044458
                                                 0.362375691
  76
##
        0.39150305
                    0.717048761
                                  0.3044458
                                                -1.268153927
## 77
       -1.03940359 -0.649325599
                                  0.3044458
                                                -1.092220389
## 78
        0.14535465
                    0.974681638
                                  0.3044458
                                                 1.228235579
  79
##
       -0.35276815 -1.467876206
                                  0.3044458
                                                -0.893406813
## 80
        1.54650709
                    0.137374790
                                  0.3044458
                                                 1.011715024
## 81
        0.89516055 -0.384331784
                                  0.3044458
                                                 1.894137074
                                  0.3044458
## 82
        0.71338942
                    1.224263486
                                                 0.345967678
## 83
                    0.970656124
        0.85539812
                                  0.3044458
                                                 1.163433562
## 84
       -0.82661596 -0.957564933
                                  0.3044458
                                                -0.311242165
## 85
       -0.15759723
                    1.232314514
                                  0.3044458
                                                -0.668038633
       -0.04399027 -0.925360823
## 86
                                  0.3044458
                                                -0.520055252
## 87
        0.53161830 -0.094494798
                                  0.3044458
                                                 1.204947169
## 88
        0.77535685 -1.601647123
                                  0.3044458
                                                -1.040648883
## 89
        1.62224506
                    1.006885747
                                  0.3044458
                                                 0.760748018
## 90
       -0.79448470
                                                -0.825270974
                    1.586559718 -3.2801577
## 91
        0.83961937
                    0.974681638
                                  0.3044458
                                                -0.886693563
## 92
       -0.17653172
                     1.103498076
                                  0.3044458
                                                 0.434722133
## 93
        1.28142420 -1.101019602
                                                -0.538391480
                                  0.3044458
## 94
       -1.11568254
                     0.224325886
                                  0.3044458
                                                 1.025019299
## 95
        1.50863811
                     1.296722733
                                  0.3044458
                                                 0.292252557
## 96
        1.26519463
                     0.965480463
                                  0.3044458
                                                -0.568993438
## 97
        1.47617898
                    0.675643478
                                  0.3044458
                                                -1.309316886
```

```
## 98
        -0.63366447 -1.187594286
                                        0.3044458
                                                         -1.149543621
##
          0.05446909 -0.210429592
                                        0.3044458
                                                          1.146678713
   100 -1.35047025 -0.007543702
                                        0.3044458
                                                          2.024120553
##
##
##
   Clustering vector:
##
      [1]
            62
                 62
                      62
                           62
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                                     62
                                          90
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##
     [19]
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                 72
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##
     [37]
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##
     [55]
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##
     [73]
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##
     [91]
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   [109]
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##
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##
   [127]
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                           84
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##
   [145]
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##
   [163]
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   [181]
                      38
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##
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##
   [199]
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   [217]
##
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                                     52
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## [235]
            37
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##
   [253]
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##
   [289]
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## [307]
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   [325]
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##
   [343]
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##
   [361]
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##
   [379]
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##
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##
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##
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##
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##
   [487]
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   [505]
            25
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                      20
                           44
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                                          51
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##
##
   [523]
             8
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                      56
                           46
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                                          29 100
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##
   [541]
            81
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                                                                            81
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                                                                                      29
                                                                                           50
                                                                                                29
##
   [559]
                          100
                               100
                                     94
                                        100
                                               94
                                                    94
                                                         32
                                                              52
                                                                   61
                                                                        61
                                                                                  68
                                                                                                41
##
   [577]
            50
                 11
                      58
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##
   [595]
            41
                 41
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##
   [613]
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                 94
                      94
                           94
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                                     42
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             9
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                                45
                                     97
                                          97
                                               75
## [631]
                      45
                                                    24
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                                                                                                 1
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                  7
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                                                                                           45
##
   [649]
             7
                                35
                                     92
                                          40
                                               35
                                                    76
                                                         76
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                                                                        21
                                                                                      45
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                      97
                                          48
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##
   [667]
            97
                           64
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                                     26
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                                                                                      92
##
   [685]
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                 78
                      78
                           78
                                47
                                     82
                                          83
                                               83
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## [703]
            48
                 36
                           65
                                36
                                     65
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                                                    85
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                                                                         3
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                 82
                      82
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                                96
                                     22
                                          22
                                               95
                                                    95
##
   [721]
            82
##
## Within cluster sum of squares by cluster:
      [1] 0.33675413 0.33822595 0.74457613 0.27349226 1.30308616 0.32548693
##
      [7] 0.07867657 0.45255928 1.08167225 1.97199148 0.01415986 0.15529761
##
##
     [13] 0.08999685 0.38083881 0.57327712 0.22624777 0.09214895 0.75468030
     [19] 0.19679974 0.57768649 0.90087006 0.18615901 0.41665361 0.20283961
##
```

```
##
    [25] 0.18469489 0.65768770 0.67010572 0.11811163 0.24984810 1.12639053
   [31] 0.24229415 0.16151898 0.73813216 0.70836439 0.17390510 0.25724888
##
##
   [37] 0.14250339 0.85208030 0.07972357 0.55004067 0.27353208 0.42061431
##
   [43] 0.94386598 0.64321746 0.45536130 0.29596985 0.24866290 0.76737072
   [49] 0.43094171 1.39706350 0.20089654 1.24062817 0.22581202 0.24915102
##
   [55] 0.89760796 0.29086166 0.45937122 0.89083781 0.90403463 0.33335867
##
##
   [61] 0.24334140 1.35767334 0.32355957 0.38350399 0.30262355 0.40116073
##
   [67] 0.48790014 0.67454434 0.32373487 1.74927352 0.60184990 0.49091435
   [73] 0.75879777 0.13347234 0.75289581 0.17393488 0.57479685 0.69100491
##
##
   [79] 0.80433756 0.14989636 0.33517548 0.26162423 0.76199187 0.76338955
##
   [85] 1.55517497 0.16158021 0.15342577 0.54495494 0.10255143 1.27100134
   [91] 1.34916694 0.43466670 1.30939663 0.95188663 0.09107142 0.58231368
##
   [97] 0.32212886 0.28617229 0.27965315 0.43555583
##
    (between SS / total SS = 98.2 %)
##
##
## Available components:
##
## [1] "cluster"
                      "centers"
                                                     "withinss"
                                                                    "tot.withinss"
                                      "totss"
                      "size"
                                                     "ifault"
## [6] "betweenss"
                                      "iter"
```

#I prefer unstandardized because it will give an exact number of clusters, while standardized seems to approach infinite

#e For hierarchical, they did not match at all, there were a lot more clusters than 4, this is because many of the observations are statistically different from each other. For non-hierarchical, they also did not match, the optimal amount was actually less than 4, this is because it specifically tried to find what number of groups are statistically similar while not having the cluster mean to be zero